

ОСНОВЫ Python

Пакет NumPy

PIP: PIP Installs Packages

- `sudo pip install packagename`
`sudo pip uninstall packagename` Linux
- `cd C:\Python27\Scripts\
pip install packagename` Windows
`pip uninstall packagename`
- `pip install numpy`

Arrays – Numerical Python (Numpy)

- Списки

```
>>> a = [1,3,5,7,9]
>>> print(a[2:4])
[5, 7]
>>> b = [[1, 3, 5, 7, 9], [2, 4, 6, 8, 10]]
>>> print(b[0])
[1, 3, 5, 7, 9]
>>> print(b[1][2:4])
[6, 8]
```

```
>>> a = [1,3,5,7,9]
>>> b = [3,5,6,7,9]
>>> c = a + b
>>> print c
[1, 3, 5, 7, 9, 3, 5, 6, 7, 9]
```

- Нет арифметических операций (+, -, *, /, ...)

- Numpy

```
>>> import numpy
```

Numpy – N-dimensional Array manipulations

NumPy – основная библиотека для научных расчетов в Python:

- поддержка многомерных массивов (арифметика, подмассивы, преобразования)

включает 3 доп. библиотеки с процедурами для:

- линейной алгебры (решение СЛАУ)
- дискретное преобразование Фурье
- работа со случайными числами

Numpy – Creating vectors

- From lists

- `numpy.array` – создание массива из списка значений

```
>>> import numpy
>>> a = numpy.array([1,3,5,7,9])
>>> b = numpy.array([3,5,6,7,9])
>>> c = a + b
>>> print c
[4, 8, 11, 14, 18]

>>> type(c)
(<type 'numpy.ndarray'>)

>>> c.shape
(5,)
```

```
• >>> import numpy
• >>> M = numpy.array([[1,2], [3, 4], [5,6], [7,8]], dtype=float)
• >>> print M
• [[ 1.  2.]
•  [ 3.  4.]
•  [ 5.  6.]
•  [ 7.  8.]]

• >>> print M.ndim
• 2
• >>> print M.shape
• (4, 2)
• >>> print M.size
• 8
• >>> print len(M)
• 4
• >>> print numpy.sin(M)
• [[ 0.84147098  0.90929743]
•  [ 0.14112001 -0.7568025 ]
•  [-0.95892427 -0.2794155 ]
•  [ 0.6569866   0.98935825]]
```

Numpy – Creating matrices

```
>>> L = [[1, 2, 3], [3, 6, 9], [2, 4, 6]] # create a list
>>> a = numpy.array(L) # convert a list to an array
>>> print a
[[1 2 3]
 [3 6 9]
 [2 4 6]]
>>> print a.shape
(3, 3)
>>> print a.dtype # get type of an array
dtype('int64')
```

```
# or directly as matrix
```

```
>>> M = numpy.array([[1, 2], [3, 4]])
>>> print M.shape
(2,2)
>>> print M.dtype
dtype('int64')
```

```
#only one type
```

```
>>> M[0,0] = "hello"
```

```
Traceback (most recent call last):
```

```
  File "<stdin>", line 1, in <module>
```

```
ValueError: invalid literal for long() with base 10:
```

```
>>> M = numpy.array([[1, 2], [3, 4]], dtype=complex)
```

```
>>> print M
```

```
array([[ 1.+0.j,  2.+0.j],
       [ 3.+0.j,  4.+0.j]])
```

Numpy – Matrices use

```
>>> print(a)
[[1 2 3]
 [3 6 9]
 [2 4 6]]
>>> print(a[0]) # this is just like a list of lists
[1 2 3]
>>> print(a[1, 2]) # arrays can be given comma separated indices
9
>>> print(a[1, 1:3]) # and slices
[6 9]
>>> print(a[:,1])
[2 6 4]
>>> a[1, 2] = 7
>>> print(a)
[[1 2 3]
 [3 6 7]
 [2 4 6]]
>>> a[:, 0] = [0, 9, 8]
>>> print(a)
[[0 2 3]
 [9 6 7]
 [8 4 6]]
```


