```
In [42]: s.rolling(2, min_periods=1).apply(lambda x: x.iloc[-1], raw=False)
Out[42]:
1     0.0
2     1.0
3     2.0
4     3.0
5     4.0
Length: 5, dtype: float64
```

### Mimic the original behavior of passing a ndarray:

```
In [43]: s.rolling(2, min_periods=1).apply(lambda x: x[-1], raw=True)
Out[43]:
1     0.0
2     1.0
3     2.0
4     3.0
5     4.0
Length: 5, dtype: float64
```

### DataFrame.interpolate has gained the limit\_area kwarg

DataFrame.interpolate() has gained a limit\_area parameter to allow further control of which NaN s are replaced. Use limit\_area='inside' to fill only NaNs surrounded by valid values or use limit\_area='outside' to fill only NaN s outside the existing valid values while preserving those inside. (GH16284) See the full documentation here.

```
In [44]: ser = pd.Series([np.nan, np.nan, 5, np.nan, np.nan,
                           np.nan, 13, np.nan, np.nan])
In [45]: ser
Out [45]:
0
      NaN
      NaN
1
      5.0
2
3
     NaN
4
     NaN
5
     NaN
6
    13.0
     NaN
8
     NaN
Length: 9, dtype: float64
```

## Fill one consecutive inside value in both directions

```
In [46]: ser.interpolate(limit_direction='both', limit_area='inside', limit=1)
Out[46]:
0    NaN
1    NaN
2    5.0
3    7.0
4    NaN
5    11.0
6    13.0
```

(continues on next page)

```
7 NaN
8 NaN
Length: 9, dtype: float64
```

### Fill all consecutive outside values backward

```
In [47]: ser.interpolate(limit_direction='backward', limit_area='outside')
Out [47]:
      5.0
0
      5.0
1
2
      5.0
3
      NaN
4
      NaN
5
      NaN
     13.0
6
      NaN
      NaN
Length: 9, dtype: float64
```

#### Fill all consecutive outside values in both directions

```
In [48]: ser.interpolate(limit_direction='both', limit_area='outside')
Out [48]:
      5.0
      5.0
1
2
      5.0
3
      NaN
4
      NaN
      NaN
6
     13.0
     13.0
     13.0
Length: 9, dtype: float64
```

### get\_dummies now supports dtype argument

The get\_dummies () now accepts a dtype argument, which specifies a dtype for the new columns. The default remains uint8. (GH18330)

```
In [49]: df = pd.DataFrame({'a': [1, 2], 'b': [3, 4], 'c': [5, 6]})
In [50]: pd.get_dummies(df, columns=['c']).dtypes
Out [50]:
       int64
а
h
       int64
      uint8
c_5
     uint8
Length: 4, dtype: object
In [51]: pd.get_dummies(df, columns=['c'], dtype=bool).dtypes
Out [51]:
       int64
а
b
       int64
c_5
        bool
```

(continues on next page)

```
c_6 bool
Length: 4, dtype: object
```

#### Timedelta mod method

mod (%) and divmod operations are now defined on Timedelta objects when operating with either timedelta-like or with numeric arguments. See the *documentation here*. (GH19365)

```
In [52]: td = pd.Timedelta(hours=37)
In [53]: td % pd.Timedelta(minutes=45)
Out[53]: Timedelta('0 days 00:15:00')
```

### .rank() handles inf values when NaN are present

In previous versions, .rank() would assign inf elements NaN as their ranks. Now ranks are calculated properly. (GH6945)

```
In [54]: s = pd.Series([-np.inf, 0, 1, np.nan, np.inf])
In [55]: s
Out[55]:
0    -inf
1     0.0
2     1.0
3     NaN
4     inf
Length: 5, dtype: float64
```

#### Previous behavior:

```
In [11]: s.rank()
Out[11]:
0    1.0
1    2.0
2    3.0
3    NaN
4    NaN
dtype: float64
```

## Current behavior:

```
In [56]: s.rank()
Out[56]:
0    1.0
1    2.0
2    3.0
3    NaN
4    4.0
Length: 5, dtype: float64
```

Furthermore, previously if you rank inf or -inf values together with NaN values, the calculation won't distinguish NaN from infinity when using 'top' or 'bottom' argument.

```
In [57]: s = pd.Series([np.nan, np.nan, -np.inf, -np.inf])

In [58]: s
Out[58]:
0    NaN
1    NaN
2    -inf
3    -inf
Length: 4, dtype: float64
```

#### Previous behavior:

```
In [15]: s.rank(na_option='top')
Out[15]:
0    2.5
1    2.5
2    2.5
3    2.5
dtype: float64
```

#### Current behavior:

```
In [59]: s.rank(na_option='top')
Out[59]:
0    1.5
1    1.5
2    3.5
3    3.5
Length: 4, dtype: float64
```

### These bugs were squashed:

- Bug in DataFrame.rank() and Series.rank() when method='dense' and pct=True in which percentile ranks were not being used with the number of distinct observations (GH15630)
- Bug in Series.rank() and DataFrame.rank() when ascending='False' failed to return correct ranks for infinity if NaN were present (GH19538)
- Bug in DataFrameGroupBy.rank() where ranks were incorrect when both infinity and NaN were present (GH20561)

### Series.str.cat has gained the join kwarg

Previously, Series.str.cat() did not – in contrast to most of pandas – align Series on their index before concatenation (see GH18657). The method has now gained a keyword join to control the manner of alignment, see examples below and here.

In v.0.23 *join* will default to None (meaning no alignment), but this default will change to 'left' in a future version of pandas.

```
In [60]: s = pd.Series(['a', 'b', 'c', 'd'])
In [61]: t = pd.Series(['b', 'd', 'e', 'c'], index=[1, 3, 4, 2])
In [62]: s.str.cat(t)
Out[62]:
0  NaN
```

(continues on next page)

Furthermore, Series.str.cat() now works for CategoricalIndex as well (previously raised a ValueError; see GH20842).

