

hrl7ijdb

November 26, 2025

```
[ ]: ##### !!!! Exploratory Data Analysis with Pandas !!!! #####
```

```
[ ]: import kagglehub
```

```
[ ]: path = kagglehub.dataset_download('kashnitsky/mlcourse')
      print(path)
```

Downloading from https://www.kaggle.com/api/v1/datasets/download/kashnitsky/mlcourse?dataset_version_number=17...

100%| | 51.1M/51.1M [00:00<00:00, 167MB/s]

Extracting files...

/root/.cache/kagglehub/datasets/kashnitsky/mlcourse/versions/17

```
[ ]: import numpy as np
      import pandas as pd
```

```
pd.set_option("display.precision", 2)
```

```
[ ]: #####
      help(pd.set_option)
      #####
```

Help on CallableDynamicDoc in module pandas._config.config:

```
<pandas._config.config.CallableDynamicDoc object>
  set_option(pat, value)
```

Sets the value of the specified option.

Available options:

- compute.[use_bottleneck, use_numba, use_numexpr]
- display.[chop_threshold, colheader_justify, date_dayfirst, date_yearfirst, encoding, expand_frame_repr, float_format]
- display.html.[border, table_schema, use_mathjax]

- display.[large_repr, max_categories, max_columns, max_colwidth, max_dir_items, max_info_columns, max_info_rows, max_rows, max_seq_items, memory_usage, min_rows, multi_sparse, notebook_repr_html, pprint_nest_depth, precision, show_dimensions]
- display.unicode.[ambiguous_as_wide, east_asian_width]
- display.[width]
- future.[infer_string, no_silent_downcasting]
- io.excel.ods.[reader, writer]
- io.excel.xls.[reader]
- io.excel.xlsb.[reader]
- io.excel.xlsm.[reader, writer]
- io.excel.xlsx.[reader, writer]
- io.hdf.[default_format, dropna_table]
- io.parquet.[engine]
- io.sql.[engine]
- mode.[chained_assignment, copy_on_write, data_manager, sim_interactive, string_storage, use_inf_as_na]
- plotting.[backend]
- plotting.matplotlib.[register_converters]
- styler.format.[decimal, escape, formatter, na_rep, precision, thousands]
- styler.html.[mathjax]
- styler.latex.[environment, hrules, multicol_align, multirow_align]
- styler.render.[encoding, max_columns, max_elements, max_rows, repr]
- styler.sparse.[columns, index]

Parameters

pat : str

Regexp which should match a single option.

Note: partial matches are supported for convenience, but unless you use the

full option name (e.g. x.y.z.option_name), your code may break in future versions if new options with similar names are introduced.

value : object

New value of option.

Returns

None

Raises

OptionError if no such option exists

Notes

Please reference the :ref:`User Guide <options>` for more information.

The available options with its descriptions:

```
compute.use_bottleneck : bool
    Use the bottleneck library to accelerate if it is installed,
    the default is True
    Valid values: False,True
    [default: True] [currently: True]
compute.use_numba : bool
    Use the numba engine option for select operations if it is installed,
    the default is False
    Valid values: False,True
    [default: False] [currently: False]
compute.use_numexpr : bool
    Use the numexpr library to accelerate computation if it is installed,
    the default is True
    Valid values: False,True
    [default: True] [currently: True]
display.chop_threshold : float or None
    if set to a float value, all float values smaller than the given
threshold
    will be displayed as exactly 0 by repr and friends.
    [default: None] [currently: None]
display.colheader_justify : 'left'/'right'
    Controls the justification of column headers. used by
DataFrameFormatter.
    [default: right] [currently: right]
display.date_dayfirst : boolean
    When True, prints and parses dates with the day first, eg 20/01/2005
    [default: False] [currently: False]
display.date_yearfirst : boolean
    When True, prints and parses dates with the year first, eg 2005/01/20
    [default: False] [currently: False]
display.encoding : str/unicode
    Defaults to the detected encoding of the console.
    Specifies the encoding to be used for strings returned by to_string,
    these are generally strings meant to be displayed on the console.
    [default: UTF-8] [currently: UTF-8]
display.expand_frame_repr : boolean
    Whether to print out the full DataFrame repr for wide DataFrames across
    multiple lines, `max_columns` is still respected, but the output will
    wrap-around across multiple "pages" if its width exceeds
`display.width`.
    [default: True] [currently: True]
display.float_format : callable
    The callable should accept a floating point number and return
    a string with the desired format of the number. This is used
    in some places like SeriesFormatter.
```

See `formats.format.EngFormatter` for an example.

[default: None] [currently: None]

`display.html.border` : int

A `border=value` attribute is inserted in the `<table>` tag for the DataFrame HTML repr.

[default: 1] [currently: 1]

`display.html.table_schema` : boolean

Whether to publish a Table Schema representation for frontends that support it.

(default: False)

[default: False] [currently: False]

`display.html.use_mathjax` : boolean

When True, Jupyter notebook will process table contents using MathJax, rendering mathematical expressions enclosed by the dollar symbol.

(default: True)

[default: True] [currently: True]

`display.large_repr` : 'truncate'/'info'

For DataFrames exceeding `max_rows/max_cols`, the repr (and HTML repr) can show a truncated table, or switch to the view from `df.info()` (the behaviour in earlier versions of pandas).

[default: truncate] [currently: truncate]

`display.max_categories` : int

This sets the maximum number of categories pandas should output when printing out a `Categorical` or a Series of dtype "category".

[default: 8] [currently: 8]

`display.max_columns` : int

If `max_cols` is exceeded, switch to truncate view. Depending on `large_repr`, objects are either centrally truncated or printed as a summary view. 'None' value means unlimited.

In case python/IPython is running in a terminal and `large_repr` equals 'truncate' this can be set to 0 or None and pandas will auto-detect

the width of the terminal and print a truncated object which fits the screen width. The IPython notebook, IPython qtconsole, or IDLE do not run in a terminal and hence it is not possible to do correct auto-detection and defaults to 20.

[default: 20] [currently: 20]

`display.max_colwidth` : int or None

The maximum width in characters of a column in the repr of a pandas data structure. When the column overflows, a "..." placeholder is embedded in the output. A 'None' value means unlimited.

[default: 50] [currently: 50]

`display.max_dir_items` : int

The number of items that will be added to `dir(...)`. 'None' value means unlimited. Because `dir` is cached, changing this option will not immediately

affect already existing dataframes until a column is deleted or added.

This is for instance used to suggest columns from a dataframe to tab completion.

[default: 100] [currently: 100]

`display.max_info_columns` : int

`max_info_columns` is used in `DataFrame.info` method to decide if per column information will be printed.

[default: 100] [currently: 100]

`display.max_info_rows` : int

`df.info()` will usually show null-counts for each column. For large frames this can be quite slow. `max_info_rows` and `max_info_cols` limit this null check only to frames with smaller dimensions than specified.

[default: 1690785] [currently: 1690785]

`display.max_rows` : int

If `max_rows` is exceeded, switch to truncate view. Depending on ``large_repr``, objects are either centrally truncated or printed as a summary view. 'None' value means unlimited.

In case python/IPython is running in a terminal and ``large_repr`` equals 'truncate' this can be set to 0 and pandas will auto-detect the height of the terminal and print a truncated object which fits the screen height. The IPython notebook, IPython qtconsole, or IDLE do not run in a terminal and hence it is not possible to do correct auto-detection.

[default: 60] [currently: 60]

`display.max_seq_items` : int or None

When pretty-printing a long sequence, no more then ``max_seq_items`` will be printed. If items are omitted, they will be denoted by the addition of "..." to the resulting string.

If set to None, the number of items to be printed is unlimited.

[default: 100] [currently: 100]

`display.memory_usage` : bool, string or None

This specifies if the memory usage of a DataFrame should be displayed

when `df.info()` is called. Valid values True,False,'deep'

[default: True] [currently: True]

`display.min_rows` : int

The numbers of rows to show in a truncated view (when ``max_rows`` is exceeded). Ignored when ``max_rows`` is set to None or 0. When set to None, follows the value of ``max_rows``.

[default: 10] [currently: 10]

`display.multi_sparse` : boolean

"sparsify" MultiIndex display (don't display repeated elements in outer levels within groups)

[default: True] [currently: True]

`display.notebook_repr_html` : boolean

When True, IPython notebook will use html representation for pandas objects (if it is available).
[default: True] [currently: True]

`display.pprint_nest_depth` : int
Controls the number of nested levels to process when pretty-printing
[default: 3] [currently: 3]

`display.precision` : int
Floating point output precision in terms of number of places after the decimal, for regular formatting as well as scientific notation. Similar to ``precision`` in :meth:`numpy.set_printoptions`.
[default: 6] [currently: 2]

`display.show_dimensions` : boolean or 'truncate'
Whether to print out dimensions at the end of DataFrame repr. If 'truncate' is specified, only print out the dimensions if the frame is truncated (e.g. not display all rows and/or columns)
[default: truncate] [currently: truncate]

`display.unicode.ambiguous_as_wide` : boolean
Whether to use the Unicode East Asian Width to calculate the display text width.
Enabling this may affect to the performance (default: False)
[default: False] [currently: False]

`display.unicode.east_asian_width` : boolean
Whether to use the Unicode East Asian Width to calculate the display text width.
Enabling this may affect to the performance (default: False)
[default: False] [currently: False]

`display.width` : int
Width of the display in characters. In case python/IPython is running in a terminal this can be set to None and pandas will correctly auto-detect the width.
Note that the IPython notebook, IPython qtconsole, or IDLE do not run in a terminal and hence it is not possible to correctly detect the width.
[default: 80] [currently: 80]

`future.infer_string` Whether to infer sequence of str objects as pyarrow string dtype, which will be the default in pandas 3.0 (at which point this option will be deprecated).
[default: False] [currently: False]

`future.no_silent_downcasting` Whether to opt-in to the future behavior which will *not* silently downcast results from Series and DataFrame `where`, `mask`, and `clip` methods. Silent downcasting will be removed in pandas 3.0 (at which point this option will be deprecated).
[default: False] [currently: False]

`io.excel.ods.reader` : string
The default Excel reader engine for 'ods' files. Available options: auto, odf, calamine.

```

    [default: auto] [currently: auto]
io.excel.ods.writer : string
    The default Excel writer engine for 'ods' files. Available options:
    auto, odf.
    [default: auto] [currently: auto]
io.excel.xls.reader : string
    The default Excel reader engine for 'xls' files. Available options:
    auto, xlrd, calamine.
    [default: auto] [currently: auto]
io.excel.xlsb.reader : string
    The default Excel reader engine for 'xlsb' files. Available options:
    auto, pyxlsb, calamine.
    [default: auto] [currently: auto]
io.excel.xlsm.reader : string
    The default Excel reader engine for 'xlsm' files. Available options:
    auto, xlrd, openpyxl, calamine.
    [default: auto] [currently: auto]
io.excel.xlsm.writer : string
    The default Excel writer engine for 'xlsm' files. Available options:
    auto, openpyxl.
    [default: auto] [currently: auto]
io.excel.xlsx.reader : string
    The default Excel reader engine for 'xlsx' files. Available options:
    auto, xlrd, openpyxl, calamine.
    [default: auto] [currently: auto]
io.excel.xlsx.writer : string
    The default Excel writer engine for 'xlsx' files. Available options:
    auto, openpyxl, xlsxwriter.
    [default: auto] [currently: auto]
io.hdf.default_format : format
    default format writing format, if None, then
    put will default to 'fixed' and append will default to 'table'
    [default: None] [currently: None]
io.hdf.dropna_table : boolean
    drop ALL nan rows when appending to a table
    [default: False] [currently: False]
io.parquet.engine : string
    The default parquet reader/writer engine. Available options:
    'auto', 'pyarrow', 'fastparquet', the default is 'auto'
    [default: auto] [currently: auto]
io.sql.engine : string
    The default sql reader/writer engine. Available options:
    'auto', 'sqlalchemy', the default is 'auto'
    [default: auto] [currently: auto]
mode.chained_assignment : string
    Raise an exception, warn, or no action if trying to use chained
assignment,
    The default is warn

```

```

    [default: warn] [currently: warn]
mode.copy_on_write : bool
    Use new copy-view behaviour using Copy-on-Write. Defaults to False,
    unless overridden by the 'PANDAS_COPY_ON_WRITE' environment variable
    (if set to "1" for True, needs to be set before pandas is imported).
    [default: False] [currently: False]
mode.data_manager : string
    Internal data manager type; can be "block" or "array". Defaults to
"block",
    unless overridden by the 'PANDAS_DATA_MANAGER' environment variable
(needs
    to be set before pandas is imported).
    [default: block] [currently: block]
    (Deprecated, use `` instead.)
mode.sim_interactive : boolean
    Whether to simulate interactive mode for purposes of testing
    [default: False] [currently: False]
mode.string_storage : string
    The default storage for StringDtype. This option is ignored if
    ``future.infer_string`` is set to True.
    [default: python] [currently: python]
mode.use_inf_as_na : boolean
    True means treat None, NaN, INF, -INF as NA (old way),
    False means None and NaN are null, but INF, -INF are not NA
    (new way).

    This option is deprecated in pandas 2.1.0 and will be removed in 3.0.
    [default: False] [currently: False]
    (Deprecated, use `` instead.)
plotting.backend : str
    The plotting backend to use. The default value is "matplotlib", the
    backend provided with pandas. Other backends can be specified by
    providing the name of the module that implements the backend.
    [default: matplotlib] [currently: matplotlib]
plotting.matplotlib.register_converters : bool or 'auto'.
    Whether to register converters with matplotlib's units registry for
    dates, times, datetimes, and Periods. Toggling to False will remove
    the converters, restoring any converters that pandas overwrote.
    [default: auto] [currently: auto]
styler.format.decimal : str
    The character representation for the decimal separator for floats and
complex.
    [default: .] [currently: .]
styler.format.escape : str, optional
    Whether to escape certain characters according to the given context;
html or latex.
    [default: None] [currently: None]
styler.format.formatter : str, callable, dict, optional

```


A formatter object to be used as default within ``Styler.format``.
 [default: None] [currently: None]

styler.format.na_rep : str, optional
 The string representation for values identified as missing.
 [default: None] [currently: None]

styler.format.precision : int
 The precision for floats and complex numbers.
 [default: 6] [currently: 6]

styler.format.thousands : str, optional
 The character representation for thousands separator for floats, int and complex.
 [default: None] [currently: None]

styler.html.mathjax : bool
 If False will render special CSS classes to table attributes that indicate Mathjax will not be used in Jupyter Notebook.
 [default: True] [currently: True]

styler.latex.environment : str
 The environment to replace ``\begin{table}``. If "longtable" is used results in a specific longtable environment format.
 [default: None] [currently: None]

styler.latex.hrules : bool
 Whether to add horizontal rules on top and bottom and below the headers.
 [default: False] [currently: False]

styler.latex.multicol_align : {"r", "c", "l", "naive-l", "naive-r"}
 The specifier for horizontal alignment of sparsified LaTeX multicolumns.

Pipe
 decorators can also be added to non-naive values to draw vertical rules, e.g. "\|r" will draw a rule on the left side of right aligned merged cells.
 [default: r] [currently: r]

styler.latex.multirow_align : {"c", "t", "b"}
 The specifier for vertical alignment of sparsified LaTeX multirows.
 [default: c] [currently: c]

styler.render.encoding : str
 The encoding used for output HTML and LaTeX files.
 [default: utf-8] [currently: utf-8]

styler.render.max_columns : int, optional
 The maximum number of columns that will be rendered. May still be reduced to satisfy ``max_elements``, which takes precedence.
 [default: None] [currently: None]

styler.render.max_elements : int
 The maximum number of data-cell (<td>) elements that will be rendered before trimming will occur over columns, rows or both if needed.
 [default: 262144] [currently: 262144]

```

styler.render.max_rows : int, optional
    The maximum number of rows that will be rendered. May still be reduced
to
    satisfy ``max_elements``, which takes precedence.
    [default: None] [currently: None]
styler.render.repr : str
    Determine which output to use in Jupyter Notebook in {"html", "latex"}.
    [default: html] [currently: html]
styler.sparse.columns : bool
    Whether to sparsify the display of hierarchical columns. Setting to
False will
    display each explicit level element in a hierarchical key for each
column.
    [default: True] [currently: True]
styler.sparse.index : bool
    Whether to sparsify the display of a hierarchical index. Setting to
False will
    display each explicit level element in a hierarchical key for each row.
    [default: True] [currently: True]

```

Examples

```

>>> pd.set_option('display.max_columns', 4)
>>> df = pd.DataFrame([[1, 2, 3, 4, 5], [6, 7, 8, 9, 10]])
>>> df
   0  1  ...  3  4
0  1  2  ...  4  5
1  6  7  ...  9 10
[2 rows x 5 columns]
>>> pd.reset_option('display.max_columns')

```

```

[ ]: #####
print(path, type(path))
path
#####

```

```

/root/.cache/kagglehub/datasets/kashnitsky/mlcourse/versions/17 <class 'str'>

```

```

[ ]: df = pd.read_csv(path + "/telecom_churn.csv")

```

```

[ ]: df.head()

```

```

[ ]: State Account length Area code International plan Voice mail plan \
0 KS 128 415 No Yes
1 OH 107 415 No Yes
2 NJ 137 415 No No

```

3	OH	84	408	Yes	No
4	OK	75	415	Yes	No

	Number vmail messages	Total day minutes	Total day calls \
0	25	265.1	110
1	26	161.6	123
2	0	243.4	114
3	0	299.4	71
4	0	166.7	113

	Total day charge	Total eve minutes	Total eve calls	Total eve charge \
0	45.07	197.4	99	16.78
1	27.47	195.5	103	16.62
2	41.38	121.2	110	10.30
3	50.90	61.9	88	5.26
4	28.34	148.3	122	12.61

	Total night minutes	Total night calls	Total night charge \
0	244.7	91	11.01
1	254.4	103	11.45
2	162.6	104	7.32
3	196.9	89	8.86
4	186.9	121	8.41

	Total intl minutes	Total intl calls	Total intl charge \
0	10.0	3	2.70
1	13.7	3	3.70
2	12.2	5	3.29
3	6.6	7	1.78
4	10.1	3	2.73

	Customer service calls	Churn
0	1	False
1	1	False
2	0	False
3	2	False
4	3	False

```
[ ]: print(df.shape)
```

```
(3333, 20)
```

```
[ ]: print(df.columns)
```

```
Index(['State', 'Account length', 'Area code', 'International plan',
      'Voice mail plan', 'Number vmail messages', 'Total day minutes',
      'Total day calls', 'Total day charge', 'Total eve minutes',
      'Total eve calls', 'Total eve charge', 'Total night minutes',
```

```

    'Total night calls', 'Total night charge', 'Total intl minutes',
    'Total intl calls', 'Total intl charge', 'Customer service calls',
    'Churn'],
    dtype='object')

```

```
[ ]: print(df.info())
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 3333 entries, 0 to 3332
Data columns (total 20 columns):
#   Column                                Non-Null Count  Dtype
---  -
0   State                                3333 non-null   object
1   Account length                       3333 non-null   int64
2   Area code                           3333 non-null   int64
3   International plan                   3333 non-null   object
4   Voice mail plan                     3333 non-null   object
5   Number vmail messages               3333 non-null   int64
6   Total day minutes                   3333 non-null   float64
7   Total day calls                     3333 non-null   int64
8   Total day charge                    3333 non-null   float64
9   Total eve minutes                   3333 non-null   float64
10  Total eve calls                     3333 non-null   int64
11  Total eve charge                    3333 non-null   float64
12  Total night minutes                 3333 non-null   float64
13  Total night calls                   3333 non-null   int64
14  Total night charge                  3333 non-null   float64
15  Total intl minutes                  3333 non-null   float64
16  Total intl calls                    3333 non-null   int64
17  Total intl charge                   3333 non-null   float64
18  Customer service calls              3333 non-null   int64
19  Churn                              3333 non-null   bool
dtypes: bool(1), float64(8), int64(8), object(3)
memory usage: 498.1+ KB
None

```

```
[ ]: df["Churn"] = df["Churn"].astype("int64")
```

```
[ ]: df.describe()
```

```

[ ]:
      Account length  Area code  Number vmail messages  Total day minutes  \
count          3333.00    3333.00             3333.00          3333.00
mean           101.06     437.18                8.10           179.78
std            39.82      42.37             13.69           54.47
min             1.00     408.00                0.00              0.00
25%            74.00     408.00                0.00           143.70
50%           101.00     415.00                0.00           179.40

```

75%	127.00	510.00	20.00	216.40
max	243.00	510.00	51.00	350.80

	Total day calls	Total day charge	Total eve minutes	Total eve calls \
count	3333.00	3333.00	3333.00	3333.00
mean	100.44	30.56	200.98	100.11
std	20.07	9.26	50.71	19.92
min	0.00	0.00	0.00	0.00
25%	87.00	24.43	166.60	87.00
50%	101.00	30.50	201.40	100.00
75%	114.00	36.79	235.30	114.00
max	165.00	59.64	363.70	170.00

	Total eve charge	Total night minutes	Total night calls \
count	3333.00	3333.00	3333.00
mean	17.08	200.87	100.11
std	4.31	50.57	19.57
min	0.00	23.20	33.00
25%	14.16	167.00	87.00
50%	17.12	201.20	100.00
75%	20.00	235.30	113.00
max	30.91	395.00	175.00

	Total night charge	Total intl minutes	Total intl calls \
count	3333.00	3333.00	3333.00
mean	9.04	10.24	4.48
std	2.28	2.79	2.46
min	1.04	0.00	0.00
25%	7.52	8.50	3.00
50%	9.05	10.30	4.00
75%	10.59	12.10	6.00
max	17.77	20.00	20.00

	Total intl charge	Customer service calls	Churn
count	3333.00	3333.00	3333.00
mean	2.76	1.56	0.14
std	0.75	1.32	0.35
min	0.00	0.00	0.00
25%	2.30	1.00	0.00
50%	2.78	1.00	0.00
75%	3.27	2.00	0.00
max	5.40	9.00	1.00

```
[ ]: df.describe(include=["object", "bool"])
```

```
[ ]: State International plan Voice mail plan
count 3333 3333 3333
```

unique	51	2	2
top	WV	No	No
freq	106	3010	2411

```
[ ]: df["Churn"].value_counts()
```

```
[ ]: Churn
0    2850
1     483
Name: count, dtype: int64
```

```
[ ]: # To check the distribtion of data in percentage in the range of 0 to 1
df["Churn"].value_counts(normalize=True)
```

```
[ ]: Churn
0    0.86
1    0.14
Name: proportion, dtype: float64
```

```
[ ]: #####
df.head()
#####
```

```
[ ]: State Account length Area code International plan Voice mail plan \
0    KS          128      415              No              Yes
1    OH          107      415              No              Yes
2    NJ          137      415              No              No
3    OH           84      408              Yes              No
4    OK           75      415              Yes              No

    Number vmail messages Total day minutes Total day calls \
0                25          265.1          110
1                26          161.6          123
2                 0          243.4          114
3                 0          299.4           71
4                 0          166.7          113

    Total day charge Total eve minutes Total eve calls Total eve charge \
0          45.07          197.4          99          16.78
1          27.47          195.5         103          16.62
2          41.38          121.2         110          10.30
3          50.90           61.9          88           5.26
4          28.34          148.3         122          12.61

    Total night minutes Total night calls Total night charge \
0          244.7           91          11.01
1          254.4          103          11.45
```

2	162.6	104	7.32
3	196.9	89	8.86
4	186.9	121	8.41

	Total intl minutes	Total intl calls	Total intl charge \
0	10.0	3	2.70
1	13.7	3	3.70
2	12.2	5	3.29
3	6.6	7	1.78
4	10.1	3	2.73

	Customer service calls	Churn
0	1	0
1	1	0
2	0	0
3	2	0
4	3	0

```
[ ]: df.sort_values(by="Total day charge", ascending=False).head()
```

```
[ ]:
      State  Account length  Area code  International plan  Voice mail plan \
365      CO             154       415                No          No
985      NY              64       415                Yes          No
2594     OH             115       510                Yes          No
156      OH              83       415                No          No
605      MO             112       415                No          No
```

	Number vmail messages	Total day minutes	Total day calls \
365	0	350.8	75
985	0	346.8	55
2594	0	345.3	81
156	0	337.4	120
605	0	335.5	77

	Total day charge	Total eve minutes	Total eve calls	Total eve charge \
365	59.64	216.5	94	18.40
985	58.96	249.5	79	21.21
2594	58.70	203.4	106	17.29
156	57.36	227.4	116	19.33
605	57.04	212.5	109	18.06

	Total night minutes	Total night calls	Total night charge \
365	253.9	100	11.43
985	275.4	102	12.39
2594	217.5	107	9.79
156	153.9	114	6.93
605	265.0	132	11.93

	Total intl minutes	Total intl calls	Total intl charge \
365	10.1	9	2.73
985	13.3	9	3.59
2594	11.8	8	3.19
156	15.8	7	4.27
605	12.7	8	3.43

	Customer service calls	Churn
365	1	1
985	1	1
2594	1	1
156	0	1
605	2	1

```
[ ]: df.sort_values(by=["Churn", "Total day charge"], ascending=[True, False]).head()
```

```
[ ]:      State  Account length  Area code  International plan  Voice mail plan \
688      MN             13       510             No             Yes
2259     NC             210       415             No             Yes
534      LA             67       510             No             No
575      SD             114       415             No             Yes
2858     AL             141       510             No             Yes
```

	Number vmail messages	Total day minutes	Total day calls \
688	21	315.6	105
2259	31	313.8	87
534	0	310.4	97
575	36	309.9	90
2858	28	308.0	123

	Total day charge	Total eve minutes	Total eve calls	Total eve charge \
688	53.65	208.9	71	17.76
2259	53.35	147.7	103	12.55
534	52.77	66.5	123	5.65
575	52.68	200.3	89	17.03
2858	52.36	247.8	128	21.06

	Total night minutes	Total night calls	Total night charge \
688	260.1	123	11.70
2259	192.7	97	8.67
534	246.5	99	11.09
575	183.5	105	8.26
2858	152.9	103	6.88

	Total intl minutes	Total intl calls	Total intl charge \
688	12.1	3	3.27

2259	10.1	7	2.73
534	9.2	10	2.48
575	14.2	2	3.83
2858	7.4	3	2.00

	Customer service calls	Churn
688	3	0
2259	3	0
534	4	0
575	1	0
2858	1	0

```
[ ]: df["Churn"].mean()
```

```
[ ]: np.float64(0.14491449144914492)
```

```
[ ]: #####
df["Churn"].sum()/len(df["Churn"])
#####
```

```
[ ]: np.float64(0.14491449144914492)
```

```
[ ]: #df[df["Churn"] == 1].mean()
```

```
[ ]: #####
df["Total eve minutes"][df["Churn"] == 1].mean()
#####
```

```
[ ]: np.float64(212.41014492753624)
```

```
[ ]: #####
df["Total eve minutes"].mean()
#####
```

```
[ ]: np.float64(200.98034803480348)
```

```
[ ]: df[df["Churn"] == 1]["Total day minutes"].mean()
```

```
[ ]: np.float64(206.91407867494823)
```

```
[ ]: #####
df[df["Churn"] == 1]["Total eve minutes"].mean()
#####
```

```
[ ]: np.float64(212.41014492753624)
```

```
[ ]: df[(df["Churn"] == 1) & (df["International plan"] == "No")]["Total intl_
minutes"].max()
```

```
[ ]: 18.3
```

```
[ ]: df.loc[0:5, "State":"Area code"]
```

```
[ ]: State Account length Area code
0    KS             128      415
1    OH             107      415
2    NJ             137      415
3    OH              84      408
4    OK              75      415
5    AL             118      510
```

```
[ ]: df.iloc[0:5, 0:3]
```

```
[ ]: State Account length Area code
0    KS             128      415
1    OH             107      415
2    NJ             137      415
3    OH              84      408
4    OK              75      415
```

```
[ ]: df[-1:]
```

```
[ ]: State Account length Area code International plan Voice mail plan \
3332    TN             74      415                No                Yes

      Number vmail messages Total day minutes Total day calls \
3332                25          234.4          113

      Total day charge Total eve minutes Total eve calls Total eve charge \
3332          39.85          265.9          82          22.6

      Total night minutes Total night calls Total night charge \
3332          241.4          77          10.86

      Total intl minutes Total intl calls Total intl charge \
3332          13.7          4          3.7

      Customer service calls Churn
3332                0          0
```

```
[ ]: df.apply(np.max)
```

```
[ ]: State          WY
Account length      243
Area code           510
International plan   Yes
Voice mail plan      Yes
Number vmail messages 51
Total day minutes    350.8
Total day calls      165
Total day charge     59.64
Total eve minutes    363.7
Total eve calls      170
Total eve charge     30.91
Total night minutes  395.0
Total night calls    175
Total night charge   17.77
Total intl minutes   20.0
Total intl calls     20
Total intl charge    5.4
Customer service calls 9
Churn               1
dtype: object
```

```
[ ]: df[df["State"].apply(lambda state: state[0] == "W")].head()
```

```
[ ]:   State Account length Area code International plan Voice mail plan \
9      WV             141      415                Yes         Yes
26     WY             57      408                No          Yes
44     WI             64      510                No          No
49     WY             97      415                No          Yes
54     WY             87      415                No          No

      Number vmail messages Total day minutes Total day calls \
9                        37          258.6          84
26                       39          213.0         115
44                        0          154.0          67
49                       24          133.2         135
54                        0          151.0          83

      Total day charge Total eve minutes Total eve calls Total eve charge \
9          43.96          222.0          111          18.87
26          36.21          191.1          112          16.24
44          26.18          225.8          118          19.19
49          22.64          217.2           58          18.46
54          25.67          219.7          116          18.67

      Total night minutes Total night calls Total night charge \
9          326.4           97          14.69
```

26	182.7	115	8.22
44	265.3	86	11.94
49	70.6	79	3.18
54	203.9	127	9.18

	Total intl minutes	Total intl calls	Total intl charge \
9	11.2	5	3.02
26	9.5	3	2.57
44	3.5	3	0.95
49	11.0	3	2.97
54	9.7	3	2.62

	Customer service calls	Churn
9	0	0
26	0	0
44	1	0
49	1	0
54	5	1

```
[ ]: #####
df["International plan"].head()
#####
```

```
[ ]: 0    No
      1    No
      2    No
      3   Yes
      4   Yes
Name: International plan, dtype: object
```

```
[ ]: d = {"No": False, "Yes": True}
df["International plan"] = df["International plan"].map(d)
df.head()
```

	State	Account length	Area code	International plan	Voice mail plan \
0	KS	128	415	False	Yes
1	OH	107	415	False	Yes
2	NJ	137	415	False	No
3	OH	84	408	True	No
4	OK	75	415	True	No

	Number vmail messages	Total day minutes	Total day calls \
0	25	265.1	110
1	26	161.6	123
2	0	243.4	114
3	0	299.4	71
4	0	166.7	113

	Total day charge	Total eve minutes	Total eve calls	Total eve charge \
0	45.07	197.4	99	16.78
1	27.47	195.5	103	16.62
2	41.38	121.2	110	10.30
3	50.90	61.9	88	5.26
4	28.34	148.3	122	12.61

	Total night minutes	Total night calls	Total night charge \
0	244.7	91	11.01
1	254.4	103	11.45
2	162.6	104	7.32
3	196.9	89	8.86
4	186.9	121	8.41

	Total intl minutes	Total intl calls	Total intl charge \
0	10.0	3	2.70
1	13.7	3	3.70
2	12.2	5	3.29
3	6.6	7	1.78
4	10.1	3	2.73

	Customer service calls	Churn
0	1	0
1	1	0
2	0	0
3	2	0
4	3	0

```
[ ]: df = df.replace({"Voice mail plan": d})
df.head()
```

```
/tmp/ipython-input-1212166602.py:1: FutureWarning: Downcasting behavior in
`replace` is deprecated and will be removed in a future version. To retain the
old behavior, explicitly call `result.infer_objects(copy=False)`. To opt-in to
the future behavior, set `pd.set_option('future.no_silent_downcasting', True)`
df = df.replace({"Voice mail plan": d})
```

```
[ ]: State Account length Area code International plan Voice mail plan \
0 KS 128 415 False True
1 OH 107 415 False True
2 NJ 137 415 False False
3 OH 84 408 True False
4 OK 75 415 True False
```

	Number vmail messages	Total day minutes	Total day calls \
0	25	265.1	110

1	26	161.6	123
2	0	243.4	114
3	0	299.4	71
4	0	166.7	113

	Total day charge	Total eve minutes	Total eve calls	Total eve charge \
0	45.07	197.4	99	16.78
1	27.47	195.5	103	16.62
2	41.38	121.2	110	10.30
3	50.90	61.9	88	5.26
4	28.34	148.3	122	12.61

	Total night minutes	Total night calls	Total night charge \
0	244.7	91	11.01
1	254.4	103	11.45
2	162.6	104	7.32
3	196.9	89	8.86
4	186.9	121	8.41

	Total intl minutes	Total intl calls	Total intl charge \
0	10.0	3	2.70
1	13.7	3	3.70
2	12.2	5	3.29
3	6.6	7	1.78
4	10.1	3	2.73

	Customer service calls	Churn
0	1	0
1	1	0
2	0	0
3	2	0
4	3	0

```
[ ]: #####
help(df.replace)
#####
```

Help on method replace in module pandas.core.generic:

```
replace(to_replace=None, value=<no_default>, *, inplace: 'bool_t' = False,
limit: 'int | None' = None, regex: 'bool_t' = False, method: "Literal['pad',
'ffill', 'bfill'] | lib.NoDefault" = <no_default>) -> 'Self | None' method of
pandas.core.frame.DataFrame instance
```

Replace values given in `to_replace` with `value`.

Values of the Series/DataFrame are replaced with other values dynamically.
This differs from updating with ``.loc`` or ``.iloc``, which require

you to specify a location to update with some value.

Parameters

`to_replace` : str, regex, list, dict, Series, int, float, or None

How to find the values that will be replaced.

* numeric, str or regex:

- numeric: numeric values equal to `to_replace` will be replaced with `value`
- str: string exactly matching `to_replace` will be replaced with `value`
- regex: regexs matching `to_replace` will be replaced with `value`

* list of str, regex, or numeric:

- First, if `to_replace` and `value` are both lists, they **must** be the same length.
- Second, if `regex=True` then all of the strings in **both** lists will be interpreted as regexs otherwise they will match directly. This doesn't matter much for `value` since there are only a few possible substitution regexes you can use.
- str, regex and numeric rules apply as above.

* dict:

- Dicts can be used to specify different replacement values for different existing values. For example, `{'a': 'b', 'y': 'z'}` replaces the value 'a' with 'b' and 'y' with 'z'. To use a dict in this way, the optional `value` parameter should not be given.
- For a DataFrame a dict can specify that different values should be replaced in different columns. For example, `{'a': 1, 'b': 'z'}` looks for the value 1 in column 'a' and the value 'z' in column 'b' and replaces these values with whatever is specified in `value`. The `value` parameter should not be `None` in this case. You can treat this as a special case of passing two lists except that you are specifying the column to search in.
- For a DataFrame nested dictionaries, e.g., `{'a': {'b': np.nan}}`, are read as follows: look in column 'a' for the value 'b' and replace it with NaN. The optional

`value`

parameter should not be specified to use a nested dict in this way. You can nest regular expressions as well. Note that column names (the top-level dictionary keys in a nested

dictionary) ****cannot**** be regular expressions.

* None:

- This means that the `regex` argument must be a string, compiled regular expression, or list, dict, ndarray or Series of such elements. If `value` is also ``None`` then this ****must**** be a nested dictionary or Series.

See the examples section for examples of each of these.

value : scalar, dict, list, str, regex, default None

Value to replace any values matching `to_replace` with.

For a DataFrame a dict of values can be used to specify which value to use for each column (columns not in the dict will not be filled). Regular expressions, strings and lists or dicts of such objects are also allowed.

inplace : bool, default False

If True, performs operation inplace and returns None.

limit : int, default None

Maximum size gap to forward or backward fill.

.. deprecated:: 2.1.0

regex : bool or same types as `to_replace`, default False

Whether to interpret `to_replace` and/or `value` as regular expressions. Alternatively, this could be a regular expression or a list, dict, or array of regular expressions in which case `to_replace` must be ``None``.

method : {'pad', 'ffill', 'bfill'}

The method to use when for replacement, when `to_replace` is a scalar, list or tuple and `value` is ``None``.

.. deprecated:: 2.1.0

Returns

Series/DataFrame

Object after replacement.

Raises

AssertionError

* If `regex` is not a ``bool`` and `to_replace` is not ``None``.

TypeError

* If `to_replace` is not a scalar, array-like, ``dict``, or ``None``
* If `to_replace` is a ``dict`` and `value` is not a ``list``,

- `dict`, `ndarray`, or `Series`
- * If `to_replace` is `None` and `regex` is not compilable into a regular expression or is a list, dict, ndarray, or Series.
- * When replacing multiple `bool` or `datetime64` objects and the arguments to `to_replace` does not match the type of the value being replaced

ValueError

- * If a `list` or an `ndarray` is passed to `to_replace` and `value` but they are not the same length.

See Also

`Series.fillna` : Fill NA values.

`DataFrame.fillna` : Fill NA values.

`Series.where` : Replace values based on boolean condition.

`DataFrame.where` : Replace values based on boolean condition.

`DataFrame.map`: Apply a function to a Dataframe elementwise.

`Series.map`: Map values of Series according to an input mapping or function.

`Series.str.replace` : Simple string replacement.

Notes

- * Regex substitution is performed under the hood with `re.sub`. The rules for substitution for `re.sub` are the same.
- * Regular expressions will only substitute on strings, meaning you cannot provide, for example, a regular expression matching floating point numbers and expect the columns in your frame that have a numeric dtype to be matched. However, if those floating point numbers *are* strings, then you can do this.
- * This method has *a lot* of options. You are encouraged to experiment and play with this method to gain intuition about how it works.
- * When dict is used as the `to_replace` value, it is like `key(s)` in the dict are the `to_replace` part and `value(s)` in the dict are the `value` parameter.

Examples

****Scalar `to_replace` and `value`****

```
>>> s = pd.Series([1, 2, 3, 4, 5])
```

```
>>> s.replace(1, 5)
```

```
0    5
```

```
1    2
```

```
2    3
```

```
3    4
```

```

4      5
dtype: int64

>>> df = pd.DataFrame({'A': [0, 1, 2, 3, 4],
...                     'B': [5, 6, 7, 8, 9],
...                     'C': ['a', 'b', 'c', 'd', 'e']})
>>> df.replace(0, 5)
   A  B  C
0  5  5  a
1  1  6  b
2  2  7  c
3  3  8  d
4  4  9  e

**List-like `to_replace`**

>>> df.replace([0, 1, 2, 3], 4)
   A  B  C
0  4  5  a
1  4  6  b
2  4  7  c
3  4  8  d
4  4  9  e

>>> df.replace([0, 1, 2, 3], [4, 3, 2, 1])
   A  B  C
0  4  5  a
1  3  6  b
2  2  7  c
3  1  8  d
4  4  9  e

>>> s.replace([1, 2], method='bfill')
0      3
1      3
2      3
3      4
4      5
dtype: int64

**dict-like `to_replace`**

>>> df.replace({0: 10, 1: 100})
   A  B  C
0  10  5  a
1 100  6  b
2   2  7  c
3   3  8  d

```

```

4      4      9      e

>>> df.replace({'A': 0, 'B': 5}, 100)
      A      B      C
0  100  100    a
1     1     6    b
2     2     7    c
3     3     8    d
4     4     9    e

>>> df.replace({'A': {0: 100, 4: 400}})
      A      B      C
0  100     5    a
1     1     6    b
2     2     7    c
3     3     8    d
4  400     9    e

**Regular expression `to_replace`**

>>> df = pd.DataFrame({'A': ['bat', 'foo', 'bait'],
...                    'B': ['abc', 'bar', 'xyz']})
>>> df.replace(to_replace=r'^ba.$', value='new', regex=True)
      A      B
0  new  abc
1  foo  new
2  bait xyz

>>> df.replace({'A': r'^ba.$'}, {'A': 'new'}, regex=True)
      A      B
0  new  abc
1  foo  bar
2  bait xyz

>>> df.replace(regex=r'^ba.$', value='new')
      A      B
0  new  abc
1  foo  new
2  bait xyz

>>> df.replace(regex={r'^ba.$': 'new', 'foo': 'xyz'})
      A      B
0  new  abc
1  xyz  new
2  bait xyz

>>> df.replace(regex=[r'^ba.$', 'foo'], value='new')
      A      B

```

```

0   new  abc
1   new  new
2  bait  xyz

```

Compare the behavior of `s.replace({'a': None})` and `s.replace('a', None)` to understand the peculiarities of the `to_replace` parameter:

```
>>> s = pd.Series([10, 'a', 'a', 'b', 'a'])
```

When one uses a dict as the `to_replace` value, it is like the value(s) in the dict are equal to the `value` parameter. `s.replace({'a': None})` is equivalent to `s.replace(to_replace={'a': None}, value=None, method=None)`:

```
>>> s.replace({'a': None})
0      10
1     None
2     None
3        b
4     None
dtype: object

```

When `value` is not explicitly passed and `to_replace` is a scalar, list or tuple, `replace` uses the `method` parameter (default 'pad') to do the replacement. So this is why the 'a' values are being replaced by 10 in rows 1 and 2 and 'b' in row 4 in this case.

```
>>> s.replace('a')
0      10
1      10
2      10
3        b
4        b
dtype: object

```

.. deprecated:: 2.1.0

The 'method' parameter and padding behavior are deprecated.

On the other hand, if `None` is explicitly passed for `value`, it will be respected:

```
>>> s.replace('a', None)
0      10
1     None
2     None
3        b
4     None

```

dtype: object

.. versionchanged:: 1.4.0

Previously the explicit ``None`` was silently ignored.

When ``regex=True``, ``value`` is not ``None`` and ``to_replace`` is a string, the replacement will be applied in all columns of the DataFrame.

```
>>> df = pd.DataFrame({'A': [0, 1, 2, 3, 4],
...                     'B': ['a', 'b', 'c', 'd', 'e'],
...                     'C': ['f', 'g', 'h', 'i', 'j']})

>>> df.replace(to_replace='^[a-g]', value='e', regex=True)
   A  B  C
0  0  e  e
1  1  e  e
2  2  e  h
3  3  e  i
4  4  e  j
```

If ``value`` is not ``None`` and ``to_replace`` is a dictionary, the dictionary keys will be the DataFrame columns that the replacement will be applied.

```
>>> df.replace(to_replace={'B': '^[a-c]', 'C': '^[h-j]'}, value='e',
regex=True)
   A  B  C
0  0  e  f
1  1  e  g
2  2  e  e
3  3  d  e
4  4  e  e
```

```
[ ]: columns_to_show = ["Total day minutes", "Total eve minutes", "Total night_
↪minutes"]

df.groupby(["Churn"])[columns_to_show].describe(percentiles=[])
```

```
[ ]:      Total day minutes      Total eve minutes \
      count    mean    std  min    50%    max      count
Churn
0      2850.0  175.18  50.18  0.0  177.2  315.6      2850.0
1       483.0  206.91  69.00  0.0  217.6  350.8       483.0

      Total night minutes \
      mean    std  min    50%    max      count    mean    std
```

Churn									
0	199.04	50.29	0.0	199.6	361.8		2850.0	200.13	51.11
1	212.41	51.73	70.9	211.3	363.7		483.0	205.23	47.13

	min	50%	max
Churn			
0	23.2	200.25	395.0
1	47.4	204.80	354.9

```
[ ]: #####
help(df.groupby)
#####
```

Help on method groupby in module pandas.core.frame:

```
groupby(by=None, axis: 'Axis | lib.NoDefault' = <no_default>, level: 'IndexLabel
| None' = None, as_index: 'bool' = True, sort: 'bool' = True, group_keys: 'bool'
= True, observed: 'bool | lib.NoDefault' = <no_default>, dropna: 'bool' = True)
-> 'DataFrameGroupBy' method of pandas.core.frame.DataFrame instance
    Group DataFrame using a mapper or by a Series of columns.
```

A groupby operation involves some combination of splitting the object, applying a function, and combining the results. This can be used to group large amounts of data and compute operations on these groups.

Parameters

by : mapping, function, label, pd.Grouper or list of such

Used to determine the groups for the groupby.

If ``by`` is a function, it's called on each value of the object's index. If a dict or Series is passed, the Series or dict VALUES will be used to determine the groups (the Series' values are first aligned; see ``.align()`` method). If a list or ndarray of length equal to the selected axis is passed (see the `groupby user guide <[https://pandas.pydata.org/pandas-](https://pandas.pydata.org/pandas-docs/stable/user_guide/groupby.html#splitting-an-object-into-groups)

[docs/stable/user_guide/groupby.html#splitting-an-object-into-groups](https://pandas.pydata.org/pandas-docs/stable/user_guide/groupby.html#splitting-an-object-into-groups)>`_), the values are used as-is to determine the groups. A label or list of labels may be passed to group by the columns in ``self``. Notice that a tuple is interpreted as a (single) key.

axis : {0 or 'index', 1 or 'columns'}, default 0

Split along rows (0) or columns (1). For `Series` this parameter is unused and defaults to 0.

.. deprecated:: 2.1.0

Will be removed and behave like axis=0 in a future version.
For ``axis=1``, do ``frame.T.groupby(...)`` instead.

level : int, level name, or sequence of such, default None
If the axis is a MultiIndex (hierarchical), group by a particular level or levels. Do not specify both ``by`` and ``level``.

as_index : bool, default True
Return object with group labels as the index. Only relevant for DataFrame input. as_index=False is effectively "SQL-style" grouped output. This argument has no effect on filtrations (see the `filtrations in the user guide <https://pandas.pydata.org/docs/dev/user_guide/groupby.html#filtration>`), such as ``head()``, ``tail()``, ``nth()`` and in transformations (see the `transformations in the user guide <https://pandas.pydata.org/docs/dev/user_guide/groupby.html#transformation>`).

sort : bool, default True
Sort group keys. Get better performance by turning this off. Note this does not influence the order of observations within each group. Groupby preserves the order of rows within each group. If False, the groups will appear in the same order as they did in the original DataFrame.

This argument has no effect on filtrations (see the `filtrations in the user guide <https://pandas.pydata.org/docs/dev/user_guide/groupby.html#filtration>`), such as ``head()``, ``tail()``, ``nth()`` and in transformations (see the `transformations in the user guide <https://pandas.pydata.org/docs/dev/user_guide/groupby.html#transformation>`).

.. versionchanged:: 2.0.0

Specifying ``sort=False`` with an ordered categorical grouper will no longer sort the values.

group_keys : bool, default True
When calling apply and the ``by`` argument produces a like-indexed (i.e. :ref:`a transform <groupby.transform>`) result, add group keys to index to identify pieces. By default group keys are not included when the result's index (and column) labels match the inputs, and are included otherwise.

