

Data Processing Using Python

Powerful Data Structure and Software Ecosystem

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Data Processing Using Python

WHY DICTIONARY?

Why Dictionary?



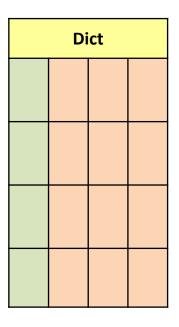
Use Python to build a simple employee information table including names and salaries. Use the table to query salary of Niuyun.

```
# Filename: info.py
names = ['Wangdachui', 'Niuyun', 'Linling', 'Tianqi']
salaries = [3000, 2000, 4500, 8000]
print(salaries[names.index('Niuyun')])
```

<u>Output</u>: 2000

salaries['Niuyun']

Dictionary



What is dictionary?

A mapping type

- key
- value
- key-value pair

Create a Dictionary

Info			
0	'Wangdachui'		
1	'Niuyun',		
2	'Linling'		
3	'Tianqi'		

Create a dictionary

- directly
- Use dict()

cInfo['Niuyun']

```
Source
```

```
>>> aInfo = {'Wangdachui': 3000, 'Niuyun':2000, 'Linling':4500, 'Tianqi':8000}

>>> info = [('Wangdachui',3000), ('Niuyun',2000), ('Linling',4500), ('Tianqi',8000)]

>>> bInfo = dict(info)

>>> cInfo = dict([['Wangdachui',3000], ['Niuyun',2000], ['Linling',4500], ['Tianqi',8000]])

>>> dInfo = dict(Wangdachui=3000, Niuyun=2000, Linling=4500, Tianqi=8000)
```

{'Tianqi': 8000, 'Wangdachui': 3000, 'Linling': 4500, 'Niuyun': 2000}

Create a Dictionary



How to set the default value of salary to be 3000?



>>> aDict = {}.fromkeys(('Wangdachui', 'Niuyun', 'Linling', 'Tianqi'),3000)

>>> aDict

{'Tianqi': 3000, 'Wangdachui': 3000, 'Niuyun': 3000, 'Linling': 3000}

sorted(aDict) = ?

['Linling', 'Niuyun', 'Tianqi', 'Wangdachui']

Generate a Dictionary



How to generate an employee information dictionary with name and salary list?

```
Source
```

```
>>> names = ['Wangdachui', 'Niuyun', 'Linling', 'Tianqi']
>>> salaries = [3000, 2000, 4500, 8000]
>>> dict(zip(names,salaries))
{'Tianqi': 8000, 'Wangdachui': 3000, 'Niuyun': 2000, 'Linling': 4500}
```

Generate a Dictionary



How to generate a dictionary of company code and stock price from data?

{'AXP': '78.51', 'BA': '184.76', 'CAT ': '96.39', 'CSCO': '33.71', 'CVX': '106.09'}

Generate a Dictionary

```
# Filename: createdict.py
pList = \cdots
aList = []
bList = []
for i in range(5):
  aStr = pList[i][0]
  bStr = pList[i][2]
  aList.append(aStr)
  bList.append(bStr)
aDict = dict(zip(aList,bList))
print(aDict)
```

```
pList = [('AXP', 'American Express Company', '78.51'),
('BA', 'The Boeing Company', '184.76'),
('CAT', 'Caterpillar Inc.', '96.39'), ···]
```

{'AXP': '78.51', 'BA': '184.76', 'CAT ': '96.39', 'CSCO': '33.71', 'CVX': '106.09'}

Data Processing Using Python



USING DICTIONARY

Basic Operation of Dictionary

```
>>> aInfo = {'Wangdachui': 3000, 'Niuyun':2000, 'Linling':4500, 'Tianqi':8000}
>>> aInfo['Niuyun'] Search by key
2000
>>> aInfo['Niuyun'] = 9999
>>> aInfo
{'Tianqi': 8000, 'Wangdachui': 3000, 'Linling': 4500, 'Niuyun': 9999}
>>> aInfo['Fuyun'] = 1000 -
                               insert
>>> aInfo
{'Tiangi': 8000, 'Fuyun': 1000, 'Wangdachui': 3000, 'Linling': 4500, 'Niuyun': 9999}
>>> 'Mayun' in alnfo__
                         Member identification
False
>>> del aInfo['Fuyun'] -
                              Delete
>>> aInfo
{'Tiangi': 8000, 'Wangdachui': 3000, 'Linling': 4500, 'Niuyun': 9999}
```