# DataFrame.astype performs column-wise conversion to Categorical

DataFrame.astype() can now perform column-wise conversion to Categorical by supplying the string 'category' or a CategoricalDtype. Previously, attempting this would raise a NotImplementedError. See the *Object creation* section of the documentation for more details and examples. (GH12860, GH18099)

Supplying the string 'category' performs column-wise conversion, with only labels appearing in a given column set as categories:

```
In [64]: df = pd.DataFrame({'A': list('abca'), 'B': list('bccd')})
In [65]: df = df.astype('category')
In [66]: df['A'].dtype
Out[66]: CategoricalDtype(categories=['a', 'b', 'c'], ordered=False)
In [67]: df['B'].dtype
Out[67]: CategoricalDtype(categories=['b', 'c', 'd'], ordered=False)
```

Supplying a CategoricalDtype will make the categories in each column consistent with the supplied dtype:

```
In [68]: from pandas.api.types import CategoricalDtype
In [69]: df = pd.DataFrame({'A': list('abca'), 'B': list('bccd')})
In [70]: cdt = CategoricalDtype(categories=list('abcd'), ordered=True)
In [71]: df = df.astype(cdt)
In [72]: df['A'].dtype
Out[72]: CategoricalDtype(categories=['a', 'b', 'c', 'd'], ordered=True)
In [73]: df['B'].dtype
Out[73]: CategoricalDtype(categories=['a', 'b', 'c', 'd'], ordered=True)
```

### Other enhancements

- Unary + now permitted for Series and DataFrame as numeric operator (GH16073)
- Better support for to\_excel() output with the xlsxwriter engine. (GH16149)
- pandas.tseries.frequencies.to\_offset() now accepts leading '+' signs e.g. '+1h'. (GH18171)
- MultiIndex.unique() now supports the level= argument, to get unique values from a specific index level(GH17896)
- pandas.io.formats.style.Styler now has method hide\_index() to determine whether the index will be rendered in output (GH14194)
- pandas.io.formats.style.Styler now has method hide\_columns() to determine whether columns will be hidden in output (GH14194)
- Improved wording of ValueError raised in to\_datetime() when unit= is passed with a non-convertible value (GH14350)
- Series. fillna () now accepts a Series or a dict as a value for a categorical dtype (GH17033)
- pandas.read\_clipboard() updated to use qtpy, falling back to PyQt5 and then PyQt4, adding compatibility with Python3 and multiple python-qt bindings (GH17722)
- Improved wording of ValueError raised in read\_csv() when the usecols argument cannot match all columns. (GH17301)
- DataFrame.corrwith() now silently drops non-numeric columns when passed a Series. Before, an exception was raised (GH18570).
- IntervalIndex now supports time zone aware Interval objects (GH18537, GH18538)
- Series () / DataFrame () tab completion also returns identifiers in the first level of a MultiIndex (). (GH16326)
- read\_excel() has gained the nrows parameter (GH16645)
- DataFrame.append() can now in more cases preserve the type of the calling dataframe's columns (e.g. if both are CategoricalIndex) (GH18359)
- DataFrame.to\_json() and Series.to\_json() now accept an index argument which allows the user to exclude the index from the JSON output (GH17394)
- IntervalIndex.to\_tuples() has gained the na\_tuple parameter to control whether NA is returned as a tuple of NA, or NA itself (GH18756)
- Categorical.rename\_categories, CategoricalIndex.rename\_categories and Series. cat.rename\_categories can now take a callable as their argument (GH18862)
- Interval and IntervalIndex have gained a length attribute (GH18789)
- Resampler objects now have a functioning *pipe* method. Previously, calls to pipe were diverted to the mean method (GH17905).
- is\_scalar() now returns True for DateOffset objects (GH18943).
- DataFrame.pivot() now accepts a list for the values= kwarg (GH17160).
- Added pandas.api.extensions.register\_dataframe\_accessor(), pandas.api.extensions.register\_series\_accessor(), and pandas.api.extensions.register\_index\_accessor(), accessor for libraries downstream of pandas to register custom accessors like .cat on pandas objects. See Registering Custom Accessors for more (GH14781).

- IntervalIndex.astype now supports conversions between subtypes when passed an IntervalDtype (GH19197)
- IntervalIndex and its associated constructor methods (from\_arrays, from\_breaks, from\_tuples) have gained a dtype parameter (GH19262)
- Added pandas.core.groupby.SeriesGroupBy.is\_monotonic\_increasing() and pandas.core.groupby.SeriesGroupBy.is monotonic decreasing() (GH17015)
- For subclassed DataFrames, DataFrame.apply() will now preserve the Series subclass (if defined) when passing the data to the applied function (GH19822)
- DataFrame.from\_dict() now accepts a columns argument that can be used to specify the column names when orient='index' is used (GH18529)
- Added option display.html.use\_mathjax so MathJax can be disabled when rendering tables in Jupyter notebooks (GH19856, GH19824)
- DataFrame.replace() now supports the method parameter, which can be used to specify the replacement method when to\_replace is a scalar, list or tuple and value is None (GH19632)
- Timestamp.month\_name(), DatetimeIndex.month\_name(), and Series.dt. month\_name() are now available (GH12805)
- Timestamp.day\_name() and DatetimeIndex.day\_name() are now available to return day names with a specified locale (GH12806)
- DataFrame.to\_sql() now performs a multi-value insert if the underlying connection supports itk rather than inserting row by row. SQLAlchemy dialects supporting multi-value inserts include: mysql, postgresql, sqlite and any dialect with supports\_multivalues\_insert. (GH14315, GH8953)
- read\_html() now accepts a displayed\_only keyword argument to controls whether or not hidden elements are parsed (True by default) (GH20027)
- read\_html() now reads all elements in a , not just the first. (GH20690)
- $\bullet$  quantile() and quantile() now accept the interpolation keyword, linear by default (GH20497)
- zip compression is supported via compression=zip in DataFrame.to\_pickle(), Series. to\_pickle(), DataFrame.to\_csv(), Series.to\_csv(), DataFrame.to\_json(), Series.to\_json().(GH17778)
- WeekOfMonth constructor now supports n=0 (GH20517).
- DataFrame and Series now support matrix multiplication (@) operator (GH10259) for Python>=3.5
- Updated DataFrame.to\_gbq() and pandas.read\_gbq() signature and documentation to reflect changes from the Pandas-GBQ library version 0.4.0. Adds intersphinx mapping to Pandas-GBQ library. (GH20564)
- Added new writer for exporting Stata dta files in version 117, StataWriter117. This format supports exporting strings with lengths up to 2,000,000 characters (GH16450)
- to\_hdf() and read\_hdf() now accept an errors keyword argument to control encoding error handling (GH20835)
- cut () has gained the duplicates='raise'|'drop' option to control whether to raise on duplicated edges (GH20947)
- date\_range(), timedelta\_range(), and interval\_range() now return a linearly spaced index if start, stop, and periods are specified, but freq is not. (GH20808, GH20983, GH20976)

