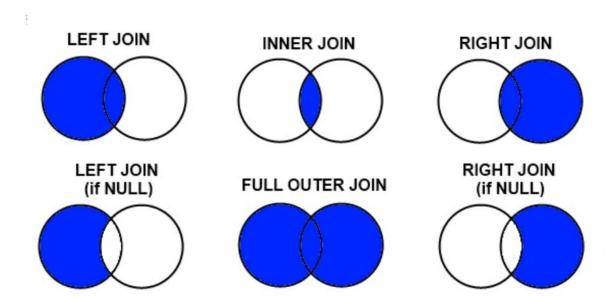
T5 - Data analysis techniques and methodologies



Merging on Dataframes Columns

We can merge Dataframes N:1 and N:N

pandas.merge(<Dataframe_1>, ..., <Dataframe_n>) -> Looks for strictly coincidences index and labels
pandas.merge(<Dataframes>, on= <ColumnLabels>) -> Label exact coincidence values, not indexes.
pandas.merge(<dfs>, on = <CoLabels>, how= {'inner', 'right', 'left', 'outer' }) -> Order to merge:

inner: for labels, after indexes df1, ..., after indexes dfn. Default value for merge right: for Colabels, after labels dfn, ..., after labels df1. NaN not permitted on right dfs labels left: for CoLabels, after labels df1, ..., after labels dfn. NaN not permitted on left dfs labels outer: same as inned, but permits NaN for any non combination.

pandas.merge(...., suffixes=<suffix list for labels not in CoLabels>)

Merging on DataFrames Indexes

Merge index to index -> **left_index = True**, **right_index = True**Merge label with index -> left_on = < list of labels>, right_index = True

|-> right_on=< list of labels>, left_index = True

Joining Dataframes with same indexes

Joining dataframe to other dataframe: adding combinations and columns for items:

Example1: df1.join(df2)

df1	data	df2	profit	df1.j(df2)	data	profit
0	0	0	10	L	2	NaN
U	1	0	20	0	0	10.0
L	2	U	20	0	0	20.0
0	3			0	3	10.0
U	4			0	3	20.0
				U	1	20.0
				U	4	20.0

Concatenation of Series

Concatenate/link them along specific access: **axis = 0** -> rows, **axis = 1** -> columns (generates Dataframe) For new behaviour (not sort by default) on **axis = 1** -> **sort = False**

Label indexes by names=

Set subindexes by keys=

```
concat(s1,s2) axis = 0--
print '--- Concatenate al, bl columns(axis=1)'
                                                                             $ (3)
                                                                                       dtype: int64
                                                                                           concat(s2,s1) axis = 0---
sl = Series([100, 200, 300], index=['A', 'B', 'C']) '
s2 = Series([400, 500], index=['D', 'E'])
print '--- sl ---'
         '--- series concat(s1,s2) axis = 0---'
                                                                                                          400
s= pdconcat([s1, s2], axis=_0,
keys=['s1', 's2'],
names=['idx_s', 'idx'])
                                                                                                          NaN
print '--- series concat(sl,s2) axis = 1---'
                                                                                             200.0
s= pdconcat([s1, s2], axis=_1, sort=_False,
kexs=['s1', 's2'],
names=['idx'])
                                                                                                         NaN
                                                                                             300.0
                                                                                                         NaN
                                                                                                      500.0
                                                                                                NaN
```

Concatenation of dataframes

pandas.concat([df1, df2, axis = 0/1, sort=False, ignore_index=True)

Same as pandas. Series, but for recreate continuous index use **ignore_index=True**.