.. versionchanged:: 1.5.0

Warns that ``group_keys`` will no longer be ignored when the result from ``apply`` is a like-indexed Series or DataFrame. Specify ``group_keys`` explicitly to include the group keys or not.

```

.. versionchanged:: 2.0.0

   ``group_keys`` now defaults to ``True``.

observed : bool, default False
    This only applies if any of the groupers are Categoricals.
    If True: only show observed values for categorical groupers.
    If False: show all values for categorical groupers.

.. deprecated:: 2.1.0

    The default value will change to True in a future version of pandas.

dropna : bool, default True
    If True, and if group keys contain NA values, NA values together
    with row/column will be dropped.
    If False, NA values will also be treated as the key in groups.

Returns
-----
pandas.api.typing.DataFrameGroupBy
    Returns a groupby object that contains information about the groups.

See Also
-----
resample : Convenience method for frequency conversion and resampling
    of time series.

Notes
-----
See the `user guide
<https://pandas.pydata.org/pandas-docs/stable/groupby.html>`__ for more
detailed usage and examples, including splitting an object into groups,
iterating through groups, selecting a group, aggregation, and more.

Examples
-----
>>> df = pd.DataFrame({'Animal': ['Falcon', 'Falcon',
...                               'Parrot', 'Parrot'],
...                     'Max Speed': [380., 370., 24., 26.]})
>>> df
   Animal  Max Speed
0  Falcon    380.0
1  Falcon    370.0
2  Parrot     24.0
3  Parrot     26.0
>>> df.groupby(['Animal']).mean()
           Max Speed
Animal
Falcon    375.0
Parrot     25.0

```



```
Animal
Falcon      375.0
Parrot       25.0
```

****Hierarchical Indexes****

We can groupby different levels of a hierarchical index using the `level` parameter:

```
>>> arrays = [['Falcon', 'Falcon', 'Parrot', 'Parrot'],
...            ['Captive', 'Wild', 'Captive', 'Wild']]
>>> index = pd.MultiIndex.from_arrays(arrays, names=('Animal', 'Type'))
>>> df = pd.DataFrame({'Max Speed': [390., 350., 30., 20.]},
...                    index=index)
>>> df
```

Animal	Type	Max Speed
Falcon	Captive	390.0
	Wild	350.0
Parrot	Captive	30.0
	Wild	20.0

```
>>> df.groupby(level=0).mean()
      Max Speed
Animal
Falcon      370.0
Parrot       25.0
>>> df.groupby(level="Type").mean()
      Max Speed
Type
Captive      210.0
Wild         185.0
```

We can also choose to include NA in group keys or not by setting `dropna` parameter, the default setting is `True`.

```
>>> l = [[1, 2, 3], [1, None, 4], [2, 1, 3], [1, 2, 2]]
>>> df = pd.DataFrame(l, columns=["a", "b", "c"])

>>> df.groupby(by=["b"]).sum()
      a    c
b
1.0 2    3
2.0 2    5

>>> df.groupby(by=["b"], dropna=False).sum()
      a    c
b
1.0 2    3
```

```
2.0 2    5
NaN 1    4
```

```
>>> l = [["a", 12, 12], [None, 12.3, 33.], ["b", 12.3, 123], ["a", 1, 1]]
>>> df = pd.DataFrame(l, columns=["a", "b", "c"])
```

```
>>> df.groupby(by="a").sum()
      b      c
a
a  13.0  13.0
b  12.3 123.0
```

```
>>> df.groupby(by="a", dropna=False).sum()
      b      c
a
a  13.0  13.0
b  12.3 123.0
NaN 12.3  33.0
```

When using ``.apply()`, use ``group_keys`` to include or exclude the group keys. The ``group_keys`` argument defaults to ``True`` (include).

```
>>> df = pd.DataFrame({'Animal': ['Falcon', 'Falcon',
...                               'Parrot', 'Parrot'],
...                    'Max Speed': [380., 370., 24., 26.]})
>>> df.groupby("Animal", group_keys=True)[['Max Speed']].apply(lambda x: x)
      Max Speed
Animal
Falcon 0      380.0
       1      370.0
Parrot 2       24.0
       3       26.0
```

```
>>> df.groupby("Animal", group_keys=False)[['Max Speed']].apply(lambda x: x)
      Max Speed
0      380.0
1      370.0
2       24.0
3       26.0
```

```
[ ]: #####
df.groupby(["Churn"])
#####
```

```
[ ]: State Account length Area code International plan Voice mail plan \
0    KS              128        415                False                True
```

1	OH	107	415	False	True
2	NJ	137	415	False	False
3	OH	84	408	True	False
4	OK	75	415	True	False
10	IN	65	415	False	False
15	NY	161	415	False	False
21	CO	77	408	False	False
33	AZ	12	408	False	False
41	MD	135	408	True	True

	Number vmail messages	Total day minutes	Total day calls \
0	25	265.1	110
1	26	161.6	123
2	0	243.4	114
3	0	299.4	71
4	0	166.7	113
10	0	129.1	137
15	0	332.9	67
21	0	62.4	89
33	0	249.6	118
41	41	173.1	85

	Total day charge	Total eve minutes	Total eve calls	Total eve charge \
0	45.07	197.4	99	16.78
1	27.47	195.5	103	16.62
2	41.38	121.2	110	10.30
3	50.90	61.9	88	5.26
4	28.34	148.3	122	12.61
10	21.95	228.5	83	19.42
15	56.59	317.8	97	27.01
21	10.61	169.9	121	14.44
33	42.43	252.4	119	21.45
41	29.43	203.9	107	17.33

	Total night minutes	Total night calls	Total night charge \
0	244.7	91	11.01
1	254.4	103	11.45
2	162.6	104	7.32
3	196.9	89	8.86
4	186.9	121	8.41
10	208.8	111	9.40
15	160.6	128	7.23
21	209.6	64	9.43
33	280.2	90	12.61
41	122.2	78	5.50

Total intl minutes	Total intl calls	Total intl charge \
--------------------	------------------	---------------------

0	10.0	3	2.70
1	13.7	3	3.70
2	12.2	5	3.29
3	6.6	7	1.78
4	10.1	3	2.73
10	12.7	6	3.43
15	5.4	9	1.46
21	5.7	6	1.54
33	11.8	3	3.19
41	14.6	15	3.94

	Customer service calls	Churn
0	1	0
1	1	0
2	0	0
3	2	0
4	3	0
10	4	1
15	4	1
21	5	1
33	1	1
41	0	1

```
[ ]: #####
help(df.describe)
#####
```

Help on method describe in module pandas.core.generic:

describe(percentiles=None, include=None, exclude=None) -> 'Self' method of pandas.core.frame.DataFrame instance

Generate descriptive statistics.

Descriptive statistics include those that summarize the central tendency, dispersion and shape of a dataset's distribution, excluding ``NaN`` values.

Analyzes both numeric and object series, as well as ``DataFrame`` column sets of mixed data types. The output will vary depending on what is provided. Refer to the notes below for more detail.

Parameters

percentiles : list-like of numbers, optional

The percentiles to include in the output. All should fall between 0 and 1. The default is

```[.25, .5, .75]```, which returns the 25th, 50th, and 75th percentiles.

`include` : 'all', list-like of dtypes or None (default), optional  
 A white list of data types to include in the result. Ignored for ```Series```. Here are the options:

- 'all' : All columns of the input will be included in the output.
- A list-like of dtypes : Limits the results to the provided data types.  
 To limit the result to numeric types submit ```numpy.number```. To limit it instead to object columns submit the ```numpy.object``` data type. Strings can also be used in the style of ```select_dtypes``` (e.g. ```df.describe(include=['O'])```). To select pandas categorical columns, use ```'category'```
- None (default) : The result will include all numeric columns.

`exclude` : list-like of dtypes or None (default), optional,  
 A black list of data types to omit from the result. Ignored for ```Series```. Here are the options:

- A list-like of dtypes : Excludes the provided data types from the result. To exclude numeric types submit ```numpy.number```. To exclude object columns submit the data type ```numpy.object```. Strings can also be used in the style of ```select_dtypes``` (e.g. ```df.describe(exclude=['O'])```). To exclude pandas categorical columns, use ```'category'```
- None (default) : The result will exclude nothing.

#### Returns

-----

Series or DataFrame

Summary statistics of the Series or Dataframe provided.

#### See Also

-----

`DataFrame.count`: Count number of non-NA/null observations.

`DataFrame.max`: Maximum of the values in the object.

`DataFrame.min`: Minimum of the values in the object.

`DataFrame.mean`: Mean of the values.

`DataFrame.std`: Standard deviation of the observations.

`DataFrame.select_dtypes`: Subset of a DataFrame including/excluding columns based on their dtype.

#### Notes

-----

For numeric data, the result's index will include ```count```, ```mean```, ```std```, ```min```, ```max``` as well as lower, ```50``` and upper percentiles. By default the lower percentile is ```25``` and the

upper percentile is ``75``. The ``50`` percentile is the same as the median.

For object data (e.g. strings or timestamps), the result's index will include ``count``, ``unique``, ``top``, and ``freq``. The ``top`` is the most common value. The ``freq`` is the most common value's frequency. Timestamps also include the ``first`` and ``last`` items.

If multiple object values have the highest count, then the ``count`` and ``top`` results will be arbitrarily chosen from among those with the highest count.

For mixed data types provided via a ``DataFrame``, the default is to return only an analysis of numeric columns. If the dataframe consists only of object and categorical data without any numeric columns, the default is to return an analysis of both the object and categorical columns. If ``include='all'`` is provided as an option, the result will include a union of attributes of each type.

The ``include`` and ``exclude`` parameters can be used to limit which columns in a ``DataFrame`` are analyzed for the output. The parameters are ignored when analyzing a ``Series``.

#### Examples

-----

Describing a numeric ``Series``.

```
>>> s = pd.Series([1, 2, 3])
>>> s.describe()
count 3.0
mean 2.0
std 1.0
min 1.0
25% 1.5
50% 2.0
75% 2.5
max 3.0
dtype: float64
```

Describing a categorical ``Series``.

```
>>> s = pd.Series(['a', 'a', 'b', 'c'])
>>> s.describe()
count 4
unique 3
top a
freq 2
dtype: object
```

Describing a timestamp ``Series``.

```
>>> s = pd.Series([
... np.datetime64("2000-01-01"),
... np.datetime64("2010-01-01"),
... np.datetime64("2010-01-01")
...])
>>> s.describe()
count 3
mean 2006-09-01 08:00:00
min 2000-01-01 00:00:00
25% 2004-12-31 12:00:00
50% 2010-01-01 00:00:00
75% 2010-01-01 00:00:00
max 2010-01-01 00:00:00
dtype: object
```

Describing a ``DataFrame``. By default only numeric fields are returned.

```
>>> df = pd.DataFrame({'categorical': pd.Categorical(['d', 'e', 'f']),
... 'numeric': [1, 2, 3],
... 'object': ['a', 'b', 'c']
... })
>>> df.describe()
 numeric
count 3.0
mean 2.0
std 1.0
min 1.0
25% 1.5
50% 2.0
75% 2.5
max 3.0
```

Describing all columns of a ``DataFrame`` regardless of data type.

```
>>> df.describe(include='all') # doctest: +SKIP
 categorical numeric object
count 3 3.0 3
unique 3 NaN 3
top f NaN a
freq 1 NaN 1
mean NaN 2.0 NaN
std NaN 1.0 NaN
min NaN 1.0 NaN
25% NaN 1.5 NaN
```

50%	NaN	2.0	NaN
75%	NaN	2.5	NaN
max	NaN	3.0	NaN

Describing a column from a ``DataFrame`` by accessing it as an attribute.

```
>>> df.numeric.describe()
count 3.0
mean 2.0
std 1.0
min 1.0
25% 1.5
50% 2.0
75% 2.5
max 3.0
Name: numeric, dtype: float64
```

Including only numeric columns in a ``DataFrame`` description.

```
>>> df.describe(include=[np.number])
 numeric
count 3.0
mean 2.0
std 1.0
min 1.0
25% 1.5
50% 2.0
75% 2.5
max 3.0
```

Including only string columns in a ``DataFrame`` description.

```
>>> df.describe(include=[object]) # doctest: +SKIP
 object
count 3
unique 3
top a
freq 1
```

Including only categorical columns from a ``DataFrame`` description.

```
>>> df.describe(include=['category'])
 categorical
count 3
unique 3
top d
freq 1
```



Excluding numeric columns from a ``DataFrame`` description.

```
>>> df.describe(exclude=[np.number]) # doctest: +SKIP
 categorical object
count 3 3
unique 3 3
top f a
freq 1 1
```

Excluding object columns from a ``DataFrame`` description.

```
>>> df.describe(exclude=[object]) # doctest: +SKIP
 categorical numeric
count 3 3.0
unique 3 NaN
top f NaN
freq 1 NaN
mean NaN 2.0
std NaN 1.0
min NaN 1.0
25% NaN 1.5
50% NaN 2.0
75% NaN 2.5
max NaN 3.0
```

```
[]: columns_to_show = ["Total day minutes", "Total eve minutes", "Total night_
↪minutes"]
df.groupby(["Churn"])[columns_to_show].agg([np.mean, np.std, np.min, np.max])
```

/tmp/ipython-input-1186384480.py:2: FutureWarning: The provided callable <function mean at 0x7fa0b7588220> is currently using SeriesGroupBy.mean. In a future version of pandas, the provided callable will be used directly. To keep current behavior pass the string "mean" instead.

```
df.groupby(["Churn"])[columns_to_show].agg([np.mean, np.std, np.min, np.max])
/tmp/ipython-input-1186384480.py:2: FutureWarning: The provided callable
<function std at 0x7fa0b7588360> is currently using SeriesGroupBy.std. In a
future version of pandas, the provided callable will be used directly. To keep
current behavior pass the string "std" instead.
```

```
df.groupby(["Churn"])[columns_to_show].agg([np.mean, np.std, np.min, np.max])
/tmp/ipython-input-1186384480.py:2: FutureWarning: The provided callable
<function min at 0x7fa0b7583920> is currently using SeriesGroupBy.min. In a
future version of pandas, the provided callable will be used directly. To keep
current behavior pass the string "min" instead.
```

```
df.groupby(["Churn"])[columns_to_show].agg([np.mean, np.std, np.min, np.max])
/tmp/ipython-input-1186384480.py:2: FutureWarning: The provided callable
<function max at 0x7fa0b75837e0> is currently using SeriesGroupBy.max. In a
```

future version of pandas, the provided callable will be used directly. To keep current behavior pass the string "max" instead.

```
df.groupby(["Churn"])[columns_to_show].agg([np.mean, np.std, np.min, np.max])
```

```
[]: Total day minutes Total eve minutes \
 mean std min max mean std min
Churn
0 175.18 50.18 0.0 315.6 199.04 50.29 0.0
1 206.91 69.00 0.0 350.8 212.41 51.73 70.9
```

```
 Total night minutes
 max mean std min max
Churn
0 361.8 200.13 51.11 23.2 395.0
1 363.7 205.23 47.13 47.4 354.9
```

```
[]: #####
help(df.agg)
#####
```

Help on method aggregate in module pandas.core.frame:

aggregate(func=None, axis: 'Axis' = 0, \*args, \*\*kwargs) method of pandas.core.frame.DataFrame instance  
Aggregate using one or more operations over the specified axis.

#### Parameters

-----

func : function, str, list or dict

Function to use for aggregating the data. If a function, must either work when passed a DataFrame or when passed to DataFrame.apply.

Accepted combinations are:

- function
- string function name
- list of functions and/or function names, e.g. ``[np.sum, 'mean']``
- dict of axis labels -> functions, function names or list of such.

axis : {0 or 'index', 1 or 'columns'}, default 0

If 0 or 'index': apply function to each column.

If 1 or 'columns': apply function to each row.

\*args

Positional arguments to pass to `func`.

\*\*kwargs

Keyword arguments to pass to `func`.

#### Returns

-----

scalar, Series or DataFrame

The return can be:

- \* scalar : when Series.agg is called with single function
- \* Series : when DataFrame.agg is called with a single function
- \* DataFrame : when DataFrame.agg is called with several functions

See Also

-----

DataFrame.apply : Perform any type of operations.  
DataFrame.transform : Perform transformation type operations.  
pandas.DataFrame.groupby : Perform operations over groups.  
pandas.DataFrame.resample : Perform operations over resampled bins.  
pandas.DataFrame.rolling : Perform operations over rolling window.  
pandas.DataFrame.expanding : Perform operations over expanding window.  
pandas.core.window.ewm.ExponentialMovingWindow : Perform operation over  
exponential  
weighted window.

Notes

-----

The aggregation operations are always performed over an axis, either the index (default) or the column axis. This behavior is different from ``numpy`` aggregation functions (``mean``, ``median``, ``prod``, ``sum``, ``std``, ``var``), where the default is to compute the aggregation of the flattened array, e.g., ``numpy.mean(arr_2d)`` as opposed to ``numpy.mean(arr_2d, axis=0)``.

``agg`` is an alias for ``aggregate``. Use the alias.

Functions that mutate the passed object can produce unexpected behavior or errors and are not supported. See :ref:`gotchas.udf-mutation` for more details.

A passed user-defined-function will be passed a Series for evaluation.

Examples

-----

```
>>> df = pd.DataFrame([[1, 2, 3],
... [4, 5, 6],
... [7, 8, 9],
... [np.nan, np.nan, np.nan]],
... columns=['A', 'B', 'C'])
```

Aggregate these functions over the rows.

```
>>> df.agg(['sum', 'min'])
```

	A	B	C
sum	12.0	15.0	18.0
min	1.0	2.0	3.0

Different aggregations per column.

```
>>> df.agg({'A' : ['sum', 'min'], 'B' : ['min', 'max']})
```

	A	B
sum	12.0	NaN
min	1.0	2.0
max	NaN	8.0

Aggregate different functions over the columns and rename the index of the resulting DataFrame.

```
>>> df.agg(x=('A', 'max'), y=('B', 'min'), z=('C', 'mean'))
```

	A	B	C
x	7.0	NaN	NaN
y	NaN	2.0	NaN
z	NaN	NaN	6.0

Aggregate over the columns.

```
>>> df.agg("mean", axis="columns")
```

0	2.0
1	5.0
2	8.0
3	NaN

dtype: float64

```
[]: # Summary tables
```

```
[]: pd.crosstab(df["Churn"], df["International plan"])
```

```
[]: International plan False True
Churn
0 2664 186
1 346 137
```

```
[]: #####
len(df[df["Churn"]==1]), len(df[df["International plan"]==1])
#####
```

```
[]: (483, 323)
```

```
[]: #####
help(pd.crosstab)
#####
```

Help on function crosstab in module pandas.core.reshape.pivot:

```
crosstab(index, columns, values=None, rownames=None, colnames=None,
aggfunc=None, margins: 'bool' = False, margins_name: 'Hashable' = 'All', dropna:
'bool' = True, normalize: "bool | Literal[0, 1, 'all', 'index', 'columns']" =
False) -> 'DataFrame'
```

Compute a simple cross tabulation of two (or more) factors.

By default, computes a frequency table of the factors unless an array of values and an aggregation function are passed.

#### Parameters

-----

index : array-like, Series, or list of arrays/Series

Values to group by in the rows.

columns : array-like, Series, or list of arrays/Series

Values to group by in the columns.

values : array-like, optional

Array of values to aggregate according to the factors.

Requires `aggfunc` be specified.

rownames : sequence, default None

If passed, must match number of row arrays passed.

colnames : sequence, default None

If passed, must match number of column arrays passed.

aggfunc : function, optional

If specified, requires `values` be specified as well.

margins : bool, default False

Add row/column margins (subtotals).

margins\_name : str, default 'All'

Name of the row/column that will contain the totals when margins is True.

dropna : bool, default True

Do not include columns whose entries are all NaN.

normalize : bool, {'all', 'index', 'columns'}, or {0,1}, default False

Normalize by dividing all values by the sum of values.

- If passed 'all' or `True`, will normalize over all values.
- If passed 'index' will normalize over each row.
- If passed 'columns' will normalize over each column.
- If margins is `True`, will also normalize margin values.

#### Returns

-----

DataFrame

Cross tabulation of the data.

See Also

-----

DataFrame.pivot : Reshape data based on column values.

pivot\_table : Create a pivot table as a DataFrame.

Notes

-----

Any Series passed will have their name attributes used unless row or column names for the cross-tabulation are specified.

Any input passed containing Categorical data will have **all** of its categories included in the cross-tabulation, even if the actual data does not contain any instances of a particular category.

In the event that there aren't overlapping indexes an empty DataFrame will be returned.

Reference :ref:`the user guide <reshaping.crosstabulations>` for more examples.

Examples

-----

```
>>> a = np.array(["foo", "foo", "foo", "foo", "bar", "bar",
... "bar", "bar", "foo", "foo", "foo"], dtype=object)
>>> b = np.array(["one", "one", "one", "two", "one", "one",
... "one", "two", "two", "two", "one"], dtype=object)
>>> c = np.array(["dull", "dull", "shiny", "dull", "dull", "shiny",
... "shiny", "dull", "shiny", "shiny", "shiny"],
... dtype=object)
>>> pd.crosstab(a, [b, c], rownames=['a'], colnames=['b', 'c'])
b one two
c dull shiny dull shiny
a
bar 1 2 1 0
foo 2 2 1 2
```

Here 'c' and 'f' are not represented in the data and will not be shown in the output because dropna is True by default. Set dropna=False to preserve categories with no data.

```
>>> foo = pd.Categorical(['a', 'b'], categories=['a', 'b', 'c'])
>>> bar = pd.Categorical(['d', 'e'], categories=['d', 'e', 'f'])
>>> pd.crosstab(foo, bar)
col_0 d e
row_0
```

```

a 1 0
b 0 1
>>> pd.crosstab(foo, bar, dropna=False)
col_0 d e f
row_0
a 1 0 0
b 0 1 0
c 0 0 0

```

```
[]: pd.crosstab(df["Churn"], df["Voice mail plan"], normalize=True)
```

```
[]: Voice mail plan False True
Churn
0 0.60 0.25
1 0.12 0.02
```

```
[]: df.pivot_table(
 ["Total day calls", "Total eve calls", "Total night calls"],
 ["Area code"],
 aggfunc="mean",
)
```

```
[]:
 Total day calls Total eve calls Total night calls
Area code
408 100.50 99.79 99.04
415 100.58 100.50 100.40
510 100.10 99.67 100.60
```

```
[]: #####
help(df.pivot_table)
#####
```

Help on method pivot\_table in module pandas.core.frame:

```

pivot_table(values=None, index=None, columns=None, aggfunc: 'AggFuncType' =
'mean', fill_value=None, margins: 'bool' = False, dropna: 'bool' = True,
margins_name: 'Level' = 'All', observed: 'bool | lib.NoDefault' = <no_default>,
sort: 'bool' = True) -> 'DataFrame' method of pandas.core.frame.DataFrame
instance

```

Create a spreadsheet-style pivot table as a DataFrame.

The levels in the pivot table will be stored in MultiIndex objects (hierarchical indexes) on the index and columns of the result DataFrame.

Parameters

-----

values : list-like or scalar, optional

Column or columns to aggregate.

`index` : column, Grouper, array, or list of the previous  
 Keys to group by on the pivot table index. If a list is passed, it can contain any of the other types (except list). If an array is passed, it must be the same length as the data and will be used in the same manner as column values.

`columns` : column, Grouper, array, or list of the previous  
 Keys to group by on the pivot table column. If a list is passed, it can contain any of the other types (except list). If an array is passed, it must be the same length as the data and will be used in the same manner as column values.

`aggfunc` : function, list of functions, dict, default "mean"  
 If a list of functions is passed, the resulting pivot table will have hierarchical columns whose top level are the function names (inferred from the function objects themselves).  
 If a dict is passed, the key is column to aggregate and the value is function or list of functions. If ``margin=True``, `aggfunc` will be used to calculate the partial aggregates.

`fill_value` : scalar, default None  
 Value to replace missing values with (in the resulting pivot table, after aggregation).

`margins` : bool, default False  
 If ``margins=True``, special ``All`` columns and rows will be added with partial group aggregates across the categories on the rows and columns.

`dropna` : bool, default True  
 Do not include columns whose entries are all NaN. If True, rows with a NaN value in any column will be omitted before computing margins.

`margins_name` : str, default 'All'  
 Name of the row / column that will contain the totals when margins is True.

`observed` : bool, default False  
 This only applies if any of the groupers are Categoricals.  
 If True: only show observed values for categorical groupers.  
 If False: show all values for categorical groupers.

.. deprecated:: 2.2.0

The default value of ``False`` is deprecated and will change to ``True`` in a future version of pandas.

`sort` : bool, default True  
 Specifies if the result should be sorted.

.. versionadded:: 1.3.0

Returns



-----

DataFrame

An Excel style pivot table.

See Also

-----

DataFrame.pivot : Pivot without aggregation that can handle non-numeric data.

DataFrame.melt: Unpivot a DataFrame from wide to long format, optionally leaving identifiers set.

wide\_to\_long : Wide panel to long format. Less flexible but more user-friendly than melt.

Notes

-----

Reference :ref:`the user guide <reshaping.pivot>` for more examples.

Examples

-----

```
>>> df = pd.DataFrame({"A": ["foo", "foo", "foo", "foo", "foo",
... "bar", "bar", "bar", "bar"],
... "B": ["one", "one", "one", "two", "two",
... "one", "one", "two", "two"],
... "C": ["small", "large", "large", "small",
... "small", "large", "small", "small",
... "large"],
... "D": [1, 2, 2, 3, 3, 4, 5, 6, 7],
... "E": [2, 4, 5, 5, 6, 6, 8, 9, 9]})
```

```
>>> df
 A B C D E
0 foo one small 1 2
1 foo one large 2 4
2 foo one large 2 5
3 foo two small 3 5
4 foo two small 3 6
5 bar one large 4 6
6 bar one small 5 8
7 bar two small 6 9
8 bar two large 7 9
```

This first example aggregates values by taking the sum.

```
>>> table = pd.pivot_table(df, values='D', index=['A', 'B'],
... columns=['C'], aggfunc="sum")
>>> table
C large small
A B
bar one 4.0 5.0
```

	two	7.0	6.0
foo	one	4.0	1.0
	two	NaN	6.0

We can also fill missing values using the `fill_value` parameter.

```
>>> table = pd.pivot_table(df, values='D', index=['A', 'B'],
... columns=['C'], aggfunc="sum", fill_value=0)
>>> table
```

		large	small
A	B		
bar	one	4	5
	two	7	6
foo	one	4	1
	two	0	6

The next example aggregates by taking the mean across multiple columns.

```
>>> table = pd.pivot_table(df, values=['D', 'E'], index=['A', 'C'],
... aggfunc={'D': "mean", 'E': "mean"})
>>> table
```

		D	E
A	C		
bar	large	5.500000	7.500000
	small	5.500000	8.500000
foo	large	2.000000	4.500000
	small	2.333333	4.333333

We can also calculate multiple types of aggregations for any given value column.

```
>>> table = pd.pivot_table(df, values=['D', 'E'], index=['A', 'C'],
... aggfunc={'D': "mean",
... 'E': ["min", "max", "mean"]})
>>> table
```

		D		E	
		mean	max	mean	min
A	C				
bar	large	5.500000	9	7.500000	6
	small	5.500000	9	8.500000	8
foo	large	2.000000	5	4.500000	4
	small	2.333333	6	4.333333	2

```
[]: # DataFrame transformations
```

```
[]: total_calls = (df["Total day calls"]
 + df["Total eve calls"]
 + df["Total night calls"]
 + df["Total intl calls"]
)
df.insert(loc=len(df.columns), column="Total calls", value=total_calls)
```

```
[]: df.head()
```

```
[]: State Account length Area code International plan Voice mail plan \
0 KS 128 415 False True
1 OH 107 415 False True
2 NJ 137 415 False False
3 OH 84 408 True False
4 OK 75 415 True False
```

```
Number vmail messages Total day minutes Total day calls \
0 25 265.1 110
1 26 161.6 123
2 0 243.4 114
3 0 299.4 71
4 0 166.7 113
```

```
Total day charge Total eve minutes ... Total eve charge \
0 45.07 197.4 ... 16.78
1 27.47 195.5 ... 16.62
2 41.38 121.2 ... 10.30
3 50.90 61.9 ... 5.26
4 28.34 148.3 ... 12.61
```

```
Total night minutes Total night calls Total night charge \
0 244.7 91 11.01
1 254.4 103 11.45
2 162.6 104 7.32
3 196.9 89 8.86
4 186.9 121 8.41
```

```
Total intl minutes Total intl calls Total intl charge \
0 10.0 3 2.70
1 13.7 3 3.70
2 12.2 5 3.29
3 6.6 7 1.78
4 10.1 3 2.73
```

```
Customer service calls Churn Total calls
0 1 0 303
1 1 0 332
```

2	0	0	333
3	2	0	255
4	3	0	359

[5 rows x 21 columns]

```
[]: #####
help(df.insert)
#####
```

Help on method insert in module pandas.core.frame:

insert(loc: 'int', column: 'Hashable', value: 'Scalar | AnyArrayLike',  
allow\_duplicates: 'bool | lib.NoDefault' = <no\_default>) -> 'None' method of  
pandas.core.frame.DataFrame instance

Insert column into DataFrame at specified location.

Raises a ValueError if `column` is already contained in the DataFrame,  
unless `allow\_duplicates` is set to True.

Parameters

-----

loc : int

Insertion index. Must verify  $0 \leq \text{loc} \leq \text{len}(\text{columns})$ .

column : str, number, or hashable object

Label of the inserted column.

value : Scalar, Series, or array-like

Content of the inserted column.

allow\_duplicates : bool, optional, default lib.no\_default

Allow duplicate column labels to be created.

See Also

-----

Index.insert : Insert new item by index.

Examples

-----

```
>>> df = pd.DataFrame({'col1': [1, 2], 'col2': [3, 4]})
```

```
>>> df
```

	col1	col2
0	1	3
1	2	4

```
>>> df.insert(1, "newcol", [99, 99])
```

```
>>> df
```

	col1	newcol	col2
0	1	99	3
1	2	99	4

```
>>> df.insert(0, "col1", [100, 100], allow_duplicates=True)
>>> df
 col1 col1 newcol col2
0 100 1 99 3
1 100 2 99 4
```

Notice that pandas uses index alignment in case of `value` from type `Series`:

```
>>> df.insert(0, "col0", pd.Series([5, 6], index=[1, 2]))
>>> df
 col0 col1 col1 newcol col2
0 NaN 100 1 99 3
1 5.0 100 2 99 4
```

```
[]: #####
df["Total day calls"] + df["Total eve calls"]
#####
```

```
[]: 0 209
 1 226
 2 224
 3 159
 4 235
 ...
3328 203
3329 112
3330 167
3331 189
3332 195
Length: 3333, dtype: int64
```

```
[]: df["Total charge"] = (
 df["Total day charge"]
 + df["Total eve charge"]
 + df["Total night charge"]
 + df["Total intl charge"]
)
df.head()
```

```
[]: State Account length Area code International plan Voice mail plan \
0 KS 128 415 No Yes
1 OH 107 415 No Yes
2 NJ 137 415 No No
3 OH 84 408 Yes No
4 OK 75 415 Yes No
```

	Number vmail messages	Total day minutes	Total day calls	\
0	25	265.1	110	
1	26	161.6	123	
2	0	243.4	114	
3	0	299.4	71	
4	0	166.7	113	

	Total day charge	Total eve minutes	...	Total eve charge	\
0	45.07	197.4	...	16.78	
1	27.47	195.5	...	16.62	
2	41.38	121.2	...	10.30	
3	50.90	61.9	...	5.26	
4	28.34	148.3	...	12.61	

	Total night minutes	Total night calls	Total night charge	\
0	244.7	91	11.01	
1	254.4	103	11.45	
2	162.6	104	7.32	
3	196.9	89	8.86	
4	186.9	121	8.41	

	Total intl minutes	Total intl calls	Total intl charge	\
0	10.0	3	2.70	
1	13.7	3	3.70	
2	12.2	5	3.29	
3	6.6	7	1.78	
4	10.1	3	2.73	

	Customer service calls	Churn	Total charge
0	1	False	75.56
1	1	False	59.24
2	0	False	62.29
3	2	False	66.80
4	3	False	52.09

[5 rows x 21 columns]

```
[]: #####
(
 df["Total day charge"]
+ df["Total eve charge"]
+ df["Total night charge"]
+ df["Total intl charge"]
)
#####
```

```
[]: 0 75.56
 1 59.24
 2 62.29
 3 66.80
 4 52.09
 ...
 3328 60.10
 3329 63.53
 3330 67.74
 3331 57.53
 3332 77.01
 Length: 3333, dtype: float64
```

```
[]: #####
 df.head(5)
 #####
```

```
[]: State Account length Area code International plan Voice mail plan \
0 KS 128 415 No Yes
1 OH 107 415 No Yes
2 NJ 137 415 No No
3 OH 84 408 Yes No
4 OK 75 415 Yes No
```

```
Number vmail messages Total day minutes Total day calls \
0 25 265.1 110
1 26 161.6 123
2 0 243.4 114
3 0 299.4 71
4 0 166.7 113
```

```
Total day charge Total eve minutes ... Total eve charge \
0 45.07 197.4 ... 16.78
1 27.47 195.5 ... 16.62
2 41.38 121.2 ... 10.30
3 50.90 61.9 ... 5.26
4 28.34 148.3 ... 12.61
```

```
Total night minutes Total night calls Total night charge \
0 244.7 91 11.01
1 254.4 103 11.45
2 162.6 104 7.32
3 196.9 89 8.86
4 186.9 121 8.41
```

```
Total intl minutes Total intl calls Total intl charge \
0 10.0 3 2.70
```

1	13.7	3	3.70
2	12.2	5	3.29
3	6.6	7	1.78
4	10.1	3	2.73

	Customer service calls	Churn	Total charge
0	1	False	75.56
1	1	False	59.24
2	0	False	62.29
3	2	False	66.80
4	3	False	52.09

[5 rows x 21 columns]

```
[]: # get rid of just created columns
df.drop(["Total charge", "Total calls"], axis=1, inplace=True)
and here's how you can delete rows
df.drop([1, 2]).head()
```

```
[]: State Account length Area code International plan Voice mail plan \
0 KS 128 415 No Yes
3 OH 84 408 Yes No
4 OK 75 415 Yes No
5 AL 118 510 Yes No
6 MA 121 510 No Yes
```

	Number vmail messages	Total day minutes	Total day calls
0	25	265.1	110
3	0	299.4	71
4	0	166.7	113
5	0	223.4	98
6	24	218.2	88

	Total day charge	Total eve minutes	Total eve calls	Total eve charge
0	45.07	197.4	99	16.78
3	50.90	61.9	88	5.26
4	28.34	148.3	122	12.61
5	37.98	220.6	101	18.75
6	37.09	348.5	108	29.62

	Total night minutes	Total night calls	Total night charge
0	244.7	91	11.01
3	196.9	89	8.86
4	186.9	121	8.41
5	203.9	118	9.18
6	212.6	118	9.57



	Total intl minutes	Total intl calls	Total intl charge \
0	10.0	3	2.70
3	6.6	7	1.78
4	10.1	3	2.73
5	6.3	6	1.70
6	7.5	7	2.03

	Customer service calls	Churn
0	1	False
3	2	False
4	3	False
5	0	False
6	3	False

```
[]: # First attempt at predicting telecom churn
```

```
[]: pd.crosstab(df["Churn"], df["International plan"], margins=True)
```

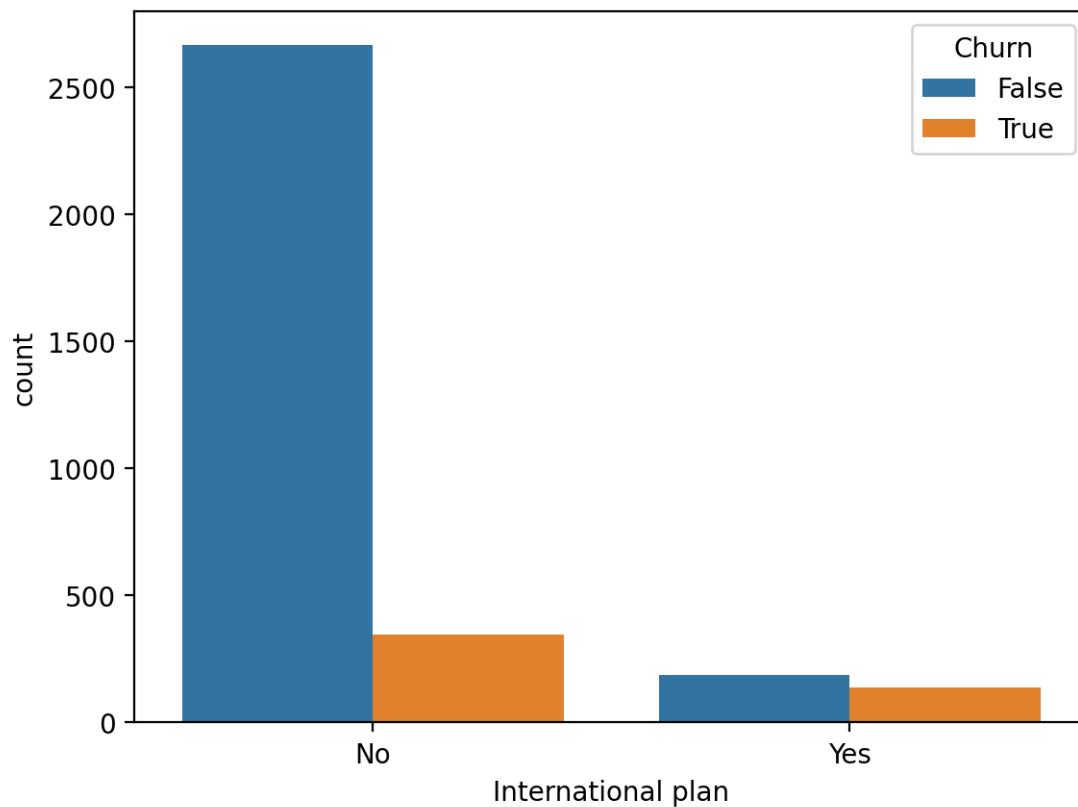
```
[]: International plan No Yes All
Churn
False 2664 186 2850
True 346 137 483
All 3010 323 3333
```

```
[]: # some import to set up plotting
import matplotlib.pyplot as plt
pip install seaborn
import seaborn as sns

Graphics in retina format are more sharp and legible
%config InlineBackend.figure_format = 'retina'
```

```
[]: sns.countplot(x="International plan", hue="Churn", data=df)
```

```
[]: <Axes: xlabel='International plan', ylabel='count'>
```



```
[]: #####
df["International plan"], df["Churn"]
#####
```

```
[]: (0 No
1 No
2 No
3 Yes
4 Yes
...
3328 No
3329 No
3330 No
3331 Yes
3332 No
Name: International plan, Length: 3333, dtype: object,
0 False
1 False
2 False
3 False
4 False
```

```

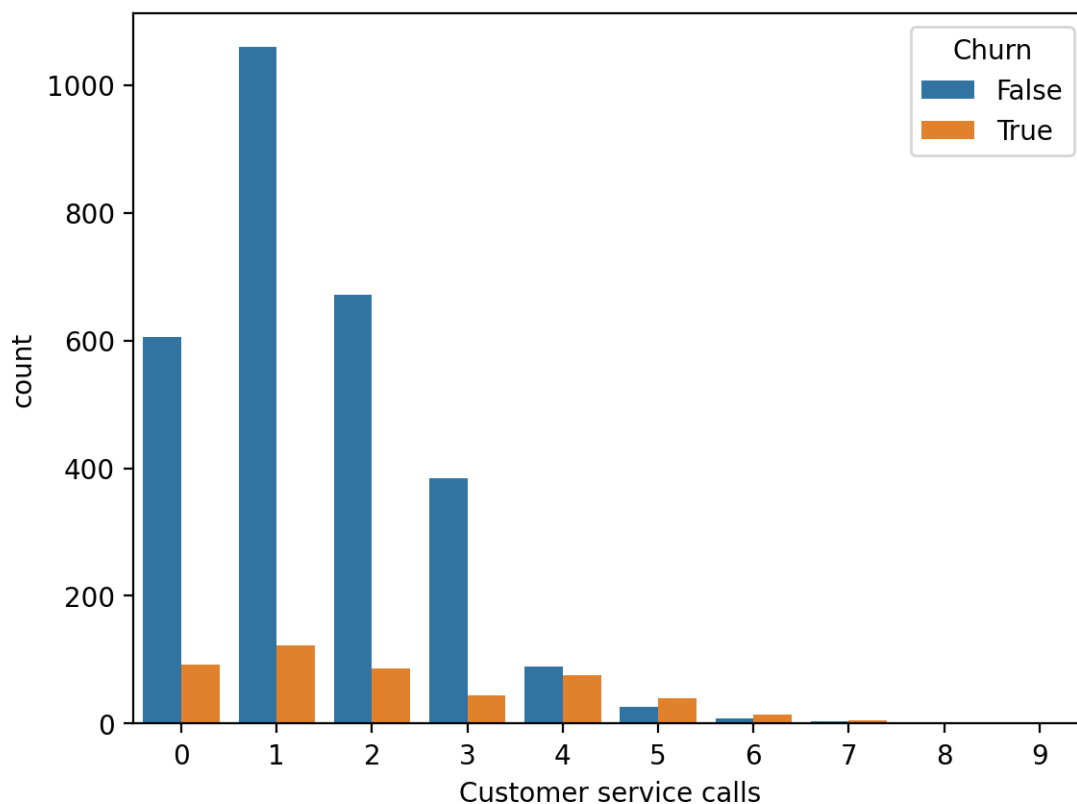
...
3328 False
3329 False
3330 False
3331 False
3332 False
Name: Churn, Length: 3333, dtype: bool)

```

```
[]: pd.crosstab(df["Churn"], df["Customer service calls"], margins=True)
```

```
[]: Customer service calls 0 1 2 3 4 5 6 7 8 9 All
Churn
False 605 1059 672 385 90 26 8 4 1 0 2850
True 92 122 87 44 76 40 14 5 1 2 483
All 697 1181 759 429 166 66 22 9 2 2 3333
```

```
[]: sns.countplot(x="Customer service calls", hue="Churn", data=df);
```



```
[]: df["Many_service_calls"] = (df["Customer service calls"] > 3).astype("int")
pd.crosstab(df["Many_service_calls"], df["Churn"], margins=True)
```

```
[]: Churn False True All
 Many_service_calls
 0 2721 345 3066
 1 129 138 267
 All 2850 483 3333
```

```
[]: #####
 print(df["Many_service_calls"].unique(), "Unique values in Many_service_calls_
 ↪column/series"), print(df["Churn"].unique(), "Unique values in Churn column/
 ↪series")
 #####
```

```
[0 1] Unique values in Many_service_calls column/series
[False True] Unique values in Churn column/series
```

```
[]: (None, None)
```

```
[]: #####
 df["Customer service calls"] > 3
 #####
```

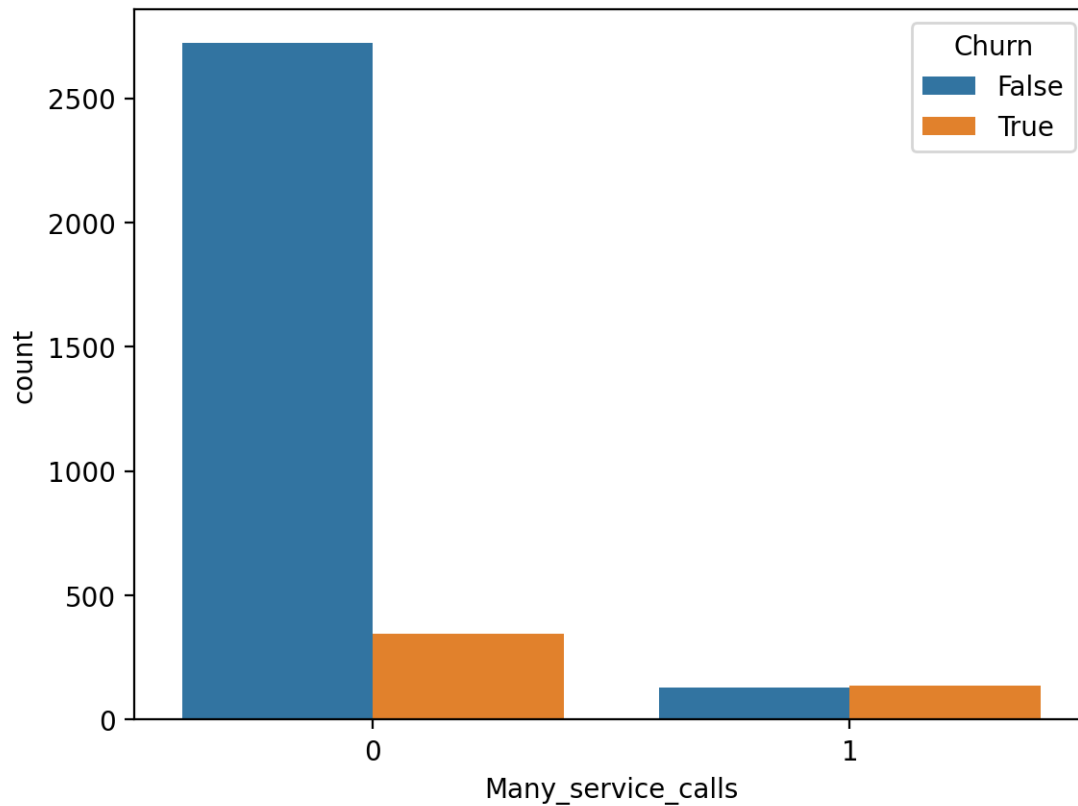
```
[]: 0 False
 1 False
 2 False
 3 False
 4 False
 ...
 3328 False
 3329 False
 3330 False
 3331 False
 3332 False
 Name: Customer service calls, Length: 3333, dtype: bool
```

```
[]: #####
 df["Many_service_calls"].info()
 #####
```

```
<class 'pandas.core.series.Series'>
RangeIndex: 3333 entries, 0 to 3332
Series name: Many_service_calls
Non-Null Count Dtype

3333 non-null int64
dtypes: int64(1)
memory usage: 26.2 KB
```

```
[]: sns.countplot(x="Many_service_calls", hue="Churn", data=df);
```



```
[]: #pd.crosstab(df["Many_service_calls"] & df["International plan"], df["Churn"])
```

```
[]: ##### !!!! Exploratory Data Analysis Amazon Sales Dataset EDA !!!! #####
#https://www.kaggle.com/code/mehakiftikhar/amazon-sales-dataset-eda
```

```
[]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import scipy as sp

%matplotlib inline
to display the plots inside jupyter-notebook
```

```
[]: # Data Loading and Exploration / Cleaning
```

```
[]: import kagglehub
```

```
[]: path = kagglehub.dataset_download("karkavelrajaj/amazon-sales-dataset")
print(path)
```

Using Colab cache for faster access to the 'amazon-sales-dataset' dataset.  
/kaggle/input/amazon-sales-dataset

```
[]: import os
```

```
[]: # load a csv file then creating a dataframe
df = pd.read_csv(os.path.join(path, "amazon.csv"))
df.head()
```

```
[]: product_id product_name \
0 B07JW9H4J1 Wayona Nylon Braided USB to Lightning Fast Cha...
1 B098NS6PVG Ambrane Unbreakable 60W / 3A Fast Charging 1.5...
2 B096MSW6CT Sounce Fast Phone Charging Cable & Data Sync U...
3 B08HDJ86NZ boAt Deuce USB 300 2 in 1 Type-C & Micro USB S...
4 B08CF3B7N1 Portronics Konnect L 1.2M Fast Charging 3A 8 P...

category discounted_price \
0 Computers&Accessories|Accessories&Peripherals|... 399
1 Computers&Accessories|Accessories&Peripherals|... 199
2 Computers&Accessories|Accessories&Peripherals|... 199
3 Computers&Accessories|Accessories&Peripherals|... 329
4 Computers&Accessories|Accessories&Peripherals|... 154

actual_price discount_percentage rating rating_count \
0 1,099 64% 4.2 24,269
1 349 43% 4.0 43,994
2 1,899 90% 3.9 7,928
3 699 53% 4.2 94,363
4 399 61% 4.2 16,905

about_product \
0 High Compatibility : Compatible With iPhone 12...
1 Compatible with all Type C enabled devices, be...
2 Fast Charger& Data Sync -With built-in safet...
3 The boAt Deuce USB 300 2 in 1 cable is compati...
4 [CHARGE & SYNC FUNCTION]- This cable comes wit...

user_id \
0 AG3D604STAQKAY2UVGEUV46KN35Q,AHMY5CWJMMK5BJRBB...
1 AECPPFYFQVRUWC3KGNLJIOREFP5LQ,AGYYVPDD7YG7FYNBX...
2 AGU3BBQ2V2DDAMOAKGFAWDDQ6QHA,AESFLDV2PT363T2AQ...
3 AEWAZDZZJLQUYVOVGBEUKSLXHQ5A,AG5HTSFRRE6NL3M5S...
4 AE3Q6KSUK5P75D5HFYHCRAOLODSA,AFUGIFH5ZAFXRDSZH...
```

```

 user_name \
0 Manav,Adarsh gupta,Sundeep,S.Sayeed Ahmed,jasp...
1 ArdKn,Nirbhay kumar,Sagar Viswanathan,Asp,Plac...
2 Kunal,Himanshu,viswanath,sai niharka,saqib mal...
3 Omkar dhale,JD,HEMALATHA,Ajwadh a.,amar singh ...
4 rahuls6099,Swasat Borah,Ajay Wadke,Pranali,RVK...

```

```

 review_id \
0 R3HXWTOLRPONMF,R2AJM3LFTLZHFO,R6AQJGUP6P86,R1K...
1 RGIQEG07R9HS2,R1SMWZQ86XIN8U,R2J3Y1WL29GWDE,RY...
2 R3J3EQQ9TZI5ZJ,R3E7WBGK7IDOKV,RWU79XKQ6I1QF,R2...
3 R3EEUZKKK9J36I,R3HJVYCLY0Y554,REDECAZ7AMPQC,R1...
4 R1BP4L2HH9TFUP,R16PVJEXKV6QZS,R2UPDB81N66T4P,R...

```

```

 review_title \
0 Satisfied,Charging is really fast,Value for mo...
1 A Good Braided Cable for Your Type C Device,Go...
2 Good speed for earlier versions,Good Product,W...
3 Good product,Good one,Nice,Really nice product...
4 As good as original,Decent,Good one for second...

```

```

 review_content \
0 Looks durable Charging is fine tooNo complains...
1 I ordered this cable to connect my phone to An...
2 Not quite durable and sturdy,https://m.media-a...
3 Good product,long wire,Charges good,Nice,I bou...
4 Bought this instead of original apple, does th...

```

```

 img_link \
0 https://m.media-amazon.com/images/W/WEBP_40237...
1 https://m.media-amazon.com/images/W/WEBP_40237...
2 https://m.media-amazon.com/images/W/WEBP_40237...
3 https://m.media-amazon.com/images/I/41V5FtEWPk...
4 https://m.media-amazon.com/images/W/WEBP_40237...

```

```

 product_link
0 https://www.amazon.in/Wayona-Braided-WN3LG1-Sy...
1 https://www.amazon.in/Ambrane-Unbreakable-Char...
2 https://www.amazon.in/Sounce-iPhone-Charging-C...
3 https://www.amazon.in/Deuce-300-Resistant-Tang...
4 https://www.amazon.in/Portronics-Konnnect-POR-1...

```

```
[]: # setting the option to show maximum columns
pd.set_option('display.max_columns', None)
```

```
[]: #####
help(pd.set_option)
```

```
####
```

Help on CallableDynamicDoc in module pandas.\_config.config:

<pandas.\_config.config.CallableDynamicDoc object>

set\_option(pat, value)

Sets the value of the specified option.

Available options:

- compute.[use\_bottleneck, use\_numba, use\_numexpr]
- display.[chop\_threshold, colheader\_justify, date\_dayfirst, date\_yearfirst, encoding, expand\_frame\_repr, float\_format]
- display.html.[border, table\_schema, use\_mathjax]
- display.[large\_repr, max\_categories, max\_columns, max\_colwidth, max\_dir\_items, max\_info\_columns, max\_info\_rows, max\_rows, max\_seq\_items, memory\_usage, min\_rows, multi\_sparse, notebook\_repr\_html, pprint\_nest\_depth, precision, show\_dimensions]
- display.unicode.[ambiguous\_as\_wide, east\_asian\_width]
- display.[width]
- future.[infer\_string, no\_silent\_downcasting]
- io.excel.ods.[reader, writer]
- io.excel.xls.[reader]
- io.excel.xlsb.[reader]
- io.excel.xlsm.[reader, writer]
- io.excel.xlsx.[reader, writer]
- io.hdf.[default\_format, dropna\_table]
- io.parquet.[engine]
- io.sql.[engine]
- mode.[chained\_assignment, copy\_on\_write, data\_manager, sim\_interactive, string\_storage, use\_inf\_as\_na]
- plotting.[backend]
- plotting.matplotlib.[register\_converters]
- styler.format.[decimal, escape, formatter, na\_rep, precision, thousands]
- styler.html.[mathjax]
- styler.latex.[environment, hrules, multicol\_align, multirow\_align]
- styler.render.[encoding, max\_columns, max\_elements, max\_rows, repr]
- styler.sparse.[columns, index]

Parameters

-----

pat : str

Regexp which should match a single option.

Note: partial matches are supported for convenience, but unless you use

the



full option name (e.g. x.y.z.option\_name), your code may break in future versions if new options with similar names are introduced.

value : object

New value of option.

Returns

-----

None

Raises

-----

OptionError if no such option exists

Notes

-----

Please reference the :ref:`User Guide <options>` for more information.

The available options with its descriptions:

compute.use\_bottleneck : bool

Use the bottleneck library to accelerate if it is installed,  
the default is True

Valid values: False, True

[default: True] [currently: True]

compute.use\_numba : bool

Use the numba engine option for select operations if it is installed,  
the default is False

Valid values: False, True

[default: False] [currently: False]

compute.use\_numexpr : bool

Use the numexpr library to accelerate computation if it is installed,  
the default is True

Valid values: False, True

[default: True] [currently: True]

display.chop\_threshold : float or None

if set to a float value, all float values smaller than the given  
threshold

will be displayed as exactly 0 by repr and friends.

[default: None] [currently: None]

display.colheader\_justify : 'left'/'right'

Controls the justification of column headers. used by

DataFrameFormatter.

[default: right] [currently: right]

display.date\_dayfirst : boolean

When True, prints and parses dates with the day first, eg 20/01/2005

[default: False] [currently: False]

display.date\_yearfirst : boolean

When True, prints and parses dates with the year first, eg 2005/01/20

```

 [default: False] [currently: False]
display.encoding : str/unicode
 Defaults to the detected encoding of the console.
 Specifies the encoding to be used for strings returned by to_string,
 these are generally strings meant to be displayed on the console.
 [default: UTF-8] [currently: UTF-8]
display.expand_frame_repr : boolean
 Whether to print out the full DataFrame repr for wide DataFrames across
 multiple lines, `max_columns` is still respected, but the output will
 wrap-around across multiple "pages" if its width exceeds
`display.width`.
 [default: True] [currently: True]
display.float_format : callable
 The callable should accept a floating point number and return
 a string with the desired format of the number. This is used
 in some places like SeriesFormatter.
 See formats.format.EngFormatter for an example.
 [default: None] [currently: None]
display.html.border : int
 A ``border=value`` attribute is inserted in the ``<table>`` tag
 for the DataFrame HTML repr.
 [default: 1] [currently: 1]
display.html.table_schema : boolean
 Whether to publish a Table Schema representation for frontends
 that support it.
 (default: False)
 [default: False] [currently: False]
display.html.use_mathjax : boolean
 When True, Jupyter notebook will process table contents using MathJax,
 rendering mathematical expressions enclosed by the dollar symbol.
 (default: True)
 [default: True] [currently: True]
display.large_repr : 'truncate'/'info'
 For DataFrames exceeding max_rows/max_cols, the repr (and HTML repr) can
 show a truncated table, or switch to the view from
 df.info() (the behaviour in earlier versions of pandas).
 [default: truncate] [currently: truncate]
display.max_categories : int
 This sets the maximum number of categories pandas should output when
 printing out a `Categorical` or a Series of dtype "category".
 [default: 8] [currently: 8]
display.max_columns : int
 If max_cols is exceeded, switch to truncate view. Depending on
 `large_repr`, objects are either centrally truncated or printed as
 a summary view. 'None' value means unlimited.