## **Backwards incompatible API changes**

## Dependencies have increased minimum versions

We have updated our minimum supported versions of dependencies (GH15184). If installed, we now require:

| Package         | Minimum Version | Required | Issue   |
|-----------------|-----------------|----------|---------|
| python-dateutil | 2.5.0           | X        | GH15184 |
| openpyxl        | 2.4.0           |          | GH15184 |
| beautifulsoup4  | 4.2.1           |          | GH20082 |
| setuptools      | 24.2.0          |          | GH20698 |

## Instantiation from dicts preserves dict insertion order for python 3.6+

Until Python 3.6, dicts in Python had no formally defined ordering. For Python version 3.6 and later, dicts are ordered by insertion order, see PEP 468. Pandas will use the dict's insertion order, when creating a Series or DataFrame from a dict and you're using Python version 3.6 or higher. (GH19884)

Previous behavior (and current behavior if on Python < 3.6):

```
In [16]: pd.Series({'Income': 2000,
  ....:
                  'Expenses': -1500,
                  'Taxes': -200,
  . . . . :
                  'Net result': 300})
  . . . . :
Out[16]:
Expenses -1500
           2000
Income
            300
Net result
            -2.00
Taxes
dtype: int64
```

Note the Series above is ordered alphabetically by the index values.

New behavior (for Python  $\geq$  3.6):

```
In [74]: pd.Series({'Income': 2000,
  ....: 'Expenses': -1500,
                  'Taxes': -200,
   . . . . :
                  'Net result': 300})
   . . . . :
  . . . . :
Out [74]:
            2000
Income
Expenses -1500
Taxes
            -200
            300
Net result
Length: 4, dtype: int64
```

Notice that the Series is now ordered by insertion order. This new behavior is used for all relevant pandas types (Series, DataFrame, SparseSeries and SparseDataFrame).

If you wish to retain the old behavior while using Python >= 3.6, you can use .sort\_index():

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```
. . . . :
                     'Net result': 300}).sort_index()
   . . . . :
Out [75]:
             -1500
Expenses
Income
              2000
Net result
               300
              -200
Taxes
Length: 4, dtype: int64
```

## **Deprecate Panel**

Panel was deprecated in the 0.20.x release, showing as a DeprecationWarning. Using Panel will now show a FutureWarning. The recommended way to represent 3-D data are with a MultiIndex on a DataFrame via the to\_frame () or with the xarray package. Pandas provides a to\_xarray () method to automate this conversion (GH13563, GH18324).

```
In [75]: import pandas._testing as tm
In [76]: p = tm.makePanel()
In [77]: p
Out [77]:
<class 'pandas.core.panel.Panel'>
Dimensions: 3 (items) x 3 (major_axis) x 4 (minor_axis)
Items axis: ItemA to ItemC
Major_axis axis: 2000-01-03 00:00:00 to 2000-01-05 00:00:00
Minor_axis axis: A to D
```

#### Convert to a MultiIndex DataFrame

```
In [78]: p.to_frame()
Out [78]:
                    ItemA
                             ItemB
                                       ItemC
major
        minor
2000-01-03 A 0.469112 0.721555 0.404705
                -1.135632 0.271860 -1.039268
          В
                0.119209 0.276232 -1.344312
                -2.104569 0.113648 -0.109050
             -0.282863 -0.706771 0.577046
2000-01-04 A
               1.212112 -0.424972 -0.370647
          В
               -1.044236 -1.087401 0.844885
          C.
          D
               -0.494929 -1.478427 1.643563
2000-01-05 A
              -1.509059 -1.039575 -1.715002
          В
               -0.173215 0.567020 -1.157892
              -0.861849 -0.673690 1.075770
               1.071804 0.524988 -1.469388
[12 rows x 3 columns]
```

#### Convert to an xarray DataArray

```
In [79]: p.to_xarray()
Out [79]:
<xarray.DataArray (items: 3, major_axis: 3, minor_axis: 4)>
```

(continues on next page)

### pandas.core.common removals

The following error & warning messages are removed from pandas.core.common (GH13634, GH19769):

- PerformanceWarning
- UnsupportedFunctionCall
- UnsortedIndexError
- AbstractMethodError

These are available from import from pandas.errors (since 0.19.0).

# Changes to make output of DataFrame.apply consistent

DataFrame.apply() was inconsistent when applying an arbitrary user-defined-function that returned a list-like with axis=1. Several bugs and inconsistencies are resolved. If the applied function returns a Series, then pandas will return a DataFrame; otherwise a Series will be returned, this includes the case where a list-like (e.g. tuple or list is returned) (GH16353, GH17437, GH17970, GH17348, GH17892, GH18573, GH17602, GH18775, GH18901, GH18919).

Previous behavior: if the returned shape happened to match the length of original columns, this would return a DataFrame. If the return shape did not match, a Series with lists was returned.

```
In [3]: df.apply(lambda x: [1, 2, 3], axis=1)
Out[3]:
  A B C
 1 2
        3
1 1 2
        3
2 1 2 3
3 1 2 3
4 1 2 3
5 1 2
In [4]: df.apply(lambda x: [1, 2], axis=1)
Out[4]:
    [1, 2]
0
    [1, 2]
    [1, 2]
    [1, 2]
    [1, 2]
    [1, 2]
dtype: object
```

New behavior: When the applied function returns a list-like, this will now always return a Series.