Built-in Functions of Dictionary

```
dict()
len()
hash()
```

```
>>> names = ['Wangdachui', 'Niuyun', 'Linling', 'Tianqi']
>>> salaries = [3000, 2000, 4500, 8000]
>>> alnfo = dict(zip(names, salaries))
>>> alnfo
{'Wangdachui': 3000, 'Linling': 4500, 'Niuyun': 2000, 'Tianqi': 8000}
>>> len(alnfo)
4
```

Built-in Functions of Dictionary

```
>>> hash('Wangdachui')
7716305958664889313
>>> testList = [1, 2, 3]
>>> hash(testList)
Traceback (most recent call last):
 File "<pyshell#127>", line 1, in <module>
  hash(testList)
TypeError: unhashable type: 'list'
```



An information dictionary is known as {'Wangdachui':3000, 'Niuyun':2000, 'Linling':4500, 'Tianqi':8000}, how to output the name and salary of employee separately?



There are two dictionaries, the first one contains original information, while the second one has some new members and updates, how to merge and update information?

```
Source
```

```
>>> aInfo = {'Wangdachui': 3000, 'Niuyun': 2000, 'Linling': 4500}
>>> bInfo = {'Wangdachui': 4000, 'Niuyun': 9999, 'Wangzi': 6000}
>>> aInfo.update(bInfo)
>>> aInfo
{'Wangzi': 6000, 'Linling': 4500, 'Wangdachui': 4000, 'Niuyun': 9999}
```



What's the difference between the two kinds of search operation?



```
>>> stock = {'AXP': 78.51, 'BA': 184.76}
>>> stock['AAA']
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
KeyError: 'AAA'
```



```
>>> stock = {'AXP': 78.51, 'BA': 184.76}
>>> print(stock.get('AAA'))
None
```

Delete a dictiontary

```
Source
>>> aStock = {'AXP': 78.51, 'BA':184.76}
>>> bStock = aStock
>>> aStock = {}
>>> bStock
{'BA': 184.76, 'AXP': 78.51}
```

```
$\square
>>> aStock = \{'AXP': 78.51, 'BA': 184.76\}
>>> bStock = aStock
>>> aStock.clear()
>>> aStock
{}
>>> bStock
{}
```

clear()	copy()	fromkeys()	get()	items()
keys()	pop()	setdefault()	update()	values()

method

Case Study

JSON format

- JavaScript Object Notation
- A lightweight data exchange format

Keyword query with search engine

```
Baidu:
http://www.baidu.com/s?wd=%s
Google:
http://www.googlestable.com/search/?q=%us
Bing
China: http://cn.bing.com/search?q=%us
USA: http://www.bing.com/search?q=%us
```

Variable Length Keyword Parameter (Diction 1988)

Parameter type in Python function:

- Position or keyword parameter
- Only position parameter
- Variable Length Position
 Parameter
- Variable length keyword parameter with default value

```
>>> def func(args1, *argst, **argsd):
       print(args1)
       print(argst)
       print(argsd)
>>> func('Hello,','Wangdachui','Niuyun','Linling',a1= 1,a2=2,a3=3)
Hello,
('Wangdachui', 'Niuyun', 'Linling')
{'a1': 1, 'a3': 3, 'a2': 2}
```

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SET

Set

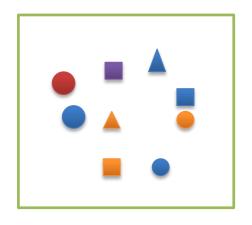


How to remove the duplicate values in information form?



```
>>> names = ['Wangdachui', 'Niuyun', 'Wangzi', 'Wangdachui', 'Linling', 'Niuyun']
>>> namesSet = set(names)
>>> namesSet
{'Wangzi', 'Wangdachui', 'Niuyun', 'Linling'}
```

Set



What is set?