 In case python/IPython is running in a terminal and `large_repr`
 equals 'truncate' this can be set to 0 or None and pandas will auto-

```

detect

the width of the terminal and print a truncated object which fits the screen width. The IPython notebook, IPython qtconsole, or IDLE do not run in a terminal and hence it is not possible to do correct auto-detection and defaults to 20.

[default: 20] [currently: 20]

display.max\_colwidth : int or None

The maximum width in characters of a column in the repr of a pandas data structure. When the column overflows, a "..." placeholder is embedded in the output. A 'None' value means unlimited.

[default: 50] [currently: 50]

display.max\_dir\_items : int

The number of items that will be added to `dir(...)`. 'None' value means unlimited. Because dir is cached, changing this option will not

immediately

affect already existing dataframes until a column is deleted or added.

This is for instance used to suggest columns from a dataframe to tab completion.

[default: 100] [currently: 100]

display.max\_info\_columns : int

max\_info\_columns is used in DataFrame.info method to decide if per column information will be printed.

[default: 100] [currently: 100]

display.max\_info\_rows : int

df.info() will usually show null-counts for each column.

For large frames this can be quite slow. max\_info\_rows and max\_info\_cols limit this null check only to frames with smaller dimensions than specified.

[default: 1690785] [currently: 1690785]

display.max\_rows : int

If max\_rows is exceeded, switch to truncate view. Depending on `large\_repr`, objects are either centrally truncated or printed as a summary view. 'None' value means unlimited.

In case python/IPython is running in a terminal and `large\_repr` equals 'truncate' this can be set to 0 and pandas will auto-detect the height of the terminal and print a truncated object which fits the screen height. The IPython notebook, IPython qtconsole, or IDLE do not run in a terminal and hence it is not possible to do correct auto-detection.

[default: 60] [currently: 60]

display.max\_seq\_items : int or None

When pretty-printing a long sequence, no more than `max\_seq\_items` will be printed. If items are omitted, they will be denoted by the addition of "..." to the resulting string.

If set to None, the number of items to be printed is unlimited.

```

 [default: 100] [currently: 100]
display.memory_usage : bool, string or None
 This specifies if the memory usage of a DataFrame should be displayed
when
 df.info() is called. Valid values True,False,'deep'
 [default: True] [currently: True]
display.min_rows : int
 The numbers of rows to show in a truncated view (when `max_rows` is
 exceeded). Ignored when `max_rows` is set to None or 0. When set to
 None, follows the value of `max_rows`.
 [default: 10] [currently: 10]
display.multi_sparse : boolean
 "sparsify" MultiIndex display (don't display repeated
 elements in outer levels within groups)
 [default: True] [currently: True]
display.notebook_repr_html : boolean
 When True, IPython notebook will use html representation for
 pandas objects (if it is available).
 [default: True] [currently: True]
display.pprint_nest_depth : int
 Controls the number of nested levels to process when pretty-printing
 [default: 3] [currently: 3]
display.precision : int
 Floating point output precision in terms of number of places after the
 decimal, for regular formatting as well as scientific notation. Similar
 to ``precision`` in :meth:`numpy.set_printoptions`.
 [default: 6] [currently: 2]
display.show_dimensions : boolean or 'truncate'
 Whether to print out dimensions at the end of DataFrame repr.
 If 'truncate' is specified, only print out the dimensions if the
 frame is truncated (e.g. not display all rows and/or columns)
 [default: truncate] [currently: truncate]
display.unicode.ambiguous_as_wide : boolean
 Whether to use the Unicode East Asian Width to calculate the display
text
 width.
 Enabling this may affect to the performance (default: False)
 [default: False] [currently: False]
display.unicode.east_asian_width : boolean
 Whether to use the Unicode East Asian Width to calculate the display
text
 width.
 Enabling this may affect to the performance (default: False)
 [default: False] [currently: False]
display.width : int
 Width of the display in characters. In case python/IPython is running in
 a terminal this can be set to None and pandas will correctly auto-detect
 the width.

```

Note that the IPython notebook, IPython qtconsole, or IDLE do not run in  
a

terminal and hence it is not possible to correctly detect the width.

[default: 80] [currently: 80]

future.infer\_string Whether to infer sequence of str objects as pyarrow  
string dtype, which will be the default in pandas 3.0 (at which point this  
option will be deprecated).

[default: False] [currently: False]

future.no\_silent\_downcasting Whether to opt-in to the future behavior which  
will *not* silently downcast results from Series and DataFrame `where`, `mask`,  
and `clip` methods. Silent downcasting will be removed in pandas 3.0 (at which  
point this option will be deprecated).

[default: False] [currently: False]

io.excel.ods.reader : string

The default Excel reader engine for 'ods' files. Available options:  
auto, odf, calamine.

[default: auto] [currently: auto]

io.excel.ods.writer : string

The default Excel writer engine for 'ods' files. Available options:  
auto, odf.

[default: auto] [currently: auto]

io.excel.xls.reader : string

The default Excel reader engine for 'xls' files. Available options:  
auto, xlrd, calamine.

[default: auto] [currently: auto]

io.excel.xlsb.reader : string

The default Excel reader engine for 'xlsb' files. Available options:  
auto, pyxlsb, calamine.

[default: auto] [currently: auto]

io.excel.xlsm.reader : string

The default Excel reader engine for 'xlsm' files. Available options:  
auto, xlrd, openpyxl, calamine.

[default: auto] [currently: auto]

io.excel.xlsm.writer : string

The default Excel writer engine for 'xlsm' files. Available options:  
auto, openpyxl.

[default: auto] [currently: auto]

io.excel.xlsx.reader : string

The default Excel reader engine for 'xlsx' files. Available options:  
auto, xlrd, openpyxl, calamine.

[default: auto] [currently: auto]

io.excel.xlsx.writer : string

The default Excel writer engine for 'xlsx' files. Available options:  
auto, openpyxl, xlsxwriter.

[default: auto] [currently: auto]

io.hdf.default\_format : format

default format writing format, if None, then  
put will default to 'fixed' and append will default to 'table'

```

 [default: None] [currently: None]
io.hdf.dropna_table : boolean
 drop ALL nan rows when appending to a table
 [default: False] [currently: False]
io.parquet.engine : string
 The default parquet reader/writer engine. Available options:
 'auto', 'pyarrow', 'fastparquet', the default is 'auto'
 [default: auto] [currently: auto]
io.sql.engine : string
 The default sql reader/writer engine. Available options:
 'auto', 'sqlalchemy', the default is 'auto'
 [default: auto] [currently: auto]
mode.chained_assignment : string
 Raise an exception, warn, or no action if trying to use chained
assignment,
 The default is warn
 [default: warn] [currently: warn]
mode.copy_on_write : bool
 Use new copy-view behaviour using Copy-on-Write. Defaults to False,
 unless overridden by the 'PANDAS_COPY_ON_WRITE' environment variable
 (if set to "1" for True, needs to be set before pandas is imported).
 [default: False] [currently: False]
mode.data_manager : string
 Internal data manager type; can be "block" or "array". Defaults to
"block",
 unless overridden by the 'PANDAS_DATA_MANAGER' environment variable
(needs
 to be set before pandas is imported).
 [default: block] [currently: block]
 (Deprecated, use `` instead.)
mode.sim_interactive : boolean
 Whether to simulate interactive mode for purposes of testing
 [default: False] [currently: False]
mode.string_storage : string
 The default storage for StringDtype. This option is ignored if
 ``future.infer_string`` is set to True.
 [default: python] [currently: python]
mode.use_inf_as_na : boolean
 True means treat None, NaN, INF, -INF as NA (old way),
 False means None and NaN are null, but INF, -INF are not NA
 (new way).

 This option is deprecated in pandas 2.1.0 and will be removed in 3.0.
 [default: False] [currently: False]
 (Deprecated, use `` instead.)
plotting.backend : str
 The plotting backend to use. The default value is "matplotlib", the
 backend provided with pandas. Other backends can be specified by

```

providing the name of the module that implements the backend.  
 [default: matplotlib] [currently: matplotlib]

plotting.matplotlib.register\_converters : bool or 'auto'.  
 Whether to register converters with matplotlib's units registry for  
 dates, times, datetimes, and Periods. Toggling to False will remove  
 the converters, restoring any converters that pandas overwrote.  
 [default: auto] [currently: auto]

styler.format.decimal : str  
 The character representation for the decimal separator for floats and  
 complex.  
 [default: .] [currently: .]

styler.format.escape : str, optional  
 Whether to escape certain characters according to the given context;  
 html or latex.  
 [default: None] [currently: None]

styler.format.formatter : str, callable, dict, optional  
 A formatter object to be used as default within ``Styler.format``.  
 [default: None] [currently: None]

styler.format.na\_rep : str, optional  
 The string representation for values identified as missing.  
 [default: None] [currently: None]

styler.format.precision : int  
 The precision for floats and complex numbers.  
 [default: 6] [currently: 6]

styler.format.thousands : str, optional  
 The character representation for thousands separator for floats, int and  
 complex.  
 [default: None] [currently: None]

styler.html.mathjax : bool  
 If False will render special CSS classes to table attributes that  
 indicate Mathjax  
 will not be used in Jupyter Notebook.  
 [default: True] [currently: True]

styler.latex.environment : str  
 The environment to replace ``\begin{table}``. If "longtable" is used  
 results  
 in a specific longtable environment format.  
 [default: None] [currently: None]

styler.latex.hrules : bool  
 Whether to add horizontal rules on top and bottom and below the headers.  
 [default: False] [currently: False]

styler.latex.multicol\_align : {"r", "c", "l", "naive-l", "naive-r"}  
 The specifier for horizontal alignment of sparsified LaTeX multicolumns.

Pipe  
 decorators can also be added to non-naive values to draw vertical  
 rules, e.g. "\r" will draw a rule on the left side of right aligned  
 merged cells.  
 [default: r] [currently: r]

```

styler.latex.multirow_align : {"c", "t", "b"}
 The specifier for vertical alignment of sparsified LaTeX multirows.
 [default: c] [currently: c]
styler.render.encoding : str
 The encoding used for output HTML and LaTeX files.
 [default: utf-8] [currently: utf-8]
styler.render.max_columns : int, optional
 The maximum number of columns that will be rendered. May still be
reduced to
 satisfy ``max_elements``, which takes precedence.
 [default: None] [currently: None]
styler.render.max_elements : int
 The maximum number of data-cell (<td>) elements that will be rendered
before
 trimming will occur over columns, rows or both if needed.
 [default: 262144] [currently: 262144]
styler.render.max_rows : int, optional
 The maximum number of rows that will be rendered. May still be reduced
to
 satisfy ``max_elements``, which takes precedence.
 [default: None] [currently: None]
styler.render.repr : str
 Determine which output to use in Jupyter Notebook in {"html", "latex"}.
 [default: html] [currently: html]
styler.sparse.columns : bool
 Whether to sparsify the display of hierarchical columns. Setting to
False will
 display each explicit level element in a hierarchical key for each
column.
 [default: True] [currently: True]
styler.sparse.index : bool
 Whether to sparsify the display of a hierarchical index. Setting to
False will
 display each explicit level element in a hierarchical key for each row.
 [default: True] [currently: True]

```

#### Examples

-----

```

>>> pd.set_option('display.max_columns', 4)
>>> df = pd.DataFrame([[1, 2, 3, 4, 5], [6, 7, 8, 9, 10]])
>>> df
 0 1 ... 3 4
0 1 2 ... 4 5
1 6 7 ... 9 10
[2 rows x 5 columns]
>>> pd.reset_option('display.max_columns')

```



```
[]: df.head(5)
```

```
[]: product_id product_name \
0 B07JW9H4J1 Wayona Nylon Braided USB to Lightning Fast Cha...
1 B098NS6PVG Ambrane Unbreakable 60W / 3A Fast Charging 1.5...
2 B096MSW6CT Sounce Fast Phone Charging Cable & Data Sync U...
3 B08HJDJ86NZ boAt Deuce USB 300 2 in 1 Type-C & Micro USB S...
4 B08CF3B7N1 Portronics Konnect L 1.2M Fast Charging 3A 8 P...
```

```
 category discounted_price \
0 Computers&Accessories|Accessories&Peripherals|... 399
1 Computers&Accessories|Accessories&Peripherals|... 199
2 Computers&Accessories|Accessories&Peripherals|... 199
3 Computers&Accessories|Accessories&Peripherals|... 329
4 Computers&Accessories|Accessories&Peripherals|... 154
```

```
 actual_price discount_percentage rating rating_count \
0 1,099 64% 4.2 24,269
1 349 43% 4.0 43,994
2 1,899 90% 3.9 7,928
3 699 53% 4.2 94,363
4 399 61% 4.2 16,905
```

```
 about_product \
0 High Compatibility : Compatible With iPhone 12...
1 Compatible with all Type C enabled devices, be...
2 Fast Charger& Data Sync -With built-in safet...
3 The boAt Deuce USB 300 2 in 1 cable is compati...
4 [CHARGE & SYNC FUNCTION]- This cable comes wit...
```

```
 user_id \
0 AG3D604STAQKAY2UVGEUV46KN35Q,AHMY5CWJMMK5BJRBB...
1 AECPFYFQVRUWC3KGNLJIOREFP5LQ,AGYYVPDD7YG7FYNBX...
2 AGU3BBQ2V2DDAMOAKGFAWDDQ6QHA,AESFLDV2PT363T2AQ...
3 AEWAZDZZJLQUYVOVGBEUKSLXHQ5A,AG5HTSFRRE6NL3M5S...
4 AE3Q6KSUK5P75D5HFYHCRAOLODSA,AFUGIFH5ZAFXRDSZH...
```

```
 user_name \
0 Manav,Adarsh gupta,Sundeep,S.Sayeed Ahmed,jasp...
1 ArdKn,Nirbhay kumar,Sagar Viswanathan,Asp,Plac...
2 Kunal,Himanshu,viswanath,sai niharka,saqib mal...
3 Omkar dhale,JD,HEMALATHA,Ajwadh a.,amar singh ...
4 rahuls6099,Swasat Borah,Ajay Wadke,Pranali,RVK...
```

```
 review_id \
0 R3HXWTOLRPONMF,R2AJM3LFTLZHFO,R6AQJGUP6P86,R1K...
1 RGIQEG07R9HS2,R1SMWZQ86XIN8U,R2J3Y1WL29GWDE,RY...
```

```

2 R3J3EQQ9TZI5ZJ,R3E7WBGK7IDOKV,RWU79XKQ6I1QF,R2...
3 R3EEUZKKK9J36I,R3HJVYCLY0Y554,REDECAZ7AMPQC,R1...
4 R1BP4L2HH9TFUP,R16PVJEXKV6QZS,R2UPDB81N66T4P,R...

```

```

 review_title \
0 Satisfied,Charging is really fast,Value for mo...
1 A Good Braided Cable for Your Type C Device,Go...
2 Good speed for earlier versions,Good Product,W...
3 Good product,Good one,Nice,Really nice product...
4 As good as original,Decent,Good one for second...

```

```

 review_content \
0 Looks durable Charging is fine tooNo complains...
1 I ordered this cable to connect my phone to An...
2 Not quite durable and sturdy,https://m.media-a...
3 Good product,long wire,Charges good,Nice,I bou...
4 Bought this instead of original apple, does th...

```

```

 img_link \
0 https://m.media-amazon.com/images/W/WEBP_40237...
1 https://m.media-amazon.com/images/W/WEBP_40237...
2 https://m.media-amazon.com/images/W/WEBP_40237...
3 https://m.media-amazon.com/images/I/41V5FtEWPk...
4 https://m.media-amazon.com/images/W/WEBP_40237...

```

```

 product_link
0 https://www.amazon.in/Wayona-Braided-WN3LG1-Sy...
1 https://www.amazon.in/Ambrane-Unbreakable-Char...
2 https://www.amazon.in/Sounce-iPhone-Charging-C...
3 https://www.amazon.in/Deuce-300-Resistant-Tang...
4 https://www.amazon.in/Portronics-Konnect-POR-1...

```

```
[]: df.columns
```

```
[]: Index(['product_id', 'product_name', 'category', 'discounted_price',
 'actual_price', 'discount_percentage', 'rating', 'rating_count',
 'about_product', 'user_id', 'user_name', 'review_id', 'review_title',
 'review_content', 'img_link', 'product_link'],
 dtype='object')
```

```
[]: # Let's have a look on the shape of the dataset
```

```
[]: print(f"The Number of Rows are {df.shape[0]}, and columns are {df.shape[1]}.")
```

The Number of Rows are 1465, and columns are 16.

```
[]: df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1465 entries, 0 to 1464
Data columns (total 16 columns):
Column Non-Null Count Dtype
--- -
0 product_id 1465 non-null object
1 product_name 1465 non-null object
2 category 1465 non-null object
3 discounted_price 1465 non-null object
4 actual_price 1465 non-null object
5 discount_percentage 1465 non-null object
6 rating 1465 non-null object
7 rating_count 1463 non-null object
8 about_product 1465 non-null object
9 user_id 1465 non-null object
10 user_name 1465 non-null object
11 review_id 1465 non-null object
12 review_title 1465 non-null object
13 review_content 1465 non-null object
14 img_link 1465 non-null object
15 product_link 1465 non-null object
dtypes: object(16)
memory usage: 183.3+ KB

```

```
[]: df.isnull().sum()
```

```

[]: product_id 0
 product_name 0
 category 0
 discounted_price 0
 actual_price 0
 discount_percentage 0
 rating 0
 rating_count 2
 about_product 0
 user_id 0
 user_name 0
 review_id 0
 review_title 0
 review_content 0
 img_link 0
 product_link 0
 dtype: int64

```

```

[]: #####
 df.isnull()
 #####

```

```
[]: product_id product_name category discounted_price actual_price \
0 False False False False False
1 False False False False False
2 False False False False False
3 False False False False False
4 False False False False False
...
1460 False False False False False
1461 False False False False False
1462 False False False False False
1463 False False False False False
1464 False False False False False
```

```
 discount_percentage rating rating_count about_product user_id \
0 False False False False False
1 False False False False False
2 False False False False False
3 False False False False False
4 False False False False False
...
1460 False False False False False
1461 False False False False False
1462 False False False False False
1463 False False False False False
1464 False False False False False
```

```
 user_name review_id review_title review_content img_link \
0 False False False False False
1 False False False False False
2 False False False False False
3 False False False False False
4 False False False False False
...
1460 False False False False False
1461 False False False False False
1462 False False False False False
1463 False False False False False
1464 False False False False False
```

```
 product_link
0 False
1 False
2 False
3 False
4 False
...
1460 False
```

```

1461 False
1462 False
1463 False
1464 False

```

```
[1465 rows x 16 columns]
```

```
[]: # Changing Data Types of Columns from object to float

df['discounted_price'] = df['discounted_price'].str.replace(' ', '')
df['discounted_price'] = df['discounted_price'].str.replace(',', '')
df['discounted_price'] = df['discounted_price'].astype('float64')

df['actual_price'] = df['actual_price'].str.replace(' ', '')
df['actual_price'] = df['actual_price'].str.replace(',', '')
df['actual_price'] = df['actual_price'].astype('float64')
```

```
[]: #####
df['discounted_price']
#####
```

```
[]: 0 399
1 199
2 199
3 329
4 154
...
1460 379
1461 2,280
1462 2,219
1463 1,399
1464 2,863
Name: discounted_price, Length: 1465, dtype: object
```

```
[]:
```

```
[]: #####
help(df['discounted_price'].str)
#####
```

Help on StringMethods in module pandas.core.strings.accessor object:

```

class StringMethods(pandas.core.base.NoNewAttributesMixin)
| StringMethods(data) -> 'None'
|
| Vectorized string functions for Series and Index.
|

```

```

| NAs stay NA unless handled otherwise by a particular method.
| Patterned after Python's string methods, with some inspiration from
| R's stringr package.
|
| Examples
| -----
| >>> s = pd.Series(["A_Str_Series"])
| >>> s
| 0 A_Str_Series
| dtype: object
|
| >>> s.str.split("_")
| 0 [A, Str, Series]
| dtype: object
|
| >>> s.str.replace("_", "")
| 0 AStrSeries
| dtype: object
|
| Method resolution order:
| StringMethods
| pandas.core.base.NoNewAttributesMixin
| builtins.object
|
| Methods defined here:
|
| __getitem__(self, key)
|
| __init__(self, data) -> 'None'
| Initialize self. See help(type(self)) for accurate signature.
|
| __iter__(self) -> 'Iterator'
|
| capitalize(self)
| Convert strings in the Series/Index to be capitalized.
|
| Equivalent to :meth:`str.capitalize`.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.lower : Converts all characters to lowercase.
| Series.str.upper : Converts all characters to uppercase.
| Series.str.title : Converts first character of each word to uppercase
and

```

```

| remaining to lowercase.
| Series.str.capitalize : Converts first character to uppercase and
| remaining to lowercase.
| Series.str.swapcase : Converts uppercase to lowercase and lowercase to
| uppercase.
| Series.str.casefold: Removes all case distinctions in the string.
|
| Examples
| -----
| >>> s = pd.Series(['lower', 'CAPITALS', 'this is a sentence',
'SwApCaSe'])
| >>> s
| 0 lower
| 1 CAPITALS
| 2 this is a sentence
| 3 SwApCaSe
| dtype: object
|
| >>> s.str.lower()
| 0 lower
| 1 capitals
| 2 this is a sentence
| 3 swapcase
| dtype: object
|
| >>> s.str.upper()
| 0 LOWER
| 1 CAPITALS
| 2 THIS IS A SENTENCE
| 3 SWAPCASE
| dtype: object
|
| >>> s.str.title()
| 0 Lower
| 1 Capitals
| 2 This Is A Sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.capitalize()
| 0 Lower
| 1 Capitals
| 2 This is a sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.swapcase()
| 0 LOWER

```

```

| 1 capitals
| 2 THIS IS A SENTENCE
| 3 sWaPcAsE
| dtype: object
|
| casefold(self)
| Convert strings in the Series/Index to be casefolded.
|
| Equivalent to :meth:`str.casefold`.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.lower : Converts all characters to lowercase.
| Series.str.upper : Converts all characters to uppercase.
| Series.str.title : Converts first character of each word to uppercase
and
| remaining to lowercase.
| Series.str.capitalize : Converts first character to uppercase and
| remaining to lowercase.
| Series.str.swapcase : Converts uppercase to lowercase and lowercase to
| uppercase.
| Series.str.casefold: Removes all case distinctions in the string.
|
| Examples
| -----
| >>> s = pd.Series(['lower', 'CAPITALS', 'this is a sentence',
'SwApCaSe'])
| >>> s
| 0 lower
| 1 CAPITALS
| 2 this is a sentence
| 3 SwApCaSe
| dtype: object
|
| >>> s.str.lower()
| 0 lower
| 1 capitals
| 2 this is a sentence
| 3 swapcase
| dtype: object
|
| >>> s.str.upper()
| 0 LOWER
| 1 CAPITALS

```



```

| 2 THIS IS A SENTENCE
| 3 SWAPCASE
| dtype: object
|
| >>> s.str.title()
| 0 Lower
| 1 Capitals
| 2 This Is A Sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.capitalize()
| 0 Lower
| 1 Capitals
| 2 This is a sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.swapcase()
| 0 LOWER
| 1 capitals
| 2 THIS IS A SENTENCE
| 3 sWaPcAsE
| dtype: object
|
| cat(self, others=None, sep: 'str | None' = None, na_rep=None, join:
'AlignJoin' = 'left') -> 'str | Series | Index'
| Concatenate strings in the Series/Index with given separator.
|
| If `others` is specified, this function concatenates the Series/Index
| and elements of `others` element-wise.
| If `others` is not passed, then all values in the Series/Index are
| concatenated into a single string with a given `sep`.
|
| Parameters
| -----
| others : Series, Index, DataFrame, np.ndarray or list-like
| Series, Index, DataFrame, np.ndarray (one- or two-dimensional) and
| other list-likes of strings must have the same length as the
| calling Series/Index, with the exception of indexed objects (i.e.
| Series/Index/DataFrame) if `join` is not None.
|
| If others is a list-like that contains a combination of Series,
| Index or np.ndarray (1-dim), then all elements will be unpacked and
| must satisfy the above criteria individually.
|
| If others is None, the method returns the concatenation of all
| strings in the calling Series/Index.

```

```

sep : str, default ''
 The separator between the different elements/columns. By default
 the empty string ``''`` is used.
na_rep : str or None, default None
 Representation that is inserted for all missing values:

 - If `na_rep` is None, and `others` is None, missing values in the
 Series/Index are omitted from the result.
 - If `na_rep` is None, and `others` is not None, a row containing a
 missing value in any of the columns (before concatenation) will
 have a missing value in the result.
join : {'left', 'right', 'outer', 'inner'}, default 'left'
 Determines the join-style between the calling Series/Index and any
 Series/Index/DataFrame in `others` (objects without an index need
 to match the length of the calling Series/Index). To disable
 alignment, use `.values` on any Series/Index/DataFrame in `others`.

```

#### Returns

```

str, Series or Index
 If `others` is None, `str` is returned, otherwise a `Series/Index`
 (same type as caller) of objects is returned.

```

#### See Also

```

split : Split each string in the Series/Index.
join : Join lists contained as elements in the Series/Index.

```

#### Examples

```

When not passing `others`, all values are concatenated into a single
string:

```

```

>>> s = pd.Series(['a', 'b', np.nan, 'd'])
>>> s.str.cat(sep=' ')
'a b d'

```

```

By default, NA values in the Series are ignored. Using `na_rep`, they
can be given a representation:

```

```

>>> s.str.cat(sep=' ', na_rep='?')
'a b ? d'

```

```

If `others` is specified, corresponding values are concatenated with
the separator. Result will be a Series of strings.

```

```

>>> s.str.cat(['A', 'B', 'C', 'D'], sep=',')
0 a,A

```

```

1 b,B
2 NaN
3 d,D
dtype: object

```

Missing values will remain missing in the result, but can again be represented using `na\_rep`

```

>>> s.str.cat(['A', 'B', 'C', 'D'], sep=',', na_rep='-')
0 a,A
1 b,B
2 -,C
3 d,D
dtype: object

```

If `sep` is not specified, the values are concatenated without separation.

```

>>> s.str.cat(['A', 'B', 'C', 'D'], na_rep='-')
0 aA
1 bB
2 -C
3 dD
dtype: object

```

Series with different indexes can be aligned before concatenation. The `join`-keyword works as in other methods.

```

>>> t = pd.Series(['d', 'a', 'e', 'c'], index=[3, 0, 4, 2])
>>> s.str.cat(t, join='left', na_rep='-')
0 aa
1 b-
2 -c
3 dd
dtype: object
>>>
>>> s.str.cat(t, join='outer', na_rep='-')
0 aa
1 b-
2 -c
3 dd
4 -e
dtype: object
>>>
>>> s.str.cat(t, join='inner', na_rep='-')
0 aa
2 -c
3 dd

```

```

| dtype: object
|
| >>>
| >>> s.str.cat(t, join='right', na_rep='-')
| 3 dd
| 0 aa
| 4 -e
| 2 -c
| dtype: object
|
| For more examples, see :ref:`here <text.concatenate>`.
|
| center(self, width: 'int', fillchar: 'str' = ' ')
| Pad left and right side of strings in the Series/Index.
|
| Equivalent to :meth:`str.center`.
|
| Parameters
| -----
| width : int
| Minimum width of resulting string; additional characters will be
filled
| with ``fillchar``.
| fillchar : str
| Additional character for filling, default is whitespace.
|
| Returns
| -----
| Series/Index of objects.
|
| Examples
| -----
| For Series.str.center:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.center(8, fillchar='.')
| 0 ..dog...
| 1 ..bird..
| 2 .mouse..
| dtype: object
|
| For Series.str.ljust:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.ljust(8, fillchar='.')
| 0 dog...
| 1 bird...
| 2 mouse...
| dtype: object

```

```

|
| For Series.str.rjust:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.rjust(8, fillchar='.')
| 0 ...dog
| 1 ...bird
| 2 ...mouse
| dtype: object
|
| contains(self, pat, case: 'bool' = True, flags: 'int' = 0, na=None, regex:
'bool' = True)
| Test if pattern or regex is contained within a string of a Series or
Index.
|
| Return boolean Series or Index based on whether a given pattern or regex
is
| contained within a string of a Series or Index.
|
| Parameters
| -----
| pat : str
| Character sequence or regular expression.
| case : bool, default True
| If True, case sensitive.
| flags : int, default 0 (no flags)
| Flags to pass through to the re module, e.g. re.IGNORECASE.
| na : scalar, optional
| Fill value for missing values. The default depends on dtype of the
| array. For object-dtype, ``numpy.nan`` is used. For ``StringDtype``,
| ``pandas.NA`` is used.
| regex : bool, default True
| If True, assumes the pat is a regular expression.
|
| If False, treats the pat as a literal string.
|
| Returns
| -----
| Series or Index of boolean values
| A Series or Index of boolean values indicating whether the
| given pattern is contained within the string of each element
| of the Series or Index.
|
| See Also
| -----
| match : Analogous, but stricter, relying on re.match instead of
re.search.
| Series.str.startswith : Test if the start of each string element matches

```

a

```
pattern.
Series.str.endswith : Same as startswith, but tests the end of string.
```

#### Examples

-----

Returning a Series of booleans using only a literal pattern.

```
>>> s1 = pd.Series(['Mouse', 'dog', 'house and parrot', '23', np.nan])
>>> s1.str.contains('og', regex=False)
0 False
1 True
2 False
3 False
4 NaN
dtype: object
```

Returning an Index of booleans using only a literal pattern.

```
>>> ind = pd.Index(['Mouse', 'dog', 'house and parrot', '23.0', np.nan])
>>> ind.str.contains('23', regex=False)
Index([False, False, False, True, nan], dtype='object')
```

Specifying case sensitivity using `case`.

```
>>> s1.str.contains('oG', case=True, regex=True)
0 False
1 False
2 False
3 False
4 NaN
dtype: object
```

Specifying `na` to be `False` instead of `NaN` replaces NaN values with `False`. If Series or Index does not contain NaN values the resultant dtype will be `bool`, otherwise, an `object` dtype.

```
>>> s1.str.contains('og', na=False, regex=True)
0 False
1 True
2 False
3 False
4 False
dtype: bool
```

Returning 'house' or 'dog' when either expression occurs in a string.

```
>>> s1.str.contains('house|dog', regex=True)
```

```

| 0 False
| 1 True
| 2 True
| 3 False
| 4 NaN
| dtype: object
|
| Ignoring case sensitivity using `flags` with regex.
|
| >>> import re
| >>> s1.str.contains('PARROT', flags=re.IGNORECASE, regex=True)
| 0 False
| 1 False
| 2 True
| 3 False
| 4 NaN
| dtype: object
|
| Returning any digit using regular expression.
|
| >>> s1.str.contains('\d', regex=True)
| 0 False
| 1 False
| 2 False
| 3 True
| 4 NaN
| dtype: object
|
| Ensure `pat` is a not a literal pattern when `regex` is set to True.
| Note in the following example one might expect only `s2[1]` and `s2[3]`
to return `True`. However, `.0` as a regex matches any character
| followed by a 0.
|
| >>> s2 = pd.Series(['40', '40.0', '41', '41.0', '35'])
| >>> s2.str.contains('.0', regex=True)
| 0 True
| 1 True
| 2 False
| 3 True
| 4 False
| dtype: bool
|
| count(self, pat, flags: 'int' = 0)
| Count occurrences of pattern in each string of the Series/Index.
|
| This function is used to count the number of times a particular regex
| pattern is repeated in each of the string elements of the

```

```

| :class:`~pandas.Series`.
|
| Parameters
| -----
| pat : str
| Valid regular expression.
| flags : int, default 0, meaning no flags
| Flags for the `re` module. For a complete list, `see here
| <https://docs.python.org/3/howto/regex.html#compilation-flags>`_.
| **kwargs
| For compatibility with other string methods. Not used.
|
| Returns
| -----
| Series or Index
| Same type as the calling object containing the integer counts.
|
| See Also
| -----
| re : Standard library module for regular expressions.
| str.count : Standard library version, without regular expression
support.
|
| Notes
| -----
| Some characters need to be escaped when passing in `pat`.
| eg. ``'$'`` has a special meaning in regex and must be escaped when
| finding this literal character.
|
| Examples
| -----
| >>> s = pd.Series(['A', 'B', 'Aaba', 'Baca', np.nan, 'CABA', 'cat'])
| >>> s.str.count('a')
| 0 0.0
| 1 0.0
| 2 2.0
| 3 2.0
| 4 NaN
| 5 0.0
| 6 1.0
| dtype: float64
|
| Escape ``'$'`` to find the literal dollar sign.
|
| >>> s = pd.Series(['$', 'B', 'Aab$', '$$ca', 'CB', 'cat'])
| >>> s.str.count('\$')
| 0 1
| 1 0

```



```

| 2 1
| 3 2
| 4 2
| 5 0
| dtype: int64
|
| This is also available on Index
|
| >>> pd.Index(['A', 'A', 'Aaba', 'cat']).str.count('a')
| Index([0, 0, 2, 1], dtype='int64')
|
| decode(self, encoding, errors: 'str' = 'strict')
| Decode character string in the Series/Index using indicated encoding.
|
| Equivalent to :meth:`str.decode` in python2 and :meth:`bytes.decode` in
| python3.
|
| Parameters
| -----
| encoding : str
| errors : str, optional
|
| Returns
| -----
| Series or Index
|
| Examples
| -----
| For Series:
|
| >>> ser = pd.Series([b'cow', b'123', b'()'])
| >>> ser.str.decode('ascii')
| 0 cow
| 1 123
| 2 ()
| dtype: object
|
| encode(self, encoding, errors: 'str' = 'strict')
| Encode character string in the Series/Index using indicated encoding.
|
| Equivalent to :meth:`str.encode`.
|
| Parameters
| -----
| encoding : str
| errors : str, optional
|
| Returns

```

```

| -----
| Series/Index of objects
|
| Examples
| -----
|
| >>> ser = pd.Series(['cow', '123', '()'])
| >>> ser.str.encode(encoding='ascii')
| 0 b'cow'
| 1 b'123'
| 2 b'()'
| dtype: object
|
| endswith(self, pat: 'str | tuple[str, ...]', na: 'Scalar | None' = None) ->
'Series | Index'
| Test if the end of each string element matches a pattern.
|
| Equivalent to :meth:`str.endswith`.
|
| Parameters
| -----
| pat : str or tuple[str, ...]
| Character sequence or tuple of strings. Regular expressions are not
| accepted.
| na : object, default NaN
| Object shown if element tested is not a string. The default depends
| on dtype of the array. For object-dtype, ``numpy.nan`` is used.
| For ``StringDtype``, ``pandas.NA`` is used.
|
| Returns
| -----
| Series or Index of bool
| A Series of booleans indicating whether the given pattern matches
| the end of each string element.
|
| See Also
| -----
| str.endswith : Python standard library string method.
| Series.str.startswith : Same as endswith, but tests the start of string.
| Series.str.contains : Tests if string element contains a pattern.
|
| Examples
| -----
| >>> s = pd.Series(['bat', 'bear', 'caT', np.nan])
| >>> s
| 0 bat
| 1 bear
| 2 caT
| 3 NaN

```

```

| dtype: object
|
| >>> s.str.endswith('t')
| 0 True
| 1 False
| 2 False
| 3 NaN
| dtype: object
|
| >>> s.str.endswith(('t', 'T'))
| 0 True
| 1 False
| 2 True
| 3 NaN
| dtype: object
|
| Specifying `na` to be `False` instead of `NaN`.
|
| >>> s.str.endswith('t', na=False)
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| extract(self, pat: 'str', flags: 'int' = 0, expand: 'bool' = True) ->
'DataFrame | Series | Index'
| Extract capture groups in the regex `pat` as columns in a DataFrame.
|
| For each subject string in the Series, extract groups from the
| first match of regular expression `pat`.
|
| Parameters
| -----
| pat : str
| Regular expression pattern with capturing groups.
| flags : int, default 0 (no flags)
| Flags from the ``re`` module, e.g. ``re.IGNORECASE``, that
| modify regular expression matching for things like case,
| spaces, etc. For more details, see :mod:`re`.
| expand : bool, default True
| If True, return DataFrame with one column per capture group.
| If False, return a Series/Index if there is one capture group
| or DataFrame if there are multiple capture groups.
|
| Returns
| -----
| DataFrame or Series or Index

```

A DataFrame with one row for each subject string, and one column for each group. Any capture group names in regular expression pat will be used for column names; otherwise capture group numbers will be used. The dtype of each result column is always object, even when no match is found. If ``expand=False`` and pat has only one capture group, then return a Series (if subject is a Series) or Index (if subject is an Index).

See Also

-----

extractall : Returns all matches (not just the first match).

Examples

-----

A pattern with two groups will return a DataFrame with two columns. Non-matches will be NaN.

```
>>> s = pd.Series(['a1', 'b2', 'c3'])
>>> s.str.extract(r'([ab])(\d)')
 0 1
0 a 1
1 b 2
2 NaN NaN
```

A pattern may contain optional groups.

```
>>> s.str.extract(r'([ab])?(\d)')
 0 1
0 a 1
1 b 2
2 NaN 3
```

Named groups will become column names in the result.

```
>>> s.str.extract(r'(?P<letter>[ab])(?P<digit>\d)')
letter digit
0 a 1
1 b 2
2 NaN NaN
```

A pattern with one group will return a DataFrame with one column if expand=True.

```
>>> s.str.extract(r'[ab](\d)', expand=True)
 0
0 1
1 2
```

```

| 2 NaN
|
| A pattern with one group will return a Series if expand=False.
|
| >>> s.str.extract(r'[ab](\d)', expand=False)
| 0 1
| 1 2
| 2 NaN
| dtype: object
|
| extractall(self, pat, flags: 'int' = 0) -> 'DataFrame'
| Extract capture groups in the regex `pat` as columns in DataFrame.
|
| For each subject string in the Series, extract groups from all
| matches of regular expression pat. When each subject string in the
| Series has exactly one match, extractall(pat).xs(0, level='match')
| is the same as extract(pat).
|
| Parameters
| -----
| pat : str
| Regular expression pattern with capturing groups.
| flags : int, default 0 (no flags)
| A ``re`` module flag, for example ``re.IGNORECASE``. These allow
| to modify regular expression matching for things like case, spaces,
| etc. Multiple flags can be combined with the bitwise OR operator,
| for example ``re.IGNORECASE | re.MULTILINE``.
|
| Returns
| -----
| DataFrame
| A ``DataFrame`` with one row for each match, and one column for each
| group. Its rows have a ``MultiIndex`` with first levels that come
from
| the subject ``Series``. The last level is named 'match' and indexes
the
| matches in each item of the ``Series``. Any capture group names in
| regular expression pat will be used for column names; otherwise
capture
| group numbers will be used.
|
| See Also
| -----
| extract : Returns first match only (not all matches).
|
| Examples
| -----
| A pattern with one group will return a DataFrame with one column.

```

Indices with no matches will not appear in the result.

```
>>> s = pd.Series(["a1a2", "b1", "c1"], index=["A", "B", "C"])
>>> s.str.extractall(r"[ab](\d)")
```

```
 0
match
A 0 1
 1 2
B 0 1
```

Capture group names are used for column names of the result.

```
>>> s.str.extractall(r"[ab](?P<digit>\d)")
```

```
 digit
match
A 0 1
 1 2
B 0 1
```

A pattern with two groups will return a DataFrame with two columns.

```
>>> s.str.extractall(r"(?P<letter>[ab])(?P<digit>\d)")
```

```
 letter digit
match
A 0 a 1
 1 a 2
B 0 b 1
```

Optional groups that do not match are NaN in the result.

```
>>> s.str.extractall(r"(?P<letter>[ab])?(?P<digit>\d)")
```

```
 letter digit
match
A 0 a 1
 1 a 2
B 0 b 1
C 0 NaN 1
```

```
find(self, sub, start: 'int' = 0, end=None)
```

Return lowest indexes in each strings in the Series/Index.

Each of returned indexes corresponds to the position where the substring is fully contained between [start:end]. Return -1 on failure. Equivalent to standard :meth:`str.find`.

Parameters

-----

sub : str

```

| Substring being searched.
| start : int
| Left edge index.
| end : int
| Right edge index.
|
| Returns
| -----
| Series or Index of int.
|
| See Also
| -----
| rfind : Return highest indexes in each strings.
|
| Examples
| -----
| For Series.str.find:
|
| >>> ser = pd.Series(["cow_", "duck_", "do_ve"])
| >>> ser.str.find("_")
| 0 3
| 1 4
| 2 2
| dtype: int64
|
| For Series.str.rfind:
|
| >>> ser = pd.Series(["_cow_", "duck_", "do_v_e"])
| >>> ser.str.rfind("_")
| 0 4
| 1 4
| 2 4
| dtype: int64
|
| findall(self, pat, flags: 'int' = 0)
| Find all occurrences of pattern or regular expression in the
Series/Index.
|
| Equivalent to applying :func:`re.findall` to all the elements in the
Series/Index.
|
| Parameters
| -----
| pat : str
| Pattern or regular expression.
| flags : int, default 0
| Flags from ``re`` module, e.g. `re.IGNORECASE` (default is 0, which
means no flags).

```

```

|
| Returns
| -----
| Series/Index of lists of strings
| All non-overlapping matches of pattern or regular expression in each
| string of this Series/Index.
|
| See Also
| -----
| count : Count occurrences of pattern or regular expression in each
string
| of the Series/Index.
| extractall : For each string in the Series, extract groups from all
matches
| of regular expression and return a DataFrame with one row for each
| match and one column for each group.
| re.findall : The equivalent ``re`` function to all non-overlapping
matches
| of pattern or regular expression in string, as a list of strings.
|
| Examples
| -----
| >>> s = pd.Series(['Lion', 'Monkey', 'Rabbit'])
|
| The search for the pattern 'Monkey' returns one match:
|
| >>> s.str.findall('Monkey')
| 0 []
| 1 [Monkey]
| 2 []
| dtype: object
|
| On the other hand, the search for the pattern 'MONKEY' doesn't return
any
| match:
|
| >>> s.str.findall('MONKEY')
| 0 []
| 1 []
| 2 []
| dtype: object
|
| Flags can be added to the pattern or regular expression. For instance,
| to find the pattern 'MONKEY' ignoring the case:
|
| >>> import re
| >>> s.str.findall('MONKEY', flags=re.IGNORECASE)
| 0 []

```



```

1 [Monkey]
2 []
dtype: object

When the pattern matches more than one string in the Series, all matches
are returned:

>>> s.str.findall('on')
0 [on]
1 [on]
2 []
dtype: object

Regular expressions are supported too. For instance, the search for all
the strings ending with the word 'on' is shown next:

>>> s.str.findall('on$')
0 [on]
1 []
2 []
dtype: object

If the pattern is found more than once in the same string, then a list
of multiple strings is returned:

>>> s.str.findall('b')
0 []
1 []
2 [b, b]
dtype: object

fullmatch(self, pat, case: 'bool' = True, flags: 'int' = 0, na=None)
 Determine if each string entirely matches a regular expression.

Parameters

pat : str
 Character sequence or regular expression.
case : bool, default True
 If True, case sensitive.
flags : int, default 0 (no flags)
 Regex module flags, e.g. re.IGNORECASE.
na : scalar, optional
 Fill value for missing values. The default depends on dtype of the
 array. For object-dtype, ``numpy.nan`` is used. For ``StringDtype``,
 ``pandas.NA`` is used.

```

```

|
| Returns
| -----
| Series/Index/array of boolean values
|
| See Also
| -----
| match : Similar, but also returns `True` when only a *prefix* of the
string
| matches the regular expression.
| extract : Extract matched groups.
|
| Examples
| -----
| >>> ser = pd.Series(["cat", "duck", "dove"])
| >>> ser.str.fullmatch(r'd.+')
| 0 False
| 1 True
| 2 True
| dtype: bool
|
| get(self, i)
| Extract element from each component at specified position or with
specified key.
|
| Extract element from lists, tuples, dict, or strings in each element in
the
| Series/Index.
|
| Parameters
| -----
| i : int or hashable dict label
| Position or key of element to extract.
|
| Returns
| -----
| Series or Index
|
| Examples
| -----
| >>> s = pd.Series(["String",
| ... (1, 2, 3),
| ... ["a", "b", "c"],
| ... 123,
| ... -456,
| ... {1: "Hello", "2": "World"}])
| >>> s
| 0 String

```

```

1 (1, 2, 3)
2 [a, b, c]
3 123
4 -456
5 {1: 'Hello', '2': 'World'}
dtype: object

>>> s.str.get(1)
0 t
1 2
2 b
3 NaN
4 NaN
5 Hello
dtype: object

>>> s.str.get(-1)
0 g
1 3
2 c
3 NaN
4 NaN
5 None
dtype: object

Return element with given key

>>> s = pd.Series([{"name": "Hello", "value": "World"},
... {"name": "Goodbye", "value": "Planet"}])
>>> s.str.get('name')
0 Hello
1 Goodbye
dtype: object

get_dummies(self, sep: 'str' = '|')
Return DataFrame of dummy/indicator variables for Series.

Each string in Series is split by sep and returned as a DataFrame
of dummy/indicator variables.

Parameters

sep : str, default "|"
 String to split on.