```
In [78]: df.apply(lambda x: [1, 2, 3], axis=1)
Out[78]:
     [1, 2, 3]
1
     [1, 2, 3]
2
     [1, 2, 3]
3
     [1, 2, 3]
4
    [1, 2, 3]
    [1, 2, 3]
Length: 6, dtype: object
In [79]: df.apply(lambda x: [1, 2], axis=1)
Out [79]:
0
     [1, 2]
     [1, 2]
1
     [1, 2]
2
3
     [1, 2]
     [1, 2]
     [1, 2]
Length: 6, dtype: object
```

To have expanded columns, you can use result\_type='expand'

To broadcast the result across the original columns (the old behaviour for list-likes of the correct length), you can use result\_type='broadcast'. The shape must match the original columns.

```
In [81]: df.apply(lambda x: [1, 2, 3], axis=1, result_type='broadcast')
Out[81]:
    A    B    C
0    1    2    3
1    1    2    3
2    1    2    3
3    1    2    3
4    1    2    3
5    1    2    3

[6 rows x 3 columns]
```

Returning a Series allows one to control the exact return structure and column names:

```
In [82]: df.apply(lambda x: pd.Series([1, 2, 3], index=['D', 'E', 'F']), axis=1)
Out[82]:
        D        E        F
0        1        2        3
1        1        2        3
2        1        2        3
3        1        2        3
4        1        2        3
5        1        2        3
[6 rows x 3 columns]
```

## Concatenation will no longer sort

In a future version of pandas <code>pandas.concat()</code> will no longer sort the non-concatenation axis when it is not already aligned. The current behavior is the same as the previous (sorting), but now a warning is issued when <code>sort</code> is not specified and the non-concatenation axis is not aligned (GH4588).

To keep the previous behavior (sorting) and silence the warning, pass sort=True

```
In [86]: pd.concat([df1, df2], sort=True)
Out[86]:
    a    b
0  1  1.0
1  2  2.0
0  4  NaN
1  5  NaN
```

(continues on next page)

```
[4 rows x 2 columns]
```

To accept the future behavior (no sorting), pass sort=False

Note that this change also applies to <code>DataFrame.append()</code>, which has also received a <code>sort</code> keyword for controlling this behavior.

# **Build changes**

- Building pandas for development now requires cython >= 0.24 (GH18613)
- Building from source now explicitly requires setuptools in setup.py (GH18113)
- Updated conda recipe to be in compliance with conda-build 3.0+ (GH18002)

### Index division by zero fills correctly

Division operations on Index and subclasses will now fill division of positive numbers by zero with np.inf, division of negative numbers by zero with -np.inf and 0 / 0 with np.nan. This matches existing Series behavior. (GH19322, GH19347)

Previous behavior:

#### Current behavior:

```
In [87]: index = pd.Int64Index([-1, 0, 1])

# division by zero gives -infinity where negative,
# +infinity where positive, and NaN for 0 / 0
In [88]: index / 0
Out[88]: Float64Index([-inf, nan, inf], dtype='float64')

# The result of division by zero should not depend on
# whether the zero is int or float
In [89]: index / 0.0
Out[89]: Float64Index([-inf, nan, inf], dtype='float64')
```

(continues on next page)

```
In [90]: index = pd.UInt64Index([0, 1])
In [91]: index / np.array([0, 0], dtype=np.uint64)
Out[91]: Float64Index([nan, inf], dtype='float64')
In [92]: pd.RangeIndex(1, 5) / 0
Out[92]: Float64Index([inf, inf, inf], dtype='float64')
```

# **Extraction of matching patterns from strings**

By default, extracting matching patterns from strings with str.extract() used to return a Series if a single group was being extracted (a DataFrame if more than one group was extracted). As of Pandas 0.23.0 str. extract() always returns a DataFrame, unless expand is set to False. Finally, None was an accepted value for the expand parameter (which was equivalent to False), but now raises a ValueError. (GH11386)

Previous behavior:

```
In [1]: s = pd.Series(['number 10', '12 eggs'])
In [2]: extracted = s.str.extract(r'.*(\d\d).*')
In [3]: extracted
Out [3]:
0    10
1    12
dtype: object
In [4]: type(extracted)
Out [4]:
pandas.core.series.Series
```

New behavior:

To restore previous behavior, simply set expand to False:

```
In [97]: s = pd.Series(['number 10', '12 eggs'])
In [98]: extracted = s.str.extract(r'.*(\d\d).*', expand=False)
```

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```
In [99]: extracted
Out[99]:
0    10
1    12
Length: 2, dtype: object
In [100]: type(extracted)
Out[100]: pandas.core.series.Series
```

## Default value for the ordered parameter of CategoricalDtype

The default value of the ordered parameter for CategoricalDtype has changed from False to None to allow updating of categories without impacting ordered. Behavior should remain consistent for downstream objects, such as Categorical (GH18790)

In previous versions, the default value for the ordered parameter was False. This could potentially lead to the ordered parameter unintentionally being changed from True to False when users attempt to update categories if ordered is not explicitly specified, as it would silently default to False. The new behavior for ordered=None is to retain the existing value of ordered.

New behavior:

2576

```
In [2]: from pandas.api.types import CategoricalDtype
In [3]: cat = pd.Categorical(list('abcaba'), ordered=True, categories=list('cba'))
In [4]: cat
Out[4]:
[a, b, c, a, b, a]
Categories (3, object): [c < b < a]
In [5]: cdt = CategoricalDtype(categories=list('cbad'))
In [6]: cat.astype(cdt)
Out[6]:
[a, b, c, a, b, a]
Categories (4, object): [c < b < a < d]</pre>
```

Notice in the example above that the converted Categorical has retained ordered=True. Had the default value for ordered remained as False, the converted Categorical would have become unordered, despite ordered=False never being explicitly specified. To change the value of ordered, explicitly pass it to the new dtype, e.g. CategoricalDtype (categories=list('cbad'), ordered=False).

Note that the unintentional conversion of ordered discussed above did not arise in previous versions due to separate bugs that prevented astype from doing any type of category to category conversion (GH10696, GH18593). These bugs have been fixed in this release, and motivated changing the default value of ordered.