Numpy – Creating arrays

```
>>> x = numpy.arange(0, 10, 1) # arguments: start, stop, step
>>> print x
array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9])

>>> print numpy.linspace(0, 10, 25)
array([ 0.          ,  0.41666667,  0.83333333,  1.25          ,
        1.66666667,  2.08333333,  2.5          ,  2.91666667,
        3.33333333,  3.75          ,  4.16666667,  4.58333333,
        5.          ,  5.41666667,  5.83333333,  6.25          ,
        6.66666667,  7.08333333,  7.5          ,  7.91666667,
        8.33333333,  8.75          ,  9.16666667,  9.58333333, 10.          ]))

>>> print numpy.logspace(-2, 3, 6)
array([ 1.00000000e-02,  1.00000000e-01,  1.00000000e+00,
        1.00000000e+01,  1.00000000e+02,  1.00000000e+03])

>>> print numpy.logspace(0, 10, 10, base=numpy.e) # по умолчанию base=10.0
array([ 1.00000000e+00,  3.03773178e+00,  9.22781435e+00,
        2.80316249e+01,  8.51525577e+01,  2.58670631e+02,
        7.85771994e+02,  2.38696456e+03,  7.25095809e+03,
        2.20264658e+04])
```

Numpy – Creating arrays

```
# a diagonal matrix
>>> print numpy.diag([1,2,3])
array([[1, 0, 0],
       [0, 2, 0],
       [0, 0, 3]])

>>> b = numpy.zeros(5)
>>> print(b)
[ 0.  0.  0.  0.  0.]
>>> print b.dtype
float64

>>> c = numpy.ones((3,3))
>>> print c
array([[ 1.,  1.,  1.],
       [ 1.,  1.,  1.],
       [ 1.,  1.,  1.]])

>>> u = eye(2) # unit 2x2 matrix; "eye" represents "I"
>>> print u
array([[ 1.,  0.],
       [ 0.,  1.]])
```

Numpy – array creation and use

```
>>> d = numpy.arange(5) # just like range()
>>> print(d)
[0 1 2 3 4]

>>> d[1] = 9.7
>>> print(d) # arrays keep their type even if elements changed
[0 9 2 3 4]

>>> print(d*0.4) # operations create a new array, with new type
[ 0.  3.6  0.8  1.2  1.6]

>>> d = numpy.arange(5, dtype=float)
>>> print(d)
[ 0.  1.  2.  3.  4.]
```

Numpy – array creation and use

```
# random data
>>> print numpy.random.rand(5,5)
array([[ 0.51531133,  0.74085206,  0.99570623,  0.97064334,  0.5819413 ],
       [ 0.2105685 ,  0.86289893,  0.13404438,  0.77967281,  0.78480563],
       [ 0.62687607,  0.51112285,  0.18374991,  0.2582663 ,  0.58475672],
       [ 0.72768256,  0.08885194,  0.69519174,  0.16049876,  0.34557215],
       [ 0.93724333,  0.17407127,  0.1237831 ,  0.96840203,  0.52790012]])
```

Numpy – Creating arrays

- Чтение из файла

```
sample.txt:
```

```
"Stn", "Datum", "Tg", "qTg", "Tn", "qTn", "Tx", "qTx"
```

```
001, 19010101, -49, 00, -68, 00, -22, 40
```

```
001, 19010102, -21, 00, -36, 30, -13, 30
```

```
001, 19010103, -28, 00, -79, 30, -5, 20
```

```
001, 19010104, -64, 00, -91, 20, -10, 00
```

```
001, 19010105, -59, 00, -84, 30, -18, 00
```

```
001, 19010106, -99, 00, -115, 30, -78, 30
```

```
001, 19010107, -91, 00, -122, 00, -66, 00
```

```
001, 19010108, -49, 00, -94, 00, -6, 00
```

```
001, 19010109, 11, 00, -27, 40, 42, 00
```

```
...
```

```
>>> data = numpy.genfromtxt('sample.txt', delimiter=',', skip_header=1)
```

```
>>> print data.shape
```

```
(25568, 8)
```