Returns

DataFrame

```

Dummy variables corresponding to values of the Series.

See Also

-----  
get\_dummies : Convert categorical variable into dummy/indicator variables.

Examples

-----  
>>> pd.Series(['a|b', 'a', 'a|c']).str.get\_dummies()

	a	b	c
0	1	1	0
1	1	0	0
2	1	0	1

>>> pd.Series(['a|b', np.nan, 'a|c']).str.get\_dummies()

	a	b	c
0	1	1	0
1	0	0	0
2	1	0	1

index(self, sub, start: 'int' = 0, end=None)

Return lowest indexes in each string in Series/Index.

Each of the returned indexes corresponds to the position where the substring is fully contained between [start:end]. This is the same as ``str.find`` except instead of returning -1, it raises a ValueError when the substring is not found. Equivalent to standard ``str.index``.

Parameters

-----  
sub : str

Substring being searched.

start : int

Left edge index.

end : int

Right edge index.

Returns

-----  
Series or Index of object

See Also

-----  
rindex : Return highest indexes in each strings.

Examples

```

| -----
| For Series.str.index:
|
| >>> ser = pd.Series(["horse", "eagle", "donkey"])
| >>> ser.str.index("e")
| 0 4
| 1 0
| 2 4
| dtype: int64
|
| For Series.str.rindex:
|
| >>> ser = pd.Series(["Deer", "eagle", "Sheep"])
| >>> ser.str.rindex("e")
| 0 2
| 1 4
| 2 3
| dtype: int64
|
| isalnum(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are alphanumeric.
|
| This is equivalent to running the Python string method
| :meth:`str.isalnum` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.
| Series.str.isdecimal : Check whether all characters are decimal.
| Series.str.isspace : Check whether all characters are whitespace.
| Series.str.islower : Check whether all characters are lowercase.
| Series.str.isupper : Check whether all characters are uppercase.
| Series.str.istitle : Check whether all characters are titlecase.
|
| Examples
| -----
| **Checks for Alphabetic and Numeric Characters**

```

```

|
| >>> s1 = pd.Series(['one', 'one1', '1', ''])
|
| >>> s1.str.isalpha()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s1.str.isnumeric()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| >>> s1.str.isalnum()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| Note that checks against characters mixed with any additional
punctuation
| or whitespace will evaluate to false for an alphanumeric check.
|
| >>> s2 = pd.Series(['A B', '1.5', '3,000'])
| >>> s2.str.isalnum()
| 0 False
| 1 False
| 2 False
| dtype: bool
|
| **More Detailed Checks for Numeric Characters**
|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '3', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()

```

```

| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False

```

```

| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| isalpha(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are alphabetic.
|
| This is equivalent to running the Python string method
| :meth:`str.isalpha` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.
| Series.str.isdecimal : Check whether all characters are decimal.
| Series.str.isspace : Check whether all characters are whitespace.
| Series.str.islower : Check whether all characters are lowercase.
| Series.str.isupper : Check whether all characters are uppercase.
| Series.str.istitle : Check whether all characters are titlecase.

```



```

| Examples
| -----
| **Checks for Alphabetic and Numeric Characters**
|
| >>> s1 = pd.Series(['one', 'one1', '1', ''])
|
| >>> s1.str.isalpha()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s1.str.isnumeric()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| >>> s1.str.isalnum()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| Note that checks against characters mixed with any additional
punctuation
| or whitespace will evaluate to false for an alphanumeric check.
|
| >>> s2 = pd.Series(['A B', '1.5', '3,000'])
| >>> s2.str.isalnum()
| 0 False
| 1 False
| 2 False
| dtype: bool
|
| **More Detailed Checks for Numeric Characters**
|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers

```

```

| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True

```

```

| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| isdecimal(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are decimal.
|
| This is equivalent to running the Python string method
| :meth:`str.isdecimal` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.
| Series.str.isdecimal : Check whether all characters are decimal.
| Series.str.isspace : Check whether all characters are whitespace.
| Series.str.islower : Check whether all characters are lowercase.

```

```

Series.str.isupper : Check whether all characters are uppercase.
Series.str.istitle : Check whether all characters are titlecase.

Examples

Checks for Alphabetic and Numeric Characters

>>> s1 = pd.Series(['one', 'one1', '1', ''])

>>> s1.str.isalpha()
0 True
1 False
2 False
3 False
dtype: bool

>>> s1.str.isnumeric()
0 False
1 False
2 True
3 False
dtype: bool

>>> s1.str.isalnum()
0 True
1 True
2 True
3 False
dtype: bool

Note that checks against characters mixed with any additional
punctuation
or whitespace will evaluate to false for an alphanumeric check.

>>> s2 = pd.Series(['A B', '1.5', '3,000'])
>>> s2.str.isalnum()
0 False
1 False
2 False
dtype: bool

More Detailed Checks for Numeric Characters

There are several different but overlapping sets of numeric characters
that
can be checked for.

>>> s3 = pd.Series(['23', '³', ' ', ''])

```

```

|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])

```

```

|
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
|
| The ``s5.str.istitle`` method checks for whether all words are in title
are case (whether only the first letter of each word is capitalized). Words
|
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
|
| isdigit(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are digits.
|
|
| This is equivalent to running the Python string method
| :meth:`str.isdigit` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
|
| Returns
| -----
|
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
|
| See Also
| -----
|
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.

```

```

Series.str.isdecimal : Check whether all characters are decimal.
Series.str.isspace : Check whether all characters are whitespace.
Series.str.islower : Check whether all characters are lowercase.
Series.str.isupper : Check whether all characters are uppercase.
Series.str.istitle : Check whether all characters are titlecase.

Examples

Checks for Alphabetic and Numeric Characters

>>> s1 = pd.Series(['one', 'one1', '1', ''])

>>> s1.str.isalpha()
0 True
1 False
2 False
3 False
dtype: bool

>>> s1.str.isnumeric()
0 False
1 False
2 True
3 False
dtype: bool

>>> s1.str.isalnum()
0 True
1 True
2 True
3 False
dtype: bool

Note that checks against characters mixed with any additional
punctuation
or whitespace will evaluate to false for an alphanumeric check.

>>> s2 = pd.Series(['A B', '1.5', '3,000'])
>>> s2.str.isalnum()
0 False
1 False
2 False
dtype: bool

More Detailed Checks for Numeric Characters

There are several different but overlapping sets of numeric characters
that

```

```

| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|

```



```

| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| islower(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are lowercase.
|
| This is equivalent to running the Python string method
| :meth:`str.islower` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.

```

```

Series.str.isnumeric : Check whether all characters are numeric.
Series.str.isalnum : Check whether all characters are alphanumeric.
Series.str.isdigit : Check whether all characters are digits.
Series.str.isdecimal : Check whether all characters are decimal.
Series.str.isspace : Check whether all characters are whitespace.
Series.str.islower : Check whether all characters are lowercase.
Series.str.isupper : Check whether all characters are uppercase.
Series.str.istitle : Check whether all characters are titlecase.

Examples

Checks for Alphabetic and Numeric Characters

>>> s1 = pd.Series(['one', 'one1', '1', ''])

>>> s1.str.isalpha()
0 True
1 False
2 False
3 False
dtype: bool

>>> s1.str.isnumeric()
0 False
1 False
2 True
3 False
dtype: bool

>>> s1.str.isalnum()
0 True
1 True
2 True
3 False
dtype: bool

Note that checks against characters mixed with any additional
punctuation
or whitespace will evaluate to false for an alphanumeric check.

>>> s2 = pd.Series(['A B', '1.5', '3,000'])
>>> s2.str.isalnum()
0 False
1 False
2 False
dtype: bool

More Detailed Checks for Numeric Characters

```

```

|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True

```

```

| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| isnumeric(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are numeric.
|
| This is equivalent to running the Python string method
| :meth:`str.isnumeric` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|

```

See Also

-----

Series.str.isalpha : Check whether all characters are alphabetic.  
Series.str.isnumeric : Check whether all characters are numeric.  
Series.str.isalnum : Check whether all characters are alphanumeric.  
Series.str.isdigit : Check whether all characters are digits.  
Series.str.isdecimal : Check whether all characters are decimal.  
Series.str.isspace : Check whether all characters are whitespace.  
Series.str.islower : Check whether all characters are lowercase.  
Series.str.isupper : Check whether all characters are uppercase.  
Series.str.istitle : Check whether all characters are titlecase.

Examples

-----

**\*\*Checks for Alphabetic and Numeric Characters\*\***

```
>>> s1 = pd.Series(['one', 'one1', '1', ''])
```

```
>>> s1.str.isalpha()
```

```
0 True
1 False
2 False
3 False
dtype: bool
```

```
>>> s1.str.isnumeric()
```

```
0 False
1 False
2 True
3 False
dtype: bool
```

```
>>> s1.str.isalnum()
```

```
0 True
1 True
2 True
3 False
dtype: bool
```

Note that checks against characters mixed with any additional punctuation or whitespace will evaluate to false for an alphanumeric check.

```
>>> s2 = pd.Series(['A B', '1.5', '3,000'])
```

```
>>> s2.str.isalnum()
```

```
0 False
1 False
2 False
```

```

| dtype: bool
|
| **More Detailed Checks for Numeric Characters**
|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])

```

```

| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| isspace(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are whitespace.
|
| This is equivalent to running the Python string method
| :meth:`str.isspace` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the

```

original

```
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.
| Series.str.isdecimal : Check whether all characters are decimal.
| Series.str.isspace : Check whether all characters are whitespace.
| Series.str.islower : Check whether all characters are lowercase.
| Series.str.isupper : Check whether all characters are uppercase.
| Series.str.istitle : Check whether all characters are titlecase.
|
| Examples
| -----
| **Checks for Alphabetic and Numeric Characters**
|
| >>> s1 = pd.Series(['one', 'one1', '1', ''])
|
| >>> s1.str.isalpha()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s1.str.isnumeric()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| >>> s1.str.isalnum()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| Note that checks against characters mixed with any additional
punctuation
| or whitespace will evaluate to false for an alphanumeric check.
|
| >>> s2 = pd.Series(['A B', '1.5', '3,000'])
| >>> s2.str.isalnum()
```



```

| 0 False
| 1 False
| 2 False
| dtype: bool
|
| **More Detailed Checks for Numeric Characters**
|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|

```

```

| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
are case (whether only the first letter of each word is capitalized). Words
|
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| istitle(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are titlecase.
|
| This is equivalent to running the Python string method
| :meth:`str.istitle` for each element of the Series/Index. If a string
| has zero characters, ``False`` is returned for that check.
|
| Returns

```

```

| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.
| Series.str.isdecimal : Check whether all characters are decimal.
| Series.str.isspace : Check whether all characters are whitespace.
| Series.str.islower : Check whether all characters are lowercase.
| Series.str.isupper : Check whether all characters are uppercase.
| Series.str.istitle : Check whether all characters are titlecase.
|
| Examples
| -----
| **Checks for Alphabetic and Numeric Characters**
|
| >>> s1 = pd.Series(['one', 'one1', '1', ''])
|
| >>> s1.str.isalpha()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s1.str.isnumeric()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| >>> s1.str.isalnum()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| Note that checks against characters mixed with any additional
punctuation
| or whitespace will evaluate to false for an alphanumeric check.

```

```

|
|
| >>> s2 = pd.Series(['A B', '1.5', '3,000'])
| >>> s2.str.isalnum()
|
| 0 False
| 1 False
| 2 False
| dtype: bool
|
|
| **More Detailed Checks for Numeric Characters**
|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
|
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
|
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()
|
| 0 True
| 1 True
| 2 True

```

```

| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| isupper(self) from pandas.core.strings.accessor._map_and_wrap.<locals>
| Check whether all characters in each string are uppercase.
|
| This is equivalent to running the Python string method
| :meth:`str.isupper` for each element of the Series/Index. If a string

```

```

| has zero characters, ``False`` is returned for that check.
|
| Returns
| -----
| Series or Index of bool
| Series or Index of boolean values with the same length as the
original
| Series/Index.
|
| See Also
| -----
| Series.str.isalpha : Check whether all characters are alphabetic.
| Series.str.isnumeric : Check whether all characters are numeric.
| Series.str.isalnum : Check whether all characters are alphanumeric.
| Series.str.isdigit : Check whether all characters are digits.
| Series.str.isdecimal : Check whether all characters are decimal.
| Series.str.isspace : Check whether all characters are whitespace.
| Series.str.islower : Check whether all characters are lowercase.
| Series.str.isupper : Check whether all characters are uppercase.
| Series.str.istitle : Check whether all characters are titlecase.
|
| Examples
| -----
| **Checks for Alphabetic and Numeric Characters**
|
| >>> s1 = pd.Series(['one', 'one1', '1', ''])
|
| >>> s1.str.isalpha()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s1.str.isnumeric()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| >>> s1.str.isalnum()
| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool

```

```

| Note that checks against characters mixed with any additional
punctuation
| or whitespace will evaluate to false for an alphanumeric check.
|
| >>> s2 = pd.Series(['A B', '1.5', '3,000'])
| >>> s2.str.isalnum()
| 0 False
| 1 False
| 2 False
| dtype: bool
|
| **More Detailed Checks for Numeric Characters**
|
| There are several different but overlapping sets of numeric characters
that
| can be checked for.
|
| >>> s3 = pd.Series(['23', '³', ' ', ''])
|
| The ``s3.str.isdecimal`` method checks for characters used to form
numbers
| in base 10.
|
| >>> s3.str.isdecimal()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isdigit`` method is the same as ``s3.str.isdecimal`` but
also
| includes special digits, like superscripted and subscripted digits in
| unicode.
|
| >>> s3.str.isdigit()
| 0 True
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| The ``s.str.isnumeric`` method is the same as ``s3.str.isdigit`` but
also
| includes other characters that can represent quantities such as unicode
| fractions.
|
| >>> s3.str.isnumeric()

```

```

| 0 True
| 1 True
| 2 True
| 3 False
| dtype: bool
|
| **Checks for Whitespace**
|
| >>> s4 = pd.Series([' ', '\t\r\n ', ''])
| >>> s4.str.isspace()
| 0 True
| 1 True
| 2 False
| dtype: bool
|
| **Checks for Character Case**
|
| >>> s5 = pd.Series(['leopard', 'Golden Eagle', 'SNAKE', ''])
|
| >>> s5.str.islower()
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| >>> s5.str.isupper()
| 0 False
| 1 False
| 2 True
| 3 False
| dtype: bool
|
| The ``s5.str.istitle`` method checks for whether all words are in title
| case (whether only the first letter of each word is capitalized). Words
are
| assumed to be as any sequence of non-numeric characters separated by
| whitespace characters.
|
| >>> s5.str.istitle()
| 0 False
| 1 True
| 2 False
| 3 False
| dtype: bool
|
| join(self, sep: 'str')
| Join lists contained as elements in the Series/Index with passed

```



```

delimiter.
|
| If the elements of a Series are lists themselves, join the content of
these
| lists using the delimiter passed to the function.
| This function is an equivalent to :meth:`str.join`.
|
| Parameters
| -----
| sep : str
| Delimiter to use between list entries.
|
| Returns
| -----
| Series/Index: object
| The list entries concatenated by intervening occurrences of the
| delimiter.
|
| Raises
| -----
| AttributeError
| If the supplied Series contains neither strings nor lists.
|
| See Also
| -----
| str.join : Standard library version of this method.
| Series.str.split : Split strings around given separator/delimiter.
|
| Notes
| -----
| If any of the list items is not a string object, the result of the join
| will be `NaN`.
|
| Examples
| -----
| Example with a list that contains non-string elements.
|
| >>> s = pd.Series(['lion', 'elephant', 'zebra'],
| ... [1.1, 2.2, 3.3],
| ... ['cat', np.nan, 'dog'],
| ... ['cow', 4.5, 'goat'],
| ... ['duck', ['swan', 'fish'], 'guppy']])
| >>> s
| 0 [lion, elephant, zebra]
| 1 [1.1, 2.2, 3.3]
| 2 [cat, nan, dog]
| 3 [cow, 4.5, goat]
| 4 [duck, [swan, fish], guppy]

```

```

| dtype: object
|
| Join all lists using a '-'. The lists containing object(s) of types
other
| than str will produce a NaN.
|
| >>> s.str.join('-')
| 0 lion-elephant-zebra
| 1 NaN
| 2 NaN
| 3 NaN
| 4 NaN
| dtype: object
|
| len(self)
| Compute the length of each element in the Series/Index.
|
| The element may be a sequence (such as a string, tuple or list) or a
collection
| (such as a dictionary).
|
| Returns
| -----
| Series or Index of int
| A Series or Index of integer values indicating the length of each
| element in the Series or Index.
|
| See Also
| -----
| str.len : Python built-in function returning the length of an object.
| Series.size : Returns the length of the Series.
|
| Examples
| -----
| Returns the length (number of characters) in a string. Returns the
| number of entries for dictionaries, lists or tuples.
|
| >>> s = pd.Series(['dog',
| ... '',
| ... 5,
| ... {'foo' : 'bar'},
| ... [2, 3, 5, 7],
| ... ('one', 'two', 'three')])
| >>> s
| 0 dog
| 1
| 2 5
| 3 {'foo': 'bar'}

```

```

| 4 [2, 3, 5, 7]
| 5 (one, two, three)
| dtype: object
| >>> s.str.len()
| 0 3.0
| 1 0.0
| 2 NaN
| 3 1.0
| 4 4.0
| 5 3.0
| dtype: float64
|
| ljust(self, width: 'int', fillchar: 'str' = ' ')
| Pad right side of strings in the Series/Index.
|
| Equivalent to :meth:`str.ljust`.
|
| Parameters
| -----
| width : int
| Minimum width of resulting string; additional characters will be
filled
| with ``fillchar``.
| fillchar : str
| Additional character for filling, default is whitespace.
|
| Returns
| -----
| Series/Index of objects.
|
| Examples
| -----
| For Series.str.center:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.center(8, fillchar='.')
| 0 ..dog..
| 1 ..bird..
| 2 .mouse..
| dtype: object
|
| For Series.str.ljust:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.ljust(8, fillchar='.')
| 0 dog...
| 1 bird...
| 2 mouse...

```

```

| dtype: object
|
| For Series.str.rjust:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.rjust(8, fillchar='.')
| 0 ...dog
| 1 ...bird
| 2 ...mouse
| dtype: object
|
| lower(self)
| Convert strings in the Series/Index to lowercase.
|
| Equivalent to :meth:`str.lower`.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.lower : Converts all characters to lowercase.
| Series.str.upper : Converts all characters to uppercase.
| Series.str.title : Converts first character of each word to uppercase
and
| remaining to lowercase.
| Series.str.capitalize : Converts first character to uppercase and
| remaining to lowercase.
| Series.str.swapcase : Converts uppercase to lowercase and lowercase to
| uppercase.
| Series.str.casefold: Removes all case distinctions in the string.
|
| Examples
| -----
| >>> s = pd.Series(['lower', 'CAPITALS', 'this is a sentence',
'SwApCaSe'])
| >>> s
| 0 lower
| 1 CAPITALS
| 2 this is a sentence
| 3 SwApCaSe
| dtype: object
|
| >>> s.str.lower()
| 0 lower
| 1 capitals
| 2 this is a sentence

```

```

3 swapcase
dtype: object

>>> s.str.upper()
0 LOWER
1 CAPITALS
2 THIS IS A SENTENCE
3 SWAPCASE
dtype: object

>>> s.str.title()
0 Lower
1 Capitals
2 This Is A Sentence
3 Swapcase
dtype: object

>>> s.str.capitalize()
0 Lower
1 Capitals
2 This is a sentence
3 Swapcase
dtype: object

>>> s.str.swapcase()
0 LOWER
1 capitals
2 THIS IS A SENTENCE
3 sWaPcAsE
dtype: object

lstrip(self, to_strip=None)
 Remove leading characters.

 Strip whitespaces (including newlines) or a set of specified characters
 from each string in the Series/Index from left side.
 Replaces any non-strings in Series with NaNs.
 Equivalent to :meth:`str.lstrip`.

 Parameters

 to_strip : str or None, default None
 Specifying the set of characters to be removed.
 All combinations of this set of characters will be stripped.
 If None then whitespaces are removed.

 Returns

```

```

| Series or Index of object
|
| See Also
| -----
| Series.str.strip : Remove leading and trailing characters in
Series/Index.
| Series.str.lstrip : Remove leading characters in Series/Index.
| Series.str.rstrip : Remove trailing characters in Series/Index.
|
| Examples
| -----
| >>> s = pd.Series(['1. Ant. ', '2. Bee!\n', '3. Cat?\t', np.nan, 10,
True])
|
| >>> s
| 0 1. Ant.
| 1 2. Bee!\n
| 2 3. Cat?\t
| 3 NaN
| 4 10
| 5 True
| dtype: object
|
| >>> s.str.strip()
| 0 1. Ant.
| 1 2. Bee!
| 2 3. Cat?
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.lstrip('123.')
| 0 Ant.
| 1 Bee!\n
| 2 Cat?\t
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.rstrip('.!? \n\t')
| 0 1. Ant
| 1 2. Bee
| 2 3. Cat
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object

```

```

|
| >>> s.str.strip('123.!? \n\t')
| 0 Ant
| 1 Bee
| 2 Cat
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| match(self, pat: 'str', case: 'bool' = True, flags: 'int' = 0, na=None)
| Determine if each string starts with a match of a regular expression.
|
| Parameters
| -----
| pat : str
| Character sequence.
| case : bool, default True
| If True, case sensitive.
| flags : int, default 0 (no flags)
| Regex module flags, e.g. re.IGNORECASE.
| na : scalar, optional
| Fill value for missing values. The default depends on dtype of the
| array. For object-dtype, ``numpy.nan`` is used. For ``StringDtype``,
| ``pandas.NA`` is used.
|
| Returns
| -----
| Series/Index/array of boolean values
|
| See Also
| -----
| fullmatch : Stricter matching that requires the entire string to match.
| contains : Analogous, but less strict, relying on re.search instead of
| re.match.
| extract : Extract matched groups.
|
| Examples
| -----
| >>> ser = pd.Series(["horse", "eagle", "donkey"])
| >>> ser.str.match("e")
| 0 False
| 1 True
| 2 False
| dtype: bool
|
| normalize(self, form)
| Return the Unicode normal form for the strings in the Series/Index.

```

```

|
| For more information on the forms, see the
| :func:`unicodedata.normalize`.
|
| Parameters
| -----
| form : {'NFC', 'NFKC', 'NFD', 'NFKD'}
| Unicode form.
|
| Returns
| -----
| Series/Index of objects
|
| Examples
| -----
| >>> ser = pd.Series(['ñ'])
| >>> ser.str.normalize('NFC') == ser.str.normalize('NFD')
| 0 False
| dtype: bool
|
| pad(self, width: 'int', side: "Literal['left', 'right', 'both']" = 'left',
filled fillchar: 'str' = ' ')
| Pad strings in the Series/Index up to width.
|
| Parameters
| -----
| width : int
| Minimum width of resulting string; additional characters will be
filled
| with character defined in `fillchar`.
| side : {'left', 'right', 'both'}, default 'left'
| Side from which to fill resulting string.
| fillchar : str, default ' '
| Additional character for filling, default is whitespace.
|
| Returns
| -----
| Series or Index of object
| Returns Series or Index with minimum number of char in object.
|
| See Also
| -----
| Series.str.rjust : Fills the left side of strings with an arbitrary
| character. Equivalent to ``Series.str.pad(side='left')``.
| Series.str.ljust : Fills the right side of strings with an arbitrary
| character. Equivalent to ``Series.str.pad(side='right')``.
| Series.str.center : Fills both sides of strings with an arbitrary
| character. Equivalent to ``Series.str.pad(side='both')``.

```



```

| Series.str.zfill : Pad strings in the Series/Index by prepending '0'
| character. Equivalent to ``Series.str.pad(side='left',
fillchar='0')``.
|
| Examples
| -----
| >>> s = pd.Series(["caribou", "tiger"])
| >>> s
| 0 caribou
| 1 tiger
| dtype: object
|
| >>> s.str.pad(width=10)
| 0 caribou
| 1 tiger
| dtype: object
|
| >>> s.str.pad(width=10, side='right', fillchar='-')
| 0 caribou---
| 1 tiger-----
| dtype: object
|
| >>> s.str.pad(width=10, side='both', fillchar='-')
| 0 -caribou--
| 1 --tiger---
| dtype: object
|
| partition(self, sep: 'str' = ' ', expand: 'bool' = True)
| Split the string at the first occurrence of `sep`.
|
| This method splits the string at the first occurrence of `sep`,
| and returns 3 elements containing the part before the separator,
| the separator itself, and the part after the separator.
| If the separator is not found, return 3 elements containing the string
| itself, followed by two empty strings.
|
| Parameters
| -----
| sep : str, default whitespace
| String to split on.
| expand : bool, default True
| If True, return DataFrame/MultiIndex expanding dimensionality.
| If False, return Series/Index.
|
| Returns
| -----
| DataFrame/MultiIndex or Series/Index of objects

```

See Also

-----

`rpartition` : Split the string at the last occurrence of ``sep``.

`Series.str.split` : Split strings around given separators.

`str.partition` : Standard library version.

Examples

-----

```
>>> s = pd.Series(['Linda van der Berg', 'George Pitt-Rivers'])
```

```
>>> s
```

```
0 Linda van der Berg
```

```
1 George Pitt-Rivers
```

```
dtype: object
```

```
>>> s.str.partition()
```

```
 0 1 2
```

```
0 Linda van der Berg
```

```
1 George Pitt-Rivers
```

To partition by the last space instead of the first one:

```
>>> s.str.rpartition()
```

```
 0 1 2
```

```
0 Linda van der Berg
```

```
1 George Pitt-Rivers
```

To partition by something different than a space:

```
>>> s.str.partition('-')
```

```
 0 1 2
```

```
0 Linda van der Berg
```

```
1 George Pitt - Rivers
```

To return a Series containing tuples instead of a DataFrame:

```
>>> s.str.partition('-', expand=False)
```

```
0 (Linda van der Berg, ,)
```

```
1 (George Pitt, -, Rivers)
```

```
dtype: object
```

Also available on indices:

```
>>> idx = pd.Index(['X 123', 'Y 999'])
```

```
>>> idx
```

```
Index(['X 123', 'Y 999'], dtype='object')
```

Which will create a MultiIndex:

```

|
|
| >>> idx.str.partition()
| MultiIndex([('X', ' ', '123'),
| ('Y', ' ', '999')],
|)
|
| Or an index with tuples with ``expand=False``:
|
| >>> idx.str.partition(expand=False)
| Index([('X', ' ', '123'), ('Y', ' ', '999')], dtype='object')
|
| removeprefix(self, prefix: 'str')
| Remove a prefix from an object series.
|
| If the prefix is not present, the original string will be returned.
|
| Parameters
| -----
| prefix : str
| Remove the prefix of the string.
|
| Returns
| -----
| Series/Index: object
| The Series or Index with given prefix removed.
|
| See Also
| -----
| Series.str.removesuffix : Remove a suffix from an object series.
|
| Examples
| -----
| >>> s = pd.Series(["str_foo", "str_bar", "no_prefix"])
| >>> s
| 0 str_foo
| 1 str_bar
| 2 no_prefix
| dtype: object
| >>> s.str.removeprefix("str_")
| 0 foo
| 1 bar
| 2 no_prefix
| dtype: object
|
| >>> s = pd.Series(["foo_str", "bar_str", "no_suffix"])
| >>> s
| 0 foo_str
| 1 bar_str

```

```

2 no_suffix
dtype: object
>>> s.str.removesuffix("_str")
0 foo
1 bar
2 no_suffix
dtype: object

removesuffix(self, suffix: 'str')
 Remove a suffix from an object series.

 If the suffix is not present, the original string will be returned.

Parameters

suffix : str
 Remove the suffix of the string.

Returns

Series/Index: object
 The Series or Index with given suffix removed.

See Also

Series.str.removeprefix : Remove a prefix from an object series.

Examples

>>> s = pd.Series(["str_foo", "str_bar", "no_prefix"])
>>> s
0 str_foo
1 str_bar
2 no_prefix
dtype: object
>>> s.str.removeprefix("str_")
0 foo
1 bar
2 no_prefix
dtype: object

>>> s = pd.Series(["foo_str", "bar_str", "no_suffix"])
>>> s
0 foo_str
1 bar_str
2 no_suffix
dtype: object
>>> s.str.removesuffix("_str")

```

```

| 0 foo
| 1 bar
| 2 no_suffix
| dtype: object
|
| repeat(self, repeats)
| Duplicate each string in the Series or Index.
|
| Parameters
| -----
| repeats : int or sequence of int
| Same value for all (int) or different value per (sequence).
|
| Returns
| -----
| Series or pandas.Index
| Series or Index of repeated string objects specified by
| input parameter repeats.
|
| Examples
| -----
| >>> s = pd.Series(['a', 'b', 'c'])
| >>> s
| 0 a
| 1 b
| 2 c
| dtype: object
|
| Single int repeats string in Series
|
| >>> s.str.repeat(repeats=2)
| 0 aa
| 1 bb
| 2 cc
| dtype: object
|
| Sequence of int repeats corresponding string in Series
|
| >>> s.str.repeat(repeats=[1, 2, 3])
| 0 a
| 1 bb
| 2 ccc
| dtype: object
|
| replace(self, pat: 'str | re.Pattern', repl: 'str | Callable', n: 'int' =
-1, case: 'bool | None' = None, flags: 'int' = 0, regex: 'bool' = False)
| Replace each occurrence of pattern/regex in the Series/Index.
|

```

```

| Equivalent to :meth:`str.replace` or :func:`re.sub`, depending on
| the regex value.
|
| Parameters
| -----
|
| pat : str or compiled regex
| String can be a character sequence or regular expression.
| repl : str or callable
| Replacement string or a callable. The callable is passed the regex
| match object and must return a replacement string to be used.
| See :func:`re.sub`.
| n : int, default -1 (all)
| Number of replacements to make from start.
| case : bool, default None
| Determines if replace is case sensitive:
|
| - If True, case sensitive (the default if `pat` is a string)
| - Set to False for case insensitive
| - Cannot be set if `pat` is a compiled regex.
|
| flags : int, default 0 (no flags)
| Regex module flags, e.g. re.IGNORECASE. Cannot be set if `pat` is a
compiled
| regex.
| regex : bool, default False
| Determines if the passed-in pattern is a regular expression:
|
| - If True, assumes the passed-in pattern is a regular expression.
| - If False, treats the pattern as a literal string
| - Cannot be set to False if `pat` is a compiled regex or `repl` is
| a callable.
|
| Returns
| -----
|
| Series or Index of object
| A copy of the object with all matching occurrences of `pat` replaced
by
| `repl`.
|
| Raises
| -----
|
| ValueError
| * if `regex` is False and `repl` is a callable or `pat` is a
compiled
| regex
| * if `pat` is a compiled regex and `case` or `flags` is set
|
| Notes

```

```

| -----
| When `pat` is a compiled regex, all flags should be included in the
| compiled regex. Use of `case`, `flags`, or `regex=False` with a compiled
| regex will raise an error.
|
| Examples
| -----
| When `pat` is a string and `regex` is True, the given `pat`
| is compiled as a regex. When `repl` is a string, it replaces matching
| regex patterns as with :meth:`re.sub`. NaN value(s) in the Series are
| left as is:
|
| >>> pd.Series(['foo', 'fuz', np.nan]).str.replace('f.', 'ba',
regex=True)
| 0 bao
| 1 baz
| 2 NaN
| dtype: object
|
| When `pat` is a string and `regex` is False, every `pat` is replaced
with
| `repl` as with :meth:`str.replace`:
|
| >>> pd.Series(['f.o', 'fuz', np.nan]).str.replace('f.', 'ba',
regex=False)
| 0 bao
| 1 fuz
| 2 NaN
| dtype: object
|
| When `repl` is a callable, it is called on every `pat` using
| :func:`re.sub`. The callable should expect one positional argument
| (a regex object) and return a string.
|
| To get the idea:
|
| >>> pd.Series(['foo', 'fuz', np.nan]).str.replace('f', repr, regex=True)
| 0 <re.Match object; span=(0, 1), match='f'>oo
| 1 <re.Match object; span=(0, 1), match='f'>uz
| 2 NaN
| dtype: object
|
| Reverse every lowercase alphabetic word:
|
| >>> repl = lambda m: m.group(0)[::-1]
| >>> ser = pd.Series(['foo 123', 'bar baz', np.nan])
| >>> ser.str.replace(r'[a-z]+', repl, regex=True)
| 0 oof 123

```

```

1 rab zab
2 NaN
dtype: object

Using regex groups (extract second group and swap case):

>>> pat = r"(?P<one>\w+) (?P<two>\w+) (?P<three>\w+)"
>>> repl = lambda m: m.group('two').swapcase()
>>> ser = pd.Series(['One Two Three', 'Foo Bar Baz'])
>>> ser.str.replace(pat, repl, regex=True)
0 tW0
1 bAR
dtype: object

Using a compiled regex with flags

>>> import re
>>> regex_pat = re.compile(r'FUZ', flags=re.IGNORECASE)
>>> pd.Series(['foo', 'fuz', np.nan]).str.replace(regex_pat, 'bar',
regex=True)
0 foo
1 bar
2 NaN
dtype: object

rfind(self, sub, start: 'int' = 0, end=None)
 Return highest indexes in each strings in the Series/Index.

 Each of returned indexes corresponds to the position where the
 substring is fully contained between [start:end]. Return -1 on
 failure. Equivalent to standard :meth:`str.rfind`.

 Parameters

 sub : str
 Substring being searched.
 start : int
 Left edge index.
 end : int
 Right edge index.

 Returns

 Series or Index of int.

 See Also

 find : Return lowest indexes in each strings.

```



## Examples

-----

For Series.str.find:

```
>>> ser = pd.Series(["cow_", "duck_", "do_ve"])
>>> ser.str.find("_")
0 3
1 4
2 2
dtype: int64
```

For Series.str.rfind:

```
>>> ser = pd.Series(["_cow_", "duck_", "do_v_e"])
>>> ser.str.rfind("_")
0 4
1 4
2 4
dtype: int64
```

`rindex(self, sub, start: 'int' = 0, end=None)`

Return highest indexes in each string in Series/Index.

Each of the returned indexes corresponds to the position where the substring is fully contained between [start:end]. This is the same as `str.rfind` except instead of returning -1, it raises a `ValueError` when the substring is not found. Equivalent to standard `str.rindex`.

## Parameters

-----

`sub` : str

Substring being searched.

`start` : int

Left edge index.

`end` : int

Right edge index.

## Returns

-----

Series or Index of object

## See Also

-----

`index` : Return lowest indexes in each strings.

## Examples

```

| -----
| For Series.str.index:
|
| >>> ser = pd.Series(["horse", "eagle", "donkey"])
| >>> ser.str.index("e")
| 0 4
| 1 0
| 2 4
| dtype: int64
|
| For Series.str.rindex:
|
| >>> ser = pd.Series(["Deer", "eagle", "Sheep"])
| >>> ser.str.rindex("e")
| 0 2
| 1 4
| 2 3
| dtype: int64
|
| rjust(self, width: 'int', fillchar: 'str' = ' ')
| Pad left side of strings in the Series/Index.
|
| Equivalent to :meth:`str.rjust`.
|
| Parameters
| -----
| width : int
| Minimum width of resulting string; additional characters will be
filled
| with ``fillchar``.
| fillchar : str
| Additional character for filling, default is whitespace.
|
| Returns
| -----
| Series/Index of objects.
|
| Examples
| -----
| For Series.str.center:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.center(8, fillchar='.')
| 0 ..dog...
| 1 ..bird..
| 2 .mouse..
| dtype: object

```

```

| For Series.str.ljust:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.ljust(8, fillchar='.')
| 0 dog...
| 1 bird...
| 2 mouse...
| dtype: object
|
| For Series.str.rjust:
|
| >>> ser = pd.Series(['dog', 'bird', 'mouse'])
| >>> ser.str.rjust(8, fillchar='.')
| 0 ...dog
| 1 ...bird
| 2 ...mouse
| dtype: object
|
| rpartition(self, sep: 'str' = ' ', expand: 'bool' = True)
| Split the string at the last occurrence of `sep`.
|
| This method splits the string at the last occurrence of `sep`,
| and returns 3 elements containing the part before the separator,
| the separator itself, and the part after the separator.
| If the separator is not found, return 3 elements containing two empty
strings, followed by the string itself.
|
| Parameters
| -----
| sep : str, default whitespace
| String to split on.
| expand : bool, default True
| If True, return DataFrame/MultiIndex expanding dimensionality.
| If False, return Series/Index.
|
| Returns
| -----
| DataFrame/MultiIndex or Series/Index of objects
|
| See Also
| -----
| partition : Split the string at the first occurrence of `sep`.
| Series.str.split : Split strings around given separators.
| str.partition : Standard library version.
|
| Examples
| -----

```

```
>>> s = pd.Series(['Linda van der Berg', 'George Pitt-Rivers'])
>>> s
0 Linda van der Berg
1 George Pitt-Rivers
dtype: object
```

```
>>> s.str.partition()
 0 1 2
0 Linda van der Berg
1 George Pitt-Rivers
```

To partition by the last space instead of the first one:

```
>>> s.str.rpartition()
 0 1 2
0 Linda van der Berg
1 George Pitt-Rivers
```

To partition by something different than a space:

```
>>> s.str.partition('-')
 0 1 2
0 Linda van der Berg
1 George Pitt - Rivers
```

To return a Series containing tuples instead of a DataFrame:

```
>>> s.str.partition('-', expand=False)
0 (Linda van der Berg, ,)
1 (George Pitt, -, Rivers)
dtype: object
```

Also available on indices:

```
>>> idx = pd.Index(['X 123', 'Y 999'])
>>> idx
Index(['X 123', 'Y 999'], dtype='object')
```

Which will create a MultiIndex:

```
>>> idx.str.partition()
MultiIndex([(('X', ' ', '123'),
 ('Y', ' ', '999'))],
)
```

Or an index with tuples with ``expand=False``:

```
>>> idx.str.partition(expand=False)
```

```

| Index([('X', ' ', '123'), ('Y', ' ', '999')], dtype='object')
|
| rsplit(self, pat=None, *, n=-1, expand: 'bool' = False)
| Split strings around given separator/delimiter.
|
| Splits the string in the Series/Index from the end,
| at the specified delimiter string.
|
| Parameters
| -----
| pat : str, optional
| String to split on.
| If not specified, split on whitespace.
| n : int, default -1 (all)
| Limit number of splits in output.
| ``None``, 0 and -1 will be interpreted as return all splits.
| expand : bool, default False
| Expand the split strings into separate columns.
|
| - If ``True``, return DataFrame/MultiIndex expanding dimensionality.
| - If ``False``, return Series/Index, containing lists of strings.
|
| Returns
| -----
| Series, Index, DataFrame or MultiIndex
| Type matches caller unless ``expand=True`` (see Notes).
|
| See Also
| -----
| Series.str.split : Split strings around given separator/delimiter.
| Series.str.rsplit : Splits string around given separator/delimiter,
| starting from the right.
| Series.str.join : Join lists contained as elements in the Series/Index
| with passed delimiter.
| str.split : Standard library version for split.
| str.rsplit : Standard library version for rsplit.
|
| Notes
| -----
| The handling of the ``n`` keyword depends on the number of found splits:
|
| - If found splits > ``n``, make first ``n`` splits only
| - If found splits <= ``n``, make all splits
| - If for a certain row the number of found splits < ``n``,
| append ``None`` for padding up to ``n`` if ``expand=True``
|
| If using ``expand=True``, Series and Index callers return DataFrame and
| MultiIndex objects, respectively.

```

Examples

-----

```
>>> s = pd.Series(
... [
... "this is a regular sentence",
... "https://docs.python.org/3/tutorial/index.html",
... np.nan
...]
...)
>>> s
0 this is a regular sentence
1 https://docs.python.org/3/tutorial/index.html
2 NaN
dtype: object
```

In the default setting, the string is split by whitespace.

```
>>> s.str.split()
0 [this, is, a, regular, sentence]
1 [https://docs.python.org/3/tutorial/index.html]
2 NaN
dtype: object
```

Without the ``n`` parameter, the outputs of ``rsplit`` and ``split`` are identical.

```
>>> s.str.rsplit()
0 [this, is, a, regular, sentence]
1 [https://docs.python.org/3/tutorial/index.html]
2 NaN
dtype: object
```

The ``n`` parameter can be used to limit the number of splits on the delimiter. The outputs of ``split`` and ``rsplit`` are different.

```
>>> s.str.split(n=2)
0 [this, is, a regular sentence]
1 [https://docs.python.org/3/tutorial/index.html]
2 NaN
dtype: object
```

```
>>> s.str.rsplit(n=2)
0 [this is a, regular, sentence]
1 [https://docs.python.org/3/tutorial/index.html]
2 NaN
dtype: object
```

```

| The `pat` parameter can be used to split by other characters.
|
| >>> s.str.split(pat="/")
| 0 [this is a regular sentence]
| 1 [https:, , docs.python.org, 3, tutorial, index...
| 2 NaN
| dtype: object
|
| When using ``expand=True``, the split elements will expand out into
| separate columns. If NaN is present, it is propagated throughout
| the columns during the split.
|
| >>> s.str.split(expand=True)
|
| 0 1 2 3
4
| 0 this is a regular
sentence
| 1 https://docs.python.org/3/tutorial/index.html None None None
None
| 2 NaN NaN NaN NaN
NaN
|
| For slightly more complex use cases like splitting the html document
name
| from a url, a combination of parameter settings can be used.
|
| >>> s.str.rsplit("/", n=1, expand=True)
|
| 0 1
| 0 this is a regular sentence None
| 1 https://docs.python.org/3/tutorial index.html
| 2 NaN NaN
|
| rstrip(self, to_strip=None)
| Remove trailing characters.
|
| Strip whitespaces (including newlines) or a set of specified characters
| from each string in the Series/Index from right side.
| Replaces any non-strings in Series with NaNs.
| Equivalent to :meth:`str.rstrip`.
|
| Parameters
| -----
| to_strip : str or None, default None
| Specifying the set of characters to be removed.
| All combinations of this set of characters will be stripped.
| If None then whitespaces are removed.
|
| Returns

```

```

| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.strip : Remove leading and trailing characters in
Series/Index.
| Series.str.lstrip : Remove leading characters in Series/Index.
| Series.str.rstrip : Remove trailing characters in Series/Index.
|
| Examples
| -----
| >>> s = pd.Series(['1. Ant. ', '2. Bee!\n', '3. Cat?\t', np.nan, 10,
True])
| >>> s
| 0 1. Ant.
| 1 2. Bee!\n
| 2 3. Cat?\t
| 3 NaN
| 4 10
| 5 True
| dtype: object
|
| >>> s.str.strip()
| 0 1. Ant.
| 1 2. Bee!
| 2 3. Cat?
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.lstrip('123.')
| 0 Ant.
| 1 Bee!\n
| 2 Cat?\t
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.rstrip('!.? \n\t')
| 0 1. Ant
| 1 2. Bee
| 2 3. Cat
| 3 NaN
| 4 NaN
| 5 NaN

```



```

| dtype: object
|
| >>> s.str.strip('123.!? \n\t')
| 0 Ant
| 1 Bee
| 2 Cat
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| slice(self, start=None, stop=None, step=None)
| Slice substrings from each element in the Series or Index.
|
| Parameters
| -----
| start : int, optional
| Start position for slice operation.
| stop : int, optional
| Stop position for slice operation.
| step : int, optional
| Step size for slice operation.
|
| Returns
| -----
| Series or Index of object
| Series or Index from sliced substring from original string object.
|
| See Also
| -----
| Series.str.slice_replace : Replace a slice with a string.
| Series.str.get : Return element at position.
| Equivalent to `Series.str.slice(start=i, stop=i+1)` with `i`
| being the position.
|
| Examples
| -----
| >>> s = pd.Series(["koala", "dog", "chameleon"])
| >>> s
| 0 koala
| 1 dog
| 2 chameleon
| dtype: object
|
| >>> s.str.slice(start=1)
| 0 oala
| 1 og
| 2 hameleon

```

```

| dtype: object
|
| >>> s.str.slice(start=-1)
| 0 a
| 1 g
| 2 n
| dtype: object
|
| >>> s.str.slice(stop=2)
| 0 ko
| 1 do
| 2 ch
| dtype: object
|
| >>> s.str.slice(step=2)
| 0 kaa
| 1 dg
| 2 caeen
| dtype: object
|
| >>> s.str.slice(start=0, stop=5, step=3)
| 0 kl
| 1 d
| 2 cm
| dtype: object
|
| Equivalent behaviour to:
|
| >>> s.str[0:5:3]
| 0 kl
| 1 d
| 2 cm
| dtype: object
|
| slice_replace(self, start=None, stop=None, repl=None)
| Replace a positional slice of a string with another value.
|
| Parameters
| -----
| start : int, optional
| Left index position to use for the slice. If not specified (None),
| the slice is unbounded on the left, i.e. slice from the start
| of the string.
| stop : int, optional
| Right index position to use for the slice. If not specified (None),
| the slice is unbounded on the right, i.e. slice until the
| end of the string.
| repl : str, optional

```

```

| String for replacement. If not specified (None), the sliced region
| is replaced with an empty string.
|
| Returns
| -----
| Series or Index
| Same type as the original object.
|
| See Also
| -----
| Series.str.slice : Just slicing without replacement.
|
| Examples
| -----
| >>> s = pd.Series(['a', 'ab', 'abc', 'abdc', 'abcde'])
| >>> s
| 0 a
| 1 ab
| 2 abc
| 3 abdc
| 4 abcde
| dtype: object
|
| Specify just `start`, meaning replace `start` until the end of the
| string with `repl`.
|
| >>> s.str.slice_replace(1, repl='X')
| 0 aX
| 1 aX
| 2 aX
| 3 aX
| 4 aX
| dtype: object
|
| Specify just `stop`, meaning the start of the string to `stop` is
replaced
| with `repl`, and the rest of the string is included.
|
| >>> s.str.slice_replace(stop=2, repl='X')
| 0 X
| 1 X
| 2 Xc
| 3 Xdc
| 4 Xcde
| dtype: object
|
| Specify `start` and `stop`, meaning the slice from `start` to `stop` is
| replaced with `repl`. Everything before or after `start` and `stop` is

```

```

| included as is.
|
| >>> s.str.slice_replace(start=1, stop=3, repl='X')
| 0 aX
| 1 aX
| 2 aX
| 3 aXc
| 4 aXde
| dtype: object
|
| split(self, pat: 'str | re.Pattern | None' = None, *, n=-1, expand: 'bool' =
False, regex: 'bool | None' = None)
| Split strings around given separator/delimiter.
|
| Splits the string in the Series/Index from the beginning,
| at the specified delimiter string.
|
| Parameters
| -----
| pat : str or compiled regex, optional
| String or regular expression to split on.
| If not specified, split on whitespace.
| n : int, default -1 (all)
| Limit number of splits in output.
| ``None``, 0 and -1 will be interpreted as return all splits.
| expand : bool, default False
| Expand the split strings into separate columns.
|
| - If ``True``, return DataFrame/MultiIndex expanding dimensionality.
| - If ``False``, return Series/Index, containing lists of strings.
|
| regex : bool, default None
| Determines if the passed-in pattern is a regular expression:
|
| - If ``True``, assumes the passed-in pattern is a regular expression
| - If ``False``, treats the pattern as a literal string.
| - If ``None`` and `pat` length is 1, treats `pat` as a literal
string.
| - If ``None`` and `pat` length is not 1, treats `pat` as a regular
expression.
| - Cannot be set to False if `pat` is a compiled regex
|
| .. versionadded:: 1.4.0
|
| Returns
| -----
| Series, Index, DataFrame or MultiIndex
| Type matches caller unless ``expand=True`` (see Notes).

```

```

|
|
| Raises
| -----
| ValueError
| * if `regex` is False and `pat` is a compiled
regex
|
|
| See Also
| -----
| Series.str.split : Split strings around given separator/delimiter.
| Series.str.rsplit : Splits string around given separator/delimiter,
| starting from the right.
| Series.str.join : Join lists contained as elements in the Series/Index
| with passed delimiter.
| str.split : Standard library version for split.
| str.rsplit : Standard library version for rsplit.
|
| Notes
| -----
| The handling of the `n` keyword depends on the number of found splits:
|
| - If found splits > `n`, make first `n` splits only
| - If found splits <= `n`, make all splits
| - If for a certain row the number of found splits < `n`,
| append `None` for padding up to `n` if ``expand=True``
|
| If using ``expand=True``, Series and Index callers return DataFrame and
| MultiIndex objects, respectively.
|
| Use of `regex =False` with a `pat` as a compiled regex will raise an
error.
|
| Examples
| -----
| >>> s = pd.Series(
| ... [
| ... "this is a regular sentence",
| ... "https://docs.python.org/3/tutorial/index.html",
| ... np.nan
| ...]
| ...)
| >>> s
| 0 this is a regular sentence
| 1 https://docs.python.org/3/tutorial/index.html
| 2 NaN
| dtype: object
|
| In the default setting, the string is split by whitespace.

```

```

|
| >>> s.str.split()
| 0 [this, is, a, regular, sentence]
| 1 [https://docs.python.org/3/tutorial/index.html]
| 2 NaN
| dtype: object
|
| Without the `n` parameter, the outputs of `rsplit` and `split`
| are identical.
|
| >>> s.str.rsplit()
| 0 [this, is, a, regular, sentence]
| 1 [https://docs.python.org/3/tutorial/index.html]
| 2 NaN
| dtype: object
|
| The `n` parameter can be used to limit the number of splits on the
| delimiter. The outputs of `split` and `rsplit` are different.
|
| >>> s.str.split(n=2)
| 0 [this, is, a regular sentence]
| 1 [https://docs.python.org/3/tutorial/index.html]
| 2 NaN
| dtype: object
|
| >>> s.str.rsplit(n=2)
| 0 [this is a, regular, sentence]
| 1 [https://docs.python.org/3/tutorial/index.html]
| 2 NaN
| dtype: object
|
| The `pat` parameter can be used to split by other characters.
|
| >>> s.str.split(pat="/")
| 0 [this is a regular sentence]
| 1 [https:, , docs.python.org, 3, tutorial, index...]
| 2 NaN
| dtype: object
|
| When using ``expand=True``, the split elements will expand out into
| separate columns. If NaN is present, it is propagated throughout
| the columns during the split.
|
| >>> s.str.split(expand=True)
|
| 0 1 2 3
4
| 0 this is a regular
sentence

```

```

| 1 https://docs.python.org/3/tutorial/index.html None None None
None
| 2 NaN NaN NaN NaN
NaN
|
| For slightly more complex use cases like splitting the html document
name
| from a url, a combination of parameter settings can be used.
|
| >>> s.str.rsplitt("/", n=1, expand=True)
| 0 1
| 0 this is a regular sentence None
| 1 https://docs.python.org/3/tutorial index.html
| 2 NaN NaN
|
| Remember to escape special characters when explicitly using regular
expressions.
|
| >>> s = pd.Series(["foo and bar plus baz"])
| >>> s.str.split(r"and|plus", expand=True)
| 0 1 2
| 0 foo bar baz
|
| Regular expressions can be used to handle urls or file names.
| When `pat` is a string and ``regex=None`` (the default), the given `pat`
is compiled
| as a regex only if ``len(pat) != 1``.
|
| >>> s = pd.Series(['foojpgbar.jpg'])
| >>> s.str.split(r".", expand=True)
| 0 1
| 0 foojpgbar jpg
|
| >>> s.str.split(r"\.jpg", expand=True)
| 0 1
| 0 foojpgbar
|
| When ``regex=True``, `pat` is interpreted as a regex
|
| >>> s.str.split(r"\.jpg", regex=True, expand=True)
| 0 1
| 0 foojpgbar
|
| A compiled regex can be passed as `pat`
|
| >>> import re
| >>> s.str.split(re.compile(r"\.jpg"), expand=True)
| 0 1

```