Cell values not assigned were filled with NaN.

```
'--- concat(s1,s2) axis = 0---'
print pdconcat([s1, s2])
print '--- concat(s2, s1) axis = 0---
                                                                                        0.904843 0.013675 -1.758741
                                                                            print pdconcat([s2, s1])
print '--- series concat(s1,s2) axis = 0---'
s = pdconcat([sl, s2], axis=0,
keys=['s1', 's2'],
names=['idx_s', ':
                                      'idx'1)
                                                                                     0 0.124771 -1.821855 -1.395193
1 -1.247934 2.219757 -1.057643
2 -2.446749 0.557201 0.168668
                                                                                     0 0.904843 0.013675 -1.758741
                                                                                                                                       NaN
                                                                                                                                       NaN
                                                                                     2 -0.120983 1.201189 0.981723
                                                                                                                                       NaN
                                                                                     3 1.009936 0.680958 -1.351300
0 -1.395193 0.124771 NaN
                                                                                                                                       NaN
dfl = DataFrame(random.randn(4, 3),
columns=['A', 'B', 'C'])
                                                                                                                         NaN -1.821855
                                                                                     1 -1.057643 -1.247934
2 0.168668 -2.446749
                                                                                                                       NaN 2.219757
NaN 0.557201
--- df concat(dfl, df2) axis=0 ignore_index ---
                                                                                     0 0.904843 0.013675 -1.758741
                                                                                                                                       NaN
                                                                                     1 0.607929 0.753118 -1.182747
                                                                                                                                       NaN
                                                                                     3 1.009936 0.680958 -1.351300
print df2
                                                                                                                                      NaN
4 -1.395193 0.124771
5 -1.057643 -1.247934
6 0.168668 -2.446749
                                                                                                                         NaN -1.821855
                                                                                                                         NaN 2,219757
                                                                                                                         NaN 0.557201
                                                                                     0 0.904843 0.013675 -1.758741 0.124771 -1.821855 -1.395193
1 0.607929 0.753118 -1.182747 -1.247934 2.219757 -1.057643
2 -0.120983 1.201189 0.981723 -2.446749 0.557201 0.168668
print '--- df concat(df1, df2) axis=1 ---'
print pdconcat([df1, df2], axis=1, sort=False)
                                                                                     3 1.009936 0.680958 -1.351300
                                                                                                                                     NaN
```

Combining Series and Dataframes

Example combining series if values are NaN:

```
C
                                                                                           5.0
from numpy import nan, float64, arange, where from pandas import Series, <u>DataFrame</u>, isnull
                                                                                <u>=</u> ₽
                                                                                           NaN
                                                                                           6.0
                                                                                 🖶 D
                                                                                          NaN
                                                                               dtype: float64
print sl
                                                                                0
                                                                            电
s2=Series(arange(4), dtype=float64, index=s1.index)
                                                                            +
                                                                                     dtype: float64
                                                                                     - combine s2 values if s1 value is NaN -
# isnull() selects choice s1 or s2 values
s3 = Series(where(isnull(s1), s2, s1), index=s1.index)
                                                                                           1.0
print '- combine s2 values if s1 value is NaN -
print s3
                                                                                     dtype: float64
                                                                                      ---- Same with combine_first method ---
s4 = sl.combine_first(s2)
print '---- Same with combine_first method ---'
print s4
                                                                                           3.0
```

Example combining Dataframes, same method combine_first:

Stacking/unstacking to/from series

Example:

- how to stack Dataframe to Serie.
- unstack from several Serie indexes.

```
--- dfl ---
attributes cl c2 c3 c4
cabs
Uber 0 l 2 3
Grab 4 5 6 7
Index([u'Uber', u'Grab'], dtype='object', name=u'cabs')
```

```
from numpy import arange
from pandas import <u>Series</u>, DataFrame, Index
                                                                                        cabs attributes
                                                                                        =↓ Uber
dfl = DataFrame(arange(8).reshape(2, 4),
index=Index(['Uber', 'Grab']
                                                                                        ÷
                                                                                   *
                                                                                        0
                                                                                             print dfl.index
# Stack to series dfl for attributes
df2 = dfl.stack('attributes')
print '- stacked dfl for attributes -'
print df2
                                                                                             Uher
                                                                                             Grab 4 5 6 7
Index([u'Uber', u'Grab'], dtype='object', name=u'cabs')
--- unstacked df2 for cabs---
# Unstac from serie to Dataframe
undf2 = df2.unstack('attributes')
print '--- unstacked df2 for attributes---'
print undf2
                                                                                                              Uber Grab
print '--- unstacked df2 for cabs---'
print undf3
```

Other example from series to DataFrame with dropna utility to fill NaN values instead drop.