A combination of several unordered elements with no duplicate

- Variable set (set)
- Fixed set (frozenset)

Create a Set

```
>>> aSet = set('hello')
>>> aSet
{'h', 'e', 'l', 'o'}
>>> fSet = frozenset('hello')
>>> fSet
frozenset({'h', 'e', 'l', 'o'})
>>> type(aSet)
<class 'set'>
>>> type(fSet)
<class 'frozenset'>
```

Comparison between Sets



```
>>> aSet = set('sunrise')
```

>>> 'u' in aSet

True

>>> aSet == bSet

False

>>> aSet < bSet

False

>>> set('sun') < aSet

True

Mathematic	Python
€	in
∉	not in
=	==
≠	!=
C	<
⊆	<=
□	>
⊇	>=

Standard type operators

Relational Operation



```
>>> aSet = set('sunrise')
>>> bSet = set('sunset')
>>> aSet & bSet
{'u', 's', 'e', 'n'}
>>> aSet | bSet
{'e', 'i', 'n', 's', 'r', 'u', 't'}
>>> aSet - bSet
{'i', 'r'}
>>> aSet ^ bSet
{'i', 'r', 't'}
>>> aSet -= set('sun')
>>> aSet
{'e', 'i', 'r'}
```

Mathematic	Python
Λ	&
U	
- or \	-
Δ	۸

Set type operator

compound assignment operators

Built-in Function for Set

- Function can also be used to do similar work
 - For all sets

```
s.issubset(t)
issuperset(t)
union(t)
intersection(t)
difference(t)
symmetric_difference(t)
copy()
```

```
>>> aSet = set('sunrise')
>>> bSet = set('sunset')
>>> aSet.issubset(bSet)
False
>>> aSet.intersection(bSet)
{'u', 's', 'e', 'n'}
>>> aSet.difference(bSet)
{'i', 'r'}
>>> cSet = aSet.copy()
>>> cSet
```

{'s', 'r', 'e', 'i', 'u', 'n'}

Built-in Function for Set

- Function can also be used to do similar work
 - For variable sets

```
update(t)
intersection update(t)
difference update(t)
symmetric difference update(t)
add(obj)
remove(obj)
discard(obj)
pop()
clear()
```

```
>>> aSet = set('sunrise')
>>> aSet.add('!')
>>> aSet
{'!', 'e', 'i', 'n', 's', 'r', 'u'}
>>> aSet.remove('!')
>>> aSet
{'e', 'i', 'n', 's', 'r', 'u'}
>>> aSet.update('Yeah')
>>> aSet
{'a', 'e', 'i', 'h', 'n', 's', 'r', 'u', 'Y'}
>>> aSet.clear()
>>> aSet
set()
```



Data Processing Using Python

SCIPY LIBRARY

SciPy

Feature

- A software ecosystem based on Python
- Open-source
- Serve for math, science and engineering



NumPy
Base N-dimensional array
package



SciPy library Fundamental library for scientific computing



Matplotlib Comprehensive 2D Plotting



IPython Enhanced Interactive Console

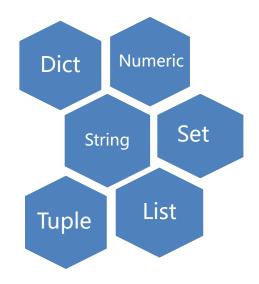


Sympoy
Symbolic mathematics



pandas Data structures & analysis

Common Data Type in Python



Other Data Structure



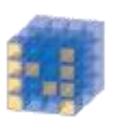
Data Structure in SciPy

Modification based on original

Python data structure

- ndarray (n-dimension array)
- Series (dictionary with variable length)
- DataFrame

NumPy



Feature

- Powerful ndarray object and ufunc() function
- Ingenious funciton
- Suitable for scientific computation like linear algebra and random number handling
- Flexible and available general multi-dimension data structure
- Easy to connect with database



>>> import numpy as np

>>> xArray = np.ones((3,4))

SciPy

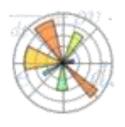


Feature

- Key package for scientific computation in Python and it is based on NumPy. It includes richer functions and methods than NumPy and it probably has stronger function when they have the same functions or methods.
- Efficiently compute NumPy matrix to benefit collaboration between NumPy and SciPy.
- Toolbox to deal with different fields in scientific computation with modules including interpolation, integration, optimization and image processing.