Numpy – Creating arrays

- Сохранение в файл

```
>>> numpy.savetxt('datasaved.txt', data)
```

```
datasaved.txt:
```

```
1.0000000000000000e+00 1.9010101000000000e+07 -4.9000000000000000e+01  
0.0000000000000000e+00 -6.8000000000000000e+01 0.0000000000000000e+00  
-2.2000000000000000e+01 4.0000000000000000e+01  
1.0000000000000000e+00 1.9010102000000000e+07 -2.1000000000000000e+01  
0.0000000000000000e+00 -3.6000000000000000e+01 3.0000000000000000e+01  
-1.3000000000000000e+01 3.0000000000000000e+01  
1.0000000000000000e+00 1.9010103000000000e+07 -2.8000000000000000e+01  
0.0000000000000000e+00 -7.9000000000000000e+01 3.0000000000000000e+01  
-5.0000000000000000e+00 2.0000000000000000e+01
```

Numpy – Creating arrays

```
>>> M = numpy.random.rand(3,3)
>>> print M
array([[ 0.84188778,  0.70928643,  0.87321035],
       [ 0.81885553,  0.92208501,  0.873464  ],
       [ 0.27111984,  0.82213106,  0.55987325]])
>>>
>>> numpy.save('saved-matrix.npy', M) # сохраняет в бинарном формате
>>>
>>> print numpy.load('saved-matrix.npy')
array([[ 0.84188778,  0.70928643,  0.87321035],
       [ 0.81885553,  0.92208501,  0.873464  ],
       [ 0.27111984,  0.82213106,  0.55987325]])
```

Numpy – array methods

```
>>> print arr.sum()
145
>>> print arr.mean()
14.5
>>> print arr.std()
2.8722813232690143
>>> print arr.max()
19
>>> print arr.min()
10
```


Numpy – array methods - sorting

```
>>> arr = numpy.array([4.5, 2.3, 6.7, 1.2, 1.8, 5.5])
>>> arr.sort() # acts on array itself
>>> print(arr)
[ 1.2  1.8  2.3  4.5  5.5  6.7]

>>> x = numpy.array([4.5, 2.3, 6.7, 1.2, 1.8, 5.5])
>>> y = numpy.sort(x)
>>> print(y)
[ 1.2  1.8  2.3  4.5  5.5  6.7]
>>> print(x)
[ 4.5  2.3  6.7  1.2  1.8  5.5]
```

Numpy – array functions

```
>>> print arr.sum()
45
>>> print numpy.sum(arr)
45
```

```
>>> x = numpy.array([[1,2],[3,4]])
>>> print x
[[1 2]
 [3 4]]
>>> print numpy.log10(x)
[[ 0.          0.30103   ]
 [ 0.47712125  0.60205999]]
```

Numpy – array operations

```
>>> a = numpy.array([[1.0, 2.0], [4.0, 3.0]])
>>> print a
[[ 1.  2.]
 [ 3.  4.]]

>>> print a.transpose()
array([[ 1.,  3.],
       [ 2.,  4.]])

>>> print numpy.inv(a)
array([[ -2. ,  1. ],
       [ 1.5, -0.5]])

>>> j = numpy.array([[0.0, -1.0], [1.0, 0.0]])
>>> print j
array([[0., -1.],
       [1., 0.]])
>>> print j*j # element product
array([[0., 1.],
       [1., 0.]])
>>> print numpy.dot(j, j) # matrix product
array([[ -1.,  0.],
       [ 0., -1.]])
```

Numpy – arrays, matrices

В NumPy есть специальный тип `matrix` для работы с матрицами. Матрицы могут быть созданы вызовом `matrix()` или `mat()` или преобразованы из двумерных массивов методом `asmatrix()`.

```
>>> import numpy
>>> m = numpy.mat([[1,2],[3,4]])

>>> a = numpy.array([[1,2],[3,4]])
>>> m = numpy.mat(a)

>>> a = numpy.array([[1,2],[3,4]])
>>> m = numpy.asmatrix(a)
```

Numpy – matrices

```
>>> a = numpy.array([[1,2],[3,4]])
>>> m = numpy.mat(a) # convert 2-d array to matrix

>>> print a[0]          # result is 1-dimensional
array([1, 2])
>>> print m[0]         # result is 2-dimensional
matrix([[1, 2]])

>>> print a*a          # element-by-element multiplication
array([[ 1, 4], [ 9, 16]])
>>> print m*m          # (algebraic) matrix multiplication
matrix([[ 7, 10], [15, 22]])

>>> print a**3         # element-wise power
array([[ 1, 8], [27, 64]])
>>> print m**3         # matrix multiplication m*m*m
matrix([[ 37, 54], [ 81, 118]])

>>> print m.T          # transpose of the matrix
matrix([[1, 3], [2, 4]])
>>> print m.H          # conjugate transpose (differs from .T for complex matrices)
matrix([[1, 3], [2, 4]])
>>> print m.I          # inverse matrix
matrix([[ -2. , 1. ], [ 1.5, -0.5]])
```