```

| 0 foojpgbar
|
| When ``regex=False``, `pat` is interpreted as the string itself
|
| >>> s.str.split(r"\.jpg", regex=False, expand=True)
| 0
| 0 foojpgbar.jpg
|
| startswith(self, pat: 'str | tuple[str, ...]', na: 'Scalar | None' = None)
-> 'Series | Index'
| Test if the start of each string element matches a pattern.
|
| Equivalent to :meth:`str.startswith`.
|
| Parameters
| -----
| pat : str or tuple[str, ...]
| Character sequence or tuple of strings. Regular expressions are not
| accepted.
| na : object, default NaN
| Object shown if element tested is not a string. The default depends
| on dtype of the array. For object-dtype, ``numpy.nan`` is used.
| For ``StringDtype``, ``pandas.NA`` is used.
|
| Returns
| -----
| Series or Index of bool
| A Series of booleans indicating whether the given pattern matches
| the start of each string element.
|
| See Also
| -----
| str.startswith : Python standard library string method.
| Series.str.endswith : Same as startswith, but tests the end of string.
| Series.str.contains : Tests if string element contains a pattern.
|
| Examples
| -----
| >>> s = pd.Series(['bat', 'Bear', 'cat', np.nan])
| >>> s
| 0 bat
| 1 Bear
| 2 cat
| 3 NaN
| dtype: object
|
| >>> s.str.startswith('b')
| 0 True

```



```

| 1 False
| 2 False
| 3 NaN
| dtype: object
|
| >>> s.str.startswith(('b', 'B'))
| 0 True
| 1 True
| 2 False
| 3 NaN
| dtype: object
|
| Specifying `na` to be `False` instead of `NaN`.
|
| >>> s.str.startswith('b', na=False)
| 0 True
| 1 False
| 2 False
| 3 False
| dtype: bool
|
| strip(self, to_strip=None)
| Remove leading and trailing characters.
|
| Strip whitespaces (including newlines) or a set of specified characters
| from each string in the Series/Index from left and right sides.
| Replaces any non-strings in Series with NaNs.
| Equivalent to :meth:`str.strip`.
|
| Parameters
| -----
| to_strip : str or None, default None
| Specifying the set of characters to be removed.
| All combinations of this set of characters will be stripped.
| If None then whitespaces are removed.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.strip : Remove leading and trailing characters in
Series/Index.
| Series.str.lstrip : Remove leading characters in Series/Index.
| Series.str.rstrip : Remove trailing characters in Series/Index.
|
| Examples

```

```

| -----
| >>> s = pd.Series(['1. Ant. ', '2. Bee!\n', '3. Cat?\t', np.nan, 10,
True])
|
| >>> s
| 0 1. Ant.
| 1 2. Bee!\n
| 2 3. Cat?\t
| 3 NaN
| 4 10
| 5 True
| dtype: object
|
| >>> s.str.strip()
| 0 1. Ant.
| 1 2. Bee!
| 2 3. Cat?
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.lstrip('123.')
| 0 Ant.
| 1 Bee!\n
| 2 Cat?\t
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.rstrip('!.? \n\t')
| 0 1. Ant
| 1 2. Bee
| 2 3. Cat
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|
| >>> s.str.strip('123.!? \n\t')
| 0 Ant
| 1 Bee
| 2 Cat
| 3 NaN
| 4 NaN
| 5 NaN
| dtype: object
|

```

```

| swapcase(self)
| Convert strings in the Series/Index to be swapcased.
|
| Equivalent to :meth:`str.swapcase`.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.lower : Converts all characters to lowercase.
| Series.str.upper : Converts all characters to uppercase.
| Series.str.title : Converts first character of each word to uppercase
and
| remaining to lowercase.
| Series.str.capitalize : Converts first character to uppercase and
| remaining to lowercase.
| Series.str.swapcase : Converts uppercase to lowercase and lowercase to
| uppercase.
| Series.str.casefold: Removes all case distinctions in the string.
|
| Examples
| -----
| >>> s = pd.Series(['lower', 'CAPITALS', 'this is a sentence',
'SwApCaSe'])
| >>> s
| 0 lower
| 1 CAPITALS
| 2 this is a sentence
| 3 SwApCaSe
| dtype: object
|
| >>> s.str.lower()
| 0 lower
| 1 capitals
| 2 this is a sentence
| 3 swapcase
| dtype: object
|
| >>> s.str.upper()
| 0 LOWER
| 1 CAPITALS
| 2 THIS IS A SENTENCE
| 3 SWAPCASE
| dtype: object
|
| >>> s.str.title()

```

```

| 0 Lower
| 1 Capitals
| 2 This Is A Sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.capitalize()
| 0 Lower
| 1 Capitals
| 2 This is a sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.swapcase()
| 0 LOWER
| 1 capitals
| 2 THIS IS A SENTENCE
| 3 sWaPcAsE
| dtype: object
|
| title(self)
| Convert strings in the Series/Index to titlecase.
|
| Equivalent to :meth:`str.title`.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.lower : Converts all characters to lowercase.
| Series.str.upper : Converts all characters to uppercase.
| Series.str.title : Converts first character of each word to uppercase
and
| remaining to lowercase.
| Series.str.capitalize : Converts first character to uppercase and
| remaining to lowercase.
| Series.str.swapcase : Converts uppercase to lowercase and lowercase to
| uppercase.
| Series.str.casefold: Removes all case distinctions in the string.
|
| Examples
| -----
| >>> s = pd.Series(['lower', 'CAPITALS', 'this is a sentence',
'SwApCaSe'])
| >>> s
| 0 lower

```

```

| 1 CAPITALS
| 2 this is a sentence
| 3 SwApCaSe
| dtype: object
|
| >>> s.str.lower()
| 0 lower
| 1 capitals
| 2 this is a sentence
| 3 swapcase
| dtype: object
|
| >>> s.str.upper()
| 0 LOWER
| 1 CAPITALS
| 2 THIS IS A SENTENCE
| 3 SWAPCASE
| dtype: object
|
| >>> s.str.title()
| 0 Lower
| 1 Capitals
| 2 This Is A Sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.capitalize()
| 0 Lower
| 1 Capitals
| 2 This is a sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.swapcase()
| 0 LOWER
| 1 capitals
| 2 THIS IS A SENTENCE
| 3 sWaPcAsE
| dtype: object
|
| translate(self, table)
| Map all characters in the string through the given mapping table.
|
| Equivalent to standard :meth:`str.translate`.
|
| Parameters
| -----
| table : dict

```

```

| Table is a mapping of Unicode ordinals to Unicode ordinals, strings,
or
| None. Unmapped characters are left untouched.
| Characters mapped to None are deleted. :meth:`str.maketrans` is a
| helper function for making translation tables.
|
| Returns
| -----
| Series or Index
|
| Examples
| -----
| >>> ser = pd.Series(["El niño", "Françoise"])
| >>> mytable = str.maketrans({'ñ': 'n', 'ç': 'c'})
| >>> ser.str.translate(mytable)
| 0 El nino
| 1 Francoise
| dtype: object
|
| upper(self)
| Convert strings in the Series/Index to uppercase.
|
| Equivalent to :meth:`str.upper`.
|
| Returns
| -----
| Series or Index of object
|
| See Also
| -----
| Series.str.lower : Converts all characters to lowercase.
| Series.str.upper : Converts all characters to uppercase.
| Series.str.title : Converts first character of each word to uppercase
and
| remaining to lowercase.
| Series.str.capitalize : Converts first character to uppercase and
| remaining to lowercase.
| Series.str.swapcase : Converts uppercase to lowercase and lowercase to
| uppercase.
| Series.str.casefold: Removes all case distinctions in the string.
|
| Examples
| -----
| >>> s = pd.Series(['lower', 'CAPITALS', 'this is a sentence',
'SwApCaSe'])
| >>> s
| 0 lower
| 1 CAPITALS

```

```

| 2 this is a sentence
| 3 SwApCaSe
| dtype: object
|
| >>> s.str.lower()
| 0 lower
| 1 capitals
| 2 this is a sentence
| 3 swapcase
| dtype: object
|
| >>> s.str.upper()
| 0 LOWER
| 1 CAPITALS
| 2 THIS IS A SENTENCE
| 3 SWAPCASE
| dtype: object
|
| >>> s.str.title()
| 0 Lower
| 1 Capitals
| 2 This Is A Sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.capitalize()
| 0 Lower
| 1 Capitals
| 2 This is a sentence
| 3 Swapcase
| dtype: object
|
| >>> s.str.swapcase()
| 0 LOWER
| 1 capitals
| 2 THIS IS A SENTENCE
| 3 sWaPcAsE
| dtype: object
|
| wrap(self, width: 'int', **kwargs)
| Wrap strings in Series/Index at specified line width.
|
| This method has the same keyword parameters and defaults as
| :class:`textwrap.TextWrapper`.
|
| Parameters
| -----
| width : int

```

```

| Maximum line width.
| expand_tabs : bool, optional
| If True, tab characters will be expanded to spaces (default: True).
| replace_whitespace : bool, optional
| If True, each whitespace character (as defined by string.whitespace)
| remaining after tab expansion will be replaced by a single space
| (default: True).
| drop_whitespace : bool, optional
| If True, whitespace that, after wrapping, happens to end up at the
| beginning or end of a line is dropped (default: True).
| break_long_words : bool, optional
| If True, then words longer than width will be broken in order to
ensure
| that no lines are longer than width. If it is false, long words will
| not be broken, and some lines may be longer than width (default:
True).
| break_on_hyphens : bool, optional
| If True, wrapping will occur preferably on whitespace and right
after
| hyphens in compound words, as it is customary in English. If false,
| only whitespaces will be considered as potentially good places for
line
| breaks, but you need to set break_long_words to false if you want
truly
| insecable words (default: True).
|
| Returns
| -----
| Series or Index
|
| Notes
| -----
| Internally, this method uses a :class:`textwrap.TextWrapper` instance
with
| default settings. To achieve behavior matching R's stringr library
str_wrap
| function, use the arguments:
|
| - expand_tabs = False
| - replace_whitespace = True
| - drop_whitespace = True
| - break_long_words = False
| - break_on_hyphens = False
|
| Examples
| -----
| >>> s = pd.Series(['line to be wrapped', 'another line to be wrapped'])
| >>> s.str.wrap(12)

```



```

0 line to be\nwrapped
1 another line\nto be\nwrapped
dtype: object

zfill(self, width: 'int')
 Pad strings in the Series/Index by prepending '0' characters.

 Strings in the Series/Index are padded with '0' characters on the
 left of the string to reach a total string length `width`. Strings
 in the Series/Index with length greater or equal to `width` are
 unchanged.

 Parameters

 width : int
 Minimum length of resulting string; strings with length less
 than `width` be prepended with '0' characters.

 Returns

 Series/Index of objects.

 See Also

 Series.str.rjust : Fills the left side of strings with an arbitrary
 character.
 Series.str.ljust : Fills the right side of strings with an arbitrary
 character.
 Series.str.pad : Fills the specified sides of strings with an arbitrary
 character.
 Series.str.center : Fills both sides of strings with an arbitrary
 character.

 Notes

 Differs from :meth:`str.zfill` which has special handling
 for '+'/'-' in the string.

 Examples

 >>> s = pd.Series(['-1', '1', '1000', 10, np.nan])
 >>> s
0 -1
1 1
2 1000
3 10
4 NaN
dtype: object

```

```
|
| Note that ``10`` and ``NaN`` are not strings, therefore they are
| converted to ``NaN``. The minus sign in ``'-1'`` is treated as a
| special character and the zero is added to the right of it
| (:meth:`str.zfill` would have moved it to the left). ``1000``
| remains unchanged as it is longer than `width`.
|
| >>> s.str.zfill(3)
| 0 -01
| 1 001
| 2 1000
| 3 NaN
| 4 NaN
| dtype: object
|
| -----
| Data and other attributes defined here:
|
| __annotations__ = {'_doc_args': 'dict[str, dict[str, str]]'}
|
| -----
| Methods inherited from pandas.core.base.NoNewAttributesMixin:
|
| __setattr__(self, key: 'str', value) -> 'None'
| Implement setattr(self, name, value).
|
| -----
| Data descriptors inherited from pandas.core.base.NoNewAttributesMixin:
|
| __dict__
| dictionary for instance variables
|
| __weakref__
| list of weak references to the object
```

```
[]: #####
df['discounted_price']
#####
```

```
[]: 0 399.0
 1 199.0
 2 199.0
 3 329.0
 4 154.0
 ...
1460 379.0
```

```

1461 2280.0
1462 2219.0
1463 1399.0
1464 2863.0
Name: discounted_price, Length: 1465, dtype: float64

```

```

[]: #####
df['discount_percentage']
#####

```

```

[]: 0 64%
 1 43%
 2 90%
 3 53%
 4 61%
 ...
1460 59%
1461 25%
1462 28%
1463 26%
1464 22%
Name: discount_percentage, Length: 1465, dtype: object

```

```

[]: # Changing Datatype and values in Discount Percentage

df['discount_percentage'] = df['discount_percentage'].str.replace('%', '').
 .astype('float64')

df['discount_percentage'] = df['discount_percentage'] / 100

df['discount_percentage'].head()

```

```

[]: 0 0.64
 1 0.43
 2 0.90
 3 0.53
 4 0.61
Name: discount_percentage, dtype: float64

```

```

[]: # Finding unusual string in rating column
df['rating'].value_counts()

```

```

[]: rating
4.1 244
4.3 230
4.2 228
4.0 129

```

```

3.9 123
4.4 123
3.8 86
4.5 75
4 52
3.7 42
3.6 35
3.5 26
4.6 17
3.3 16
3.4 10
4.7 6
3.1 4
3.0 3
4.8 3
5.0 3
2.8 2
3.2 2
2.3 1
| 1
2 1
3 1
2.6 1
2.9 1
Name: count, dtype: int64

```

```

[]: #####
 df['rating']
 #####

```

```

[]: 0 4.2
 1 4.0
 2 3.9
 3 4.2
 4 4.2
 ...
 1460 4
 1461 4.1
 1462 3.6
 1463 4
 1464 4.3
Name: rating, Length: 1465, dtype: object

```

```

[]: # Check the strange row
 df.query('rating == "|"')

```

```
[]: product_id product_name \
1279 B08L12N5H1 Eureka Forbes car Vac 100 Watts Powerful Sucti...

 category discounted_price \
1279 Home&Kitchen|Kitchen&HomeAppliances|Vacuum,Cle... 2099.0

 actual_price discount_percentage rating rating_count \
1279 2499.0 0.16 | 992

 about_product \
1279 No Installation is provided for this product|1...

 user_id \
1279 AGTDSNT2FKVYEPDPXAA673AIS44A,AER2XFSWNN4LAUCJ5...

 user_name \
1279 Divya,Dr Nefario,Deekshith,Preeti,Prasanth R,P...

 review_id \
1279 R2KKTKM4M9RDVJ,R10692MZOBTE79,R2WRSEWL56SOS4,R...

 review_title \
1279 Decent product,doesn't pick up sand,Ok ok,Must...

 review_content \
1279 Does the job well,doesn't work on sand. though...

 img_link \
1279 https://m.media-amazon.com/images/W/WEBP_40237...

 product_link
1279 https://www.amazon.in/Eureka-Forbes-Vacuum-Cle...
```

```
[]: # Changing Rating Columns Data Type
```

```
df['rating'] = df['rating'].str.replace('|', '3.9').astype('float64')
```

```
[]: # Changing 'rating_count' Column Data Type
```

```
df['rating_count'] = df['rating_count'].str.replace(',', '').astype('float64')
```

```
[]: #####
```

```
df['rating_count']
```

```
#####
```

```
[]: 0 24,269
 1 43,994
```

```

2 7,928
3 94,363
4 16,905
...
1460 1,090
1461 4,118
1462 468
1463 8,031
1464 6,987
Name: rating_count, Length: 1465, dtype: object

```

```
[]: df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1465 entries, 0 to 1464
Data columns (total 16 columns):
Column Non-Null Count Dtype
--- -
0 product_id 1465 non-null object
1 product_name 1465 non-null object
2 category 1465 non-null object
3 discounted_price 1465 non-null float64
4 actual_price 1465 non-null float64
5 discount_percentage 1465 non-null float64
6 rating 1465 non-null float64
7 rating_count 1463 non-null float64
8 about_product 1465 non-null object
9 user_id 1465 non-null object
10 user_name 1465 non-null object
11 review_id 1465 non-null object
12 review_title 1465 non-null object
13 review_content 1465 non-null object
14 img_link 1465 non-null object
15 product_link 1465 non-null object
dtypes: float64(5), object(11)
memory usage: 183.3+ KB

```

```
[]: # Descriptive Statistics
```

```
[]: # Descriptive statistics are a collection of quantitative measures that
 ↳ summarize and describe the main characteristic of a dataset
```

```
[]: df.describe() # Note there are four columns only displayed because we converted
 ↳ only 4 to float datatype and statistics functions are only applied to
 ↳ numerical values so only 4 are displayed
```

```
[]: discounted_price actual_price discount_percentage rating \
count 1465.00 1465.00 1465.00 1465.00
mean 3125.31 5444.99 0.48 4.10
std 6944.30 10874.83 0.22 0.29
min 39.00 39.00 0.00 2.00
25% 325.00 800.00 0.32 4.00
50% 799.00 1650.00 0.50 4.10
75% 1999.00 4295.00 0.63 4.30
max 77990.00 139900.00 0.94 5.00

 rating_count
count 1463.00
mean 18295.54
std 42753.86
min 2.00
25% 1186.00
50% 5179.00
75% 17336.50
max 426973.00
```

```
[]: # Dealing with the missing values
```

```
[]: # Missing Values
df.isnull().sum().sort_values(ascending = False)
```

```
[]: rating_count 2
product_id 0
category 0
product_name 0
discounted_price 0
actual_price 0
discount_percentage 0
rating 0
about_product 0
user_id 0
user_name 0
review_id 0
review_title 0
review_content 0
img_link 0
product_link 0
dtype: int64
```

```
[]: # Finding missing values percentage in the data
round(df.isnull().sum() / len(df) * 100, 2).sort_values(ascending=False)
```

```
[]: rating_count 0.14
 product_id 0.00
 category 0.00
 product_name 0.00
 discounted_price 0.00
 actual_price 0.00
 discount_percentage 0.00
 rating 0.00
 about_product 0.00
 user_id 0.00
 user_name 0.00
 review_id 0.00
 review_title 0.00
 review_content 0.00
 img_link 0.00
 product_link 0.00
 dtype: float64
```

```
[]: # Find total number of missing values
 df.isnull().sum().sum()
```

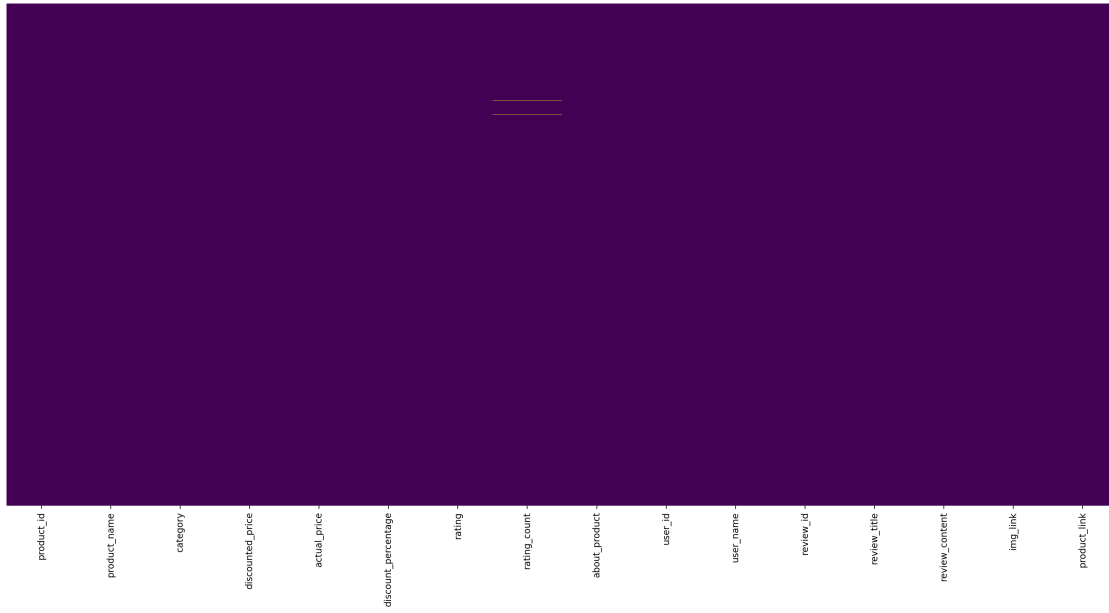
```
[]: np.int64(2)
```

```
[]: # Let's plot the missing values

 # make a figure size
 plt.figure(figsize=(22, 10))
 # plot the null values in each column
 sns.heatmap(df.isnull(), yticklabels=False, cbar=False, cmap='viridis')
```

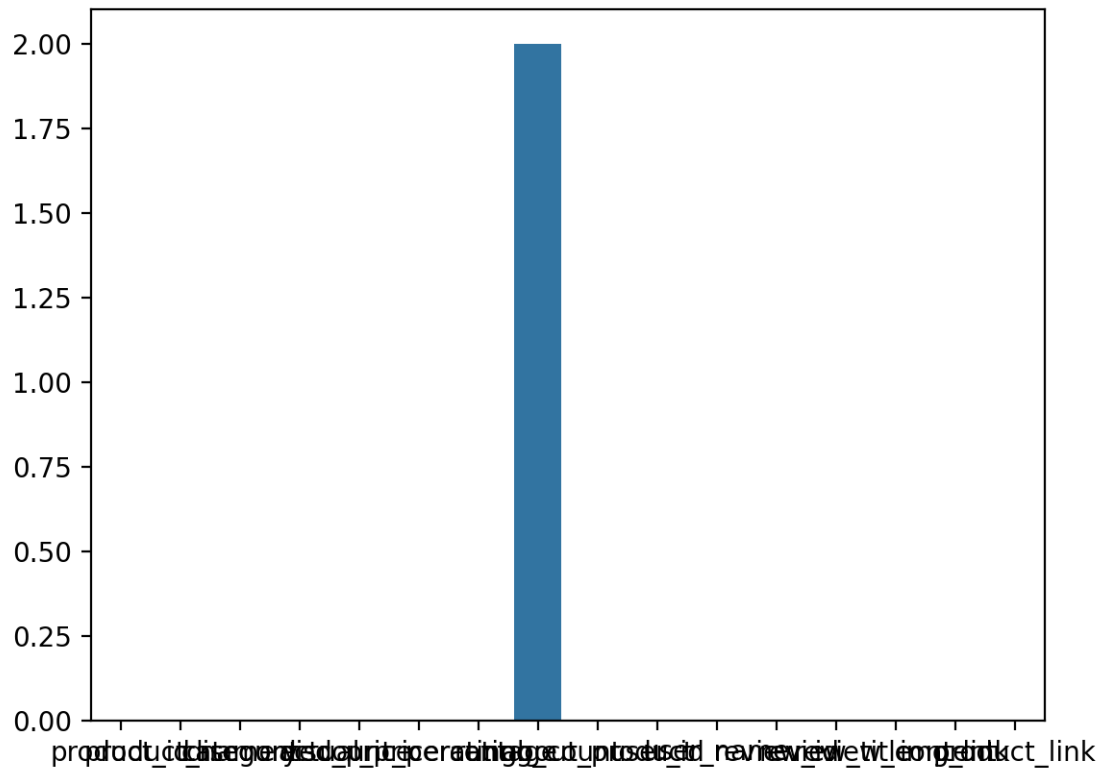
```
[]: <Axes: >
```





```
[]: #####
sns.barplot(df.isnull().sum())
#####
```

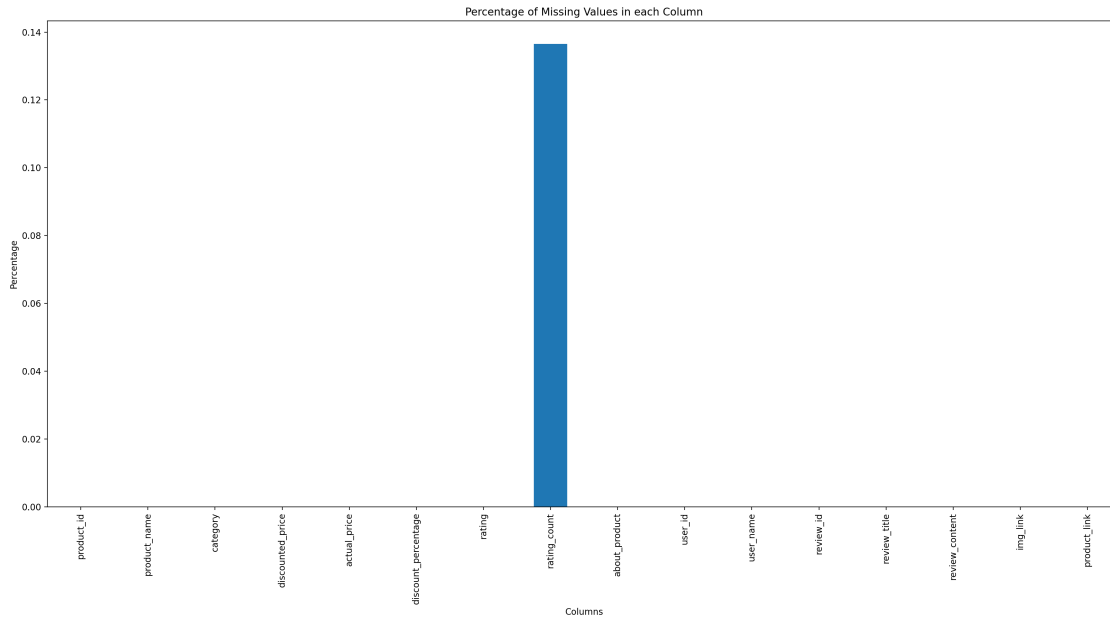
```
[]: <Axes: >
```



```
[]: # Plot the missing values by percentage

plt.figure(figsize=(22, 10))
plot the null values by their percentage in each column
missing_percentage = df.isnull().sum()/len(df)*100
missing_percentage.plot(kind='bar')
add the labels
plt.xlabel('Columns')
plt.ylabel('Percentage')
plt.title('Percentage of Missing Values in each Column')
```

```
[]: Text(0.5, 1.0, 'Percentage of Missing Values in each Column')
```



```
[]: #####
missing_percentage
#####
```

```
[]: product_id 0.00
product_name 0.00
category 0.00
discounted_price 0.00
actual_price 0.00
discount_percentage 0.00
rating 0.00
rating_count 0.14
about_product 0.00
user_id 0.00
user_name 0.00
review_id 0.00
review_title 0.00
review_content 0.00
img_link 0.00
product_link 0.00
dtype: float64
```

```
[]: # We are only viewing the rows where there are null values in the column
```

```
[]: df[df['rating_count'].isnull()].head(5)
```

```

[]: product_id product_name \
282 B0B94JPY2N Amazon Brand - Solimo 65W Fast Charging Braide...
324 B0BQRJ3C47 REDTECH USB-C to Lightning Cable 3.3FT, [Apple...

 category discounted_price \
282 Computers&Accessories|Accessories&Peripherals|... 199.0
324 Computers&Accessories|Accessories&Peripherals|... 249.0

 actual_price discount_percentage rating rating_count \
282 999.0 0.80 3.0 NaN
324 999.0 0.75 5.0 NaN

 about_product \
282 USB C to C Cable: This cable has type C connec...
324 [The Fastest Charge] - This iPhone USB C cabl...

 user_id user_name review_id \
282 AE7CFHY23VAJT2FI4NZKKP6GS2UQ Pranav RUB7U91HVZ30
324 AGJC505H5BBXWUV7WRIEI00R3TVQ Abdul Gafur RQXD5SAMMPC6L

 review_title \
282 The cable works but is not 65W as advertised
324 Awesome Product

 review_content \
282 I have a pd supported car charger and I bought...
324 Quick delivery.Awesome ProductPacking was good...

 img_link \
282 https://m.media-amazon.com/images/W/WEBP_40237...
324 https://m.media-amazon.com/images/I/31-q0xhaTA...

 product_link
282 https://www.amazon.in/Amazon-Brand-Charging-Su...
324 https://www.amazon.in/REDTECH-Lightning-Certif...

```

```

[]: # Impute missing values
df['rating_count'] = df.rating_count.fillna(value=df['rating_count'].median())

[]: df.isnull().sum().sort_values(ascending=False)

```

```

[]: product_id 0
 product_name 0
 category 0
 discounted_price 0
 actual_price 0
 discount_percentage 0

```

```

rating 0
rating_count 0
about_product 0
user_id 0
user_name 0
review_id 0
review_title 0
review_content 0
img_link 0
product_link 0
dtype: int64

```

```
[]: # Milestone 1: We have cleaned the dataset from null values
```

```
[]: # Finding Duplications and Analyse them
```

```
[]: # Find Duplicate
df.duplicated().any()
```

```
[]: np.False_
```

```
[]: #####
df.duplicated()
#####
```

```
[]: 0 False
1 False
2 False
3 False
4 False
...
1460 False
1461 False
1462 False
1463 False
1464 False
Length: 1465, dtype: bool
```

```
[]: #####
help(df.any)
#####
```

Help on method any in module pandas.core.frame:

```

any(*, axis: 'Axis | None' = 0, bool_only: 'bool' = False, skipna: 'bool' =
True, **kwargs) -> 'Series | bool' method of pandas.core.frame.DataFrame
instance

```

Return whether any element is True, potentially over an axis.

Returns False unless there is at least one element within a series or along a Dataframe axis that is True or equivalent (e.g. non-zero or non-empty).

#### Parameters

-----

axis : {0 or 'index', 1 or 'columns', None}, default 0

Indicate which axis or axes should be reduced. For `Series` this parameter is unused and defaults to 0.

\* 0 / 'index' : reduce the index, return a Series whose index is the original column labels.

\* 1 / 'columns' : reduce the columns, return a Series whose index is the original index.

\* None : reduce all axes, return a scalar.

bool\_only : bool, default False

Include only boolean columns. Not implemented for Series.

skipna : bool, default True

Exclude NA/null values. If the entire row/column is NA and skipna is True, then the result will be False, as for an empty row/column.

If skipna is False, then NA are treated as True, because these are not equal to zero.

\*\*kwargs : any, default None

Additional keywords have no effect but might be accepted for compatibility with NumPy.

#### Returns

-----

Series or DataFrame

If level is specified, then, DataFrame is returned; otherwise, Series is returned.

#### See Also

-----

numpy.any : Numpy version of this method.

Series.any : Return whether any element is True.

Series.all : Return whether all elements are True.

DataFrame.any : Return whether any element is True over requested axis.

DataFrame.all : Return whether all elements are True over requested axis.

#### Examples

-----

**\*\*Series\*\***

For Series input, the output is a scalar indicating whether any element is True.

```
>>> pd.Series([False, False]).any()
False
>>> pd.Series([True, False]).any()
True
>>> pd.Series([], dtype="float64").any()
False
>>> pd.Series([np.nan]).any()
False
>>> pd.Series([np.nan]).any(skipna=False)
True
```

**\*\*DataFrame\*\***

Whether each column contains at least one True element (the default).

```
>>> df = pd.DataFrame({"A": [1, 2], "B": [0, 2], "C": [0, 0]})
>>> df
 A B C
0 1 0 0
1 2 2 0

>>> df.any()
A True
B True
C False
dtype: bool
```

Aggregating over the columns.

```
>>> df = pd.DataFrame({"A": [True, False], "B": [1, 2]})
>>> df
 A B
0 True 1
1 False 2

>>> df.any(axis='columns')
0 True
1 True
dtype: bool

>>> df = pd.DataFrame({"A": [True, False], "B": [1, 0]})
>>> df
 A B
0 True 1
1 False 0
```

```
>>> df.any(axis='columns')
0 True
1 False
dtype: bool
```

Aggregating over the entire DataFrame with ``axis=None``.

```
>>> df.any(axis=None)
True
```

``any`` for an empty DataFrame is an empty Series.

```
>>> pd.DataFrame([]).any()
Series([], dtype: bool)
```

```
[]: #####
help(df.duplicated)
#####
```

Help on method duplicated in module pandas.core.frame:

```
duplicated(subset: 'Hashable | Sequence[Hashable] | None' = None, keep:
'DropKeep' = 'first') -> 'Series' method of pandas.core.frame.DataFrame instance
Return boolean Series denoting duplicate rows.
```

Considering certain columns is optional.

Parameters  
-----

subset : column label or sequence of labels, optional  
Only consider certain columns for identifying duplicates, by default use all of the columns.

keep : {'first', 'last', False}, default 'first'  
Determines which duplicates (if any) to mark.

- ``first`` : Mark duplicates as ``True`` except for the first occurrence.
- ``last`` : Mark duplicates as ``True`` except for the last occurrence.
- False : Mark all duplicates as ``True``.

Returns  
-----

Series  
Boolean series for each duplicated rows.

See Also



-----  
Index.duplicated : Equivalent method on index.  
Series.duplicated : Equivalent method on Series.  
Series.drop\_duplicates : Remove duplicate values from Series.  
DataFrame.drop\_duplicates : Remove duplicate values from DataFrame.

#### Examples

-----  
Consider dataset containing ramen rating.

```
>>> df = pd.DataFrame({
... 'brand': ['Yum Yum', 'Yum Yum', 'Indomie', 'Indomie', 'Indomie'],
... 'style': ['cup', 'cup', 'cup', 'pack', 'pack'],
... 'rating': [4, 4, 3.5, 15, 5]
... })
>>> df
 brand style rating
0 Yum Yum cup 4.0
1 Yum Yum cup 4.0
2 Indomie cup 3.5
3 Indomie pack 15.0
4 Indomie pack 5.0
```

By default, for each set of duplicated values, the first occurrence is set on False and all others on True.

```
>>> df.duplicated()
0 False
1 True
2 False
3 False
4 False
dtype: bool
```

By using 'last', the last occurrence of each set of duplicated values is set on False and all others on True.

```
>>> df.duplicated(keep='last')
0 True
1 False
2 False
3 False
4 False
dtype: bool
```

By setting ``keep`` on False, all duplicates are True.

```
>>> df.duplicated(keep=False)
```

```

0 True
1 True
2 False
3 False
4 False
dtype: bool

```

To find duplicates on specific column(s), use ``subset``.

```

>>> df.duplicated(subset=['brand'])
0 False
1 True
2 False
3 True
4 True
dtype: bool

```

```
[]: df.columns
```

```
[]: Index(['product_id', 'product_name', 'category', 'discounted_price',
 'actual_price', 'discount_percentage', 'rating', 'rating_count',
 'about_product', 'user_id', 'user_name', 'review_id', 'review_title',
 'review_content', 'img_link', 'product_link'],
 dtype='object')
```

```
[]: any_duplicates = df.duplicated(subset=['product_id', 'product_name',
↪ 'category', 'discounted_price',
 'actual_price', 'discount_percentage',
↪ 'rating',
 'rating_count', 'about_product',
↪ 'user_id', 'user_name',
 'review_id', 'review_title',
↪ 'review_content', 'img_link', 'product_link']).any()
```

```
[]: any_duplicates
```

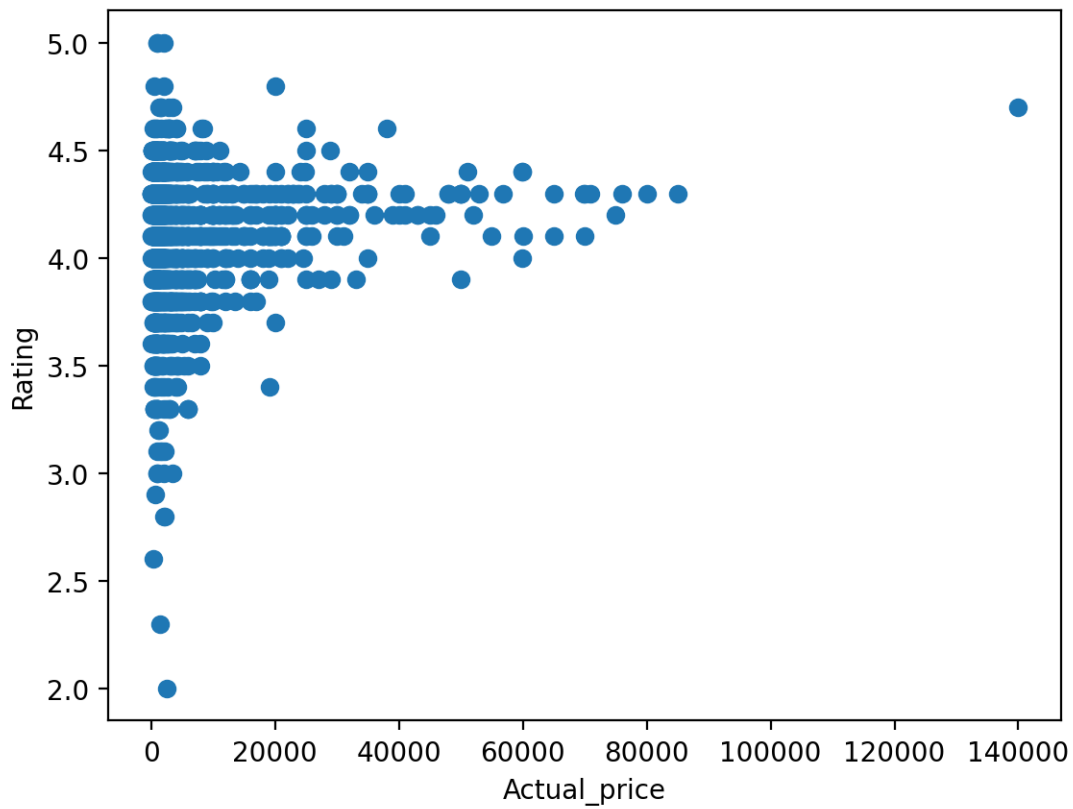
```
[]: np.False_
```

```
[]: # Milestone 2: Hence no duplicates found
```

```
[]: # Data Visualization
Scatter Plot

Plot actual_price vs. rating
plt.scatter(df['actual_price'], df['rating'])
plt.xlabel('Actual_price')
```

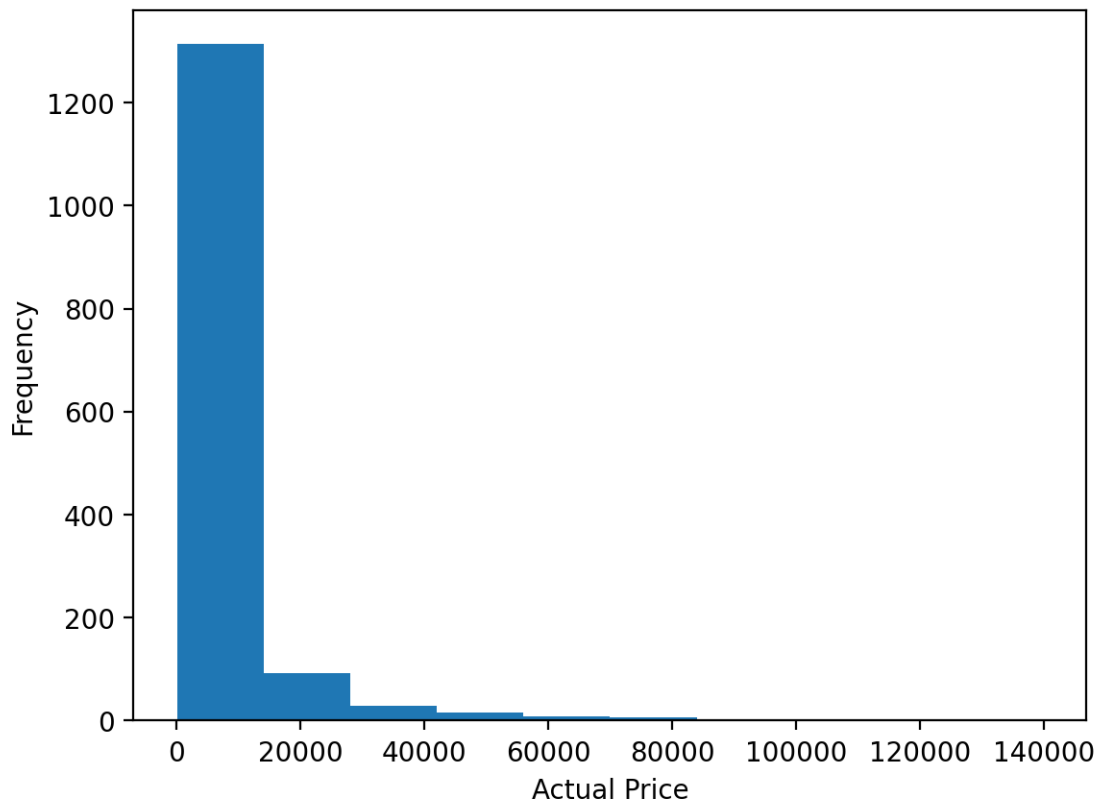
```
plt.ylabel('Rating')
plt.show()
```



```
[]: # p.s inorder to remove warning do this,
import warnings
warnings.filterwarnings('ignore')
```

```
[]: # Histogram

Plot distributions of actual_price
plt.hist(df['actual_price'])
plt.xlabel('Actual Price')
plt.ylabel('Frequency')
plt.show()
```



```
[]: from sklearn.preprocessing import LabelEncoder
 # label encode categorical variables

 le_product_id = LabelEncoder()
 le_category = LabelEncoder()
 le_review_id = LabelEncoder()
 le_review_content = LabelEncoder()
 le_product_name = LabelEncoder()
 le_user_name = LabelEncoder()
 le_about_product = LabelEncoder()
 le_user_id = LabelEncoder()
 le_review_title = LabelEncoder()
 le_img_link = LabelEncoder()
 le_product_link = LabelEncoder()

 df['product_id'] = le_product_id.fit_transform(df['product_id'])
 df['category'] = le_category.fit_transform(df['category'])
 df['review_id'] = le_review_id.fit_transform(df['review_id'])
 df['review_content'] = le_review_content.fit_transform(df['review_content'])
 df['product_name'] = le_product_name.fit_transform(df['product_name'])
 df['user_name'] = le_user_name.fit_transform(df['user_name'])
```

```
df['about_product'] = le_about_product.fit_transform(df['about_product'])
df['user_id'] = le_user_id.fit_transform(df['user_id'])
df['review_title'] = le_review_title.fit_transform(df['review_title'])
df['img_link'] = le_img_link.fit_transform(df['img_link'])
df['product_link'] = le_product_link.fit_transform(df['product_link'])
```

```
[]: #####
df['product_id']
#####
```

```
[]: 0 B07JW9H4J1
1 B098NS6PVG
2 B096MSW6CT
3 B08HDJ86NZ
4 B08CF3B7N1
...
1460 B08L7J3T31
1461 B01M6453MB
1462 B009P2LIL4
1463 B00J5DYCCA
1464 B01486F4G6
Name: product_id, Length: 1465, dtype: object
```

```
[]: df['product_id']
```

```
[]: 0 346
1 848
2 819
3 643
4 588
...
1460 673
1461 201
1462 27
1463 61
1464 134
Name: product_id, Length: 1465, dtype: int64
```

```
[]: #####
help(LabelEncoder)
#####
```

Help on class LabelEncoder in module sklearn.preprocessing.\_label:

```
class LabelEncoder(sklearn.base.TransformerMixin, sklearn.base.BaseEstimator)
| Encode target labels with value between 0 and n_classes-1.
|
```

```

| This transformer should be used to encode target values, *i.e.* `y`, and
| not the input `X`.
|
| Read more in the :ref:`User Guide <preprocessing_targets>`.
|
| .. versionadded:: 0.12
|
| Attributes
| -----
| classes_ : ndarray of shape (n_classes,)
| Holds the label for each class.
|
| See Also
| -----
| OrdinalEncoder : Encode categorical features using an ordinal encoding
| scheme.
| OneHotEncoder : Encode categorical features as a one-hot numeric array.
|
| Examples
| -----
| `LabelEncoder` can be used to normalize labels.
|
| >>> from sklearn.preprocessing import LabelEncoder
| >>> le = LabelEncoder()
| >>> le.fit([1, 2, 2, 6])
| LabelEncoder()
| >>> le.classes_
| array([1, 2, 6])
| >>> le.transform([1, 1, 2, 6])
| array([0, 0, 1, 2]...)
| >>> le.inverse_transform([0, 0, 1, 2])
| array([1, 1, 2, 6])
|
| It can also be used to transform non-numerical labels (as long as they are
| hashable and comparable) to numerical labels.
|
| >>> le = LabelEncoder()
| >>> le.fit(["paris", "paris", "tokyo", "amsterdam"])
| LabelEncoder()
| >>> list(le.classes_)
| [np.str_('amsterdam'), np.str_('paris'), np.str_('tokyo')]
| >>> le.transform(["tokyo", "tokyo", "paris"])
| array([2, 2, 1]...)
| >>> list(le.inverse_transform([2, 2, 1]))
| [np.str_('tokyo'), np.str_('tokyo'), np.str_('paris')]
|
| Method resolution order:
| LabelEncoder

```

```

| sklearn.base.TransformerMixin
| sklearn.utils._set_output._SetOutputMixin
| sklearn.base.BaseEstimator
| sklearn.utils._estimator_html_repr._HTMLDocumentationLinkMixin
| sklearn.utils._metadata_requests._MetadataRequester
| builtins.object
|
| Methods defined here:
|
| __sklearn_tags__(self)
|
| fit(self, y)
| Fit label encoder.
|
| Parameters
| -----
| y : array-like of shape (n_samples,)
| Target values.
|
| Returns
| -----
| self : returns an instance of self.
| Fitted label encoder.
|
| fit_transform(self, y)
| Fit label encoder and return encoded labels.
|
| Parameters
| -----
| y : array-like of shape (n_samples,)
| Target values.
|
| Returns
| -----
| y : array-like of shape (n_samples,)
| Encoded labels.
|
| inverse_transform(self, y)
| Transform labels back to original encoding.
|
| Parameters
| -----
| y : array-like of shape (n_samples,)
| Target values.
|
| Returns
| -----
| y : ndarray of shape (n_samples,)

```

```

| Original encoding.
|
| transform(self, y)
| Transform labels to normalized encoding.
|
| Parameters
| -----
| y : array-like of shape (n_samples,)
| Target values.
|
| Returns
| -----
| y : array-like of shape (n_samples,)
| Labels as normalized encodings.
|
| -----
| Methods inherited from sklearn.utils._set_output._SetOutputMixin:
|
| set_output(self, *, transform=None)
| Set output container.
|
| See :ref:`sphx_glr_auto_examples_miscellaneous_plot_set_output.py`
| for an example on how to use the API.
|
| Parameters
| -----
| transform : {"default", "pandas", "polars"}, default=None
| Configure output of `transform` and `fit_transform`.
|
| - `"default"`: Default output format of a transformer
| - `"pandas"`: DataFrame output
| - `"polars"`: Polars output
| - `None`: Transform configuration is unchanged
|
| .. versionadded:: 1.4
| `"polars"` option was added.
|
| Returns
| -----
| self : estimator instance
| Estimator instance.
|
| -----
| Class methods inherited from sklearn.utils._set_output._SetOutputMixin:
|
| __init_subclass__(auto_wrap_output_keys=('transform',), **kwargs)
| Set the ``set_{method}_request`` methods.
|

```



This uses PEP-487 [1]\_ to set the ``set\_{method}\_request`` methods. It looks for the information available in the set default values which are set using ``\_\_metadata\_request\_\_\*`` class attributes, or inferred from method signatures.

The ``\_\_metadata\_request\_\_\*`` class attributes are used when a method does not explicitly accept a metadata through its arguments or if the developer would like to specify a request value for those metadata which are different from the default ``None``.

#### References

.. [1] <https://www.python.org/dev/peps/pep-0487>

---

Data descriptors inherited from `sklearn.utils._set_output._SetOutputMixin`:

`__dict__`  
dictionary for instance variables

`__weakref__`  
list of weak references to the object

---

Methods inherited from `sklearn.base.BaseEstimator`:

`__getstate__(self)`  
Helper for pickle.

`__repr__(self, N_CHAR_MAX=700)`  
Return `repr(self)`.

`__setstate__(self, state)`

`__sklearn_clone__(self)`

`get_params(self, deep=True)`  
Get parameters for this estimator.

#### Parameters

deep : bool, default=True  
If True, will return the parameters for this estimator and contained subobjects that are estimators.

#### Returns

params : dict

```

| Parameter names mapped to their values.
|
| set_params(self, **params)
| Set the parameters of this estimator.
|
| The method works on simple estimators as well as on nested objects
| (such as :class:`~sklearn.pipeline.Pipeline`). The latter have
| parameters of the form ``<component>__<parameter>`` so that it's
| possible to update each component of a nested object.
|
| Parameters
| -----
|
| **params : dict
| Estimator parameters.
|
| Returns
| -----
|
| self : estimator instance
| Estimator instance.
|
| -----
| Methods inherited from sklearn.utils._metadata_requests._MetadataRequester:
|
| get_metadata_routing(self)
| Get metadata routing of this object.
|
| Please check :ref:`User Guide <metadata_routing>` on how the routing
| mechanism works.
|
| Returns
| -----
|
| routing : MetadataRequest
| A :class:`~sklearn.utils.metadata_routing.MetadataRequest`
| encapsulating
| routing information.