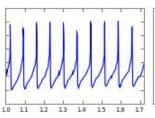
```
>>> import numpy as np
>>> from scipy import linalg
>>> arr = np.array([[1,2],[3,4]])
>>> linalg.det(arr)
-2.0
```

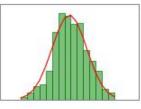
Matplotlib

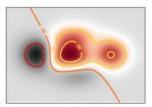


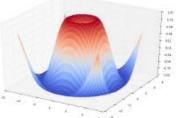
Feature

- Based on NumPy
- 2-dimensional graph library to rapidly generate all kinds of graphs
- Pyplot module provides MATLAB-like interface.









pandas



Feature

- Based on SciPy and NumPy
- Efficient Series and DataFrame structure
- Powerful Python library for scalable data processing
- Efficient solution for large dataset slides
- Optimized library function to read/write many types of files, like CSV and HDF5



>>> df[2:5]

>>> df.head(4)

>>> df.tail(3)

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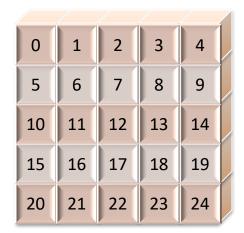
NDARRAY

Array in Python

Format

- Use data structure like list and tuple
 - One-dimensional array list = [1,2,3,4]
 - Two-dimensional array list = [[1,2,3],[4,5,6],[7,8,9]]
- Array module
 - Create array with array() , array.array("B", range(5))
 - Provide methods including append, insert and read

Ndarray

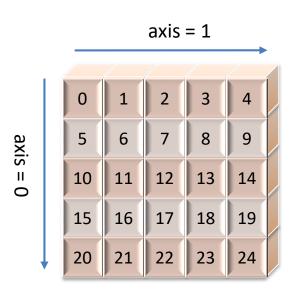


What is ndarray?

N-dimensional array

- Basic data type in NumPy
- Elements are of the same type
- With another name array
- Reduce memory cost and improve the computational efficiency
- Powerful functions

Basic Concepts of Ndarray



Ndarray attributes

ndarray

- Dimensions are called axes, the number of axes is rank.
- Basic attributes
 - ndarray.ndim (rank)
 - ndarray.shape (dimension)
 - ndarray.size (total size)
 - ndarray.dtype (type of element)
 - ndarray.itemsize (size of item(in byte))

Creation of Ndarray

```
>>> import numpy as np
>>> aArray = np.array([1,2,3])
>>> aArray
array([1, 2, 3])
>> bArray = np.array([(1,2,3),(4,5,6)])
>>> bArray
array([[1, 2, 3],
      [4, 5, 6]])
>>> np.arange(1,5,0.5)
array([ 1. , 1.5, 2. , 2.5, 3. , 3.5, 4. , 4.5])
>>> np.random.random((2,2))
array([[ 0.79777004, 0.1468679 ],
    [0.95838379, 0.86106278]])
>>> np.linspace(1, 2, 10, endpoint=False)
array([ 1. , 1.1, 1.2, 1.3, 1.4, 1.5, 1.6, 1.7, 1.8, 1.9])
```

arange	array
сору	empty
empty_like	eye
fromfile	fromfunction
identity	linspace
logspace	mgrid
ogrid	ones
ones_like	r
zeros	zeros_like

Ndarray creation funciton

Creation of Ndarray

```
>>> np.ones([2,3])
array([[ 1., 1., 1.],
   [1., 1., 1.]])
>>> np.zeros((2,2))
array([[ 0., 0.],
       [0., 0.1]
>> np.fromfunction(lambda i,j:(i+1)*(j+1), (9,9))
array([[ 1., 2., 3., 4., 5., 6., 7., 8., 9.],
       [ 2., 4., 6., 8., 10., 12., 14., 16., 18.]
       [ 3., 6., 9., 12., 15., 18., 21., 24., 27.]
       [ 4., 8., 12., 16., 20., 24., 28., 32., 36.],
       [ 5., 10., 15., 20., 25., 30., 35., 40., 45.],
       [ 6., 12., 18., 24., 30., 36., 42., 48., 54.],
       [7., 14., 21., 28., 35., 42., 49., 56., 63.],
       [ 8., 16., 24., 32., 40., 48., 56., 64., 72.],
        9., 18., 27., 36., 45., 54., 63., 72., 81.]])
```

arange	array
сору	empty
empty_like	eye
fromfile	fromfunction
identity	linspace
logspace	mgrid
ogrid	ones
ones_like	r
zeros	zeros_like