## Better pretty-printing of DataFrames in a terminal

Previously, the default value for the maximum number of columns was pd.options.display. max\_columns=20. This meant that relatively wide data frames would not fit within the terminal width, and pandas would introduce line breaks to display these 20 columns. This resulted in an output that was relatively difficult to read:

```
Terminal
                                                                                                    In [1]: import pandas as pd
[In [2]: import numpy as np
In [3]: pd.DataFrame(np.random.rand(5, 10))
Out [3]:
            0.933153
                      0.577028
  0.146401
                                0.617467
                                           0.195179
                                                     0.929250
                                                              0.603845
   0.670827
             0.885104
                       0.152909
                                 0.028042
                                           0.016283
                                                     0.843786
                                                               0.824537
   0.261850
                       0.281256
             0.370457
                                 0.461355
                                           0.094714
                                                     0.763125
                                                               0.086964
   0.789373
             0.357872
                       0.894594
                                                               0.375119
3
                                 0.434197
                                           0.266116
                                                    0.061527
                       0.740593
                                0.820019
  0.256396
             0.407358
                                           0.962911 0.647236
  0.004801 0.659965
                      0.989170
   0.517137
             0.673154
                       0.829435
   0.154479
            0.463588
                       0.252917
   0.266601
             0.146791
                       0.776635
   0.607805
            0.209150
In [4]:
```

If Python runs in a terminal, the maximum number of columns is now determined automatically so that the printed data frame fits within the current terminal width (pd.options.display.max\_columns=0) (GH17023). If Python runs as a Jupyter kernel (such as the Jupyter QtConsole or a Jupyter notebook, as well as in many IDEs), this value cannot be inferred automatically and is thus set to 20 as in previous versions. In a terminal, this results in a much nicer output:

```
Terminal
[In [1]: import pandas as pd
                                                                                                   In [2]: import numpy as np
In [3]: pd.DataFrame(np.random.rand(5, 10))
Out [3]:
  0.107275
                      0.024795
                                                    0.689395
                                                              0.680411
                                                                        0.586967
            0.394007
                                0.551991
                                                                                  0.293906
  0.466061
            0.402324 0.430669
                                                    0.621158
                                                              0.756752
                                                                                  0.558097
                                0.193347
                                                                        0.217444
  0.910215 0.063291 0.192110
                                0.012359
                                                    0.025301
                                                              0.185118
                                                                        0.820985
                                                                                  0.208302
  0.491853 0.612078
                      0.791199
                                0.588150
                                                    0.841104
                                                              0.612280
                                                                        0.025687
                                                                                  0.443693
  0.171760 0.921853 0.063030
                                                    0.268901 0.292862
                                                                       0.420582
                                                                                  0.608949
                                0.448301
[5 rows x 10 columns]
In [4]:
```

Note that if you don't like the new default, you can always set this option yourself. To revert to the old setting, you can run this line:

```
pd.options.display.max_columns = 20
```

## **Datetimelike API changes**

- The default Timedelta constructor now accepts an ISO 8601 Duration string as an argument (GH19040)
- Subtracting NaT from a Series with dtype='datetime64[ns]' returns a Series with dtype='timedelta64[ns]' instead of dtype='datetime64[ns]' (GH18808)
- Addition or subtraction of NaT from *TimedeltaIndex* will return TimedeltaIndex instead of DatetimeIndex (GH19124)
- DatetimeIndex.shift() and TimedeltaIndex.shift() will now raise NullFrequencyError (which subclasses ValueError, which was raised in older versions) when the index object frequency is None (GH19147)
- Addition and subtraction of NaN from a Series with dtype='timedelta64[ns]' will raise a TypeError instead of treating the NaN as NaT (GH19274)
- NaT division with datetime.timedelta will now return NaN instead of raising (GH17876)

- Operations between a Series with dtype dtype='datetime64[ns]' and a PeriodIndex will correctly raises TypeError (GH18850)
- Subtraction of Series with timezone-aware dtype='datetime64[ns]' with mis-matched timezones will raise TypeError instead of ValueError (GH18817)
- Timestamp will no longer silently ignore unused or invalid tz or tzinfo keyword arguments (GH17690)
- Timestamp will no longer silently ignore invalid freq arguments (GH5168)
- CacheableOffset and WeekDay are no longer available in the pandas.tseries.offsets module (GH17830)
- pandas.tseries.frequencies.get\_freq\_group() and pandas.tseries.frequencies. DAYS are removed from the public API (GH18034)
- Series.truncate() and DataFrame.truncate() will raise a ValueError if the index is not sorted instead of an unhelpful KeyError (GH17935)
- Series.first and DataFrame.first will now raise a TypeError rather than NotImplementedError when index is not a DatetimeIndex (GH20725).
- Series.last and DataFrame.last will now raise a TypeError rather than NotImplementedError when index is not a DatetimeIndex (GH20725).
- Restricted DateOffset keyword arguments. Previously, DateOffset subclasses allowed arbitrary keyword
  arguments which could lead to unexpected behavior. Now, only valid arguments will be accepted. (GH17176,
  GH18226).
- pandas.merge() provides a more informative error message when trying to merge on timezone-aware and timezone-naive columns (GH15800)
- For DatetimeIndex and TimedeltaIndex with freq=None, addition or subtraction of integer-dtyped array or Index will raise NullFrequencyError instead of TypeError (GH19895)
- Timestamp constructor now accepts a nanosecond keyword or positional argument (GH18898)
- DatetimeIndex will now raise an AttributeError when the tz attribute is set after instantiation (GH3746)
- DatetimeIndex with a pytz timezone will now return a consistent pytz timezone (GH18595)

## Other API changes

- Series.astype() and Index.astype() with an incompatible dtype will now raise a TypeError rather than a ValueError (GH18231)
- Series construction with an object dtyped tz-aware datetime and dtype=object specified, will now return an object dtyped Series, previously this would infer the datetime dtype (GH18231)
- A Series of dtype=category constructed from an empty dict will now have categories of dtype=object rather than dtype=float64, consistently with the case in which an empty list is passed (GH18515)
- All-NaN levels in a MultiIndex are now assigned float rather than object dtype, promoting consistency with Index (GH17929).
- Levels names of a MultiIndex (when not None) are now required to be unique: trying to create a MultiIndex with repeated names will raise a ValueError (GH18872)
- Both construction and renaming of Index/MultiIndex with non-hashable name/names will now raise TypeError (GH20527)