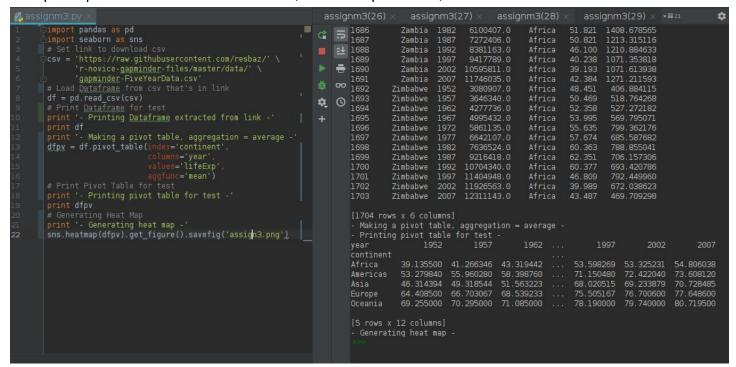
```
rint undf3.index
                                                                                     ₫ 5 sl cl
                                                                                                      concat sl,s2 --
# Unstack from series to <u>Dataframe</u>
sl = Series([5, 10, 15], <u>index=['cl', 'c2', 'c3'])</u>
                                                                                      ■ ±
                                                                                      ▶ 🖶 s2 c2
                                                                                     s3 = concat([s1, s2], keys=['s1', 's2'])
print '--- concat s1,s2 ---'
                                                                                                       sl s2
5.0 NaN
 rint s3.index
                                                                                                c2 10.0 15.0
c3 15.0 20.0
c4 NaN 25.0
Index([u'c1', u'c2', u'c3', u'c4'], dtype='object')
- unstack from Serie to DataFrame -
print '- unstack from Serie to DataFrame -'
print '- First index=0 as columns'
print df.index
                                                                                                 - Second index=1 as columns
                                                                                                cl c2 c3 c4
sl 5.0 10.0 15.0 NaN
s2 NaN 15.0 20.0 25.0
Index([u'sl', u's2'], dtype='object')
sl cl 5.0
c2 10.0
df = s3.unstack(1)
print '- unstack from Serie to DataFrame -'
print '- Second index=l as columns'
                                                                                                                NaN
                                                                                                                NaN
                                                                                                               15.0
                                                                                                                20.0
                                                                                                                25.0
```

Pivot Tables

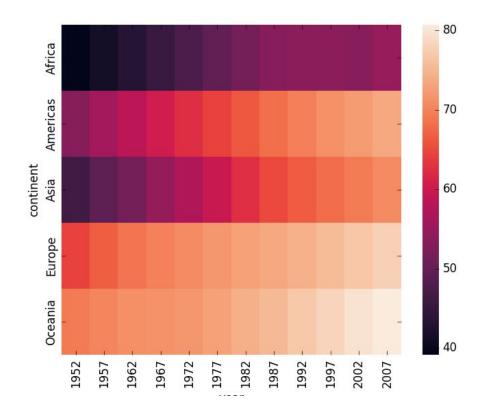
Were a resume table for near value data or equal. New table is an agregation table for this values: summarize, average, count, std. deviation,

Example1: df.pivot('year', 'month', 'passengers') en flights.csv

Example2: **df.pivot_table(index= 'continent', columns= 'year', values='lifeExp', aggfunc='mean'** It keeps simple: Download csv as dataframe, and make pivot table, after render this data with seaborn.



Graphical representation of pivot table as heatmap:



Dealing with duplicates on Python DataFrame

df.duplicated(<columns>) -> How to find indexes for True duplicated columns on rows. **df.drop_duplicates(<columns>, keep=...)** -> remove duplicates same columns values, keep= 'first' or 'last'.

```
Dropped duplicates (nothing), all column -
from pandas import DataFrame
                                                                  coll col2
df = DataFrame({'coll':['uber', 'uber', 'grab', 'grab']
                                                                  uber
                                                            🚐 l uber
                                                               2 grab
                                                           ∞ 3 grab
print df
                                                        🌣 🕓 - Dropped duplicates, coll -
print '- Duplicated for all column coincidence -'
                                                                  coll col2
print df.duplicated()
                                                               0 uber
print '- Dropped duplicates (nothing), all column -'
                                                               2 grab
print df.drop duplicates()
                                                                 Duplicated for col2 coincidence -
                                                                    False
print '- Dropped duplicates, coll -'
                                                                    False
print df.drop_duplicates(['coll'])
                                                                    True
                                                                    False
print' - Duplicated for col2 coincidence -'
                                                               dtype: bool
print df.duplicated(['col2'])
                                                               - Dropped duplicates keeping first, col2 -
print '- Dropped duplicates keeping first, col2 -'
                                                                  coll col2
print df.drop duplicates(['col2'], keep='first')
                                                               0 uber
print '- Dropped duplicates keeping last, col2 -'
                                                               1 uber
print df.drop duplicates(['col2'], keep='last')
                                                               - Dropped duplicates keeping last, col2 -
                                                                  coll col2
                                                               0 uber
                                                               2 grab
                                                               3 grab
```

Mapping in a DataFrame

Previous we have a new dictionary object to complete one column of dataframe with a column index.

```
runfile('/home/r5sim/
from pandas import DataFrame
                                                                  /4 Methods/MapDf.py',
df = DataFrame({'city': ['Tarragona', 'Barcelona', 'Lle
                                                                 wdir='/home/r5sim/Pychar
                'pref': ['977', '93', '973', '972']})
                                                                        city pref
                                                                O Tarragona 977
                                                            oo 1 Barcelona
print df
                                                                               93
                                                            0 2
                                                                      Lleida 973
Habs = {'Tarragona': 0.8,
                                                                3
                                                                      Girona 972
        'Barcelona': 5.6,
                                                                        city pref
                                                                                   Mhabs
        'Lleida': 0.4
                                                                O Tarragona 977
                                                                                     0.8
        'Girona': 0.7}
                                                                   Barcelona
                                                                              93
                                                                                     5.6
                                                                2
                                                                      Lleida 973
                                                                                     0.4
df['Mhabs'] = df['city'].map(Habs)
                                                                      Girona 972
                                                                                     0.7
print df
```

Map functions are a powerful tool to main default element wise transformations.

Replacing values on Series

We can replace values with other values, list of values with other values, replace through dictionary.

```
= Python Console
from numpy import nan
from pandas import Series
                                                                   runfile('/home/r5sim/PycharmProjects/
                                                                 /4_Methods/replceSrVal.py',
s1 = Series([10, 20, 40, 50, 20, 10, 50, 40])
                                                                wdir='/home/r5sim/PycharmProjects/Exampl
                                                               [10 20 40 50 20 10 50 40]
print sl.values
                                                            (§ [10, 20, 40, nan 20, 10, nan 40.]
                                                        文
print sl.replace(50, nan).values
                                                        +
                                                               [100 200 40 500 200 100 500 40]
print sl.replace([10, 20, 50], [100, 200, 500]).values
                                                                [100.
                                                                      nan 400.
                                                                                     nan 100. 50. 400.]
print sl.replace({10: 100, 20: nan, 40: 400}).values
```