Ndarray creation funciton

Ndarray Operations



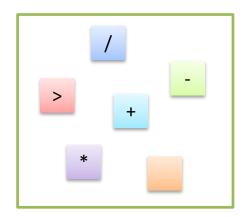
```
>> aArray = np.array([(1,2,3),(4,5,6)])
array([[1, 2, 3],
    [4, 5, 6]]
>>> print(aArray[1])
[4 5 6]
>>> print(aArray[0:2])
[[1 2 3]
[4 5 6]]
>>> print(aArray[:,[0,1]])
[[1 2]
[45]]
>>> print(aArray[1,[0,1]])
[45]
>>> for row in aArray:
         print(row)
[1 2 3]
[456]
```

Ndarray Operations

```
>> aArray = np.array([(1,2,3),(4,5,6)])
>>> aArray.shape
(2, 3)
>>> bArray = aArray.reshape(3,2)
>>> bArray
array([[1, 2],
       [3, 4],
       [5, 6]])
>>> aArray
array([[1, 2, 3],
      [4, 5, 6]]
```

```
>>> aArray.resize(3,2)
>>> aArray
array([[1, 2],
    [3, 4],
    [5, 6]])
>>> bArray = np.array([1,3,7])
>> cArray = np.array([3,5,8])
>>> np.vstack((bArray, cArray))
array([[1, 3, 7],
    [3, 5, 8]]
>>> np.hstack((bArray, cArray))
array([1, 3, 7, 3, 5, 8])
```

Ndarray Calculation



Use basic operators.

```
>> aArray = np.array([(5,5,5),(5,5,5)])
>> bArray = np.array([(2,2,2),(2,2,2)])
>>> cArray = aArray * bArray
>>> cArray
array([[10, 10, 10],
       [10, 10, 10]])
>>> aArray += bArray
>>> aArray
array([[7, 7, 7],
       [7, 7, 7]]
>>> a = np.array([1,2,3])
>> b = np.array([[1,2,3],[4,5,6]])
>>> a + b
array([[2, 4, 6],
    [5, 7, 9]])
```

Ndarray Calculation

```
Source
```

```
>> aArray = np.array([(1,2,3),(4,5,6)])
>>> aArray.sum()
21
>>> aArray.sum(axis = 0)
array([5, 7, 9])
>>> aArray.sum(axis = 1)
array([ 6, 15])
>>> aArray.min() # return value
>>> aArray.argmax() # return index
5
>>> aArray.mean()
3.5
>>> aArray.var()
2.916666666666665
>>> aArray.std()
1.707825127659933
```

sum	mean
std	var
min	max
argmin	argmax
cumsum	cumprod

Use basic array statistic methods

Specific Application—Linear Algebra

```
Source
>>> import numpy as np
>> x = np.array([[1,2], [3,4]])
>>> r1 = np.linalg.det(x)
>>> print(r1)
-2.0
>> r2 = np.linalg.inv(x)
>>> print(r2)
[[-2. 1.]
[1.5 - 0.5]
>> r3 = np.dot(x, x)
>>> print(r3)
[[ 7 10]
[15 22]]
```

dot	Inner product of matrix
linalg.det	Determinant
linalg.inv	Inverse matrix
linalg.solve	Multiple linear equation
linalg.eig	Eigenvalue and eigenvector

Common Functions

ufunc() in Ndarray

ufunc (universal function)
 can operate each element in
 the array. As many ufunc()s in
 NumPy are implemented by C,
 the speed can be fast.

add, all, any, arange, apply_along_axis, argmax, argmin, argsort, average, bincount, ceil, clip, conj, corrcoef, cov, cross, cumprod, cumsum, diff, dot, exp, floor, ...

```
# Filename: math_numpy.py
import time
import math
import numpy as np
x = np.arange(0, 100, 0.01)
t m1 = time.clock()
for i, t in enumerate(x):
  x[i] = math.pow((math.sin(t)), 2)
t m2 = time.clock()
y = np.arange(0,100,0.01)
t n1 = time.clock()
y = np.power(np.sin(y), 2)
t n2 = time.clock()
print('Running time of math:', t m2 - t m1)
print('Running time of numpy:', t n2 - t n1)
```

Data Processing Using Python



SERIES

Series

Basic feature

- Object similar to one-dimensional array
- Consist of data and index.

```
>>> from pandas import Series
>>> aSer = Series([1,2.0,'a'])
>>> aSer
0  1
1  2
2  a
dtype: object
```