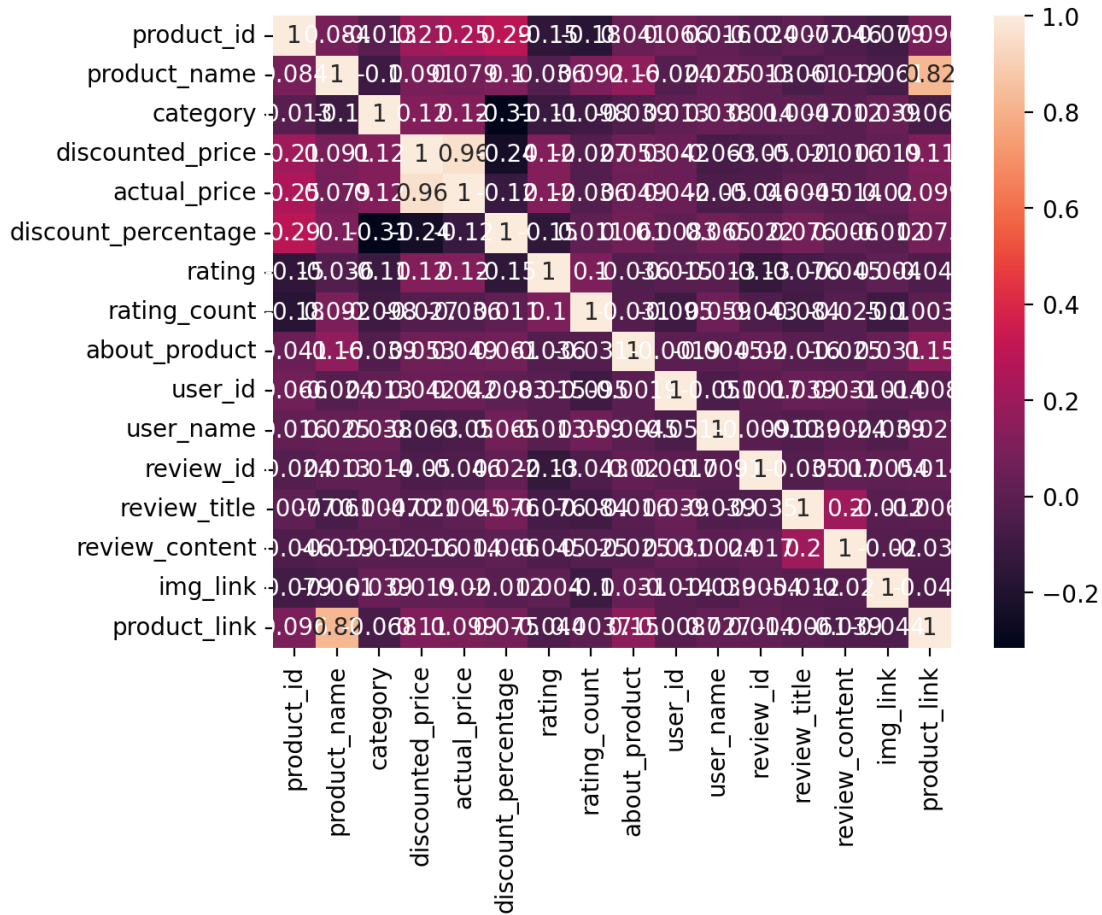
```

```

[]: # Heatmap

Plot correlations between variables
correlation_matrix = df.corr()
sns.heatmap(correlation_matrix, annot=True)
plt.show()

```



```
[]: #####
correlation_matrix
#####
```

```
[]:
product_id product_id product_name category discounted_price \
product_id 1.00e+00 0.08 -1.26e-02 0.21
product_name 8.41e-02 1.00 -1.04e-01 0.09
category -1.26e-02 -0.10 1.00e+00 0.12
discounted_price 2.06e-01 0.09 1.19e-01 1.00
actual_price 2.47e-01 0.08 1.22e-01 0.96
discount_percentage 2.90e-01 0.10 -3.14e-01 -0.24
rating -1.49e-01 -0.04 -1.09e-01 0.12
rating_count -1.76e-01 0.09 -9.84e-02 -0.03
about_product 4.14e-02 0.16 -3.88e-02 0.05
user_id 6.57e-02 -0.02 1.27e-02 0.04
user_name 1.61e-02 0.02 3.78e-02 -0.06
review_id -2.43e-02 0.01 1.40e-02 -0.05
review_title 7.65e-03 -0.06 4.71e-03 -0.02
```

review_content	-4.63e-02	-0.02	-1.21e-02	-0.02
img_link	-7.88e-02	-0.06	3.89e-02	0.02
product_link	9.62e-02	0.82	-6.77e-02	0.11

	actual_price	discount_percentage	rating	\
product_id	2.47e-01	2.90e-01	-1.49e-01	
product_name	7.86e-02	1.02e-01	-3.56e-02	
category	1.22e-01	-3.14e-01	-1.09e-01	
discounted_price	9.62e-01	-2.42e-01	1.20e-01	
actual_price	1.00e+00	-1.18e-01	1.22e-01	
discount_percentage	-1.18e-01	1.00e+00	-1.55e-01	
rating	1.22e-01	-1.55e-01	1.00e+00	
rating_count	-3.60e-02	1.11e-02	1.02e-01	
about_product	4.85e-02	6.08e-02	-3.61e-02	
user_id	4.15e-02	8.29e-03	-1.45e-02	
user_name	-4.96e-02	6.46e-02	-1.27e-02	
review_id	-4.56e-02	2.24e-02	-1.34e-01	
review_title	4.52e-03	7.60e-02	-7.57e-02	
review_content	-1.39e-02	5.99e-03	-4.46e-02	
img_link	2.01e-02	-1.17e-02	3.99e-03	
product_link	9.93e-02	7.45e-02	-4.41e-02	

	rating_count	about_product	user_id	user_name	\
product_id	-1.76e-01	4.14e-02	6.57e-02	1.61e-02	
product_name	9.24e-02	1.58e-01	-2.41e-02	2.46e-02	
category	-9.84e-02	-3.88e-02	1.27e-02	3.78e-02	
discounted_price	-2.71e-02	5.26e-02	4.17e-02	-6.31e-02	
actual_price	-3.60e-02	4.85e-02	4.15e-02	-4.96e-02	
discount_percentage	1.11e-02	6.08e-02	8.29e-03	6.46e-02	
rating	1.02e-01	-3.61e-02	-1.45e-02	-1.27e-02	
rating_count	1.00e+00	-3.08e-02	-9.45e-02	5.92e-02	
about_product	-3.08e-02	1.00e+00	-1.95e-03	-4.55e-03	
user_id	-9.45e-02	-1.95e-03	1.00e+00	-5.14e-02	
user_name	5.92e-02	-4.55e-03	-5.14e-02	1.00e+00	
review_id	-4.31e-02	1.97e-02	1.69e-03	-9.06e-03	
review_title	-8.42e-02	-1.58e-02	3.90e-02	-3.89e-02	
review_content	-2.53e-02	-2.46e-02	3.13e-02	2.43e-03	
img_link	-1.01e-01	3.09e-02	-1.41e-02	-3.88e-02	
product_link	3.67e-03	1.47e-01	-8.66e-03	2.70e-02	

	review_id	review_title	review_content	img_link	\
product_id	-2.43e-02	7.65e-03	-4.63e-02	-7.88e-02	
product_name	1.35e-02	-6.06e-02	-1.85e-02	-6.09e-02	
category	1.40e-02	4.71e-03	-1.21e-02	3.89e-02	
discounted_price	-4.98e-02	-2.10e-02	-1.59e-02	1.89e-02	
actual_price	-4.56e-02	4.52e-03	-1.39e-02	2.01e-02	
discount_percentage	2.24e-02	7.60e-02	5.99e-03	-1.17e-02	

rating	-1.34e-01	-7.57e-02	-4.46e-02	3.99e-03
rating_count	-4.31e-02	-8.42e-02	-2.53e-02	-1.01e-01
about_product	1.97e-02	-1.58e-02	-2.46e-02	3.09e-02
user_id	1.69e-03	3.90e-02	3.13e-02	-1.41e-02
user_name	-9.06e-03	-3.89e-02	2.43e-03	-3.88e-02
review_id	1.00e+00	-3.46e-02	1.67e-02	5.42e-03
review_title	-3.46e-02	1.00e+00	2.01e-01	-1.21e-02
review_content	1.67e-02	2.01e-01	1.00e+00	-2.03e-02
img_link	5.42e-03	-1.21e-02	-2.03e-02	1.00e+00
product_link	1.44e-02	-6.08e-03	-3.86e-02	-4.39e-02

	product_link
product_id	9.62e-02
product_name	8.24e-01
category	-6.77e-02
discounted_price	1.10e-01
actual_price	9.93e-02
discount_percentage	7.45e-02
rating	-4.41e-02
rating_count	3.67e-03
about_product	1.47e-01
user_id	-8.66e-03
user_name	2.70e-02
review_id	1.44e-02
review_title	-6.08e-03
review_content	-3.86e-02
img_link	-4.39e-02
product_link	1.00e+00

```
[]: ##### Data Wrangling of Electoral Data
https://www.kaggle.com/code/zusmani/election-data-wrangling
```

```
[]: import numpy as np # linear algebra library
import pandas as pd # data preprocessing, CSV files etc

!pip install fuzzywuzzy
import fuzzywuzzy
from fuzzywuzzy import process
import chardet

from subprocess import check_output
```

Collecting fuzzywuzzy

Downloading fuzzywuzzy-0.18.0-py2.py3-none-any.whl.metadata (4.9 kB)

Downloading fuzzywuzzy-0.18.0-py2.py3-none-any.whl (18 kB)

Installing collected packages: fuzzywuzzy

Successfully installed fuzzywuzzy-0.18.0

```
/usr/local/lib/python3.12/dist-packages/fuzzywuzzy/fuzz.py:11: UserWarning:
Using slow pure-python SequenceMatcher. Install python-Levenshtein to remove
this warning
```

```
warnings.warn('Using slow pure-python SequenceMatcher. Install python-
Levenshtein to remove this warning')
```

```
[]: import kagglehub
```

```
[]: path = kagglehub.dataset_download("zusmani/predict-pakistan-elections-2018")
print(path)
```

Downloading from

[https://www.kaggle.com/api/v1/datasets/download/zusmani/predict-pakistan-elections-2018?dataset\\_version\\_number=15...](https://www.kaggle.com/api/v1/datasets/download/zusmani/predict-pakistan-elections-2018?dataset_version_number=15...)

100%| | 46.5M/46.5M [00:00<00:00, 64.7MB/s]

Extracting files...

/root/.cache/kagglehub/datasets/zusmani/predict-pakistan-elections-2018/versions/15

```
[]: import os.path
```

```
[]: NA2 = pd.read_csv(os.path.join(path, 'National Assembly 2002 - Updated.csv'),
 ↪encoding = "ISO-8859-1")
NA8 = pd.read_csv(os.path.join(path, 'National Assembly 2008.csv'), encoding =
 ↪"ISO-8859-1")
NA13 = pd.read_csv(os.path.join(path, "National Assembly 2013.csv"), encoding =
 ↪"ISO-8859-1")

print("Data Dimensions are: ", NA2.shape)
print("Data Dimensions are: ", NA8.shape)
print("Data Dimensions are: ", NA13.shape)
```

Data Dimensions are: (1793, 11)

Data Dimensions are: (2316, 11)

Data Dimensions are: (4510, 11)

```
[]: print("NA 2002.csv")
NA2.info()
print("\nNA 2008.csv")
NA8.info()
print("\nNA 2013.csv")
NA13.info()
```

NA 2002.csv

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 1793 entries, 0 to 1792

Data columns (total 11 columns):

#	Column	Non-Null Count	Dtype
0	District	1793 non-null	object
1	Seat	1793 non-null	object
2	Constituency_title	1793 non-null	object
3	Candidate_Name	1793 non-null	object
4	Party	1793 non-null	object
5	Votes	1793 non-null	int64
6	Total_Valid_Votes	1793 non-null	int64
7	Total_Rejected_Votes	1793 non-null	int64
8	Total_Votes	1793 non-null	int64
9	Total_Registered_Voters	1793 non-null	int64
10	Turnout	1793 non-null	float64

dtypes: float64(1), int64(5), object(5)

memory usage: 154.2+ KB

NA 2008.csv

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 2316 entries, 0 to 2315

Data columns (total 11 columns):

#	Column	Non-Null Count	Dtype
0	Unnamed: 0	2316 non-null	int64
1	Seat	2316 non-null	object
2	ConstituencyTitle	2316 non-null	object
3	CandidateName	2316 non-null	object
4	Party	2316 non-null	object
5	Votes	2316 non-null	int64
6	TotalValidVotes	2316 non-null	int64
7	TotalRejectedVotes	2316 non-null	int64
8	TotalVotes	2316 non-null	int64
9	TotalRegisteredVoters	2316 non-null	int64
10	Turnout	2316 non-null	object

dtypes: int64(6), object(5)

memory usage: 199.2+ KB

NA 2013.csv

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 4510 entries, 0 to 4509

Data columns (total 11 columns):

#	Column	Non-Null Count	Dtype
0	Unnamed: 0	4510 non-null	int64
1	Seat	4510 non-null	object
2	ConstituencyTitle	4510 non-null	object
3	CandidateName	4510 non-null	object

```

4 Party 4510 non-null object
5 Votes 4510 non-null int64
6 TotalValidVotes 4510 non-null int64
7 TotalRejectedVotes 4510 non-null int64
8 TotalVotes 4510 non-null int64
9 TotalRegisteredVoters 4510 non-null int64
10 Turnout 4510 non-null object
dtypes: int64(6), object(5)
memory usage: 387.7+ KB

```

```

[]: print(NA2.head())
 print(NA8.head())
 print(NA13.head())
 print(NA8.columns, "\n>>\n", NA13.columns)

```

```

District Seat Constituency_title \
0 PESHAWAR PESHAWAR-I NA-1
1 PESHAWAR PESHAWAR-I NA-1
2 PESHAWAR PESHAWAR-I NA-1
3 PESHAWAR PESHAWAR-I NA-1
4 PESHAWAR PESHAWAR-I NA-1

```

```

Candidate_Name Party \
0 Mr Sajid Abdullah Pakistan Tehreek-e-Insaf
1 Mr Shabir Ahmad Muttahidda Majlis-e-Amal Pakistan
2 Mr Usman Bashir Bilour Awami National Party
3 Mr Muhammad Khurshid Khan Advocate Independent
4 Mr Muhammad Muazzam Butt Pakistan Muslim League(QA)

```

```

Votes Total_Valid_Votes Total_Rejected_Votes Total_Votes \
0 2029 65642 1552 67194
1 37179 65642 1552 67194
2 23002 65642 1552 67194
3 1537 65642 1552 67194
4 1417 65642 1552 67194

```

```

Total_Registered_Voters Turnout
0 233907 28.73
1 233907 28.73
2 233907 28.73
3 233907 28.73
4 233907 28.73

```

```

Unnamed: 0 Seat ConstituencyTitle CandidateName \
0 0 Peshawar-1 NA-1 Abdullah Jan
1 1 Peshawar-1 NA-1 Ashoni Kumar
2 2 Peshawar-1 NA-1 Aurangzeb
3 3 Peshawar-1 NA-1 Ayub Shah
4 4 Peshawar-1 NA-1 Fakhri Alam Khan Paracha

```



	Party	Votes	TotalValidVotes	\
0	Independent	313	88325	
1	Independent	156	88325	
2	Independent	261	88325	
3	Pakistan Peoples Party Parliamentarians	37682	88325	
4	Independent	184	88325	

	TotalRejectedVotes	TotalVotes	TotalRegisteredVoters	Turnout
0	629	88913	387083	22.97 %
1	629	88913	387083	22.97 %
2	629	88913	387083	22.97 %
3	629	88913	387083	22.97 %
4	629	88913	387083	22.97 %

Unnamed: 0	Seat	ConstituencyTitle	CandidateName	\
0	0	PESHAWAR-I	NA-1	Aamir Shehzad Hashmi
1	1	PESHAWAR-I	NA-1	Akram Khan
2	2	PESHAWAR-I	NA-1	Alhaaj Ghulam Ahmad Bilour
3	3	PESHAWAR-I	NA-1	Amir Syed
4	4	PESHAWAR-I	NA-1	Bashir Ahmad Afridi

	Party	Votes	TotalValidVotes	\
0	Mustaqbil Pakistan	77	145924	
1	Independent	182	145924	
2	Awami National Party	24468	145924	
3	Pakistan Peoples Party (Shaheed Bhutto)	454	145924	
4	Muttahida Qaumi Movement Pakistan	117	145924	

	TotalRejectedVotes	TotalVotes	TotalRegisteredVoters	Turnout
0	2103	146044	320578	46.18%
1	2103	146044	320578	46.18 %
2	2103	146044	320578	46.18 %
3	2103	146044	320578	46.18 %
4	2103	146044	320578	46.18 %

```

Index(['Unnamed: 0', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout'],
 dtype='object')
>>
Index(['Unnamed: 0', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout'],
 dtype='object')

```

```

[]: NA8.rename(columns={'Unnamed: 0': 'District'}, inplace=True)
NA13.rename(columns={'Unnamed: 0': 'District'}, inplace=True)
print("NA 8: ", NA8.columns, "\nNA 13: ", NA13.columns)

```

```

NA 8: Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout'],
 dtype='object')
NA 13: Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName',
 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout'],
 dtype='object')

```

```

[]: #####
 NA8.District
 #####

```

```

[]: 0 0
 1 1
 2 2
 3 3
 4 4
 ...
 2311 2311
 2312 2312
 2313 2313
 2314 2314
 2315 2315
 Name: District, Length: 2316, dtype: int64

```

```

[]: #####
 NA8.Seat
 #####

```

```

[]: 0 Peshawar-1
 1 Peshawar-1
 2 Peshawar-1
 3 Peshawar-1
 4 Peshawar-1
 ...
 2311 Kech-cum-Gwadar.
 2312 Kech-cum-Gwadar.
 2313 Kech-cum-Gwadar.
 2314 Kech-cum-Gwadar.
 2315 Kech-cum-Gwadar.
 Name: Seat, Length: 2316, dtype: object

```

```

[]: #####
 NA8.District.unique()
 #####

```

```
[]: array([0, 1, 2, ..., 2313, 2314, 2315])
```

```
[]: #####
NA8['District'].unique()
#####
```

```
[]: array([0, 1, 2, ..., 2313, 2314, 2315])
```

```
[]: #####
NA8['District'].unique()
#####
```

```
[]: array([0, 1, 2, ..., 2313, 2314, 2315])
```

```
[]: NA8.District = NA8.Seat
NA8.District.head()
```

```
[]: 0 Peshawar-1
1 Peshawar-1
2 Peshawar-1
3 Peshawar-1
4 Peshawar-1
Name: District, dtype: object
```

```
[]: #####
NA8.District.unique()
#####
```

```
[]: array(['Peshawar-1', 'Peshawar-II', 'Peshawar-III', 'Peshawar-IV',
 'Nowshera-I', 'Nowshera-II', 'Charsadda-I', 'Mardan-I',
 'Mardan-II', 'Mardan-III', 'Swabi-I', 'Swabi-II', 'Kohat', 'Karak',
 'Hangu', 'Abbottabad-I', 'Abbottabad-II', 'Haripur', 'Mansehra-I',
 'Mansehra-II', 'Battagram', 'Kohistan', 'D.I.Khan',
 'D.I.Khan-com-Tank', 'Bannu', 'Lakki Marwat', 'Buner', 'Swat-I',
 'Swat-II', 'Shangla', 'Chitral',
 'Upper Dir-cum-Lower Dir (Old Upper Dir', 'Lower Dir',
 'Malakand P.A', 'Tribal Area-I', 'Tribal Area-II',
 'Tribal Area-III', 'Tribal Area-IV', 'Tribal Area-V',
 'Tribal Area-VI', 'Tribal Area-VII', 'Tribal Area-VIII',
 'Tribal Area-IX', 'Tribal Area-X', 'Tribal Area-XI',
 'Tribal Area-XII', 'Islamabad-I', 'Islamabad-II', 'Rawalpindi-I',
 'Rawalpindi -II', 'Rawalpindi-III', 'Rawalpindi-IV',
 'Rawalpindi \x96V', 'Rawalpindi-VI', 'Rawalpindi-VII', 'Attock-I',
 'Attock-II', 'Attock-III', 'Chakwal-I', 'Chakwal-II', 'Jhelum-I',
 'Jhelum-II', 'Sargodha-I', 'Sargodha-II', 'Sargodha-III',
 'Sargodha-IV', 'Sargodha-V', 'Khushab-I', 'Khushab-II',
 'Mianwali-I', 'Mianwali-II', 'Bhakkar-I', 'Bhakkar-II',
```

'Faisalabad-I', 'Faisalabad-II', 'Faisalabad-III', 'Faisalabad-IV',  
 'Faisalabad-V', 'Faisalabad-VI', 'Faisalabad-VII',  
 'Faisalabad-VIII', 'Faisalabad-IX', 'Faisalabad-X',  
 'Faisalabad-XI', 'Jhang-I', 'Jhang-II', 'Jhang-III', 'Jhang-IV',  
 'Jhang-V', 'Jhang-VI', 'Toba Tek Singh-I', 'Toba Tek Singh-II',  
 'Toba Tek Singh-III', 'Gujranwala-I', 'Gujranwala-II',  
 'Gujranwala-III', 'Gujranwala-IV', 'Gujranwala-V', 'Gujranwala-VI',  
 'Gujranwala-VII', 'Hafizabad-I', 'Hafizabad-II', 'Gujrat-I',  
 'Gujrat-II', 'Gujrat-III', 'Gujrat-IV', 'M.B.Din-I', 'M.B.Din-II',  
 'Sialkot-I', 'Sialkot-II', 'Sialkot-III', 'Sialkot-IV',  
 'Sialkot-V', 'Narowal-I', 'Narowal-II', 'Narowal-III', 'Lahore-I',  
 'Lahore-III', 'Lahore-IV', 'Lahore-V', 'Lahore-VI', 'Lahore-VII',  
 'Lahore-VIII', 'Lahore-IX', 'Lahore-X', 'Lahore-XI', 'Lahore-XII',  
 'Lahore-XIII', 'Sheikhupura-I',  
 'Sheikhupura-Cum-Nankana Sahib-I (Old Sheikhupura-I',  
 'Sheikhupura-II (Old Sheikhupura-III',  
 'Sheikhupura-Cum-Nankana Sahib-II (Old Sheikhupura-',  
 'Nanka Sahib-I (Old Sheikhupura-V',  
 'Nankana Sahib-cum- Sheikhupura (Old Sheikhupura-VI',  
 'Nankana Sahib-II (Old Sheikhupura-VII', 'Kasur-I', 'Kasur-II',  
 'Kasur-III', 'Kasur-IV', 'Kasur-V', 'Okara-I', 'Okara-II',  
 'Okara-III', 'Okara-IV', 'Okara-V', 'Multan-I', 'Multan-II',  
 'Multan-III', 'Multan-IV', 'Multan-V', 'Multan-VI', 'Lodhran-I',  
 'Lodhran-II', 'Khanewal-I', 'Khanewal-II', 'Khanewal-III',  
 'Khanewal-IV', 'Sahiwal-I', 'Sahiwal-II', 'Sahiwal-III',  
 'Sahiwal-IV', 'Pakpattan-I', 'Pakpattan-II', 'Pakpattan-III',  
 'Vehari-I', 'Vehari-II', 'Vehari-III', 'Vehari-IV',  
 'Dera Ghazi Khan-I', 'Dera Ghazi Khan-II', 'Dera Ghazi Khan-III',  
 'Rajanpur-I', 'Rajanpur-II', 'Muzaffargarh-I', 'Muzaffargarh-II',  
 'Muzaffargarh-III', 'Muzaffargarh-IV', 'Muzaffargarh-V',  
 'Layyah-I', 'Layyah-II', 'Bahawalpur-I', 'Bahawalpur-II',  
 'Bahawalpur-III', 'Bahawalpur-IV', 'Bahawalpur-V',  
 'Bahawalnagar-I', 'Bahawalnagar-II', 'Bahawalnagar-III',  
 'Bahawalnagar-IV', 'Rahimyar Khan-I', 'Rahimyar Khan-II',  
 'Rahimyar Khan-III', 'Rahimyar Khan-IV', 'Rahimyar Khan-V',  
 'Rahimyar Khan-VI', 'Sukkur cum Shikarpur(I',  
 'Sukkur cum Shikarpur(II', 'Ghotki-I', 'Ghotki-II',  
 'Shikarpur (Old Shikarpur-I',  
 'Shikarpur-cum-Sukkur-cum-Larkana (Old Shikarpur-II',  
 'Larkana (Old Larkana I',  
 'Larka cum-Kamber Shahdadkot (Old Larkana II',  
 'Kamber Shahdadkot (Old Larkana III',  
 'Jacobabad (Old Jacobabad-I',  
 'Jacobabad-cum-Kashmore (Old Jacobabad-II',  
 'Kashmore (Old Jacobabad-III', 'Naushero Feroze-I',  
 'Naushero Feroze-II', 'Nawabshah-I', 'Nawabshah-II', 'Khairpur-I',  
 'Khairpur-II', 'Khairpur-III',

```
'Matiari-cum-Hyderabad (Old Hyderabad-I',
'Hyderabad-I (Old Hyderabad-II', 'Hyderabad-II (Old Hyderabad-III',
'Hyderabad-cum-Matiari (Old Hyderabad-IV',
'Tando Muhammad Khan-cum-Hyderabad-cum-Badin (Old H',
'Tando Allahyar-cum-Matiari (Old Hyderabad-VI',
'Badin-cum-Tando Muhammad Khan-I (Old Badin-I',
'Badin-cum-Tando Muhammad Khan-II', 'Mirpurkhas-cum-Umerkot(I',
'Mirpurkhas-cum-Umerkot(II', 'Umerkot (Old Mirpurkhas-III',
'Tharparkar-I', 'Tharparkar-II.', 'Jamshoro (Old Dadu-I',
'Dadu-I (Old Dadu-II', 'Dadu-II (Old Dadu-III', 'Sanghar-I',
'Sanghar-II (Old Sanghar-III', 'Thatta-I', 'Thatta-II',
'Karachi-I', 'Karachi-II', 'Karachi-III', 'Karachi-IV',
'Karachi-V', 'Karachi-VI', 'Karachi-VII', 'Karachi-VIII',
'Karachi-IX', 'Karachi-X', 'Karachi-XI', 'Karachi-XII',
'Karachi-XIII', 'Karachi-XIV', 'Karachi-XV', 'Karachi-XVI',
'Karachi-XVII', 'Karachi-XVIII', 'Karachi-XIX', 'Karachi-XX',
'Quetta', 'Quetta-cum-Chagai-cum-Nushki (Old Quetta-cum-Chaga',
'Pishin-cum-Ziarat', 'Killa Abdullah',
'Loralai-cum-Musakhel-cum-Barkhan (Old Loralai',
'Zhob-cum-Sherani-cum-Killa Saifullah(Old Zhob-cum-',
'Sibi-cum-Kohlu-cum-Dera Bugti-cum-Hernai(Old Sibi-',
'Bolan-cum-Jhal Magsi (Old Kachhi', 'Kalat-cum-Mastung.',
'Khuzdar.', 'Awaran-cum-Lasbela.',
'Kharan-cum-Washuk-cum-Panjgur(Old Kharan-cum-Panjg',
'Kech-cum-Gwadar.'], dtype=object)
```

```
[]: #####
help(str.split)
#####
```

Help on method\_descriptor:

split(self, /, sep=None, maxsplit=-1) unbound builtins.str method

Return a list of the substrings in the string, using sep as the separator string.

sep

The separator used to split the string.

When set to None (the default value), will split on any whitespace character (including \n \r \t \f and spaces) and will discard empty strings from the result.

maxsplit

Maximum number of splits.

-1 (the default value) means no limit.

Splitting starts at the front of the string and works to the end.

Note, `str.split()` is mainly useful for data that has been intentionally delimited. With natural text that includes punctuation, consider using the regular expression module.

```
[]: NA8.District.str.split("-", expand=True)[0]
```

```
[]: 0
 1
 2
 3
 4
 ...
 2311
 2312
 2313
 2314
 2315
 Name: 0, Length: 2316, dtype: object
```

```
[]: #####
 #NA8['District'] = NA8['District'].str.replace(".", " ")
 tim = "D.I. Khan"
 tim.replace(".", " ")
 #####
```

```
[]: 'D I Khan'
```

```
[]: #####
 tim.replace(r"\(.*\)", "")
 #####
```

```
[]: 'D.I. Khan'
```

```
[]: #####
 NA8.District.unique()
 #####
```

```
[]: array(['Peshawar-1', 'Peshawar-II', 'Peshawar-III', 'Peshawar-IV',
 'Nowshera-I', 'Nowshera-II', 'Charsadda-I', 'Mardan-I',
 'Mardan-II', 'Mardan-III', 'Swabi-I', 'Swabi-II', 'Kohat', 'Karak',
 'Hangu', 'Abbottabad-I', 'Abbottabad-II', 'Haripur', 'Mansehra-I',
 'Mansehra-II', 'Battagram', 'Kohistan', 'D.I.Khan',
 'D.I.Khan-com-Tank', 'Bannu', 'Lakki Marwat', 'Buner', 'Swat-I',
 'Swat-II', 'Shangla', 'Chitral',
 'Upper Dir-cum-Lower Dir (Old Upper Dir', 'Lower Dir',
```

'Malakand P.A', 'Tribal Area-I', 'Tribal Area-II',  
'Tribal Area-III', 'Tribal Area-IV', 'Tribal Area-V',  
'Tribal Area-VI', 'Tribal Area-VII', 'Tribal Area-VIII',  
'Tribal Area-IX', 'Tribal Area-X', 'Tribal Area-XI',  
'Tribal Area-XII', 'Islamabad-I', 'Islamabad-II', 'Rawalpindi-I',  
'Rawalpindi -II', 'Rawalpindi-III', 'Rawalpindi-IV',  
'Rawalpindi \x96V', 'Rawalpindi-VI', 'Rawalpindi-VII', 'Attock-I',  
'Attock-II', 'Attock-III', 'Chakwal-I', 'Chakwal-II', 'Jhelum-I',  
'Jhelum-II', 'Sargodha-I', 'Sargodha-II', 'Sargodha-III',  
'Sargodha-IV', 'Sargodha-V', 'Khushab-I', 'Khushab-II',  
'Mianwali-I', 'Mianwali-II', 'Bhakkar-I', 'Bhakkar-II',  
'Faisalabad-I', 'Faisalabad-II', 'Faisalabad-III', 'Faisalabad-IV',  
'Faisalabad-V', 'Faisalabad-VI', 'Faisalabad-VII',  
'Faisalabad-VIII', 'Faisalabad-IX', 'Faisalabad-X',  
'Faisalabad-XI', 'Jhang-I', 'Jhang-II', 'Jhang-III', 'Jhang-IV',  
'Jhang-V', 'Jhang-VI', 'Toba Tek Singh-I', 'Toba Tek Singh-II',  
'Toba Tek Singh-III', 'Gujranwala-I', 'Gujranwala-II',  
'Gujranwala-III', 'Gujranwala-IV', 'Gujranwala-V', 'Gujranwala-VI',  
'Gujranwala-VII', 'Hafizabad-I', 'Hafizabad-II', 'Gujrat-I',  
'Gujrat-II', 'Gujrat-III', 'Gujrat-IV', 'M.B.Din-I', 'M.B.Din-II',  
'Sialkot-I', 'Sialkot-II', 'Sialkot-III', 'Sialkot-IV',  
'Sialkot-V', 'Narowal-I', 'Narowal-II', 'Narowal-III', 'Lahore-I',  
'Lahore-III', 'Lahore-IV', 'Lahore-V', 'Lahore-VI', 'Lahore-VII',  
'Lahore-VIII', 'Lahore-IX', 'Lahore-X', 'Lahore-XI', 'Lahore-XII',  
'Lahore-XIII', 'Sheikhupura-I',  
'Sheikhupura-Cum-Nankana Sahib-I (Old Sheikhupura-I',  
'Sheikhupura-II (Old Sheikhupura-III',  
'Sheikhupura-Cum-Nankana Sahib-II (Old Sheikhupura-',  
'Nanka Sahib-I (Old Sheikhupura-V',  
'Nankana Sahib-cum- Sheikhupura (Old Sheikhupura-VI',  
'Nankana Sahib-II (Old Sheikhupura-VII', 'Kasur-I', 'Kasur-II',  
'Kasur-III', 'Kasur-IV', 'Kasur-V', 'Okara-I', 'Okara-II',  
'Okara-III', 'Okara-IV', 'Okara-V', 'Multan-I', 'Multan-II',  
'Multan-III', 'Multan-IV', 'Multan-V', 'Multan-VI', 'Lodhran-I',  
'Lodhran-II', 'Khanewal-I', 'Khanewal-II', 'Khanewal-III',  
'Khanewal-IV', 'Sahiwal-I', 'Sahiwal-II', 'Sahiwal-III',  
'Sahiwal-IV', 'Pakpattan-I', 'Pakpattan-II', 'Pakpattan-III',  
'Vehari-I', 'Vehari-II', 'Vehari-III', 'Vehari-IV',  
'Dera Ghazi Khan-I', 'Dera Ghazi Khan-II', 'Dera Ghazi Khan-III',  
'Rajanpur-I', 'Rajanpur-II', 'Muzaffargarh-I', 'Muzaffargarh-II',  
'Muzaffargarh-III', 'Muzaffargarh-IV', 'Muzaffargarh-V',  
'Layyah-I', 'Layyah-II', 'Bahawalpur-I', 'Bahawalpur-II',  
'Bahawalpur-III', 'Bahawalpur-IV', 'Bahawalpur-V',  
'Bahawalnagar-I', 'Bahawalnagar-II', 'Bahawalnagar-III',  
'Bahawalnagar-IV', 'Rahimyar Khan-I', 'Rahimyar Khan-II',  
'Rahimyar Khan-III', 'Rahimyar Khan-IV', 'Rahimyar Khan-V',  
'Rahimyar Khan-VI', 'Sukkur cum Shikarpur(I',

```
'Sukkur cum Shikarpur(II', 'Ghotki-I', 'Ghotki-II',
'Shikarpur (Old Shikarpur-I',
'Shikarpur-cum-Sukkur-cum-Larkana (Old Shikarpur-II',
'Larkana (Old Larkana I',
'Larka cum-Kamber Shahdadkot (Old Larkana II',
'Kamber Shahdadkot (Old Larkana III',
'Jacobabad (Old Jacobabad-I',
'Jacobabad-cum-Kashmore (Old Jacobabad-II',
'Kashmore (Old Jacobabad-III', 'Naushero Feroze-I',
'Naushero Feroze-II', 'Nawabshah-I', 'Nawabshah-II', 'Khairpur-I',
'Khairpur-II', 'Khairpur-III',
'Matiari-cum-Hyderabad (Old Hyderabad-I',
'Hyderabad-I (Old Hyderabad-II', 'Hyderabad-II (Old Hyderabad-III',
'Hyderabad-cum-Matiari (Old Hyderabad-IV',
'Tando Muhammad Khan-cum-Hyderabad-cum-Badin (Old H',
'Tando Allahyar-cum-Matiari (Old Hyderabad-VI',
'Badin-cum-Tando Muhammad Khan-I (Old Badin-I',
'Badin-cum-Tando Muhammad Khan-II', 'Mirpurkhas-cum-Umerkot(I',
'Mirpurkhas-cum-Umerkot(II', 'Umerkot (Old Mirpurkhas-III',
'Tharparkar-I', 'Tharparkar-II.', 'Jamshoro (Old Dadu-I',
'Dadu-I (Old Dadu-II', 'Dadu-II (Old Dadu-III', 'Sanghar-I',
'Sanghar-II (Old Sanghar-III', 'Thatta-I', 'Thatta-II',
'Karachi-I', 'Karachi-II', 'Karachi-III', 'Karachi-IV',
'Karachi-V', 'Karachi-VI', 'Karachi-VII', 'Karachi-VIII',
'Karachi-IX', 'Karachi-X', 'Karachi-XI', 'Karachi-XII',
'Karachi-XIII', 'Karachi-XIV', 'Karachi-XV', 'Karachi-XVI',
'Karachi-XVII', 'Karachi-XVIII', 'Karachi-XIX', 'Karachi-XX',
'Quetta', 'Quetta-cum-Chagai-cum-Nushki (Old Quetta-cum-Chaga',
'Pishin-cum-Ziarat', 'Killa Abdullah',
'Loralai-cum-Musakhel-cum-Barkhan (Old Loralai',
'Zhob-cum-Sherani-cum-Killa Saifullah(Old Zhob-cum-',
'Sibi-cum-Kohlu-cum-Dera Bugti-cum-Hernai(Old Sibi-',
'Bolan-cum-Jhal Magsi (Old Kachhi', 'Kalat-cum-Mastung.',
'Khuzdar.', 'Awaran-cum-Lasbela.',
'Kharan-cum-Washuk-cum-Panjgur(Old Kharan-cum-Panjg',
'Kech-cum-Gwadar.'], dtype=object)
```

```
[]: #####
tim = "hello (Old Jacobabad-I)"
tim.replace(r"\(.*\)", "")
#####
```

```
[]: 'hello (Old Jacobabad-I)'
```

```
[]: #####
tim = "M.B.Din-I"
print(tim, "before first")
```



```

tim = tim.replace(".", "")
print(tim, "before second")
tim = re.sub(r"(XX|IX|X?I{0,3})(IX|IV|V?I{0,3})$", '', tim)
tim
####

```

M.B.Din-I before first

MBDin-I before second

```
[]: 'MBDin-'
```

```

[]: #####
import regex as re
tim = "Yes you are (You how are you)"
re.sub(r"\(.*\)\"", "", tim)
#####

```

```
[]: 'Yes you are '
```

```

[]: #####
tim = "Yo boy, how You ar.e doing ,!s1 -"
tim = re.sub("[^a-zA-Z -]", "", tim)
tim
#####

```

```
[]: 'Yo boy how You are doing s -'
```

```

[]: #####
tim = "timmy yo lets go to London-II and get back to France-IIIGood"
tim = re.sub(r"-.*", "", tim)
tim
#####

```

```
[]: 'timmy yo lets go to London'
```

```

[]: #####
help(str.replace)
#####

```

Help on method\_descriptor:

replace(self, old, new, count=-1, /) unbound builtins.str method  
 Return a copy with all occurrences of substring old replaced by new.

count

Maximum number of occurrences to replace.

-1 (the default value) means replace all occurrences.

If the optional argument count is given, only the first count occurrences are replaced.

```
[]: #####
NA8.District = NA8.Seat#.str.split("-", expand=True)[0]
#Add District column
#NA8['District'] = NA8['Seat']
NA8['District'] = NA8['District'].str.replace(".", " ") # to deal with D.I. Khan
remove all those substring with (
NA8['District'] = NA8['District'].str.replace(r"\(.*\)", "")
remove numeric
NA8['District'] = NA8['District'].str.replace('[^a-zA-Z -]', '')
#NA8['District'] = NA8['District'].str.replace(r"Cum.*", "")
#NA8['District'] = NA8['District'].str.replace(r"cum.*", "")
#na18['District'] = na18['District'].str.replace(r"KUM.*", "")
to convert Tribal Area III - Mohman into Tribal Area III
NA8['District'] = NA8['District'].str.replace(r"-.*", "")
NA8['District'] = NA8['District'].str.replace(r" (XX|IX|X?I{0,3})(IX|IV|V?
↪I{0,3})$", '')
NA8['District'] = NA8['District'].str.replace(r" (XX|IX|X?I{0,3})(IX|IV|V?
↪I{0,3})$", '')
NA8['District'].unique()
#####
```

```
[]: #####
help(str.split)
#####
```

Help on method\_descriptor:

split(self, /, sep=None, maxsplit=-1) unbound builtins.str method

Return a list of the substrings in the string, using sep as the separator string.

sep

The separator used to split the string.

When set to None (the default value), will split on any whitespace character (including \n \r \t \f and spaces) and will discard empty strings from the result.

maxsplit

Maximum number of splits.

-1 (the default value) means no limit.

Splitting starts at the front of the string and works to the end.

Note, `str.split()` is mainly useful for data that has been intentionally delimited. With natural text that includes punctuation, consider using the regular expression module.

```
[]: NA8.District = NA8.Seat#.str.split("-", expand=True)[0]
#Add District column
#NA8['District'] = NA8['Seat']
NA8['District'] = NA8['District'].str.replace(".", " ") # to deal with D.I. Khan
remove all those substring with ()
NA8['District'] = NA8['District'].str.replace(r"\(.*\)", "")
remove numeric
NA8['District'] = NA8['District'].str.replace('[^a-zA-Z -]', '')
#NA8['District'] = NA8['District'].str.replace(r"Cum.*", "")
NA8['District'] = NA8['District'].str.replace(r"cum.*", "")
#na18['District'] = na18['District'].str.replace(r"KUM.*", "")
to convert Tribal Area III - Mohman into Tribal Area III
NA8['District'] = NA8['District'].str.replace(r"-.*", "")
NA8['District'] = NA8['District'].str.replace(r" (XX|IX|X?I{0,3})(IX|IV|V?
↵I{0,3})$", '')
NA8['District'] = NA8['District'].str.replace(r" (XX|IX|X?I{0,3})(IX|IV|V?
↵I{0,3})$", '')
NA8['District'].unique()
```

```
[]: array(['Peshawar-I', 'Peshawar-II', 'Peshawar-III', 'Peshawar-IV',
'Nowshera-I', 'Nowshera-II', 'Charsadda-I', 'Mardan-I',
'Mardan-II', 'Mardan-III', 'Swabi-I', 'Swabi-II', 'Kohat', 'Karak',
'Hangu', 'Abbottabad-I', 'Abbottabad-II', 'Haripur', 'Mansehra-I',
'Mansehra-II', 'Battagram', 'Kohistan', 'D I Khan',
'D I Khan-com-Tank', 'Bannu', 'Lakki Marwat', 'Buner', 'Swat-I',
'Swat-II', 'Shangla', 'Chitral',
'Upper Dir-cum-Lower Dir (Old Upper Dir', 'Lower Dir',
'Malakand P A', 'Tribal Area-I', 'Tribal Area-II',
'Tribal Area-III', 'Tribal Area-IV', 'Tribal Area-V',
'Tribal Area-VI', 'Tribal Area-VII', 'Tribal Area-VIII',
'Tribal Area-IX', 'Tribal Area-X', 'Tribal Area-XI',
'Tribal Area-XII', 'Islamabad-I', 'Islamabad-II', 'Rawalpindi-I',
'Rawalpindi -II', 'Rawalpindi-III', 'Rawalpindi-IV',
'Rawalpindi \x96V', 'Rawalpindi-VI', 'Rawalpindi-VII', 'Attock-I',
'Attock-II', 'Attock-III', 'Chakwal-I', 'Chakwal-II', 'Jhelum-I',
'Jhelum-II', 'Sargodha-I', 'Sargodha-II', 'Sargodha-III',
'Sargodha-IV', 'Sargodha-V', 'Khushab-I', 'Khushab-II',
'Mianwali-I', 'Mianwali-II', 'Bhakkar-I', 'Bhakkar-II',
'Faisalabad-I', 'Faisalabad-II', 'Faisalabad-III', 'Faisalabad-IV',
'Faisalabad-V', 'Faisalabad-VI', 'Faisalabad-VII',
'Faisalabad-VIII', 'Faisalabad-IX', 'Faisalabad-X',
'Faisalabad-XI', 'Jhang-I', 'Jhang-II', 'Jhang-III', 'Jhang-IV',
```

'Jhang-V', 'Jhang-VI', 'Toba Tek Singh-I', 'Toba Tek Singh-II',  
 'Toba Tek Singh-III', 'Gujranwala-I', 'Gujranwala-II',  
 'Gujranwala-III', 'Gujranwala-IV', 'Gujranwala-V', 'Gujranwala-VI',  
 'Gujranwala-VII', 'Hafizabad-I', 'Hafizabad-II', 'Gujrat-I',  
 'Gujrat-II', 'Gujrat-III', 'Gujrat-IV', 'M B Din-I', 'M B Din-II',  
 'Sialkot-I', 'Sialkot-II', 'Sialkot-III', 'Sialkot-IV',  
 'Sialkot-V', 'Narowal-I', 'Narowal-II', 'Narowal-III', 'Lahore-I',  
 'Lahore-III', 'Lahore-IV', 'Lahore-V', 'Lahore-VI', 'Lahore-VII',  
 'Lahore-VIII', 'Lahore-IX', 'Lahore-X', 'Lahore-XI', 'Lahore-XII',  
 'Lahore-XIII', 'Sheikhupura-I',  
 'Sheikhupura-Cum-Nankana Sahib-I (Old Sheikhupura-I',  
 'Sheikhupura-II (Old Sheikhupura-III',  
 'Sheikhupura-Cum-Nankana Sahib-II (Old Sheikhupura-',  
 'Nanka Sahib-I (Old Sheikhupura-V',  
 'Nankana Sahib-cum- Sheikhupura (Old Sheikhupura-VI',  
 'Nankana Sahib-II (Old Sheikhupura-VII', 'Kasur-I', 'Kasur-II',  
 'Kasur-III', 'Kasur-IV', 'Kasur-V', 'Okara-I', 'Okara-II',  
 'Okara-III', 'Okara-IV', 'Okara-V', 'Multan-I', 'Multan-II',  
 'Multan-III', 'Multan-IV', 'Multan-V', 'Multan-VI', 'Lodhran-I',  
 'Lodhran-II', 'Khanewal-I', 'Khanewal-II', 'Khanewal-III',  
 'Khanewal-IV', 'Sahiwal-I', 'Sahiwal-II', 'Sahiwal-III',  
 'Sahiwal-IV', 'Pakpattan-I', 'Pakpattan-II', 'Pakpattan-III',  
 'Vehari-I', 'Vehari-II', 'Vehari-III', 'Vehari-IV',  
 'Dera Ghazi Khan-I', 'Dera Ghazi Khan-II', 'Dera Ghazi Khan-III',  
 'Rajanpur-I', 'Rajanpur-II', 'Muzaffargarh-I', 'Muzaffargarh-II',  
 'Muzaffargarh-III', 'Muzaffargarh-IV', 'Muzaffargarh-V',  
 'Layyah-I', 'Layyah-II', 'Bahawalpur-I', 'Bahawalpur-II',  
 'Bahawalpur-III', 'Bahawalpur-IV', 'Bahawalpur-V',  
 'Bahawalnagar-I', 'Bahawalnagar-II', 'Bahawalnagar-III',  
 'Bahawalnagar-IV', 'Rahimyar Khan-I', 'Rahimyar Khan-II',  
 'Rahimyar Khan-III', 'Rahimyar Khan-IV', 'Rahimyar Khan-V',  
 'Rahimyar Khan-VI', 'Sukkur cum Shikarpur(I',  
 'Sukkur cum Shikarpur(II', 'Ghotki-I', 'Ghotki-II',  
 'Shikarpur (Old Shikarpur-I',  
 'Shikarpur-cum-Sukkur-cum-Larkana (Old Shikarpur-II',  
 'Larkana (Old Larkana I',  
 'Larka cum-Kamber Shahdadkot (Old Larkana II',  
 'Kamber Shahdadkot (Old Larkana III',  
 'Jacobabad (Old Jacobabad-I',  
 'Jacobabad-cum-Kashmore (Old Jacobabad-II',  
 'Kashmore (Old Jacobabad-III', 'Naushero Feroze-I',  
 'Naushero Feroze-II', 'Nawabshah-I', 'Nawabshah-II', 'Khairpur-I',  
 'Khairpur-II', 'Khairpur-III',  
 'Matiari-cum-Hyderabad (Old Hyderabad-I',  
 'Hyderabad-I (Old Hyderabad-II', 'Hyderabad-II (Old Hyderabad-III',  
 'Hyderabad-cum-Matiari (Old Hyderabad-IV',  
 'Tando Muhammad Khan-cum-Hyderabad-cum-Badin (Old H',

```
'Tando Allahyar-cum-Matiari (Old Hyderabad-VI',
'Badin-cum-Tando Muhammad Khan-I (Old Badin-I',
'Badin-cum-Tando Muhammad Khan-II', 'Mirpurkhas-cum-Umerkot(I',
'Mirpurkhas-cum-Umerkot(II', 'Umerkot (Old Mirpurkhas-III',
'Tharparkar-I', 'Tharparkar-II ', 'Jamshoro (Old Dadu-I',
'Dadu-I (Old Dadu-II', 'Dadu-II (Old Dadu-III', 'Sanghar-I',
'Sanghar-II (Old Sanghar-III', 'Thatta-I', 'Thatta-II',
'Karachi-I', 'Karachi-II', 'Karachi-III', 'Karachi-IV',
'Karachi-V', 'Karachi-VI', 'Karachi-VII', 'Karachi-VIII',
'Karachi-IX', 'Karachi-X', 'Karachi-XI', 'Karachi-XII',
'Karachi-XIII', 'Karachi-XIV', 'Karachi-XV', 'Karachi-XVI',
'Karachi-XVII', 'Karachi-XVIII', 'Karachi-XIX', 'Karachi-XX',
'Quetta', 'Quetta-cum-Chagai-cum-Nushki (Old Quetta-cum-Chaga',
'Pishin-cum-Ziarat', 'Killa Abdullah',
'Loralai-cum-Musakhel-cum-Barkhan (Old Loralai',
'Zhob-cum-Sherani-cum-Killa Saifullah(Old Zhob-cum-',
'Sibi-cum-Kohlu-cum-Dera Bugti-cum-Hernai(Old Sibi-',
'Bolan-cum-Jhal Magsi (Old Kachhi', 'Kalat-cum-Mastung ',
'Khuzdar ', 'Awaran-cum-Lasbela ',
'Kharan-cum-Washuk-cum-Panjgur(Old Kharan-cum-Panjg',
'Kech-cum-Gwadar '], dtype=object)
```

```
[]: #####
tim = "Peshawar-1"
tim = (re.sub(".", " ", tim))
tim
#####
```

```
[]: ' '
```

```
[]: import regex as re

NA8.District = NA8.Seat#.str.split("-", expand=True)[0]
#Add District column

#NA8['District'] = NA8['District'].map(lambda x: (re.sub(".", " ", x))) # to
↳ deal with D.I. Khan
remove all those substring with ()
NA8['District'] = NA8['District'].map(lambda x: (re.sub(r"\(.*\)", "", x)))
remove numeric
NA8['District'] = NA8['District'].map(lambda x: (re.sub('[^a-zA-Z -]', '',
↳ x)))
to convert Tribal Area III - Mohman into Tribal Area III
#NA8['District'] = NA8['District'].str.replace(r"Cum.*", "")
#NA8['District'] = NA8['District'].str.replace(r"cum.*", "")
#na18['District'] = na18['District'].str.replace(r"KUM.*", "")
NA8['District'] = NA8['District'].map(lambda x: (re.sub(r"-.*", "", x)))
```