Numpy – Fourier

```
>>> a = linspace(0,1,11)
>>> print a
[ 0.   0.1  0.2  0.3  0.4  0.5  0.6  0.7  0.8  0.9  1. ]

>>> from numpy.fft import fft, ifft
>>> b = fft(a)
>>> print b
[ 5.50+0.j          -0.55+1.87312798j -0.55+0.85581671j -0.55+0.47657771j
 -0.55+0.25117658j -0.55+0.07907806j -0.55-0.07907806j -0.55-0.25117658j
 -0.55-0.47657771j -0.55-0.85581671j -0.55-1.87312798j]

>>> print(ifft(b))
[ 1.61486985e-15+0.j    1.00000000e-01+0.j    2.00000000e-01+0.j
 3.00000000e-01+0.j    4.00000000e-01+0.j    5.00000000e-01+0.j
 6.00000000e-01+0.j    7.00000000e-01+0.j    8.00000000e-01+0.j
 9.00000000e-01+0.j    1.00000000e+00+0.j]
```

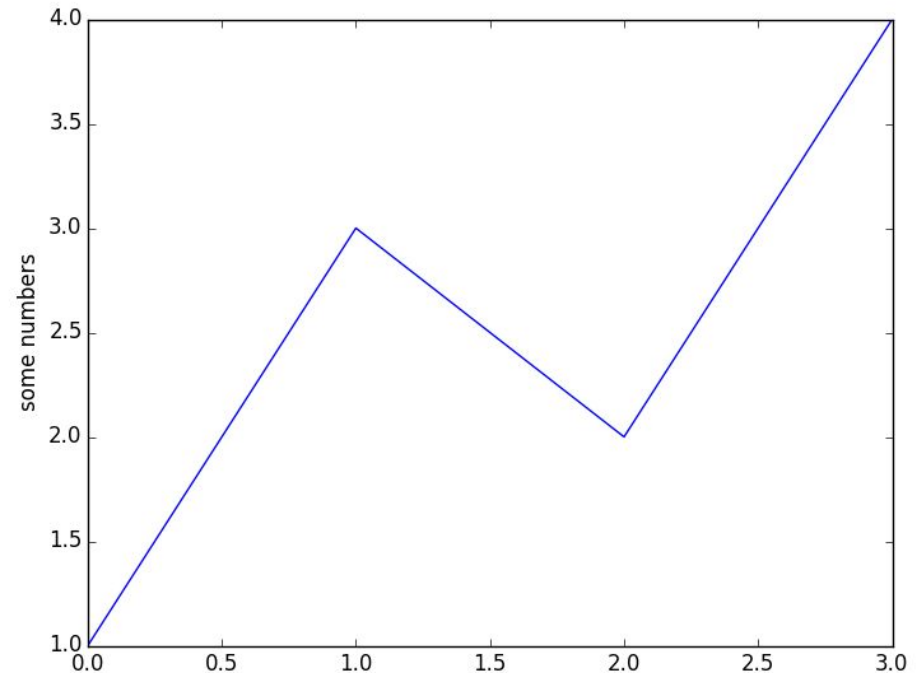
Plotting - matplotlib



```
>>> import matplotlib.pyplot as plt
```

Matplotlib.pyplot basic example

```
import matplotlib.pyplot as plt
plt.plot([1,3,2,4])
plt.ylabel('some numbers')
plt.show()
```