Rename Indexes on Series, Dataframes

How we can change the values of indexes, via rename method, mapping functions, or using dictionaries

```
from numpy import arange
                                                                         RE
                                                                             LO
                                                                                  QU
from pandas import DataFrame
                                                                  UBER
                                                                                   2
                                                                                       3
                                                                  OLA
                                                                              6
df = DataFrame(
                                                                  GRAB
                                                                         10
                                                                             11
                                                                                 12
                                                                                      13
                                                                                          14
                                                                         15
                                                                                          19
    arange (25), reshape (5, 5),
                                                                  GOJEK
                                                                                 17
                                                                                      18
                                                              00
    index=['UBER', 'OLA', 'GRAB', 'GOJEK', 'LYFT'],
                                                                  LYFT
                                                                         20
                                                                             21
                                                                                  22
                                                                                      23
                                                                                          24
    columns=['RE', 'LO', 'QU', 'GR', 'AG'])
                                                              O - Change idx updating df in place -
                                                          阜
                                                                         re
                                                                                          ag
                                                           +
                                                                  Uber
                                                                                   2
                                                                  Ola
                                                                                      13
                                                                             11
                                                                                          14
                                                                  Grab
                                                                                 12
print '- Change idx updating df in place -'
                                                                  Gojek 15
                                                                             16
                                                                                 17
                                                                                      18
df.rename(index=str.title, columns=str.lower,
                                                                  Lyft
                                                                         20
                                                                             21
                                                                                      23
                                                                                          24
          inplace=True)

    Change indexes using mapping -

                                                                                          AG
                                                                         RE
                                                                             LO OU
                                                                                      GR
                                                                  uber
                                                                                   2
                                                                                       3
                                                                                           4
print' - Change indexes using mapping -'
                                                                  ola
df.index = df.index.map(str.lower)
                                                                         10
                                                                             11
                                                                                 12
                                                                                     13
                                                                                          14
                                                                  grab
df.columns = df.columns.map(str.upper)
                                                                  gojek
                                                                         15
                                                                             16
                                                                                  17
                                                                                      18
                                                                                          19
                                                                  lyft
                                                                         20
                                                                                  22
                                                                                      23
                                                                                          24
print df

    Renaming with dictionary

                                                                         Revenue
                                                                                   LO
                                                                                       QU
                                                                                           GR
                                                                                               AG
print '- Renaming with dictionary -'
                                                                                        2
                                                                                            3
df.rename(index={'uber': 'U', 'ola': 'O', 'grab': 'G'
                                                                                            8
                  'lyft': 'L'},
                                                                                  11
                                                                                       12
                                                                                          13
                                                                                               14
                                                                              10
          columns={'RE': 'Revenue'}, inplace=True)
                                                                  gojek
                                                                              15
                                                                                      17
                                                                                           18
                                                                                               19
print df
                                                                               20 21 22 23 24
```

Binning Values

Separating elements into bin sort categories. How to create bins, add elements to bins, categorize elements into the frame bins.

Observation, filtering and Basic Analysis on Dataframes.

df.head() -> First (five) elements of df dataframedf.tail() -> Last (five) elements of df dataframe.

df.describe()-> each column dataframe: count, mean, std, min, max, 25%, 50%, 75% values dataframe. **column = df [0]** Series as columns of dataframe: df[0],... you can use previous methods.

You can filter column with conditions.eg: column[np.abs(column)>1]

Same for dataframe **df.column[(np.abs(df)>3).any(1)]** where any(1) is one of more coordinate coincidence. Replace values for condition on dataframe: **df[(np.abs(df>3)] = np.sign(df)*<valor>**

```
from numpy <mark>import</mark> random, abs
from pandas import DataFrame
                                    ■ ± 0 0.395326 0.350652 0.486284 -0.200360 0.748497 1.129702
df = DataFrame(random.randn(300, 6))
                                    1 -0.726854 0.639944 -1.149157 -0.891027 -0.714333 1.596035
                                   2 -0.178330 0.207914 0.791249 1.376595 -1.755830 -1.203099 3 -0.535323 -1.722779 -1.249950 -0.051593 0.588967 0.100919
print df.head()
                                   Q 0.700991 -0.016208 -0.799536 -1.345773 0.688871 1.387114
print '- description -'
                                          295 -0.123751 0.187325 0.134778 -0.091010 0.645569 -1.053574
                                          296 1.431165 -0.883932 -0.347978 0.684907 -0.506576 1.700571
                                          297 -0.536441 -0.408682 1.260484 -1.329479 1.385930 0.119962
print df[(abs(df) > 3).any(1)]
                                          298 - 0.813200 - 0.368584 1.179449 - 1.454540 0.944520 - 1.430976
                                          299 1.973873 0.550871 0.059220 1.230382 0.158260 0.998530
                                           - description -
                                          count 300,000000 300,000000 300,000000 300,000000 300,000000 300,000000
                                                  0.013811 -0.128243 0.072664 -0.035737 -0.057174
                                                  0.963472 1.041952 0.993132 1.108172
                                                                                               1.016685
                                                                                                            0.982238
                                                  -3.286583 -3.391898 -2.691259 -3.205952
                                                                                                           -2.816689
                                                 -0.599171 -0.725603 -0.620242 -0.794939
                                                                                               -0.742209
                                                                                                           -0.514275
                                                  0.061233 -0.111774 0.123687 0.016023
                                                                                                0.024312
                                                                                                            0.093642
                                                  0.615239 0.584670
                                                                                   0.715435
                                                                        0.699852
                                                                                                0.647024
                                                                                                            0.675512
                                                  2.417312 3.183064 3.362810 3.323146
                                                                                                 2.671871
                                                                                                            2.835463
                                           condition on dataframe
                                          16 -0.837905 0.071305 3.362810 0.100070 1.793270 0.679372
                                           23 0.209472 0.984246 -0.480356 -3.205952 -1.886118 0.103550
                                          68 0.094521 -3.391898 1.335944 -1.117206 -0.637098 0.060504
```