```

NA8['District'] = NA8['District'].map(lambda x: (re.sub(r" (XX|IX|X?
↳I{0,3})(IX|IV|V?I{0,3})$", '', x)))
#NA8['District'] = NA8['District'].map(lambda x: (re.sub(r" (XX|IX|X?
↳I{0,3})(IX|IV|V?I{0,3})$", '', x)))
NA8['District'].unique()

```

```

[]: array(['Peshawar', 'Nowshera', 'Charsadda', 'Mardan', 'Swabi', 'Kohat',
'Karak', 'Hangu', 'Abbottabad', 'Haripur', 'Mansehra', 'Battagram',
'Kohistan', 'DIKhan', 'Bannu', 'Lakki Marwat', 'Buner', 'Swat',
'Shangla', 'Chitral', 'Upper Dir', 'Lower Dir', 'Malakand PA',
'Tribal Area', 'Islamabad', 'Rawalpindi', 'Attock', 'Chakwal',
'Jhelum', 'Sargodha', 'Khushab', 'Mianwali', 'Bhakkar',
'Faisalabad', 'Jhang', 'Toba Tek Singh', 'Gujranwala', 'Hafizabad',
'Gujrat', 'MBDin', 'Sialkot', 'Narowal', 'Lahore', 'Sheikhupura',
'Nanka Sahib', 'Nankana Sahib', 'Kasur', 'Okara', 'Multan',
'Lodhran', 'Khanewal', 'Sahiwal', 'Pakpattan', 'Vehari',
'Dera Ghazi Khan', 'Rajanpur', 'Muzaffargarh', 'Layyah',
'Bahawalpur', 'Bahawalnagar', 'Rahimyar Khan',
'Sukkur cum ShikarpurI', 'Sukkur cum ShikarpurII', 'Ghotki',
'Shikarpur Old Shikarpur', 'Shikarpur', 'Larkana Old Larkana',
'Larka cum', 'Kamber Shahdadt Kot Old Larkana',
'Jacobabad Old Jacobabad', 'Jacobabad', 'Kashmore Old Jacobabad',
'Naushero Feroze', 'Nawabshah', 'Khairpur', 'Matiari', 'Hyderabad',
'Tando Muhammad Khan', 'Tando Allahyar', 'Badin', 'Mirpurkhas',
'Umerkot Old Mirpurkhas', 'Tharparkar', 'Jamshoro Old Dadu',
'Dadu', 'Sanghar', 'Thatta', 'Karachi', 'Quetta', 'Pishin',
'Killa Abdullah', 'Loralai', 'Zhob', 'Sibi', 'Bolan', 'Kalat',
'Khuzdar', 'Awaran', 'Kharan', 'Kech'], dtype=object)

```

```

[]: import regex as re

NA13.District = NA13.Seat#.str.split("-", expand=True)[0]
#Add District column

#NA8['District'] = NA8['District'].map(lambda x: (re.sub(".", " ", x))) # to
↳deal with D.I. Khan
remove all those substring with ()
NA13['District'] = NA13['District'].map(lambda x: (re.sub(r"\(.*\)", "", x)))
remove numeric
NA13['District'] = NA13['District'].map(lambda x: (re.sub('[^a-zA-Z -]', '',
↳x)))
to convert Tribal Area III - Mohman into Tribal Area III
NA8['District'] = NA8['District'].map(lambda x: (re.sub(r"Cum.*", "", x)))
#NA8['District'] = NA8['District'].str.replace(r"cum.*", "")
#na18['District'] = na18['District'].str.replace(r"KUM.*", "")
NA13['District'] = NA13['District'].map(lambda x: (re.sub(r"-.*", "", x)))

```

```

NA13['District'] = NA13['District'].map(lambda x: (re.sub(r" (XX|IX|X?
↪I{0,3})(IX|IV|V?I{0,3})$", '', x)))
#NA8['District'] = NA8['District'].map(lambda x: (re.sub(r" (XX|IX|X?
↪I{0,3})(IX|IV|V?I{0,3})$", '', x)))
NA13['District'].unique()

```

```

[]: array(['PESHAWAR', 'NOWSHERA', 'CHARSADDA', 'MARDAN', 'SWABI', 'KOHAT',
'KARAK', 'HANGU', 'ABBOTTABAD', 'HARIPUR', 'MANSEHRA',
'Tor Ghar cum Mansehra', 'BATTAGRAM', 'KOHISTAN',
'DERA ISMAIL KHAN', 'DIKHAN', 'BANNU', 'LAKKI MARWAT', 'BUNER',
'SWAT', 'SHANGLA', 'CHITRAL', 'UPPER DIR', 'LOWER DIR',
'MALAKAND P AREA', 'TRIBAL AREA', 'ISLAMABAD', 'RAWALPINDI',
'ATTOCK', 'CHAKWAL', 'JHELM', 'SARGODHA', 'KHUSHAB', 'MIANWALI',
'BHAKKAR', 'FAISALABAD', 'Chiniot', 'Jhang', 'TOBA TEK SINGH',
'GUJRANWALA', 'HAFIZABAD', 'GUJRAT', 'MANDI BAHAUDDIN', 'SIALKOT',
'NAROWAL', 'LAHORE', 'SHEIKHUPURA', 'Sheikhupura', 'Nankana Sahib',
'Kasur', 'KASUR', 'OKARA', 'MULTAN', 'LODHRAN', 'KHANEWAL',
'SAHIWAL', 'PAKPATTAN', 'VEHARI', 'DERA GHAZI KHAN', 'RAJANPUR',
'MUZAFFARGARH', 'LAYYAH', 'BAHAWALPUR', 'BAHAWALNAGAR',
'RAHIM YAR KHAN', 'SUKKUR', 'GHOTKI', 'SHIKARPUR OLD SHIKARPUR',
'SHEIKHUPUR', 'Larkana Old Larkana', 'LARKANA',
'KAMBER SHAHDADKOT OLD LARKANA', 'JACOBABAD OLD JACOBABAD',
'JACOBABAD', 'KASHMORE OLD JACOBABAD', 'NAUSHEHRO FEROZ',
'NAWABSHAH', 'KHAIRPUR', 'MATIARI', 'HYDERABAD',
'TANDO MUHAMMAD KHAN', 'TANDO ALLAHYAR', 'BADIN', 'MIRPUR KHAS',
'MIRPURKHAS', 'UMERKOTOLD MIRPURKHAS', 'THARPARKAR',
'JAMSHOROOLD DADU', 'DADU', 'SANGHAR', 'THATTA', 'KARACHI',
'QUETTA', 'Quetta', 'Pishin', 'Killa Abdullah', 'Loralai', 'Zhob',
'Sibi', 'Nasirabad', 'Kachhi', 'Kalat', 'Khuzdar', 'Awaran',
'Kharan', 'Kech'], dtype=object)

```

```

[]: NA13.head()

```

	District	Seat	Constituency	Title	Candidate	Name \
0	PESHAWAR	PESHAWAR-I	NA-1	Aamir Shehzad Hashmi		
1	PESHAWAR	PESHAWAR-I	NA-1	Akram Khan		
2	PESHAWAR	PESHAWAR-I	NA-1	Alhaaj Ghulam Ahmad Bilour		
3	PESHAWAR	PESHAWAR-I	NA-1	Amir Syed		
4	PESHAWAR	PESHAWAR-I	NA-1	Bashir Ahmad Afridi		

		Party	Votes	TotalValidVotes \
0		Mustaqbil Pakistan	77	145924
1		Independent	182	145924
2		Awami National Party	24468	145924
3	Pakistan Peoples Party (Shaheed Bhutto)		454	145924
4	Muttahida Qaumi Movement Pakistan		117	145924

	TotalRejectedVotes	TotalVotes	TotalRegisteredVoters	Turnout
0	2103	146044	320578	46.18%
1	2103	146044	320578	46.18 %
2	2103	146044	320578	46.18 %
3	2103	146044	320578	46.18 %
4	2103	146044	320578	46.18 %

```
[]: NA8['Turnout'] = NA8['Turnout'].str.rstrip('%').str.rstrip(' ')
NA13['Turnout'] = NA13['Turnout'].str.rstrip('%').str.rstrip(' ')
NA8['Turnout'] = pd.to_numeric(NA8['Turnout'], errors='coerce')
NA13['Turnout'] = pd.to_numeric(NA13['Turnout'], errors='coerce')
```

```
[]: #####
NA8['Turnout'].str.rstrip('%').head(1).item(), (NA8['Turnout'].str.rstrip('%').
↳str.rstrip(' ').head(1).item())
#####
```

```
[]: ('22.97 ', '22.97')
```

```
[]: #####
NA8['Turnout']
#####
```

```
[]: 0 22.97
1 22.97
2 22.97
3 22.97
4 22.97
...
2311 33.75
2312 33.75
2313 33.75
2314 33.75
2315 33.75
Name: Turnout, Length: 2316, dtype: float64
```

```
[]: #####
help(pd.to_numeric)
#####
```

Help on function to\_numeric in module pandas.core.tools.numeric:

```
to_numeric(arg, errors: 'DatetimeErrorChoices' = 'raise', downcast:
"Literal['integer', 'signed', 'unsigned', 'float'] | None" = None,
dtype_backend: 'DtypeBackend | lib.NoDefault' = <no_default>)
 Convert argument to a numeric type.
```



The default return dtype is `'float64'` or `'int64'` depending on the data supplied. Use the `'downcast'` parameter to obtain other dtypes.

Please note that precision loss may occur if really large numbers are passed in. Due to the internal limitations of `'ndarray'`, if numbers smaller than `'-9223372036854775808'` (`np.iinfo(np.int64).min`) or larger than `'18446744073709551615'` (`np.iinfo(np.uint64).max`) are passed in, it is very likely they will be converted to float so that they can be stored in an `'ndarray'`. These warnings apply similarly to `'Series'` since it internally leverages `'ndarray'`.

#### Parameters

-----

`arg` : scalar, list, tuple, 1-d array, or Series

Argument to be converted.

`errors` : {'ignore', 'raise', 'coerce'}, default 'raise'

- If 'raise', then invalid parsing will raise an exception.
- If 'coerce', then invalid parsing will be set as NaN.
- If 'ignore', then invalid parsing will return the input.

.. versionchanged:: 2.2

"ignore" is deprecated. Catch exceptions explicitly instead.

`downcast` : str, default None

Can be 'integer', 'signed', 'unsigned', or 'float'.

If not None, and if the data has been successfully cast to a numerical dtype (or if the data was numeric to begin with), downcast that resulting data to the smallest numerical dtype possible according to the following rules:

- 'integer' or 'signed': smallest signed int dtype (min.: `np.int8`)
- 'unsigned': smallest unsigned int dtype (min.: `np.uint8`)
- 'float': smallest float dtype (min.: `np.float32`)

As this behaviour is separate from the core conversion to numeric values, any errors raised during the downcasting will be surfaced regardless of the value of the 'errors' input.

In addition, downcasting will only occur if the size of the resulting data's dtype is strictly larger than the dtype it is to be cast to, so if none of the dtypes checked satisfy that specification, no downcasting will be performed on the data.

`dtype_backend` : {'numpy\_nullable', 'pyarrow'}, default 'numpy\_nullable'

Back-end data type applied to the resultant `:class:`DataFrame`` (still experimental). Behaviour is as follows:

```
* ``"numpy_nullable"``: returns nullable-dtype-backed :class:`DataFrame`
 (default).
* ``"pyarrow"``: returns pyarrow-backed nullable :class:`ArrowDtype`
 DataFrame.
```

```
.. versionadded:: 2.0
```

#### Returns

```

```

```
ret
```

```
 Numeric if parsing succeeded.
```

```
 Return type depends on input. Series if Series, otherwise ndarray.
```

#### See Also

```

```

```
DataFrame.astype : Cast argument to a specified dtype.
```

```
to_datetime : Convert argument to datetime.
```

```
to_timedelta : Convert argument to timedelta.
```

```
numpy.ndarray.astype : Cast a numpy array to a specified type.
```

```
DataFrame.convert_dtypes : Convert dtypes.
```

#### Examples

```

```

```
Take separate series and convert to numeric, coercing when told to
```

```
>>> s = pd.Series(['1.0', '2', -3])
>>> pd.to_numeric(s)
0 1.0
1 2.0
2 -3.0
dtype: float64
>>> pd.to_numeric(s, downcast='float')
0 1.0
1 2.0
2 -3.0
dtype: float32
>>> pd.to_numeric(s, downcast='signed')
0 1
1 2
2 -3
dtype: int8
>>> s = pd.Series(['apple', '1.0', '2', -3])
>>> pd.to_numeric(s, errors='coerce')
0 NaN
1 1.0
2 2.0
3 -3.0
```

```
dtype: float64
```

Downcasting of nullable integer and floating dtypes is supported:

```
>>> s = pd.Series([1, 2, 3], dtype="Int64")
>>> pd.to_numeric(s, downcast="integer")
0 1
1 2
2 3
dtype: Int8
>>> s = pd.Series([1.0, 2.1, 3.0], dtype="Float64")
>>> pd.to_numeric(s, downcast="float")
0 1.0
1 2.1
2 3.0
dtype: Float32
```

```
[]: #####
NA2.head(1)
#####
```

```
[]: District Seat Constituency_title Candidate_Name \
0 PESHAWAR PESHAWAR-I NA-1 Mr Sajid Abdullah

 Party Votes Total_Valid_Votes Total_Rejected_Votes \
0 Pakistan Tehreek-e-Insaf 2029 65642 1552

 Total_Votes Total_Registered_Voters Turnout
0 67194 233907 28.73
```

```
[]: NA2['Year'] = "2002"
NA8['Year'] = "2008"
NA13['Year'] = "2013"
```

```
[]: #####
NA2.head(3)
#####
```

```
[]: District Seat Constituency_title Candidate_Name \
0 PESHAWAR PESHAWAR-I NA-1 Mr Sajid Abdullah
1 PESHAWAR PESHAWAR-I NA-1 Mr Shabir Ahmad
2 PESHAWAR PESHAWAR-I NA-1 Mr Usman Bashir Bilour

 Party Votes Total_Valid_Votes \
0 Pakistan Tehreek-e-Insaf 2029 65642
1 Muttahidha Majlis-e-Amal Pakistan 37179 65642
```

```
2 Awami National Party 23002 65642
```

```

Total_Rejected_Votes Total_Votes Total_Registered_Voters Turnout Year
0 1552 67194 233907 28.73 2002
1 1552 67194 233907 28.73 2002
2 1552 67194 233907 28.73 2002

```

```
[]: print(NA2.head(), "\n", NA8.head(), "\n", NA13.head())
```

```

District Seat Constituency_title \
0 PESHAWAR PESHAWAR-I NA-1
1 PESHAWAR PESHAWAR-I NA-1
2 PESHAWAR PESHAWAR-I NA-1
3 PESHAWAR PESHAWAR-I NA-1
4 PESHAWAR PESHAWAR-I NA-1

```

```

Candidate_Name Party \
0 Mr Sajid Abdullah Pakistan Tehreek-e-Insaf
1 Mr Shabir Ahmad Muttahidda Majlis-e-Amal Pakistan
2 Mr Usman Bashir Bilour Awami National Party
3 Mr Muhammad Khurshid Khan Advocate Independent
4 Mr Muhammad Muazzam Butt Pakistan Muslim League(QA)

```

```

Votes Total_Valid_Votes Total_Rejected_Votes Total_Votes \
0 2029 65642 1552 67194
1 37179 65642 1552 67194
2 23002 65642 1552 67194
3 1537 65642 1552 67194
4 1417 65642 1552 67194

```

```

Total_Registered_Voters Turnout Year
0 233907 28.73 2002
1 233907 28.73 2002
2 233907 28.73 2002
3 233907 28.73 2002
4 233907 28.73 2002

```

```

District Seat ConstituencyTitle CandidateName \
0 Peshawar Peshawar-1 NA-1 Abdullah Jan
1 Peshawar Peshawar-1 NA-1 Ashoni Kumar
2 Peshawar Peshawar-1 NA-1 Aurangzeb
3 Peshawar Peshawar-1 NA-1 Ayub Shah
4 Peshawar Peshawar-1 NA-1 Fakhri Alam Khan Paracha

```

```

Party Votes TotalValidVotes \
0 Independent 313 88325
1 Independent 156 88325
2 Independent 261 88325

```

3	Pakistan Peoples Party Parliamentarians	37682	88325
4	Independent	184	88325

	TotalRejectedVotes	TotalVotes	TotalRegisteredVoters	Turnout	Year
0	629	88913	387083	22.97	2008
1	629	88913	387083	22.97	2008
2	629	88913	387083	22.97	2008
3	629	88913	387083	22.97	2008
4	629	88913	387083	22.97	2008

	District	Seat	ConstituencyTitle	CandidateName	\
0	PESHAWAR	PESHAWAR-I	NA-1	Aamir Shehzad Hashmi	
1	PESHAWAR	PESHAWAR-I	NA-1	Akram Khan	
2	PESHAWAR	PESHAWAR-I	NA-1	Alhaaj Ghulam Ahmad Bilour	
3	PESHAWAR	PESHAWAR-I	NA-1	Amir Syed	
4	PESHAWAR	PESHAWAR-I	NA-1	Bashir Ahmad Afridi	

	Party	Votes	TotalValidVotes	\
0	Mustaqbil Pakistan	77	145924	
1	Independent	182	145924	
2	Awami National Party	24468	145924	
3	Pakistan Peoples Party (Shaheed Bhutto)	454	145924	
4	Muttahida Qaumi Movement Pakistan	117	145924	

	TotalRejectedVotes	TotalVotes	TotalRegisteredVoters	Turnout	Year
0	2103	146044	320578	46.18	2013
1	2103	146044	320578	46.18	2013
2	2103	146044	320578	46.18	2013
3	2103	146044	320578	46.18	2013
4	2103	146044	320578	46.18	2013

```
[]: print("NA2", NA2.isnull().any(), "\nNA8: ", NA8.isnull().any(), "\nNA13:", NA13.
 ↪isnull().any())
```

NA2 District	False
Seat	False
Constituency_title	False
Candidate_Name	False
Party	False
Votes	False
Total_Valid_Votes	False
Total_Rejected_Votes	False
Total_Votes	False
Total_Registered_Voters	False
Turnout	False
Year	False
dtype: bool	
NA8: District	False
Seat	False

```

ConstituencyTitle False
CandidateName False
Party False
Votes False
TotalValidVotes False
TotalRejectedVotes False
TotalVotes False
TotalRegisteredVoters False
Turnout False
Year False
dtype: bool
NA13: District False
Seat False
ConstituencyTitle False
CandidateName False
Party False
Votes False
TotalValidVotes False
TotalRejectedVotes False
TotalVotes False
TotalRegisteredVoters False
Turnout False
Year False
dtype: bool

```

```

[]: #####
NA2.isnull().any()
#####

```

```

[]: District False
Seat False
Constituency_title False
Candidate_Name False
Party False
Votes False
Total_Valid_Votes False
Total_Rejected_Votes False
Total_Votes False
Total_Registered_Voters False
Turnout False
Year False
dtype: bool

```

```

[]: print("\n NA2", NA2.columns, "\n NA8", NA8.columns, "\n NA13", NA13.columns)

```

```

NA2 Index(['District', 'Seat', 'Constituency_title', 'Candidate_Name', 'Party',
 'Votes', 'Total_Valid_Votes', 'Total_Rejected_Votes', 'Total_Votes',

```

```

 'Total_Registered_Voters', 'Turnout', 'Year'],
 dtype='object')
NA8 Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout', 'Year'],
 dtype='object')
NA13 Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout', 'Year'],
 dtype='object')

```

```

[]: NA2.rename(columns={'Constituency_title': 'ConstituencyTitle',
 'Candidate_Name': 'CandidateName',
 'Total_Valid_Votes': 'TotalValidVotes',
 'Total_Rejected_Votes': 'TotalRejectedVotes',
 'Total_Votes': 'TotalVotes',
 'Total_Registered_Voters': 'TotalRegisteredVoters'},
 inplace=True)
NA2.columns, NA8.columns

```

```

[]: (Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout', 'Year'],
 dtype='object'),
 Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout', 'Year'],
 dtype='object'))

```

```

[]: #####
NA2.shape, NA8.shape, NA13.shape
#####

```

```

[]: ((1793, 12), (2316, 12), (4510, 12))

```

```

[]: # Concatenating All 3 Datasets

df = pd.concat([NA2, NA8, NA13])
print(df.shape)
df.head()

```

```

(8619, 12)

```

```

[]: District Seat ConstituencyTitle CandidateName \
0 PESHAWAR PESHAWAR-I NA-1 Mr Sajid Abdullah
1 PESHAWAR PESHAWAR-I NA-1 Mr Shabir Ahmad
2 PESHAWAR PESHAWAR-I NA-1 Mr Usman Bashir Bilour

```

3	PESHAWAR	PESHAWAR-I	NA-1	Mr Muhammad Khurshid Khan Advocate
4	PESHAWAR	PESHAWAR-I	NA-1	Mr Muhammad Muazzam Butt

	Party	Votes	TotalValidVotes \
0	Pakistan Tehreek-e-Insaf	2029	65642
1	Muttahidda Majlis-e-Amal Pakistan	37179	65642
2	Awami National Party	23002	65642
3	Independent	1537	65642
4	Pakistan Muslim League(QA)	1417	65642

	TotalRejectedVotes	TotalVotes	TotalRegisteredVoters	Turnout	Year
0	1552	67194	233907	28.73	2002
1	1552	67194	233907	28.73	2002
2	1552	67194	233907	28.73	2002
3	1552	67194	233907	28.73	2002
4	1552	67194	233907	28.73	2002

```
[]: df.isnull().any()
```

```
[]: District False
Seat False
ConstituencyTitle False
CandidateName False
Party False
Votes False
TotalValidVotes False
TotalRejectedVotes False
TotalVotes False
TotalRegisteredVoters False
Turnout False
Year False
dtype: bool
```

```
[]: dist = df['District'].unique()
dist
```

```
[]: array(['PESHAWAR', 'NOWSHERA', 'Nowshera', 'Charsadda', 'Charsdda',
'Mardan', 'Sawabi', 'Kohat', 'Karak', 'Hangu', 'Abbottabad',
'Haripur', 'Mansehra', 'Batagram', 'Kohistan', 'Dera Ismail Khan',
'Dera Ismail Khan cum Tank', 'Bannu', 'Lakki Marwat', 'Buner',
'Sawat', 'Shangla', 'Chitral', 'Upper Dir', 'Lower Dir',
'Malakand', 'Tribal Area', 'Islamabad', 'Rawalpindi', 'Attock',
'Chakwal', 'Jhelum', 'Sargodha', 'Khushab', 'khushab', 'Mianwali',
'Bhakkar', 'Faisalabad', 'Jhang', 'Toba Tek Singh', 'Gujranwala',
'Hafizabad', 'Gujrat', 'Mandi Bahauddin', 'Sialkot', 'Narowal',
'Lahore', 'Sheikhupura', 'Sheiklhupura', 'Kasur', 'Okara',
'Multan', 'Lodhran', 'Khanewal', 'Sahiwal', 'Pakpattan', 'Vehari',
```



```
'Dera Ghazi Khan', 'Rajanpur', 'Muzaffargarh', 'Layyah',
'Bahawalpur', 'Bahawalnagar', 'Rahimyar Khan', 'SUKKUR', 'Ghotki',
'Shikarpur', 'Shikarpur', 'Larkana', 'Jacobabad',
'Nausheroferoze', 'Nawabshah', 'Khairpur', 'Hyderabad', 'Badin',
'Mirpurkhas', 'Tharparkar', 'Dadu', 'Sanghar', 'Thatta', 'Karachi',
'Quetta', 'Quetta Cum Chagai cum Mastung', 'Pishin Cum Ziarat',
'Killa', 'Loralai', 'Zhob Cum Killa Saifullah',
'Sibi Cum Kolhu Cum Dera Bugti', 'Nasirabad', 'Kachhi',
'Kalat Cum Mastung', 'Khuzdar', 'Awaran Cum Lasbela',
'Kharan Cum Panjgur', 'Kech Cum Gwadar', 'Peshawar', 'Swabi',
'Battagram', 'DIKhan', 'Swat', 'Malakand PA', 'MBDin',
'Nanka Sahib', 'Nankana Sahib', 'Sukkur cum ShikarpurI',
'Sukkur cum ShikarpurII', 'Shikarpur Old Shikarpur',
'Larkana Old Larkana', 'Larka cum',
'Kamber Shahdadt Old Larkana', 'Jacobabad Old Jacobabad',
'Kashmore Old Jacobabad', 'Naushero Feroze', 'Matiari',
'Tando Muhammad Khan', 'Tando Allahyar', 'Umerkot Old Mirpurkhas',
'Jamshoro Old Dadu', 'Pishin', 'Killa Abdullah', 'Zhob', 'Sibi',
'Bolan', 'Kalat', 'Awaran', 'Kharan', 'Kech', 'CHARSADDA',
'MARDAN', 'SWABI', 'KOHAT', 'KARAK', 'HANGU', 'ABBOTTABAD',
'HARIPUR', 'MANSEHRA', 'Tor Ghar cum Mansehra', 'BATTAGRAM',
'KOHISTAN', 'DERA ISMAIL KHAN', 'DIKHAN', 'BANNU', 'LAKKI MARWAT',
'BUNER', 'SWAT', 'SHANGLA', 'CHITRAL', 'UPPER DIR', 'LOWER DIR',
'MALAKAND P AREA', 'TRIBAL AREA', 'ISLAMABAD', 'RAWALPINDI',
'ATTOCK', 'CHAKWAL', 'JHELM', 'SARGODHA', 'KHUSHAB', 'MIANWALI',
'BHAKKAR', 'FAISALABAD', 'Chiniot', 'TOBA TEK SINGH', 'GUJRANWALA',
'HAFIZABAD', 'GUJRAT', 'MANDI BAHAUDDIN', 'SIALKOT', 'NAROWAL',
'LAHORE', 'SHEIKHUPURA', 'KASUR', 'OKARA', 'MULTAN', 'LODHAN',
'KHANEWAL', 'SAHIWAL', 'PAKPATTAN', 'VEHARI', 'DERA GHAZI KHAN',
'RAJANPUR', 'MUZAFFARGARH', 'LAYYAH', 'BAHAWALPUR', 'BAHAWALNAGAR',
'RAHIM YAR KHAN', 'GHOTKI', 'SHIKARPUR OLD SHIKARPUR',
'SHEIKHUPUR', 'LARKANA', 'KAMBER SHAHDADKOT OLD LARKANA',
'JACOBABAD OLD JACOBABAD', 'JACOBABAD', 'KASHMORE OLD JACOBABAD',
'NAUSHEHRO FEROZ', 'NAWABSHAH', 'KHAIRPUR', 'MATIARI', 'HYDERABAD',
'TANDO MUHAMMAD KHAN', 'TANDO ALLAHYAR', 'BADIN', 'MIRPUR KHAS',
'MIRPURKHAS', 'UMERKOTOLD MIRPURKHAS', 'THARPARKAR',
'JAMSHOROOLD DADU', 'DADU', 'SANGHAR', 'THATTA', 'KARACHI',
'QUETTA'], dtype=object)
```

```
[]: #####
df['District'] = df['District'].str.lower()
df.District.tail(1).item()
#####
```

```
[]: 'kech'
```

```
[]: #####
help(str.strip)
#####
```

Help on method\_descriptor:

```
strip(self, chars=None, /) unbound builtins.str method
 Return a copy of the string with leading and trailing whitespace removed.

 If chars is given and not None, remove characters in chars instead.
```

```
[]: # convert to lower case
df['District'] = df['District'].str.lower()
remove trailing white spaces
df['District'] = df['District'].str.strip()
```

```
[]: dist = df['District'].unique()
dist
```

```
[]: array(['peshawar', 'nowshera', 'charsadda', 'charsdda', 'mardan',
'sawabi', 'kohat', 'karak', 'hangu', 'abbottabad', 'haripur',
'mansehra', 'batagram', 'kohistan', 'dera ismail khan',
'dera ismail khan cum tank', 'bannu', 'lakki marwat', 'buner',
'sawat', 'shangla', 'chitral', 'upper dir', 'lower dir',
'malakand', 'tribal area', 'islamabad', 'rawalpindi', 'attock',
'chakwal', 'jhelum', 'sargodha', 'khushab', 'mianwali', 'bhakkar',
'faisalabad', 'jhang', 'toba tek singh', 'gujranwala', 'hafizabad',
'gujrat', 'mandi bahauddin', 'sialkot', 'narowal', 'lahore',
'sheikhupura', 'sheiklhupura', 'kasur', 'okara', 'multan',
'lodhran', 'khanewal', 'sahiwal', 'pakpattan', 'vehari',
'dera ghazi khan', 'rajanpur', 'muzaffargarh', 'layyah',
'bahawalpur', 'bahawalnagar', 'rahimyar khan', 'sukkur', 'ghotki',
'shikarpur', 'shikarapur', 'larkana', 'jacobabad',
'nausheroferoze', 'nawabshah', 'khairpur', 'hyderabad', 'badin',
'mirpurkhas', 'tharparkar', 'dadu', 'sanghar', 'thatta', 'karachi',
'quetta', 'quetta cum chagai cum mastung', 'pishin cum ziarat',
'killa', 'loralai', 'zhob cum killa saifullah',
'sibi cum kolhu cum dera bugti', 'nasirabad', 'kachhi',
'kalat cum mastung', 'khuzdar', 'awaran cum lasbela',
'kharan cum panjgur', 'kech cum gwadar', 'swabi', 'battagram',
'dikhan', 'swat', 'malakand pa', 'mbdin', 'nanka sahib',
'nankana sahib', 'sukkur cum shikarpuri', 'sukkur cum shikarpurii',
'shikarpur old shikarpur', 'larkana old larkana', 'larka cum',
'kamber shahdadt old larkana', 'jacobabad old jacobabad',
'kashmore old jacobabad', 'naushero feroze', 'matiari',
'tando muhammad khan', 'tando allahyar', 'umerkot old mirpurkhas',
```

```
'jamshoro old dadu', 'pishin', 'killa abdullah', 'zhob', 'sibi',
'bolan', 'kalat', 'awaran', 'kharan', 'kech',
'tor ghar cum mansehra', 'malakand p area', 'chiniot',
'rahim yar khan', 'sheikhupur', 'jacobabad old jacobabad',
'naushehro feroz', 'mirpur khas', 'umerkotold mirpurkhas',
'jamshoroold dadu'], dtype=object)
```

```
[]: # get the top 10 closest matches to "charsadda"
matches = fuzzywuzzy.process.extract("charsadda", dist, limit=10,
↳scorer=fuzzywuzzy.fuzz.token_sort_ratio)
matches
```

```
[]: [('charsadda', 100),
('charsdda', 94),
('mardan', 53),
('tharparkar', 53),
('kharan', 53),
('chakwal', 50),
('larkana', 50),
('rahimyar khan', 45),
('hafizabad', 44),
('jacobabad', 44)]
```

```
[]: # function to replace rows in the provided column of the provided dataframe
that match the provided string above the provided ratio with the provided
↳string
def replace_matches_in_column(df, column, string_to_match, min_ratio = 90):
 # get a list of unique strings
 strings = df[column].unique()

 # get the top 10 closest matches to our input string
 matches = fuzzywuzzy.process.extract(string_to_match, strings,
↳limit=10, scorer=fuzzywuzzy.fuzz.
↳token_sort_ratio)

 # only get matches with a ratio > 90
 close_matches = [matches[0] for matches in matches if matches[1] >=
↳min_ratio]

 # get the rows of all the close matches in our dataframe
 rows_with_matches = df[column].isin(close_matches)

 # replace all rows with close matches with the input matches
 df.loc[rows_with_matches, column] = string_to_match
```

```
[]: replace_matches_in_column(df=df, column='District', string_to_match="charsadda")
```

```
[]: dist = df['District'].unique()
dist
```

```
[]: array(['peshawar', 'nowshera', 'charsadda', 'mardan', 'sawabi', 'kohat',
'karak', 'hangu', 'abbottabad', 'haripur', 'mansehra', 'batagram',
'kohistan', 'dera ismail khan', 'dera ismail khan cum tank',
'bannu', 'lakki marwat', 'buner', 'sawat', 'shangla', 'chitral',
'upper dir', 'lower dir', 'malakand', 'tribal area', 'islamabad',
'rawalpindi', 'attock', 'chakwal', 'jhelum', 'sargodha', 'khushab',
'mianwali', 'bhakkar', 'faisalabad', 'jhang', 'toba tek singh',
'gujranwala', 'hafizabad', 'gujrat', 'mandi bahauddin', 'sialkot',
'narowal', 'lahore', 'sheikhupura', 'sheiklhupura', 'kasur',
'okara', 'multan', 'lodhran', 'khanewal', 'sahiwal', 'pakpattan',
'vehari', 'dera ghazi khan', 'rajanpur', 'muzaffargarh', 'layyah',
'bahawalpur', 'bahawalnagar', 'rahimyar khan', 'sukkur', 'ghotki',
'shikarpur', 'shikarapur', 'larkana', 'jacobabad',
'nausheroferoze', 'nawabshah', 'khairpur', 'hyderabad', 'badin',
'mirpurkhas', 'tharparkar', 'dadu', 'sanghar', 'thatta', 'karachi',
'quetta', 'quetta cum chagai cum mastung', 'pishin cum ziarat',
'killa', 'loralai', 'zhob cum killa saifullah',
'sibi cum kolhu cum dera bugti', 'nasirabad', 'kachhi',
'kalat cum mastung', 'khuzdar', 'awaran cum lasbela',
'kharan cum panjgur', 'kech cum gwadar', 'swabi', 'battagram',
'dikhan', 'swat', 'malakand pa', 'mbdin', 'nanka sahib',
'nankana sahib', 'sukkur cum shikarpuri', 'sukkur cum shikarpurii',
'shikarpur old shikarpur', 'larkana old larkana', 'larka cum',
'kamber shahdadtold old larkana', 'jacobabad old jacobabad',
'kashmore old jacobabad', 'naushero feroze', 'matiari',
'tando muhammad khan', 'tando allahyar', 'umerkot old mirpurkhas',
'jamshoro old dadu', 'pishin', 'killa abdullah', 'zhob', 'sibi',
'bolan', 'kalat', 'awaran', 'kharan', 'kech',
'tor ghar cum mansehra', 'malakand p area', 'chiniot',
'rahim yar khan', 'sheikhupur', 'jacobabad old jacobabad',
'naushehro feroz', 'mirpur khas', 'umerkotold mirpurkhas',
'jamshoroold dadu'], dtype=object)
```

```
[]: replace_matches_in_column(df=df, column='District', string_to_match="nowshera")
replace_matches_in_column(df=df, column='District',
↳string_to_match="rawalpindi")
replace_matches_in_column(df=df, column='District',
↳string_to_match="sheikhupura")
replace_matches_in_column(df=df, column='District', string_to_match="shikarpur")
replace_matches_in_column(df=df, column='District', string_to_match="nankana_
↳sahib")
```

```
[]: #del dist
```

```
pty = df['Party'].unique()
pty.sort()
pty
```

```
[]: array(['Aap Janab Sarkar Party', 'Afghan Qumi Movement (Pakistan)',
 'All Pakistan Bayrozgar Party', 'All Pakistan Muslim League',
 'All Pakistan Youth Working Party',
 'Awami Himayat Tehreek Pakistan', 'Awami Jamhuri Ittehad Pakistan',
 'Awami Justice Party', 'Awami Muslim League Pakistan',
 'Awami National Party', 'Awami Qaidat Party', 'Awami Qiadat Party',
 'Awami Workers Party', 'Azad Pakistan Party',
 'Bahawalpur National Awami Party', 'Balochistan National Congress',
 'Balochistan National Democratic Party',
 'Balochistan National Movement', 'Balochistan National Party',
 'Balochistan National Party (Awami)',
 'Balohistan National Movement', 'Christian Progressive Movement',
 'Communist Party of Pakistan', 'Ghareeb Awam Party',
 'Hazara Awami Ittehad Pakistan', 'Hazara Democratic Party',
 'Hazara Quami Mahaz', 'IndeIndependentdent',
 'IndeIndependentdentE', 'Independent', 'Independent (RETIRED)',
 'Independentt', 'Indepndent', 'Islami Inqalab Party',
 'Islami Tehreek Pakistan', 'Islamic Republican Party',
 'Istehkaam-e-Pakistan Movement Party', 'Istiqlal Party',
 'Istiqlil Party', 'Ittehad Milli Hazara',
 'Jamaat-e-Islami Pakistan',
 'Jamait Ahle-Hadith Pakistan(Elahi Zaheer)',
 'Jamhoori Wattan Party', 'Jamiat Ulama-e-Islam (F)',
 'Jamiat Ulama-e-Islam (S)', 'Jamiat Ulama-e-Pakistan (Noorani)',
 'Jamiat Ulema-e-Pakistan (Niazi)',
 'JamiatUlema-e-pakistan(Nifaz-e-Shariat)', 'Jamote Qami Movement',
 'Jamote Qaumi Movement', 'Jannat Pakistan Party',
 'Jumiat Ulma-e-Islam(Nazryati)', 'Kakar Jamhoori Party Pakistan',
 'Karwan-i-Millat Pakistan', 'Labour Party Pakistan',
 'Labour Party Pakistan(Krandi)', 'Laboyr Party Pakistan',
 'MUTAHIDA DEENI MAHAZ', 'MUTTHIDA\xa0MAJLIS-E-AMAL\xa0PAKISTAN',
 'Majlis-e-Wahdat-e-Muslimeen Pakistan', 'Markazi Jamat-al-Hadaish',
 'Markazi Jamiat Mushaikh Pakistan', 'Menecracy action Party',
 'Millat Party', 'Mohajar Qaumi Movement Pakistan',
 'Mohajir Ittehad Tehrik', 'Mohajir Kashmir Movement',
 'Mohajir Qaumi Movement Pakistan',
 'Mohib-e-Wattan Nowjawan Inqilabion Ki Anjuman (MNAKA)',
 'Mohib-e-Wattan Nowjawan Inqilabion Ki Anjuman(MNAKA)',
 'Mustaqbil Pakistan', 'Mutahida Baloch Movement Pakistan',
 'Mutahidda Qabail Party', 'Muttahida Qaumi Moement',
 'Muttahida Qaumi Moment', 'Muttahida Qaumi Movement',
 'Muttahida Qaumi Movement Pakistan', 'Muttahidda Majlis-e-Amal',
 'Muttahidda Majlis-e-Amal Pakistan', 'National Alliance',
```

'National Party', 'National People Party Worker Group',  
 'National Peoples Party', 'Nazim-e-Mistafa',  
 'Nizam-e-Mustafa Party', 'PAK MUSLIM ALLIANCE',  
 'Pak Justic Party (Haqiqi)', 'Pak Muslim Alliance',  
 'Pak Wattan Party', 'Pakista Muslim League(J)',  
 'Pakistan Amn Party', 'Pakistan Awami Inqalab',  
 'Pakistan Awami Party', 'Pakistan Awami Quwat Party',  
 'Pakistan Awami Tehreek', 'Pakistan Awami Tehrik-e-Inqilab',  
 'Pakistan Awami party', 'Pakistan Bachao Party',  
 'Pakistan Brohi Party', 'Pakistan Citizen Movement',  
 'Pakistan Conservative Party', 'Pakistan Democratic Party',  
 'Pakistan Democratic party', 'Pakistan Falah Party',  
 'Pakistan Freedom Party', 'Pakistan Gharib Party',  
 'Pakistan Insani Haqook Party (Pakistan Human Rights Party)',  
 'Pakistan Islami Justice Party', 'Pakistan Ittehad Tehreek',  
 'Pakistan Justice Party', 'Pakistan Kissan Ittehad',  
 'Pakistan Mazdoor Kissan Party', 'Pakistan Motherland Party',  
 'Pakistan Muhafiz Party', 'Pakistan Muhafiz Watan Party',  
 'Pakistan Muhajir League', 'Pakistan Muhammadi Party',  
 'Pakistan Mulim League(QA)', 'Pakistan Muslim League',  
 'Pakistan Muslim League (F)', 'Pakistan Muslim League (J)',  
 'Pakistan Muslim League (N)', 'Pakistan Muslim League (Safdar)',  
 'Pakistan Muslim League (Sher-e-Bangal)',  
 'Pakistan Muslim League (Zehri Group)',  
 'Pakistan Muslim League Council',  
 'Pakistan Muslim League Humkhiyal (Like Minded)',  
 'Pakistan Muslim League \x93H\x94 Haqiqi',  
 'Pakistan Muslim League(F)', 'Pakistan Muslim League(J)',  
 'Pakistan Muslim League(N)', 'Pakistan Muslim League(QA)',  
 'Pakistan Muslim League(Z)', 'Pakistan National Democratic Party',  
 'Pakistan National Muslim League',  
 'Pakistan Pakhtoonkhawa Milli Awami Party',  
 'Pakistan Patriotic Movement',  
 'Pakistan Peoples Party (Shaheed Bhutto)',  
 'Pakistan Peoples Party Parliamentarian',  
 'Pakistan Peoples Party Parliamentarians',  
 'Pakistan Peoples Party Parlimentarians',  
 'Pakistan Peoples Party(Sheed Bhutto)',  
 'Pakistan Peoples Party(Sherpao)',  
 'Pakistan Peoples party(Shaheed Bhutto)',  
 'Pakistan Peoples party(Sherpao)', 'Pakistan Qaumi League',  
 'Pakistan Qaumi Party', 'Pakistan Sariaki Party',  
 'Pakistan Shia Political Party', 'Pakistan Sunni Tehreek',  
 'Pakistan Tahreek-e-Insaf', 'Pakistan Tehreek-e-Insaf',  
 'Pakistan Tehrek-e-Inqalab', 'Pakistan Workers Party',  
 'Pakistan mazdoor Kissan Party',  
 'Pakistan peoples Party Parlimentarians',

```

'Pakistan peoples party(Sherpao)', 'Pasban',
'Pashtoonkhwa Milli Awami Party', 'Punjab National Party',
'Qaumi Inqilab Party', 'Qaumi Jamhoori Party',
'Qaumi Tahaffaz party', 'Qaumi Watan Party (Sherpao)',
'Qomi Awami Tehreek', 'Sairkistan Qaumi Ittehad',
'Saraiki Sooba Movement Pakistan',
'Seraiki Sooba Movement Pakistan', 'Shan-e-Pakistan Party',
'Sindh Dost Ittehad', 'Sindh Taraqi Passand Party (STP)',
'Sindh United Party', 'Sindh Urban-Rural Alliance',
'Sunni Ittehad Council', 'Sunni Tehreek',
'Tameer-e-Pakistan Party', 'Tehreek Hussainia Pakistan',
'Tehreek Tabdili Nizam Pakistan', 'Tehreek-e-Insaniyat Pakistan',
'Tehreek-e-Istehkaam Pakistan', 'Tehreek-e-Itehad Pakistan.',
'Tehreek-e-Ittehad Ummat Pakistan',
'Tehreek-e-Pasmanada Awam Pakistan', 'Tehreek-e-Suba Hazara',
'Tehreek-e-Wafaq Pakistan', 'Tehrik-e-Istaqlal',
'Tehrik-e-Masawaat', 'pakistan Social Democratic party'],
dtype=object)

```

```

[]: df['Party'] = df['Party'].replace(['MUTTHIDA\xa0MAJLIS-E-AMAL\xa0PAKISTAN'],
 ↳ 'Muttahidda Majlis-e-Amal Pakistan')
df['Party'] = df['Party'].replace(['Pakistan Muslim League'], 'Pakistan Muslim
 ↳ League (QA)')
converting text to lower case and removing white spaces
df['Party'] = df['Party'].str.lower()
df['Party'] = df['Party'].str.strip()

```

```

[]: replace_matches_in_column(df=df, column='Party', string_to_match="Balochistan
 ↳ National Movement")
replace_matches_in_column(df=df, column='Party', string_to_match="Independent")
replace_matches_in_column(df=df, column='Party', string_to_match="Istiqlal
 ↳ Party")
replace_matches_in_column(df=df, column='Party', string_to_match="Jamote Qaumi
 ↳ Movement")
replace_matches_in_column(df=df, column='Party', string_to_match="Labour Party
 ↳ Pakistan")
replace_matches_in_column(df=df, column='Party',
 ↳ string_to_match="Mohib-e-Wattan Nowjawan Inqilabion Ki Anjuman (MNAKA)")
replace_matches_in_column(df=df, column='Party', string_to_match="Muttahida
 ↳ Qaumi Movement") # Muttahida Qaumi Movement Pakistan
replace_matches_in_column(df=df, column='Party', string_to_match="Muttahidda
 ↳ Majlis-e-Amal") # Muttahidda Majlis-e-Amal Pakistan
replace_matches_in_column(df=df, column='Party', string_to_match="National
 ↳ Peoples Party")
replace_matches_in_column(df=df, column='Party',
 ↳ string_to_match="Nizam-e-Mustafa Party")

```

```

replace_matches_in_column(df=df, column='Party', string_to_match="Pak Muslim_
↳Alliance")
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Awami Party")
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Democratic Party")
After analyzing each of the below strings.
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Muslim League (QA)", min_ratio =97)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Muslim League (N)", min_ratio =97)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Muslim League (J)", min_ratio =97)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Muslim League (F)", min_ratio =97)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Peoples Party Parliamentarians", min_ratio =97)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Peoples Party(Shaheed Bhutto)", min_ratio =95)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Peoples Party(Sherpao)", min_ratio =97)
replace_matches_in_column(df=df, column='Party', string_to_match="Pakistan_
↳Tehreek-e-Insaf", min_ratio =95)
replace_matches_in_column(df=df, column='Party', string_to_match="Saraiki Sooba_
↳Movement Pakistan", min_ratio =95)

```

```

[]: df['Party'] = df['Party'].str.lower()
df['Party'].replace(['muttahida qaumi movement pakistan'], 'muttahida qaumi_
↳movement', inplace=True)
df['Party'].replace(['indeindependentdente', 'independent (retired)',_
↳'indepdent'], 'independent', inplace=True)
df['Party'].replace(['indeindependentdente','independent_
↳(retired)','indepdent'], 'independent',inplace = True)
df['Party'].replace(['muttahidda majlis-e-amal_
↳pakistan','mutthida\x0majlis-e-amal\x0pakistan'
, 'mutthidaï½majlis-e-amali½pakistan']
, 'muttahidda majlis-e-amal' ,inplace = True)
df['Party'].replace(['nazim-e-mistafa'], 'nizam-e-mustafa party' ,inplace =_
↳True)
df['Party'].replace(['pakistan muslim league (qa)'], 'pakistan muslim league_
↳(q)' ,inplace = True)
df['Party'].replace(['pakistan muslim league council'], 'pakistan muslim league_
↳(c)' ,inplace = True)
df['Party'].replace(['pakistan muslim league \x93h\x94 haqiqi'], 'pakistan_
↳muslim league haqiqi' ,inplace = True)

```



```

df['Party'].replace(['pakistan muslim league(z)'], 'pakistan muslim league (z)' ,
 inplace = True)
df['Party'].replace(['pakistan peoples party(shaheed bhutto)'], 'pakistan
 peoples party (shaheed bhutto)' ,inplace = True)
df['Party'].replace(['pakistan peoples party parliamentarians'], 'pakistan
 peoples party parliamentarians' ,inplace = True)
df['Party'].replace(['pakistan sariaki party'], 'Pakistan Siraiki Party (T)' ,
 inplace = True)
df['Party'].replace(['pasban'], 'pasban pakistan' ,inplace = True)
df['Party'].replace(['qaumi watan party (sherpao)'], 'qaumi watan party' ,
 inplace = True)
df['Party'].replace(['tehreek-e-suba hazara'], 'tehreek-e-suba hazara pakistan' ,
 inplace = True)
#...
df['Party'].replace(['pashtoonkhwa milli awami party'], 'pakhtoonkhwa milli
 Awami party' ,inplace = True)
df['Party'].replace(['pakistan amn party'], 'pakistan aman party' ,inplace =
 True)
df['Party'].replace(['pakistan awami inqelabi'], 'Pakistan Awami Inqelabi
 League' ,inplace = True)
df['Party'].replace(['pakistan freedom party'], 'pakistan freedom movement' ,
 inplace = True)
df['Party'].replace(['pakistan insani haqook party (pakistan human rights
 party)'], 'pakistan human rights party' ,inplace = True)
df['Party'].replace(['awami justice party'], 'awami justice party pakistan' ,
 inplace = True)
df['Party'].replace(['indeindependentdent'], 'independent' ,inplace = True)
df['Party'].replace(['jamiat ulama-e-pakistan (noorani)'], 'jamiat
 ulama-e-pakistan (noorani)' ,inplace = True)
df['Party'].replace(['jumiati ulma-e-islam(nazryati)'], 'jamiat ulma-e-islam
 nazryati pakistan' ,inplace = True)
df['Party'].replace(['majlis-e-wahdat-e-muslimeen pakistan'], 'Majlis
 Wahdat-e-Muslimeen Pakistan' ,inplace = True)
df['Party'].replace(['markazi jamat-al-hadaish'], 'Markazi Jamiat Ahl-e-Hadith' ,
 inplace = True)
df['Party'].replace(['mohib-e-wattan nowjawan inqilabion ki anjuman (mnaka)'],
 'Muhib-e-Watan Noujawan Anqlabion Ki Anjuman (MNAKA)' ,inplace = True)

pty = df['Party'].unique()
pty.sort()
pty

```

/tmp/ipython-input-1221807450.py:2: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment using an inplace method.

The behavior will change in pandas 3.0. This inplace method will never work

because the intermediate object on which we are setting values always behaves as a copy.

For example, when doing `'df[col].method(value, inplace=True)'`, try using `'df.method({col: value}, inplace=True)'` or `df[col] = df[col].method(value)` instead, to perform the operation `inplace` on the original object.