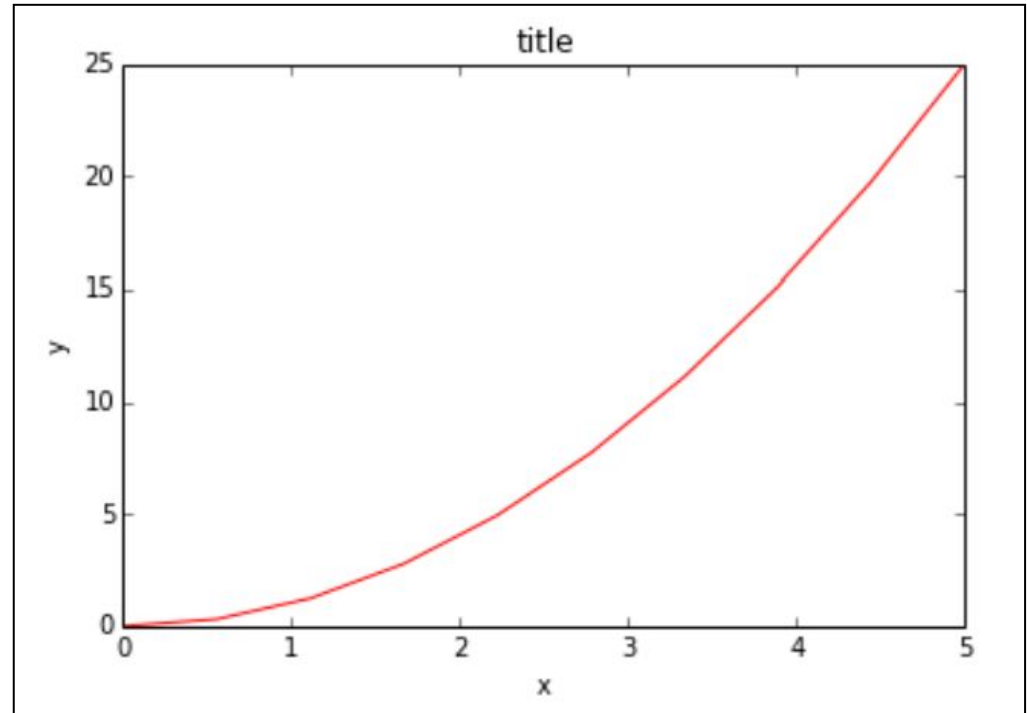


Matplotlib.pyplot basic example

```
import numpy
import matplotlib.pyplot as plt

x = numpy.linspace(0, 5, 10)
y = x ** 2

plt.plot(x, y, 'r')
plt.xlabel('x')
plt.ylabel('y')
plt.title('title')
plt.show()
```



character	description
'-'	solid line style
'--'	dashed line style
'-.'	dash-dot line style
':'	dotted line style
'.'	point marker
','	pixel marker
'o'	circle marker
'v'	triangle_down marker
'^'	triangle_up marker
'<'	triangle_left marker
'>'	triangle_right marker
'1'	tri_down marker
'2'	tri_up marker
'3'	tri_left marker
'4'	tri_right marker
's'	square marker
'p'	pentagon marker
'*'	star marker
'h'	hexagon1 marker
'H'	hexagon2 marker
'+'	plus marker
'x'	x marker
'D'	diamond marker
'd'	thin_diamond marker
' '	vline marker
'_'	hline marker

character	color
'b'	blue
'g'	green
'r'	red
'c'	cyan
'm'	magenta
'y'	yellow
'k'	black
'w'	white