Index of Self-defined Series

```
>>> bSer = pd.Series(['apple','peach','lemon'], index = [1,2,3])
>>> bSer
   apple
   peach
  lemon
dtype: object
>>> bSer.index
Int64Index([1, 2, 3], dtype='int64')
>>> bSer.values
array(['apple', 'peach', 'lemon'], dtype=object)
```

Basic Operation of Series

```
Source
>>> aSer = pd.Series([3,5,7],index = ['a','b','c'])
>>> aSer['b']
5
>>> aSer * 2
    6
  10
  14
dtype: int64
>>> import numpy as np
>>> np.exp(aSer)
     20.085537
    148.413159
   1096.633158
dtype: float64
```

Data Alignment of Series

```
>>> data = {'AXP':'86.40','CSCO':'122.64','BA':'99.44'}
>>> sindex = ['AXP','CSCO','BA','AAPL']
>>> aSer = pd.Series(data, index = sindex)
>>> aSer
AXP
      86.40
CSCO 122.64
  BA
      99.44
AAPL
      NaN
dtype: object
>>> pd.isnull(aSer)
AXP False
CSCO False
      False
  BA
AAPL
      True
dtype: bool
```

Data Alignment of Series

Important feature

Align data with different indexes

during computation

```
Source
>>> aSer = pd.Series(data, index = sindex)
>>> aSer
 AXP
         86.40
CSCO
        122.64
      99.44
  BA
AAPL
           NaN
dtype: object
>>> bSer = {'AXP':'86.40','CSCO':'122.64','CVX':'23.78'}
>>> cSer = pd.Series(bSer)
>>> aSer + cSer
AAPL
                NaN
AXP 86.4086.40
  BA
               NaN
CSCO 122.64122.64
CVX
                NaN
dtype: object
```

Name Attribute in Series

Important feature

- Series object and its index both have name attribute.
- Name attribute of
 Series is important
 to other functions.

```
>>> aSer = pd.Series(data, index = sindex)
>>> aSer.name = 'cnames'
>>> aSer.index.name = 'volume'
>>> aSer
volume
   AXP
            86.40
  CSCO
           122.64
    BA
            99.44
  AAPI
             NaN
Name: cnames, dtype: object
```

Data Processing Using Python



DATAFRAME

DataFrame

Basic Feature

- A form-like data structure
- Have an ordered column (like index)
- Can be considered as a set of Series sharing the same index

Index and Value of Dataframe

```
Source
>>> data = np.array([('Wangdachui', 4000), ('Linling', 5000), ('Niuyun', 6000)])
>>> frame =pd.DataFrame(data, index = range(1, 4), columns = ['name', 'pay'])
>>> frame
         name
                  pay
1 Wangdachui
                4000
                 5000
        Linling
        Niuyun 6000
>>> frame.index
RangeIndex(start=1, stop=4, step=1)
>>> frame.columns
Index(['name', 'pay'], dtype='object')
>>> frame.values
array([['Wangdachui', '4000'],
    ['Linling', '5000'],
    ['Niuyun', '6000']], dtype=object)
```

Basic Operation of DataFrame

 The query for row and column of DataFrame object returns Series

```
>>> frame['name']
0 Wangdachui
1 Linling
2 Niuyun
Name: name, dtype: object
>>> frame.pay
0 4000
```

Name: pay, dtype: int64

5000

6000

```
name pay
0 Wangdachui 4000
1 Linling 5000
2 Niuyun 6000
```

```
S<sub>ource</sub> >>> frame
```

>>> frame.iloc[: 2, 1]

0 40001 5000

Name: pay, dtype: object

Basic Operation of DataFrame

Modification and deletion of DataFrame object

```
>>> frame['name'] = 'admin'
>>> frame
    name pay
0 admin 4000
1 admin 5000
2 admin 6000
```

```
>>> del frame['pay']
>>> frame
  name
0 admin
1 admin
2 admin
[3 rows x 1 columns]
```

Statistics with DataFrame

Find groups with lowest and high salaries in DataFrame object members

	name	pay
0	Wangdachui	4000
1	Linling	5000
2	Niuyun	6000





>>> frame[frame.pay >= '5000']

name pay

- 1 Linling 5000
- 2 Niuyun 6000