```
df['Party'].replace(['muttahida qaumi movement pakistan'], 'muttahida qaumi movement', inplace=True)
```

```
[]: array(['Majlis Wahdat-e-Muslimeen Pakistan',
 'Markazi Jamiat Ahl-e-Hadith',
 'Muhib-e-Watan Noujawan Anqlabion Ki Anjuman (MNAKA)',
 'Pakistan Siraiki Party (T)', 'aap janab sarkar party',
 'afghan qumi movement (pakistan)', 'all pakistan bayrozgar party',
 'all pakistan muslim league', 'all pakistan youth working party',
 'awami himayat tehreek pakistan', 'awami jamhuri ittehad pakistan',
 'awami justice party pakistan', 'awami muslim league pakistan',
 'awami national party', 'awami qaidat party', 'awami qiadat party',
 'awami workers party', 'azad pakistan party',
 'bahawalpur national awami party', 'balochistan national congress',
 'balochistan national democratic party',
 'balochistan national movement', 'balochistan national party',
 'balochistan national party (awami)',
 'christian progressive movement', 'communist party of pakistan',
 'ghareeb awam party', 'hazara awami ittehad pakistan',
 'hazara democratic party', 'hazara quami mahaz', 'independent',
 'islami inqalab party', 'islami tehreek pakistan',
 'islamic republican party', 'istehkaam-e-pakistan movement party',
 'istiqlal party', 'ittehad milli hazara',
 'jamaat-e-islami pakistan',
 'jamait ahle-hadith pakistan(elahi zaheer)',
 'jamhoori wattan party', 'jamiat ulama-e-islam (f)',
 'jamiat ulama-e-islam (s)', 'jamiat ulama-e-pakistan (noorani)',
 'jamiat ulema-e-pakistan (niazi)',
 'jamiat ulma-e-islam nazryati pakistan',
 'jamiatulema-e-pakistan(nifaz-e-shariat)', 'jamote qaumi movement',
 'jannat pakistan party', 'kakar jamhoori party pakistan',
 'karwan-i-millat pakistan', 'labour party pakistan',
 'labour party pakistan(krandi)',
 'markazi jamiat mushaikh pakistan', 'menecracy action party',
 'millat party', 'mohajar qaumi movement pakistan',
 'mohajir ittehad tehrik', 'mohajir kashmir movement',
 'mohajir qaumi movement pakistan', 'mustaqbil pakistan',
 'mutahida baloch movement pakistan', 'mutahida deeni mahaz',
 'mutahidda qabail party', 'muttahida qaumi movement',
```

'muttahidda majlis-e-amal', 'national alliance', 'national party',  
 'national people party worker group', 'national peoples party',  
 'nizam-e-mustafa party', 'pak justic party (haqiqi)',  
 'pak muslim alliance', 'pak wattan party',  
 'pakhtoonkhwa milli Awami party', 'pakistan aman party',  
 'pakistan awami inqalab', 'pakistan awami party',  
 'pakistan awami quwat party', 'pakistan awami tehreek',  
 'pakistan awami tehrik-e-inqilab', 'pakistan bachao party',  
 'pakistan brohi party', 'pakistan citizen movement',  
 'pakistan conservative party', 'pakistan democratic party',  
 'pakistan falah party', 'pakistan freedom movement',  
 'pakistan gharib party', 'pakistan human rights party',  
 'pakistan islami justice party', 'pakistan ittehad tehreek',  
 'pakistan justice party', 'pakistan kissan ittehad',  
 'pakistan mazdoor kissan party', 'pakistan motherland party',  
 'pakistan muhafiz party', 'pakistan muhafiz watan party',  
 'pakistan muhajir league', 'pakistan muhammadi party',  
 'pakistan muslim league (c)', 'pakistan muslim league (f)',  
 'pakistan muslim league (j)', 'pakistan muslim league (n)',  
 'pakistan muslim league (q)', 'pakistan muslim league (safdar)',  
 'pakistan muslim league (sher-e-bangal)',  
 'pakistan muslim league (z)',  
 'pakistan muslim league (zehri group)',  
 'pakistan muslim league haqiqi',  
 'pakistan muslim league humkhiyal (like minded)',  
 'pakistan national democratic party',  
 'pakistan national muslim league',  
 'pakistan pakhtoonkhawa milli awami party',  
 'pakistan patriotic movement',  
 'pakistan peoples party (shaheed bhutto)',  
 'pakistan peoples party parliamentarians',  
 'pakistan peoples party(sherpao)', 'pakistan qaumi league',  
 'pakistan qaumi party', 'pakistan shia political party',  
 'pakistan social democratic party', 'pakistan sunni tehreek',  
 'pakistan tehreek-e-insaf', 'pakistan tehrek-e-inqalab',  
 'pakistan workers party', 'pasban pakistan',  
 'punjab national party', 'qaumi inqilab party',  
 'qaumi jamhoori party', 'qaumi tahaffaz party',  
 'qaumi watan party', 'qomi awami tehreek',  
 'sairkistan qaumi ittehad', 'saraiki sooba movement pakistan',  
 'shan-e-pakistan party', 'sindh dost ittehad',  
 'sindh taraqi passand party (stp)', 'sindh united party',  
 'sindh urban-rurel alliance', 'sunni ittehad council',  
 'sunni tehreek', 'tameer-e-pakistan party',  
 'tehreek hussainia pakistan', 'tehreek tabdili nizam pakistan',  
 'tehreek-e-insaniyat pakistan', 'tehreek-e-istehkaam pakistan',  
 'tehreek-e-itehad pakistan.', 'tehreek-e-ittehad ummat pakistan',

```
'tehreek-e-pasmanada awam pakistan',
'tehreek-e-suba hazara pakistan', 'tehreek-e-wafaq pakistan',
'tehrik-e-istaqlal', 'tehrik-e-masawaat'], dtype=object)
```

```
[]: df['CandidateName'] = df['CandidateName'].str.lower()
df['CandidateName'] = df['CandidateName'].str.strip()
df['CandidateName'].head(10)
```

```
[]: 0 mr sajid abduallah
1 mr shabir ahmad
2 mr usman bashir bilour
3 mr muhammad khurshid khan advocate
4 mr muhammad muazzam butt
5 dr arbab alamgir khan
6 mr abdul manan akhonzada advocate
7 maulana rehmat ullah
8 mr arbab muhammad ayub jan
9 mr iqbal zafar jhagra
Name: CandidateName, dtype: object
```

```
[]: # removing mr from the starting of the CandidateName but leaving dr
df['CandidateName'] = df.loc[:, 'CandidateName'].replace(regex=True,
↳to_replace="mr ", value="")
df['CandidateName'] = df.loc[:, 'CandidateName'].replace(regex=True,
↳to_replace="mrs ", value="")
df['CandidateName'] = df.loc[:, 'CandidateName'].replace(regex=True,
↳to_replace="miss", value="")
df['CandidateName'].head(10)
```

```
[]: 0 sajid abduallah
1 shabir ahmad
2 usman bashir bilour
3 muhammad khurshid khan advocate
4 muhammad muazzam butt
5 dr arbab alamgir khan
6 abdul manan akhonzada advocate
7 maulana rehmat ullah
8 arbab muhammad ayub jan
9 iqbal zafar jhagra
Name: CandidateName, dtype: object
```

```
[]: df.loc[:, 'CandidateName'], df['CandidateName']
```

```
[]: (0 mr sajid abduallah
1 mr shabir ahmad
2 mr usman bashir bilour
3 mr muhammad khurshid khan advocate
```

```

4 mr muhammad muazzam butt
 ...
4505 gulab baloch
4506 muhammad yasin baloch
4507 nazimuddin
4508 sayed essa nori
4509 zobaida jalal
Name: CandidateName, Length: 8619, dtype: object,
0 mr sajid abdullah
1 mr shabir ahmad
2 mr usman bashir bilour
3 mr muhammad khurshid khan advocate
4 mr muhammad muazzam butt
 ...
4505 gulab baloch
4506 muhammad yasin baloch
4507 nazimuddin
4508 sayed essa nori
4509 zobaida jalal
Name: CandidateName, Length: 8619, dtype: object)

```

```

[]: #####
help(df.loc)
#####

```

Help on `_LocIndexer` in module `pandas.core.indexing` object:

```

class _LocIndexer(_LocationIndexer)
| Access a group of rows and columns by label(s) or a boolean array.
|
| ``.loc[]`` is primarily label based, but may also be used with a
| boolean array.
|
| Allowed inputs are:
|
| - A single label, e.g. ``5`` or ``'a'``, (note that ``5`` is
| interpreted as a *label* of the index, and never as an
| integer position along the index).
| - A list or array of labels, e.g. ``['a', 'b', 'c']``.
| - A slice object with labels, e.g. ``'a':'f'``.
|
| .. warning:: Note that contrary to usual python slices, both the
| start and the stop are included
|
| - A boolean array of the same length as the axis being sliced,
| e.g. ``[True, False, True]``.
| - An alignable boolean Series. The index of the key will be aligned before

```

```

| masking.
| - An alignable Index. The Index of the returned selection will be the input.
| - A ``callable`` function with one argument (the calling Series or
| DataFrame) and that returns valid output for indexing (one of the above)
|
| See more at :ref:`Selection by Label <indexing.label>`.
|
| Raises
| -----
| KeyError
| If any items are not found.
| IndexError
| If an indexed key is passed and its index is unalignable to the frame
index.
|
| See Also
| -----
| DataFrame.at : Access a single value for a row/column label pair.
| DataFrame.iloc : Access group of rows and columns by integer position(s).
| DataFrame.xs : Returns a cross-section (row(s) or column(s)) from the
| Series/DataFrame.
| Series.loc : Access group of values using labels.
|
| Examples
| -----
| **Getting values**
|
| >>> df = pd.DataFrame([[1, 2], [4, 5], [7, 8]],
| ... index=['cobra', 'viper', 'sidewinder'],
| ... columns=['max_speed', 'shield'])
| >>> df
|
| max_speed shield
| cobra 1 2
| viper 4 5
| sidewinder 7 8
|
| Single label. Note this returns the row as a Series.
|
| >>> df.loc['viper']
| max_speed 4
| shield 5
| Name: viper, dtype: int64
|
| List of labels. Note using ``[[]]`` returns a DataFrame.
|
| >>> df.loc[['viper', 'sidewinder']]
| max_speed shield
| viper 4 5

```

```

| sidewinder 7 8
|
| Single label for row and column
|
| >>> df.loc['cobra', 'shield']
| 2
|
| Slice with labels for row and single label for column. As mentioned
| above, note that both the start and stop of the slice are included.
|
| >>> df.loc['cobra':'viper', 'max_speed']
| cobra 1
| viper 4
| Name: max_speed, dtype: int64
|
| Boolean list with the same length as the row axis
|
| >>> df.loc[[False, False, True]]
| max_speed shield
| sidewinder 7 8
|
| Alignable boolean Series:
|
| >>> df.loc[pd.Series([False, True, False],
| ... index=['viper', 'sidewinder', 'cobra'])]
| max_speed shield
| sidewinder 7 8
|
| Index (same behavior as ``df.reindex``)
|
| >>> df.loc[pd.Index(["cobra", "viper"], name="foo")]
| max_speed shield
| foo
| cobra 1 2
| viper 4 5
|
| Conditional that returns a boolean Series
|
| >>> df.loc[df['shield'] > 6]
| max_speed shield
| sidewinder 7 8
|
| Conditional that returns a boolean Series with column labels specified
|
| >>> df.loc[df['shield'] > 6, ['max_speed']]
| max_speed
| sidewinder 7

```

```

| Multiple conditional using ``&`` that returns a boolean Series
|
| >>> df.loc[(df['max_speed'] > 1) & (df['shield'] < 8)]
| max_speed shield
| viper 4 5
|
| Multiple conditional using ``|`` that returns a boolean Series
|
| >>> df.loc[(df['max_speed'] > 4) | (df['shield'] < 5)]
| max_speed shield
| cobra 1 2
| sidewinder 7 8
|
| Please ensure that each condition is wrapped in parentheses ``()``.
| See the :ref:`user guide<indexing.boolean>`
| for more details and explanations of Boolean indexing.
|
| .. note::
| If you find yourself using 3 or more conditionals in ``.loc[]``,
| consider using :ref:`advanced indexing<advanced.advanced_hierarchical>`.
|
| See below for using ``.loc[]`` on MultiIndex DataFrames.
|
| Callable that returns a boolean Series
|
| >>> df.loc[lambda df: df['shield'] == 8]
| max_speed shield
| sidewinder 7 8
|
| **Setting values**
|
| Set value for all items matching the list of labels
|
| >>> df.loc[['viper', 'sidewinder'], ['shield']] = 50
| >>> df
| max_speed shield
| cobra 1 2
| viper 4 50
| sidewinder 7 50
|
| Set value for an entire row
|
| >>> df.loc['cobra'] = 10
| >>> df
| max_speed shield
| cobra 10 10
| viper 4 50
| sidewinder 7 50

```



```

|
| Set value for an entire column
|
| >>> df.loc[:, 'max_speed'] = 30
| >>> df
|
| max_speed shield
| cobra 30 10
| viper 30 50
| sidewinder 30 50
|
| Set value for rows matching callable condition
|
| >>> df.loc[df['shield'] > 35] = 0
| >>> df
|
| max_speed shield
| cobra 30 10
| viper 0 0
| sidewinder 0 0
|
| Add value matching location
|
| >>> df.loc["viper", "shield"] += 5
| >>> df
|
| max_speed shield
| cobra 30 10
| viper 0 5
| sidewinder 0 0
|
| Setting using a ``Series`` or a ``DataFrame`` sets the values matching the
| index labels, not the index positions.
|
| >>> shuffled_df = df.loc[["viper", "cobra", "sidewinder"]]
| >>> df.loc[:] += shuffled_df
| >>> df
|
| max_speed shield
| cobra 60 20
| viper 0 10
| sidewinder 0 0
|
| **Getting values on a DataFrame with an index that has integer labels**
|
| Another example using integers for the index
|
| >>> df = pd.DataFrame([[1, 2], [4, 5], [7, 8]],
| ... index=[7, 8, 9], columns=['max_speed', 'shield'])
| >>> df
|
| max_speed shield
| 7 1 2

```

```

| 8 4 5
| 9 7 8
|
| Slice with integer labels for rows. As mentioned above, note that both
| the start and stop of the slice are included.
|
| >>> df.loc[7:9]
| max_speed shield
| 7 1 2
| 8 4 5
| 9 7 8
|
| **Getting values with a MultiIndex**
|
| A number of examples using a DataFrame with a MultiIndex
|
| >>> tuples = [
| ... ('cobra', 'mark i'), ('cobra', 'mark ii'),
| ... ('sidewinder', 'mark i'), ('sidewinder', 'mark ii'),
| ... ('viper', 'mark ii'), ('viper', 'mark iii')
| ...]
| >>> index = pd.MultiIndex.from_tuples(tuples)
| >>> values = [[12, 2], [0, 4], [10, 20],
| ... [1, 4], [7, 1], [16, 36]]
| >>> df = pd.DataFrame(values, columns=['max_speed', 'shield'], index=index)
| >>> df
|
| max_speed shield
| cobra mark i 12 2
| mark ii 0 4
| sidewinder mark i 10 20
| mark ii 1 4
| viper mark ii 7 1
| mark iii 16 36
|
| Single label. Note this returns a DataFrame with a single index.
|
| >>> df.loc['cobra']
| max_speed shield
| mark i 12 2
| mark ii 0 4
|
| Single index tuple. Note this returns a Series.
|
| >>> df.loc[('cobra', 'mark ii')]
| max_speed 0
| shield 4
| Name: (cobra, mark ii), dtype: int64
|

```

| Single label for row and column. Similar to passing in a tuple, this  
| returns a Series.

```
| >>> df.loc['cobra', 'mark i']
| max_speed 12
| shield 2
| Name: (cobra, mark i), dtype: int64
```

| Single tuple. Note using ``[[]]`` returns a DataFrame.

```
| >>> df.loc[[('cobra', 'mark ii')]]
| max_speed shield
| cobra mark ii 0 4
```

| Single tuple for the index with a single label for the column

```
| >>> df.loc[('cobra', 'mark i'), 'shield']
| 2
```

| Slice from index tuple to single label

```
| >>> df.loc[('cobra', 'mark i'):'viper']
| max_speed shield
| cobra mark i 12 2
| mark ii 0 4
| sidewinder mark i 10 20
| mark ii 1 4
| viper mark ii 7 1
| mark iii 16 36
```

| Slice from index tuple to index tuple

```
| >>> df.loc[('cobra', 'mark i'):(('viper', 'mark ii'))]
| max_speed shield
| cobra mark i 12 2
| mark ii 0 4
| sidewinder mark i 10 20
| mark ii 1 4
| viper mark ii 7 1
```

| Please see the :ref:`user guide<advanced.advanced\_hierarchical>`  
| for more details and explanations of advanced indexing.

| Method resolution order:

```
| _LocIndexer
| _LocationIndexer
| pandas._libs.indexing.NDFrameIndexerBase
| builtins.object
```

```

|
| Data and other attributes defined here:
|
| __annotations__ = {'_takeable': 'bool'}
|
| -----
| Methods inherited from _LocationIndexer:
|
| __call__(self, axis: 'Axis | None' = None) -> 'Self'
| Call self as a function.
|
| __getitem__(self, key)
|
| __setitem__(self, key, value) -> 'None'
|
| -----
| Data descriptors inherited from _LocationIndexer:
|
| __dict__
| dictionary for instance variables
|
| __weakref__
| list of weak references to the object
|
| -----
| Data and other attributes inherited from _LocationIndexer:
|
| axis = None
|
| -----
| Methods inherited from pandas._libs.indexing.NDFrameIndexerBase:
|
| __init__(self, /, *args, **kwargs)
| Initialize self. See help(type(self)) for accurate signature.
|
| __reduce__ = __reduce_cython__(...)
|
| __reduce_cython__(self)
|
| __setstate__ = __setstate_cython__(...)
|
| __setstate_cython__(self, __pyx_state)
|
| -----
| Static methods inherited from pandas._libs.indexing.NDFrameIndexerBase:
|
| __new__(*args, **kwargs) class method of
pandas._libs.indexing.NDFrameIndexerBase

```

```

| Create and return a new object. See help(type) for accurate signature.
|
| -----
| Data descriptors inherited from pandas._libs.indexing.NDFrameIndexerBase:
|
| name
|
| ndim
|
| obj

```

```

[]: cn = df['CandidateName'].unique()
cn.sort()
print("cn size: ", cn.shape, "\nValues", cn)

```

```

cn size: (7657,)
Values [' mehwish chaudhary' 'aadil altaf unar' 'aamanullah' ... 'zulqurnain'
'zumarad khan' 'zumurad khan']

```

```

[]: df['CandidateName']

```

```

[]: 0 sajid abdullah
1 shabir ahmad
2 usman bashir bilour
3 muhammad khurshid khan advocate
4 muhammad muazzam butt
...
4505 gulab baloch
4506 muhammad yasin baloch
4507 nazimuddin
4508 sayed essa nori
4509 zobaida jalal
Name: CandidateName, Length: 8619, dtype: object

```

```

[]: print(fuzzywuzzy.process.extract("zumurad khan" , cn, limit=10,
↳scorer=fuzzywuzzy.fuzz.token_sort_ratio)) # acceptance value > 90
print(fuzzywuzzy.process.extract("zobaida jalal", cn, limit=10,
↳scorer=fuzzywuzzy.fuzz.token_sort_ratio)) # acceptance value > 79

```

```

[('zumurad khan', 96), ('zumarad khan', 92), ('murad khan', 91), ('umara khan',
82), ('khan zada', 76), ('majid khan', 73), ('munir khan', 73), ('zahid khan',
73), ('muhammad khan', 72), ('musharaf khan', 72)]
[('zobaida jalal', 100), ('zubada jalal', 88), ('zubeda jalal', 80), ('jalil
zahid', 75), ('laiq zada', 64), ('qaisar jamal', 64), ('saida jan', 64), ('zahid
ali', 64), ('umaid ali dal', 62), ('aqaal zaman', 61)]

```

```
[]: replace_matches_in_column(df=df, column='CandidateName',
 ↳string_to_match="zumurad khan", min_ratio=92)
replace_matches_in_column(df=df, column='CandidateName',
 ↳string_to_match="zobaida jalal", min_ratio=80)
replace_matches_in_column(df=df, column='CandidateName',
 ↳string_to_match="barkat ali", min_ratio=90)
replace_matches_in_column(df=df, column='CandidateName',
 ↳string_to_match="muhammad yasin baloch", min_ratio=90)

for candi in df['CandidateName'].unique(): # 7000
 replace_matches_in_column(df=df, column='CandidateName',
 ↳string_to_match=candi, min_ratio=90)

let us know the loop is completed
print("All done!")
```

All done!

```
[]: df.to_csv('NA2002-18.csv', index=None)
```

```
[]: # Candidate List and Parties of 2018 Election

cc = pd.read_csv(os.path.join(path, "National Assembly Candidates List - 2018_
 ↳Updated.csv"), encoding="ISO-8859-1")
na18 = pd.read_csv(os.path.join(path, "2013-2018 Seat Changes in NA.csv"),
 ↳encoding="ISO-8859-1")
pp = pd.read_csv(os.path.join(path, "Political Parties in 2018 Elections -
 ↳Updated.csv"), encoding="ISO-8859-1")
print(cc.shape, na18.shape, pp.shape)
```

(3438, 4) (288, 3) (119, 3)

```
[]: print(cc.columns, na18.columns)
```

Index(['NA#', 'Name', 'Party', 'Province'], dtype='object') Index(['2018 Seat  
Number', 'Seat Name', '2013 Seat Number'], dtype='object')

```
[]: cc['NA#'] = 'NA-' + cc['NA#'].astype(str)
cc['NA#']
```

```
[]: 0 NA-1
 1 NA-1
 2 NA-1
 3 NA-1
 4 NA-1
 ...
 3433 NA-272
```

```

3434 NA-272
3435 NA-272
3436 NA-272
3437 NA-272
Name: NA#, Length: 3438, dtype: object

```

```

[]: print(cc['NA#'].unique().shape) # 272
 print(na18['2018 Seat Number'].unique().shape) # 273
 na18.rename(columns={'2018 Seat Number': 'NA#'}, inplace=True)
 na18.rename(columns={'Seat Name': 'Seat'}, inplace=True)
 na18[na18['NA#'] == "Old Constituency Changed Considerably"]

```

```

(272,)
(273,)

```

```

[]:
 NA# \
272 Old Constituency Changed Considerably
273 Old Constituency Changed Considerably
274 Old Constituency Changed Considerably
275 Old Constituency Changed Considerably
276 Old Constituency Changed Considerably
277 Old Constituency Changed Considerably
278 Old Constituency Changed Considerably
279 Old Constituency Changed Considerably
280 Old Constituency Changed Considerably
281 Old Constituency Changed Considerably
282 Old Constituency Changed Considerably
283 Old Constituency Changed Considerably
284 Old Constituency Changed Considerably
285 Old Constituency Changed Considerably
286 Old Constituency Changed Considerably
287 Old Constituency Changed Considerably

 Seat 2013 Seat Number
272 Karachi 9 - Central 5 NA-247
273 Karachi 12 - South 3 NA-250
274 Attock III NA-059
275 Faisalabad 11 NA-085
276 Jhang- Cum-Chiniot (Old NA-87 Jhang-II) NA-088
277 Gujaranwala 7 NA-101
278 Hafizabad 2 NA-103
279 Narowal 3 NA-117
280 Nankana Sahib-III (Old Sheikhpura-VII) NA-137
281 Kasur 5 NA-142
282 Okara 5 NA-147
283 Sahiwal 4 NA-163
284 Pakpattan 3 NA-166

```

285	JACOBABAD-CUM-KASHMORE(OLD JACOBABAD-II)	NA-209
286	Thatta 2	NA-238
287	Kachhi-cum-Jhal Magsi	NA-267

```
[]: na18 = na18[na18['NA#'] != "Old Constituency Changed Considerably"]
na18['NA#'] = na18.loc[:, 'NA#'].replace(regex=True, to_replace="NA-", value="")
na18['NA#'] = pd.to_numeric(na18['NA#'])
na18['NA#'] = na18['NA#'].astype(np.int64)
na18['NA#'] = 'NA-' + na18['NA#'].astype(str)

na18['NA#'].head()
```

```
[]: 0 NA-1
 1 NA-2
 2 NA-3
 3 NA-4
 4 NA-5
Name: NA#, dtype: object
```

```
[]: # Add District column and its cleani
na18['District'] = na18['Seat']
remove all those substring with ()
na18['District'] = na18['District'].map(lambda x: (re.sub(r"\(.*\)", "", x)))
na18['District'] = na18['District'].map(lambda x: (re.sub(r"Cum.*", "", x)))
na18['District'] = na18['District'].map(lambda x: (re.sub(r"-.*", "", x)))
na18['District'] = na18['District'].map(lambda x: (re.sub(r"\(.*\)", "", x)))
na18['District'] = na18['District'].map(lambda x: (re.sub(r"(XX|IX|X?
↳I{0,3})(IX|IV|V?I{0,3})$", "", x)))
na18['District'] = na18['District'].map(lambda x: (re.sub(r"(XX|IX|X?
↳I{0,3})(IX|IV|V?I{0,3})$", "", x)))
na18['District'].unique()
```

```
[]: array(['Chitral', 'Swat ', 'Upper Dir', 'Lower Dir', 'Lower Dir ',
'Malakand', 'Boner', 'Shangla', 'Kohistan', 'Battagram',
'Mansehra ', 'Abottabad ', 'Haripur', 'Swabi ', 'Mardan ',
'Charsadda ', 'Nowshera ', 'Peshawar ', 'Kohat', 'Hangu', 'Karak',
'Bannu', 'Lakki Marwat', 'Tank', 'D I Khan', 'D I Khan KUM Tank',
'Tribal Area I ', 'Tribal Area II ', 'Tribal Area III ',
'Tribal Area IV ', 'Tribal Area V ', 'Tribal Area VI ',
'Tribal Area VII ', 'Tribal Area VIII ', 'Tribal Area IX ',
'Tribal Area X ', 'Tribal Area XI ', 'Tribal Area XII ',
'Islamabad 1', 'Islamabad 2', 'Islamabad 3', 'Attock ',
'Rawalpindi ', 'Chakwal ', 'Jehlum ', 'Gujarat 1', 'Gujarat 2',
'Gujarat 3', 'Gujarat 4', 'Sialkot 1', 'Sialkot 2', 'Sialkot 3',
'Sialkot 4', 'Sialkot 5', 'Narowal 1', 'Narowal 2',
'Gujaranwala 1', 'Gujaranwala 2', 'Gujaranwala 3', 'Gujaranwala 4',
'Gujaranwala 5', 'Gujaranwala 6', 'MANDI BAHAUDDIN', 'Hafizabad 1',
```



```
'Sargodha ', 'Khushab ', 'Mianwali ', 'Bhakkar ', 'Chiniot',
'Faisalabad 1', 'Faisalabad 2', 'Faisalabad 3', 'Faisalabad 4',
'Faisalabad 5', 'Faisalabad 6', 'Faisalabad 7', 'Faisalabad 8',
'Faisalabad 9', 'Faisalabad 10', 'Toba Tek Singh 1',
'Toba Tek Singh 2', 'Toba Tek Singh 3', 'Jhang', 'Nankana Sahib',
'Sheikhupura 1', 'Sheikhupura 2', 'Sheikhupura 3', 'Sheikhupura 4',
'Lahore 1', 'Lahore 2', 'Lahore 3', 'Lahore 4', 'Lahore 5',
'Lahore 6', 'Lahore 7', 'Lahore 8', 'Lahore 9', 'Lahore 10',
'Lahore 11', 'Lahore 12', 'Lahore 13', 'Lahore 14', 'Kasur 1',
'Kasur 2', 'Kasur 3', 'Kasur 4', 'Okara 1', 'Okara 2', 'Okara 3',
'Okara 4', 'Pakpattan 1', 'Pakpattan 2', 'Sahiwal 1', 'Sahiwal 2',
'Sahiwal 3', 'Khanewal 1', 'Khanewal 2', 'Khanewal 3',
'Khanewal 4', 'Multan 1', 'Multan 2', 'Multan 3', 'Multan 4',
'Multan 5', 'Multan 6', 'Lodhran 1', 'Lodhran 2', 'Vehari 1',
'Vehari 2', 'Vehari 3', 'Vehari 4', 'Bahawalnagar 1',
'Bahawalnagar 2', 'Bahawalnagar 3', 'Bahawalnagar 4',
'Bahawalpur 1', 'Bahawalpur 2', 'Bahawalpur 3', 'Bahawalpur 4',
'Bahawalpur 5', 'Rahim Yar Khan 1', 'Rahim Yar Khan 2',
'Rahim Yar Khan 3', 'Rahim Yar Khan 4', 'Rahim Yar Khan 5',
'Rahim Yar Khan 6', 'Muzaffargarh 1', 'Muzaffargarh 2',
'Muzaffargarh 3', 'Muzaffargarh 4', 'Muzaffargarh 5',
'Muzaffargarh 6', 'Layyah 1', 'Layyah 2', 'Dera Ghazi Khan 1',
'Dera Ghazi Khan 2', 'Dera Ghazi Khan 3', 'Dera Ghazi Khan',
'Rajanpur 1', 'Rajanpur 2', 'Rajanpur 3',
'JACOBABAD (OLD JACOBABAD', 'KASHMORE (OLD JACOBABAD',
'SHIKARPUR (OLD SHIKARPUR', 'SHEIKHUPUR', 'Larkana (Old Larkana',
'LARKANA', 'KAMBER SHAHDADKOT (OLD LARKANA', 'GHOTK', 'SUKKUR',
'Khairpur 1', 'Khairpur 2', 'Khairpur 3', 'NAUSHEHRO FEROZ',
'Nawabshah 1', 'Nawabshah 2', 'Sanghar 1', 'SANGHAR',
'MIRPUR KHAS', 'MIRPURKHAS', 'UMERKOT(OLD MIRPURKHAS',
'Tharparkar 1', 'Tharparkar 2', 'MATIAR', 'HYDERABAD',
'TANDO MUHAMMAD KHAN', 'TANDO ALLAHYAR', 'BADIN', 'Sujawal',
'Thatta 1', 'JAMSHORO(OLD DADU', 'DADU', 'Karachi 19 ',
'Karachi 20 ', 'Karachi 21 ', 'Karachi 13 ', 'Karachi 18 ',
'Karachi ', 'Karachi 14 ', 'Karachi 15 ', 'Karachi 16 ',
'Karachi 17 ', 'Karachi 10 ', 'Karachi 11 ', 'Karachi 1 ',
'Karachi 2 ', 'Karachi 3 ', 'Karachi 4 ', 'Karachi 5 ',
'Karachi 6 ', 'Karachi 7 ', 'Karachi 8 ', 'Zhob', 'Loralai',
'Sibi', 'Nasirabad', 'Jaffarabad', 'Pishin', 'Killa Abdullah',
'Quetta', 'Quetta 3', 'Kalat', 'Chaghai', 'Khuzdar', 'Kharan',
'Awaran', 'Kech'], dtype=object)
```

```
[]: cc = cc.join(na18.set_index('NA#'), on='NA#')
cc.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 3438 entries, 0 to 3437
```

Data columns (total 8 columns):

#	Column	Non-Null Count	Dtype
0	NA#	3438 non-null	object
1	Name	3435 non-null	object
2	Party	3438 non-null	object
3	Province	3438 non-null	object
4	Seat	3438 non-null	object
5	2013 Seat Number	3438 non-null	object
6	District	3438 non-null	object
7	Distirct	3438 non-null	object

dtypes: object(8)

memory usage: 215.0+ KB

```
[]: print(pp.shape)
 pp['Name of Political Party'].unique()
```

(119, 3)

```
[]: array(['Aam Admi Tehreek Pakistan', 'Aam Awam Party',
 'Aam Log Party Pakistan',
 'All Pakistan Minority Movement Pakistan',
 'All Pakistan Muslim League',
 'All Pakistan Muslim League (Jinnah)', 'All Pakistan Tehreek',
 'Allah-O-Akbar Tehreek', 'Amun Taraqqi Party', 'Awam League',
 'Awami Justice Party Pakistan', 'Awami Muslim League Pakistan',
 'Awami National Party', 'Awami Party Pakistan-S',
 'Awami Workers Party', 'Balochistan Awami Party',
 'Balochistan National Movement', 'Balochistan National Party',
 'Balochistan National Party(Awami)', 'Barabri Party Pakistan',
 'Front National Pakistan', 'Grand Democratic Alliance',
 'Hazara Democratic Party', 'Humdardan-e-Watan Pakistan',
 'Islami Jamhoori Ittehad Pakistan', 'Islami Tehreek Pakistan',
 'Ittehad-e-Ummat Pakistan', 'Jamat-e-Islami Pakistan',
 'Jamhoori Watan Party', 'Jamiat Ulama-e-Islam Nazaryati Pakistan',
 'Jamiat Ulama-e-Islam(F)', 'Jamiat Ulema-e-Pakistan (Noorani)',
 'Jamiyat Ulma-e-Islam Pakistan(S)', 'Jamote Qaumi Movement',
 'Jannat Pakistan Party', 'Majlis Wahdat-e-Muslimeen Pakistan',
 'Markazi Jamiat Ahl-e-Hadith', 'Mohajir Qaumi Movement (Pakistan)',
 'Move on Pakistan',
 'Muhib-e-Watan Noujawan Anqlabion Ki Anjuman (MNAKA)',
 'Mustaqbil Pakistan', 'Mutahida Majlis-e-Amal Pakistan',
 'Mutahidda Ulema Mashaikh Council of Pakistan',
 'Mutahiddia Qabail Party', 'Mutihida League',
 'Muttahida Qaumi Movement Pakistan', 'National Party',
 'National Peace Council Party', 'Pak Sarzameen Party',
 'Pakhtoonkhwa Milli Awami Party', 'Pakistan Aman Party',
```

```

'Pakistan Aman Tehreek', 'Pakistan Awami Inqelabi League',
'Pakistan Awami League', 'Pakistan Awami Raj',
'Pakistan Awami Tehreek', 'Pakistan Citizen Movement',
'Pakistan Conservative Party', 'Pakistan Falah Party',
'Pakistan Falahi Tehreek', 'Pakistan Freedom Movement',
'Pakistan Human Party', 'Pakistan Human Rights Party',
'Pakistan Islamic Republican Party',
'Pakistan Justice and Democratic Party',
'Pakistan Kissan Ittehad (Ch. Anwar)', 'Pakistan Muslim Alliance',
'Pakistan Muslim League', 'Pakistan Muslim League (Council)',
'Pakistan Muslim League (Functional)',
'Pakistan Muslim League (Junejo)', 'Pakistan Muslim League (N)',
'Pakistan Muslim League (Zia-ul-Haq Shaheed)',
'Pakistan Muslim League Organization',
'Pakistan Muslim League SHER-E-BANGAL A.K. Fazal-Ul-Haque',
'Pakistan National Muslim League', 'Pakistan Peoples Party',
'Pakistan Peoples Party (Shaheed Bhutto)',
'Pakistan Peoples Party Parliamentarians',
'Pakistan Peoples Party Workers', 'Pakistan Quami Yakjehti Party',
'Pakistan Reh-e- Haq Party', 'Pakistan Siraiki Party (T)',
'Pakistan Sunni Tehreek', 'Pakistan Supreme Democratic',
'Pakistan Tehreek-e-Insaf', 'Pakistan Tehreek-e-Insaf (Nazriati)',
'Pakistan Tehreek-e-Insaf-Gulalai', 'Pakistan Tehreek-e-Insaniat',
'Pakistan Welfare Party', 'Pakistan Yaqeen Party',
'Pasban Pakistan', 'Peoples Movement of Pakistan',
'Peoples Muslim League (Pakistan)', 'Qaumi Watan Party',
'Roshan Pakistan League', 'Saraikistan Democratic Party',
'Sindh United Party', 'Sunni Ittehad Council', 'Sunni Tehreek',
'Tabdeeli Pasand Party (Pakistan)', 'Tehreek Labbaik Pakistan',
'Tehreek Tabdili Nizam Pakistan', 'Tehreek-e-Difa-e-Pakistan',
'Tehreek-e-Labbaiq Islam', 'Tehreek-e-Suba Hazara Pakistan',
'Tehrik Jawanan Pakistan', 'Pakistan Rah-e-Haq Party',
'Tehreek Jawanan Pakistan.', 'Allah-o-Akbar Tehreek',
'Jamiat Ulma-e-Islam Nazryati Pakistan',
'Pakistan Muslim League (Q)',
'Pakistan Justice & Democratic Party',
'Justice and Development Party Pakistan',
'Muttahidda Qaumi Movement Pakistan', 'Muttahida Majlis-e-Amal',
'Pakistan Muslim League-Nawaz ', 'Tehreek Jamhuriat Pakistan',
'Pakistan Muhajir League'], dtype=object)

```

```

[]: pp.rename(columns={'Acronym': 'PartyAcro'} , inplace=True)
cc.rename(columns={'Party': 'PartyAcro'} , inplace=True)
pp.rename(columns={'Name of Political Party': 'Party'}, inplace=True)

```

```

[]: # Clean Candidate file

```

```

pp['Party'].replace(['pakistan reh-e- haq party'], 'Pakistan Rah-e- Haq Party',
 inplace=True)
pp['Party'].replace(['Pakistan Muslim League SHER-E-BANGAL A.K.
 ↳Fazal-Ul-Haque'], 'pakistan muslim league(sher-e-bangal)', inplace=True)
pp['Party'].replace(['Pakistan Muslim League (Zia-ul-Haq Shaheed)'], 'pakistan
 ↳muslim league (z)', inplace = True)
pp['Party'].replace(['Pakistan Muslim League (Junejo)'], 'pakistan muslim
 ↳league (j)', inplace = True)
pp['Party'].replace(['Pakistan Muslim League (Functional)'], 'pakistan muslim
 ↳league (f)', inplace = True)
pp['Party'].replace(['Pakistan Muslim League (Council)'], 'pakistan muslim
 ↳league (c)', inplace = True)
pp['Party'].replace(['Pakistan Muslim League-Nawaz'], 'pakistan muslim league
 ↳(n)', inplace = True)
pp['Party'].replace(['Pakistan Justice & Democratic Party'], 'Pakistan Justice
 ↳and Democratic Party', inplace = True)
pp['Party'].replace(['Pakistan Kissan Ittehad (Ch. Anwar)'], 'Pakistan Kissan
 ↳Ittehad', inplace = True)
pp['Party'].replace(['Jamiat Ulma-e-Islam Nazryati Pakistan'], 'Jamiat
 ↳Ulma-e-Islam Nazaryati Pakistan', inplace = True)
pp['Party'].replace(['Jamiat Ulma-e-Islam Nazryati Pakistan'], 'Jamiat
 ↳Ulma-e-Islam Nazaryati Pakistan', inplace = True)
pp['Party'].replace(['Jamiat Ulama-e-Islam(F)'], 'Jamiat Ulama-e-Islam (F)'
 ↳,inplace = True)
pp['Party'].replace(['Jamiat Ulama-e-Islam(S)'], 'Jamiat Ulama-e-Islam (S)'
 ↳,inplace = True)
pp['Party'].replace(['Mohajir Qaumi Movement (Pakistan)'], 'Mohajir Qaumi
 ↳Movement pakistan', inplace = True)
pp['Party'].replace(['Mutahida Majlis-e-Amal'], 'Muttahida Majlis-e-Amal'
 ↳,inplace = True)
pp['Party'].replace(['Muttahidda Qaumi Movement Pakistan'], 'Muttahida Qaumi
 ↳Movement Pakistan', inplace = True)

```

/tmp/ipython-input-3055495350.py:2: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment using an inplace method.

The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting values always behaves as a copy.

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col].method(value) instead, to perform the operation inplace on the original object.

```
pp['Party'].replace(['pakistan reh-e- haq party'], 'Pakistan Rah-e- Haq
```

```
Party', inplace=True)
```

```
[]: # Remove duplicates
pp.drop_duplicates(subset=['PartyAcro'], keep="first", inplace=True)
pp.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Index: 112 entries, 0 to 118
Data columns (total 3 columns):
Column Non-Null Count Dtype
--- -
0 Party 112 non-null object
1 Symbol 106 non-null object
2 PartyAcro 111 non-null object
dtypes: object(3)
memory usage: 3.5+ KB
```

```
[]: pp
```

```
[]:
 Party Symbol PartyAcro
0 Aam Admi Tehreek Pakistan Mug AATP
1 Aam Awam Party Wheat Bunch AAP
2 Aam Log Party Pakistan Hut ALPP
3 All Pakistan Minority Movement Pakistan Giraffe APMMP
4 All Pakistan Muslim League Eagle APML
..
111 Pakistan Muslim League (Q) cycle PMLQ
112 Pakistan Justice and Democratic Party NaN PJDP
113 Justice and Development Party Pakistan NaN JDPP
117 Tehreek Jamhuriat Pakistan NaN TJ
118 Pakistan Muhajir League NaN NaN
```

```
[112 rows x 3 columns]
```

```
[]: cc[cc['PartyAcro']=='PTI'].head()
```

```
[]:
 NA# Name PartyAcro Province Seat \
10 NA-1 Abdul Latif PTI Khyber Pakhtunkhwa Chitral
20 NA-2 Dr. Haider Ali Khan PTI Khyber Pakhtunkhwa Swat I
28 NA-3 Saleem Rehman PTI Khyber Pakhtunkhwa Swat II
37 NA-4 Murad Saeed PTI Khyber Pakhtunkhwa Swat III
49 NA-5 Sahibzada Sibghat Ullah PTI Khyber Pakhtunkhwa Upper Dir

 2013 Seat Number District Distirct
10 NA-032 Chitral Chitral
20 NA-029 Swat Swat
28 NA-030 Swat Swat
37 Newly Added Swat Swat
```

```
[]: #####
cc.shape, pp.shape
#####
```

```
[]: ((3438, 8), (112, 3))
```

```
[]: # del cnd
cnd = cc.join(pp.set_index('PartyAcro'), on='PartyAcro')
cnd.shape
```

```
[]: (3438, 10)
```

```
[]: cnd.info(), cnd.head()
```

```
[]: #####
cnd['Name']
#####
```

```
[]: 0 Eid Ul Hussain
1 Mohammad Amjad
2 Mohammad Yahya
3 Nisar Dastageer
4 Shahzada Muharamad Taim
...
3433 Muhammad Akhtar Mengal
3434 Mohammad Aslam Bhootani
3435 Mohammad Akram
3436 Nawab Khan Bizenjo
3437 Wazir Ahmed Noorani
Name: Name, Length: 3438, dtype: object
```

```
[]: cnd[cnd['PartyAcro']=="PTI"].head()

cnd['Name'] = cnd['Name'].str.replace('[^a-zA-Z]', '', regex=True)
#cnd['Name'] = cnd['Name'].map(lambda x: (re.sub('[^a-zA-Z]', '', x)))
cnd['Name'] = cnd['Name'].str.lower()
cnd['Name'] = cnd['Name'].str.strip()

cnd['Party'] = cnd['Party'].str.lower()
cnd['Party'] = cnd['Party'].str.strip()

cnd[cnd['PartyAcro']=="PTI"].head()
```

```
[]: NA# Name PartyAcro Province Seat \
10 NA-1 abdul latif PTI Khyber Pakhtunkhwa Chitral
20 NA-2 dr haider ali khan PTI Khyber Pakhtunkhwa Swat I
28 NA-3 saleem rehman PTI Khyber Pakhtunkhwa Swat II
37 NA-4 murad saeed PTI Khyber Pakhtunkhwa Swat III
49 NA-5 sahibzada sibghat ullah PTI Khyber Pakhtunkhwa Upper Dir
```

```
 2013 Seat Number District Distirct Party Symbol
10 NA-032 Chitral Chitral pakistan tehreek-e-insaf Bat
20 NA-029 Swat Swat pakistan tehreek-e-insaf Bat
28 NA-030 Swat Swat pakistan tehreek-e-insaf Bat
37 Newly Added Swat Swat pakistan tehreek-e-insaf Bat
49 NA-033 Upper Dir Upper Dir pakistan tehreek-e-insaf Bat
```

```
[]: print(df.columns, cnd.columns)
df.info()
cnd.info()
```

```
Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
 'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
 'TotalRegisteredVoters', 'Turnout', 'Year'],
 dtype='object') Index(['NA#', 'Name', 'PartyAcro', 'Province', 'Seat',
 '2013 Seat Number',
 'District', 'Distirct', 'Party', 'Symbol'],
 dtype='object')
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
Index: 8619 entries, 0 to 4509
```

```
Data columns (total 12 columns):
```

#	Column	Non-Null Count	Dtype
0	District	8619 non-null	object
1	Seat	8619 non-null	object
2	ConstituencyTitle	8619 non-null	object
3	CandidateName	8619 non-null	object
4	Party	8619 non-null	object
5	Votes	8619 non-null	int64
6	TotalValidVotes	8619 non-null	int64
7	TotalRejectedVotes	8619 non-null	int64
8	TotalVotes	8619 non-null	int64
9	TotalRegisteredVoters	8619 non-null	int64
10	Turnout	8619 non-null	float64
11	Year	8619 non-null	object

```
dtypes: float64(1), int64(5), object(6)
```

```
memory usage: 1.1+ MB
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 3438 entries, 0 to 3437
```

```
Data columns (total 10 columns):
```

#	Column	Non-Null Count	Dtype
0	NA#	3438 non-null	object
1	Name	3435 non-null	object
2	PartyAcro	3438 non-null	object
3	Province	3438 non-null	object
4	Seat	3438 non-null	object
5	2013 Seat Number	3438 non-null	object
6	District	3438 non-null	object
7	Distirct	3438 non-null	object
8	Party	1706 non-null	object
9	Symbol	1686 non-null	object

dtypes: object(10)

memory usage: 268.7+ KB

```
[]: cnd.rename(columns={'NA#':'ConstituencyTitle'}, inplace=True)
cnd.rename(columns={'Name of Political Party':'Party'}, inplace=True)
cnd.rename(columns={'Name':'CandidateName'}, inplace=True)
```

```
[]: cnd.to_csv('Candidates2018.csv', index=None)
pp.to_csv('Parties_cleand.csv', index=None)
```

```
[]: # Reading 2018 Results Data
NA18 = pd.read_csv(os.path.join(path, "NA-Results2018 Ver 2.csv"), encoding = "ISO-8859-1")
print("Data Dimensions of NA18 are: ", NA18.shape)

print("\nNA 2018.csv")
NA18.info()

NA18 = NA18.drop('Unnamed: 0', axis=1)
NA18.rename(columns={'district':'District'}, inplace=True)

NA18.District = NA18.Seat
NA18['District'] = NA18['District'].str.replace(".", " ") # to deal with D.I. Khan
NA18['District'] = NA18['District'].str.replace(r"\(.*\)", "")
NA18['District'] = NA18['District'].str.replace('[^a-zA-Z -]', '')
NA18['District'] = NA18['District'].str.replace(r"-.*", "")
NA18['District'] = NA18['District'].str.replace(r" (XX|IX|X?I{0,3})(IX|IV|V?I{0,3})$", '')
NA18['District'] = NA18['District'].str.replace(r" (XX|IX|X?I{0,3})(IX|IV|V?I{0,3})$", '')
NA18['District'].unique()

NA18['Turnout'] = NA18['Turnout'].str.rstrip('%').str.rstrip(' ')
NA18['Turnout'] = pd.to_numeric(NA18['Turnout'], errors='coerce')
```



```

NA18.rename(columns={'Constituency_Title':'ConstituencyTitle', 'Candidate_Name':
↳'CandidateName', 'Total_Valid_Votes':'TotalValidVotes',
↳'Total_Rejected_Votes':'TotalRejectedVotes', 'Total_Votes':'TotalVotes',
↳'Total_Registered_Voters':'TotalRegisteredVoters', 'Part':'Party' },
↳inplace=True)
NA18.columns

```

Data Dimensions of NA18 are: (3428, 12)

NA 2018.csv

```
<class 'pandas.core.frame.DataFrame'>
```

RangeIndex: 3428 entries, 0 to 3427

Data columns (total 12 columns):

#	Column	Non-Null Count	Dtype
0	Unnamed: 0	3428 non-null	int64
1	district	3428 non-null	object
2	Seat	3428 non-null	object
3	Constituency_Title	3428 non-null	object
4	Candidate_Name	3428 non-null	object
5	Part	3428 non-null	object
6	Votes	3428 non-null	int64
7	Total_Valid_Votes	3428 non-null	int64
8	Total_Rejected_Votes	3428 non-null	int64
9	Total_Votes	3428 non-null	int64
10	Total_Registered_Voters	3428 non-null	int64
11	Turnout	3428 non-null	object

dtypes: int64(6), object(6)

memory usage: 321.5+ KB

```

[]: Index(['District', 'Seat', 'ConstituencyTitle', 'CandidateName', 'Party',
↳'Votes', 'TotalValidVotes', 'TotalRejectedVotes', 'TotalVotes',
↳'TotalRegisteredVoters', 'Turnout'],
↳dtype='object')

```

```

[]: # convert to lower case
NA18['District'] = NA18['District'].str.lower()
remove trailing white spaces
NA18['District'] = NA18['District'].str.strip()

convert to lower case
NA18['CandidateName'] = NA18['CandidateName'].str.lower()
remove trailing white spaces
NA18['CandidateName'] = NA18['CandidateName'].str.strip()

convert to lower case
NA18['Party'] = NA18['Party'].str.lower()

```

```
remove trailing white spaces
NA18['Party'] = NA18['Party'].str.strip()
```

```
[]: NA18.head()
```

```
[]: District Seat ConstituencyTitle CandidateName \
0 chitral Chitral NA-1 moulana abdul akbar chitrali
1 chitral Chitral NA-1 saeed ur rehman
2 chitral Chitral NA-1 muhammad yahya
3 chitral Chitral NA-1 shahzada muhammad taimur khisrao
4 chitral Chitral NA-1 eid ul hussain
```

```
 Party Votes TotalValidVotes \
0 muttahida majlis-e-amal pakistan 48616 158925
1 pakistan rah-e-haq party 3223 0
2 independent 698 0
3 independent 2414 0
4 awami national party 3613 0
```

```
 TotalRejectedVotes TotalVotes TotalRegisteredVoters Turnout
0 5430 164355 269579 60.97
1 0 0 0 60.97
2 0 0 0 60.97
3 0 0 0 60.97
4 0 0 0 60.97
```

```
[]: NA18.to_csv('NA2018_Clean.csv', index=None)
```