- Index.map () can now accept Series and dictionary input objects (GH12756, GH18482, GH18509).
- DataFrame.unstack() will now default to filling with np.nan for object columns. (GH12815)
- IntervalIndex constructor will raise if the closed parameter conflicts with how the input data is inferred to be closed (GH18421)
- Inserting missing values into indexes will work for all types of indexes and automatically insert the correct type of missing value (NaN, NaT, etc.) regardless of the type passed in (GH18295)
- When created with duplicate labels, MultiIndex now raises a ValueError. (GH17464)
- Series.fillna() now raises a TypeError instead of a ValueError when passed a list, tuple or DataFrame as a value (GH18293)
- pandas.DataFrame.merge() no longer casts a float column to object when merging on int and float columns (GH16572)
- pandas.merge() now raises a ValueError when trying to merge on incompatible data types (GH9780)
- The default NA value for <code>UInt64Index</code> has changed from 0 to NaN, which impacts methods that mask with NA, such as <code>UInt64Index.where()</code> (GH18398)
- Refactored setup.py to use find\_packages instead of explicitly listing out all subpackages (GH18535)
- Rearranged the order of keyword arguments in read\_excel () to align with read\_csv() (GH16672)
- wide\_to\_long() previously kept numeric-like suffixes as object dtype. Now they are cast to numeric if possible (GH17627)
- In read\_excel(), the comment argument is now exposed as a named parameter (GH18735)
- Rearranged the order of keyword arguments in read\_excel() to align with read\_csv() (GH16672)
- The options html.border and mode.use\_inf\_as\_null were deprecated in prior versions, these will now show FutureWarning rather than a DeprecationWarning (GH19003)
- IntervalIndex and IntervalDtype no longer support categorical, object, and string subtypes (GH19016)
- IntervalDtype now returns True when compared against 'interval' regardless of subtype, and IntervalDtype.name now returns 'interval' regardless of subtype (GH18980)
- KeyError now raises instead of ValueError in drop(), drop(), drop(), drop() when dropping a non-existent element in an axis with duplicates (GH19186)
- Series.to\_csv() now accepts a compression argument that works in the same way as the compression argument in DataFrame.to\_csv() (GH18958)
- Set operations (union, difference...) on IntervalIndex with incompatible index types will now raise a TypeError rather than a ValueError (GH19329)
- DateOffset objects render more simply, e.g. <DateOffset: days=1> instead of <DateOffset: kwds={'days': 1}>(GH19403)
- Categorical.fillna now validates its value and method keyword arguments. It now raises when both or none are specified, matching the behavior of Series.fillna() (GH19682)
- pd.to\_datetime('today') now returns a datetime, consistent with pd.Timestamp('today'); previously pd.to\_datetime('today') returned a .normalized() datetime(GH19935)
- Series.str.replace() now takes an optional *regex* keyword which, when set to False, uses literal string replacement rather than regex replacement (GH16808)
- DatetimeIndex.strftime() and PeriodIndex.strftime() now return an Index instead of a numpy array to be consistent with similar accessors (GH20127)

- Constructing a Series from a list of length 1 no longer broadcasts this list when a longer index is specified (GH19714, GH20391).
- DataFrame.to\_dict() with orient='index' no longer casts int columns to float for a DataFrame with only int and float columns (GH18580)
- A user-defined-function that is passed to Series.rolling().aggregate(), DataFrame. rolling().aggregate(), or its expanding cousins, will now *always* be passed a Series, rather than a np.array; .apply() only has the raw keyword, see *here*. This is consistent with the signatures of .aggregate() across pandas (GH20584)
- Rolling and Expanding types raise NotImplementedError upon iteration (GH11704).

### **Deprecations**

- Series.from\_array and SparseSeries.from\_array are deprecated. Use the normal constructor Series(..) and SparseSeries(..) instead (GH18213).
- DataFrame.as\_matrix is deprecated. Use DataFrame.values instead (GH18458).
- Series.asobject, DatetimeIndex.asobject, PeriodIndex.asobject and TimeDeltaIndex.asobject have been deprecated. Use .astype(object) instead (GH18572)
- Grouping by a tuple of keys now emits a FutureWarning and is deprecated. In the future, a tuple passed to 'by' will always refer to a single key that is the actual tuple, instead of treating the tuple as multiple keys. To retain the previous behavior, use a list instead of a tuple (GH18314)
- Series.valid is deprecated. Use Series.dropna() instead (GH18800).
- read\_excel() has deprecated the skip\_footer parameter. Use skipfooter instead (GH18836)
- ExcelFile.parse() has deprecated sheetname in favor of sheet\_name for consistency with read\_excel() (GH20920).
- The is\_copy attribute is deprecated and will be removed in a future version (GH18801).
- IntervalIndex.from\_intervals is deprecated in favor of the *IntervalIndex* constructor (GH19263)
- DataFrame.from\_items is deprecated. Use DataFrame.from\_dict() instead, or DataFrame.from\_dict(OrderedDict()) if you wish to preserve the key order (GH17320, GH17312)
- Indexing a *MultiIndex* or a FloatIndex with a list containing some missing keys will now show a FutureWarning, which is consistent with other types of indexes (GH17758).
- The broadcast parameter of .apply() is deprecated in favor of result\_type='broadcast' (GH18577)
- The reduce parameter of .apply() is deprecated in favor of result\_type='reduce' (GH18577)
- The order parameter of factorize () is deprecated and will be removed in a future release (GH19727)
- Timestamp.weekday\_name, DatetimeIndex.weekday\_name, and Series.dt. weekday\_name are deprecated in favor of Timestamp.day\_name(), DatetimeIndex.day\_name(), and Series.dt.day\_name() (GH12806)
- pandas.tseries.plotting.tsplot is deprecated. Use Series.plot() instead (GH18627)
- Index.summary() is deprecated and will be removed in a future version (GH18217)
- NDFrame.get\_ftype\_counts() is deprecated and will be removed in a future version (GH18243)