Substitute value:

```
om numpy import random, abs, sign
                                             count 300.000000 300.000000 300.000000 300.000000 300.000000 300.000000
from pandas import DataFrame
                                          <u>≖</u> mean
                                                     0.026879
                                                                0.062116
                                                                           0.025306
                                                                                       0.055370
                                                                                                  -0.033593
                                                                                                              -0.045183
                                                               0.998384
                                                                           0.914618
                                                                                                              1.060344
                                                      1.025849
                                                                                        0.980184
df = DataFrame(random.randn(300, 6))
                                                                                                              -3.098537
                                                     -3.179544
                                                               -2,941613
                                                                           -2.298552
                                                                                                   -2.985757
                                             min
                                          oo 25%
                                                                -0.623047
                                                     -0.667897
                                                                                       -0.610851
                                                                                                   -0.694270
                                                                                                              -0.727860
                                       0.041532
                                                                 0.096691
                                                                                                   0.001365
                                                                                                              -0.048152
                                                                                        0.022262
                                                                 0.715488
                                                                             0.580947
                                                                                        0.642533
                                                                                                   0.540159
                                              75%
                                                      0.712260
print '- description -'
                                                      3.821092
                                                                2.740674
                                                                             3.052471
                                                                                        3.138921
                                                                                                    3.521441
                                                                                                               2.655050
                                              max
print df.describe()
                                              - Condition on DataFrame -
                                                  0.539435 -0.047923 3.052471 1.006636 -2.301634 -1.955157
                                             61 0.224267 0.542995 0.199061 -1.716833 3.521441 0.934967
print '- Condition on DataFrame -'
                                             76 -0.362065 -1.740101 -2.008180 0.308733 2.507323 -3.098537
print df[(abs(df) > 3).any(1)]
                                             84 -1.381330 1.008431 0.390338 3.138921 -0.140735 -0.063606
                                             102 3.821092 1.723147 -0.106004 -0.800158 0.535789 2.209474
                                             127 -3.179544 1.464841 -0.445884 0.390668 -0.516392 1.438888
print '- Substitute for sign*5 -'
df[abs(df) > 3] = sign(df)*5
                                             - Substitute for sign*5 -
print df.describe()
                                             count 300,000000 300,000000 300,000000 300,000000 300,000000 300,000000
                                                     0.024740
                                                                0.062116
                                                                            0.031798
                                                                                       0.061574
                                                                                                  -0.028664
                                                                                                              -0.051521
                                                      1.066329
                                                                 0.998384
                                                                            0.942658
                                                                                        1.005332
                                                                                                   0.973630
                                                                                                               1.084074
                                                     -5.000000
                                                                -2.941613
                                                                            -2.298552
                                                                                        -2.743556
                                                                                                   -2.985757
                                                                                                              -5.000000
                                              25%
                                                     -0.667897
                                                                -0.623047
                                                                            -0.592780
                                                                                        -0.610851
                                                                                                   -0.694270
                                                                                                              -0.727860
                                                      0.041532
                                                                 0.096691
                                                                            0.022237
                                                                                        0.022262
                                                                                                    0.001365
                                                                                                              -0.048152
                                                                                                    0.540159
                                                      0.712260
                                                                 0.715488
                                                                             0.580947
                                                                                        0.642533
                                                                                                               0.722797
                                                      5.000000
                                                                 2.740674
                                                                            5.000000
                                                                                        5.000000
                                                                                                    5.000000
                                                                                                               2,655050
```