- The convert\_datetime64 parameter in *DataFrame.to\_records()* has been deprecated and will be removed in a future version. The NumPy bug motivating this parameter has been resolved. The default value for this parameter has also changed from True to None (GH18160).
- Series.rolling().apply(), DataFrame.rolling().apply(), Series.expanding().apply(), and DataFrame.expanding().apply() have deprecated passing an np.array by default. One will need to pass the new raw parameter to be explicit about what is passed (GH20584)
- The data, base, strides, flags and itemsize properties of the Series and Index classes have been deprecated and will be removed in a future version (GH20419).
- DatetimeIndex.offset is deprecated. Use DatetimeIndex.freq instead (GH20716)
- Floor division between an integer ndarray and a *Timedelta* is deprecated. Divide by *Timedelta.value* instead (GH19761)
- Setting PeriodIndex.freq (which was not guaranteed to work correctly) is deprecated. Use PeriodIndex.asfreq() instead (GH20678)
- Index.get\_duplicates() is deprecated and will be removed in a future version (GH20239)
- The previous default behavior of negative indices in Categorical.take is deprecated. In a future version it will change from meaning missing values to meaning positional indices from the right. The future behavior is consistent with Series.take() (GH20664).
- Passing multiple axes to the axis parameter in <code>DataFrame.dropna()</code> has been deprecated and will be removed in a future version (GH20987)

## Removal of prior version deprecations/changes

- Warnings against the obsolete usage Categorical (codes, categories), which were emitted for instance when the first two arguments to Categorical() had different dtypes, and recommended the use of Categorical.from codes, have now been removed (GH8074)
- The levels and labels attributes of a MultiIndex can no longer be set directly (GH4039).
- pd.tseries.util.pivot\_annual has been removed (deprecated since v0.19). Use pivot\_table instead (GH18370)
- pd.tseries.util.isleapyear has been removed (deprecated since v0.19). Use .is\_leap\_year property in Datetime-likes instead (GH18370)
- pd.ordered\_merge has been removed (deprecated since v0.19). Use pd.merge\_ordered instead (GH18459)
- The SparseList class has been removed (GH14007)
- The pandas.io.wb and pandas.io.data stub modules have been removed (GH13735)
- Categorical.from\_array has been removed (GH13854)
- The freq and how parameters have been removed from the rolling/expanding/ewm methods of DataFrame and Series (deprecated since v0.18). Instead, resample before calling the methods. (GH18601 & GH18668)
- DatetimeIndex.to\_datetime, Timestamp.to\_datetime, PeriodIndex.to\_datetime, and Index.to\_datetime have been removed (GH8254, GH14096, GH14113)
- read\_csv() has dropped the skip\_footer parameter (GH13386)
- read\_csv() has dropped the as\_recarray parameter (GH13373)
- read\_csv() has dropped the buffer\_lines parameter (GH13360)

- read\_csv() has dropped the compact\_ints and use\_unsigned parameters (GH13323)
- The Timestamp class has dropped the offset attribute in favor of freq (GH13593)
- The Series, Categorical, and Index classes have dropped the reshape method (GH13012)
- pandas.tseries.frequencies.get\_standard\_freq has been removed in favor of pandas. tseries.frequencies.to\_offset(freq).rule\_code(GH13874)
- The freqstr keyword has been removed from pandas.tseries.frequencies.to\_offset in favor of freq (GH13874)
- The Panel 4D and Panel ND classes have been removed (GH13776)
- The Panel class has dropped the to\_long and toLong methods (GH19077)
- The options display.line\_with and display.height are removed in favor of display.width and display.max\_rows respectively (GH4391, GH19107)
- The labels attribute of the Categorical class has been removed in favor of Categorical.codes (GH7768)
- The flavor parameter have been removed from func:to\_sql method (GH13611)
- The modules pandas.tools.hashing and pandas.util.hashing have been removed (GH16223)
- The top-level functions pd.rolling\_\*, pd.expanding\_\* and pd.ewm\* have been removed (Deprecated since v0.18). Instead, use the DataFrame/Series methods rolling, expanding and ewm (GH18723)
- Imports from pandas.core.common for functions such as is\_datetime64\_dtype are now removed. These are located in pandas.api.types. (GH13634, GH19769)
- The infer\_dst keyword in Series.tz\_localize(), DatetimeIndex.tz\_localize() and DatetimeIndex have been removed. infer\_dst=True is equivalent to ambiguous='infer', and infer\_dst=False to ambiguous='raise' (GH7963).
- When .resample() was changed from an eager to a lazy operation, like .groupby() in v0.18.0, we put in place compatibility (with a FutureWarning), so operations would continue to work. This is now fully removed, so a Resampler will no longer forward compat operations (GH20554)
- Remove long deprecated axis=None parameter from .replace() (GH20271)

### **Performance improvements**

- Indexers on Series or DataFrame no longer create a reference cycle (GH17956)
- Added a keyword argument, cache, to to\_datetime() that improved the performance of converting duplicate datetime arguments (GH11665)
- DateOffset arithmetic performance is improved (GH18218)
- Converting a Series of Timedelta objects to days, seconds, etc... sped up through vectorization of underlying methods (GH18092)
- Improved performance of .map() with a Series/dict input (GH15081)
- The overridden Timedelta properties of days, seconds and microseconds have been removed, leveraging their built-in Python versions instead (GH18242)
- Series construction will reduce the number of copies made of the input data in certain cases (GH17449)
- Improved performance of Series.dt.date() and DatetimeIndex.date() (GH18058)
- Improved performance of Series.dt.time() and DatetimeIndex.time() (GH18461)

- Improved performance of IntervalIndex.symmetric\_difference() (GH18475)
- Improved performance of DatetimeIndex and Series arithmetic operations with Business-Month and Business-Quarter frequencies (GH18489)
- Series () / DataFrame () tab completion limits to 100 values, for better performance. (GH18587)
- Improved performance of DataFrame.median() with axis=1 when bottleneck is not installed (GH16468)
- Improved performance of MultiIndex.get\_loc() for large indexes, at the cost of a reduction in performance for small ones (GH18519)
- Improved performance of MultiIndex.remove\_unused\_levels() when there are no unused levels, at the cost of a reduction in performance when there are (GH19289)
- Improved performance of Index.get\_loc() for non-unique indexes (GH19478)
- Improved performance of pairwise .rolling() and .expanding() with .cov() and .corr() operations (GH17917)
- Improved performance of pandas.core.groupby.GroupBy.rank() (GH15779)
- Improved performance of variable .rolling() on .min() and .max() (GH19521)
- Improved performance of pandas.core.groupby.GroupBy.ffill() and pandas.core.groupby.GroupBy.bfill()(GH11296)
- Improved performance of pandas.core.groupby.GroupBy.any() and pandas.core.groupby.GroupBy.all()(GH15435)
- Improved performance of pandas.core.groupby.GroupBy.pct\_change() (GH19165)
- Improved performance of Series.isin() in the case of categorical dtypes (GH20003)
- Improved performance of getattr (Series, attr) when the Series has certain index types. This manifested in slow printing of large Series with a DatetimeIndex (GH19764)
- Fixed a performance regression for GroupBy.nth() and GroupBy.last() with some object columns (GH19283)
- Improved performance of pandas.core.arrays.Categorical.from\_codes() (GH18501)

### **Documentation changes**

Thanks to all of the contributors who participated in the Pandas Documentation Sprint, which took place on March 10th. We had about 500 participants from over 30 locations across the world. You should notice that many of the *API docstrings* have greatly improved.

There were too many simultaneous contributions to include a release note for each improvement, but this GitHub search should give you an idea of how many docstrings were improved.

Special thanks to Marc Garcia for organizing the sprint. For more information, read the NumFOCUS blogpost recapping the sprint.

- Changed spelling of "numpy" to "NumPy", and "python" to "Python". (GH19017)
- Consistency when introducing code samples, using either colon or period. Rewrote some sentences for greater clarity, added more dynamic references to functions, methods and classes. (GH18941, GH18948, GH18973, GH19017)
- Added a reference to <code>DataFrame.assign()</code> in the concatenate section of the merging documentation (GH18665)

## **Bug fixes**

## Categorical

**Warning:** A class of bugs were introduced in pandas 0.21 with CategoricalDtype that affects the correctness of operations like merge, concat, and indexing when comparing multiple unordered Categorical arrays that have the same categories, but in a different order. We highly recommend upgrading or manually aligning your categories before doing these operations.

- Bug in Categorical.equals returning the wrong result when comparing two unordered Categorical arrays with the same categories, but in a different order (GH16603)
- Bug in pandas.api.types.union\_categoricals() returning the wrong result when for unordered categoricals with the categories in a different order. This affected pandas.concat() with Categorical data (GH19096).
- Bug in pandas.merge() returning the wrong result when joining on an unordered Categorical that had the same categories but in a different order (GH19551)
- Bug in CategoricalIndex.get\_indexer() returning the wrong result when target was an unordered Categorical that had the same categories as self but in a different order (GH19551)
- Bug in Index.astype() with a categorical dtype where the resultant index is not converted to a CategoricalIndex for all types of index (GH18630)
- Bug in Series.astype() and Categorical.astype() where an existing categorical data does not get updated (GH10696, GH18593)
- Bug in Series.str.split() with expand=True incorrectly raising an IndexError on empty strings (GH20002).
- Bug in *Index* constructor with dtype=CategoricalDtype(...) where categories and ordered are not maintained (GH19032)
- Bug in Series constructor with scalar and dtype=CategoricalDtype(...) where categories and ordered are not maintained (GH19565)
- Bug in Categorical. \_\_iter\_\_ not converting to Python types (GH19909)
- Bug in pandas.factorize() returning the unique codes for the uniques. This now returns a Categorical with the same dtype as the input (GH19721)
- Bug in pandas.factorize() including an item for missing values in the uniques return value (GH19721)
- Bug in Series.take() with categorical data interpreting -1 in *indices* as missing value markers, rather than the last element of the Series (GH20664)

### **Datetimelike**

- Bug in Series.\_\_sub\_\_() subtracting a non-nanosecond np.datetime64 object from a Series gave incorrect results (GH7996)
- Bug in DatetimeIndex, TimedeltaIndex addition and subtraction of zero-dimensional integer arrays gave incorrect results (GH19012)
- Bug in *DatetimeIndex* and *TimedeltaIndex* where adding or subtracting an array-like of DateOffset objects either raised (np.array, pd.Index) or broadcast incorrectly (pd.Series) (GH18849)
- Bug in Series.\_\_add\_\_() adding Series with dtype timedelta64[ns] to a timezone-aware DatetimeIndex incorrectly dropped timezone information (GH13905)
- Adding a Period object to a datetime or Timestamp object will now correctly raise a TypeError (GH17983)
- Bug in *Timestamp* where comparison with an array of Timestamp objects would result in a RecursionError (GH15183)
- Bug in Series floor-division where operating on a scalar timedelta raises an exception (GH18846)
- Bug in DatetimeIndex where the repr was not showing high-precision time values at the end of a day (e.g., 23:59:59.99999999) (GH19030)
- Bug in .astype() to non-ns timedelta units would hold the incorrect dtype (GH19176, GH19223, GH12425)
- Bug in subtracting Series from NaT incorrectly returning NaT (GH19158)
- Bug in Series.truncate() which raises TypeError with a monotonic PeriodIndex (GH17717)
- Bug in pct\_change () using periods and freq returned different length outputs (GH7292)
- Bug in comparison of DatetimeIndex against None or datetime.date objects raising TypeError for == and != comparisons instead of all-False and all-True, respectively (GH19301)
- Bug in *Timestamp* and *to\_datetime()* where a string representing a barely out-of-bounds timestamp would be incorrectly rounded down instead of raising OutOfBoundsDatetime (GH19382)
- Bug in Timestamp.floor() DatetimeIndex.floor() where time stamps far in the future and past were not rounded correctly (GH19206)
- Bug in to\_datetime() where passing an out-of-bounds datetime with errors='coerce' and utc=True would raise OutOfBoundsDatetime instead of parsing to NaT (GH19612)
- Bug in DatetimeIndex and TimedeltaIndex addition and subtraction where name of the returned object was not always set consistently. (GH19744)
- Bug in DatetimeIndex and TimedeltaIndex addition and subtraction where operations with numpy arrays raised TypeError (GH19847)
- Bug in DatetimeIndex and TimedeltaIndex where setting the freq attribute was not fully supported (GH20678)