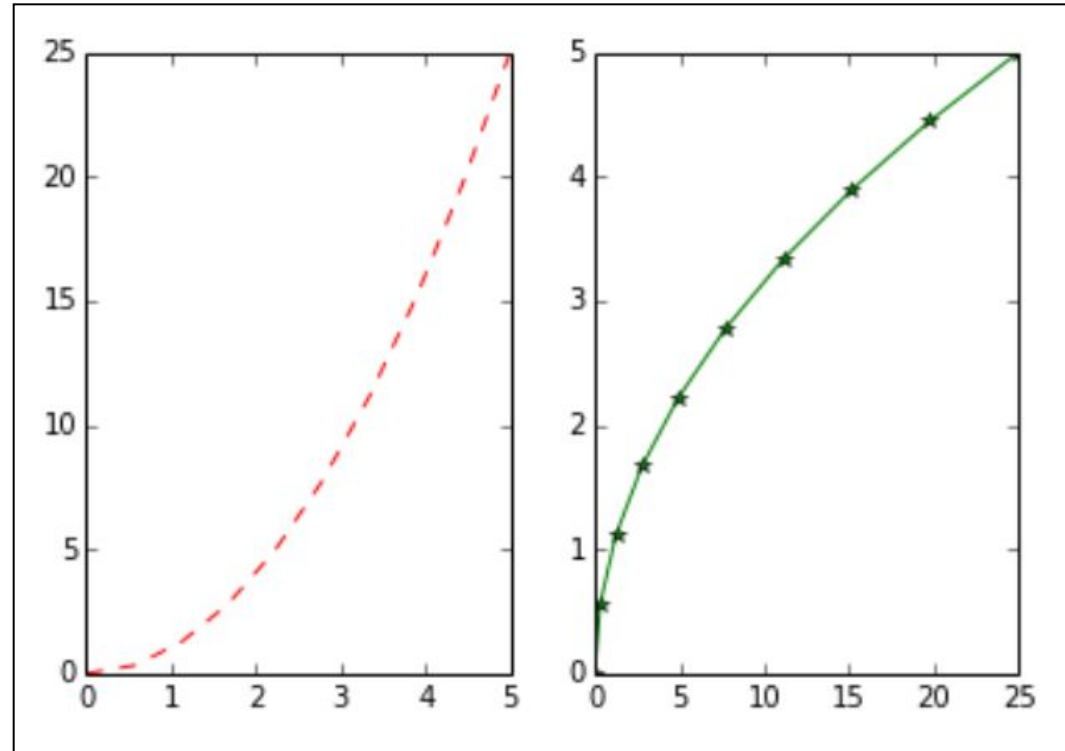
Matplotlib.pyplot basic example

```
x = numpy.linspace(0, 5, 10)
y = x ** 2

plt.subplot(1,2,1)
plt.plot(x, y, 'r--')

plt.subplot(1,2,2)
plt.plot(y, x, 'g*-')

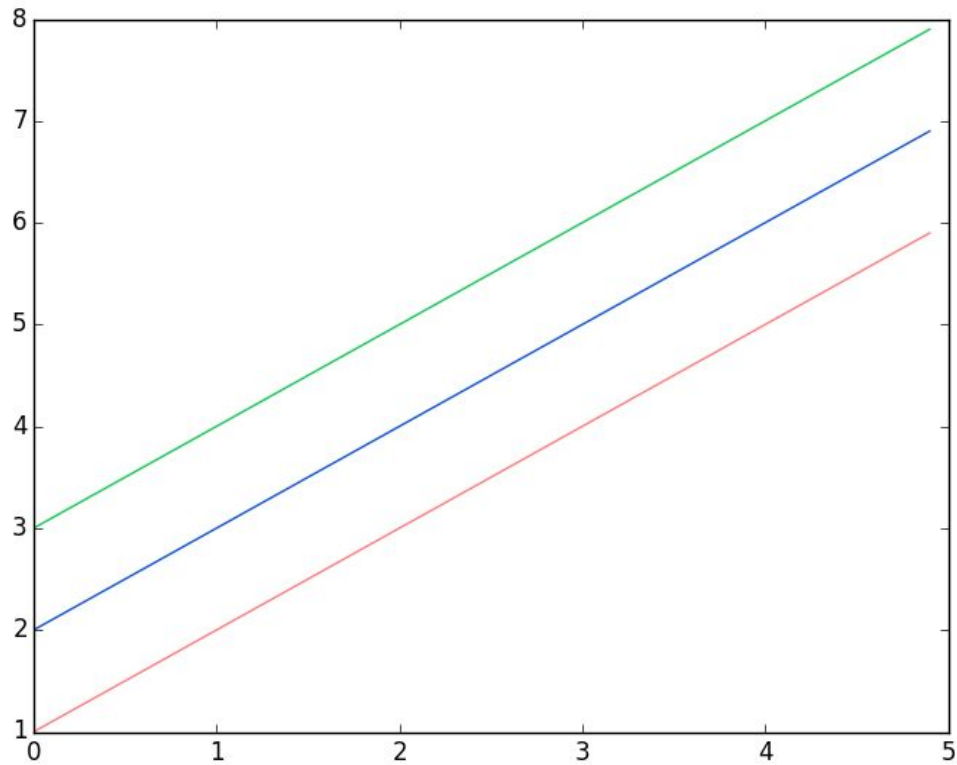
plt.show()
```



```
x = numpy.linspace(0, 5, 2)

plt.plot(x, x+1, color="red", alpha=0.5) # half-transparent red
plt.plot(x, x+2, color="#1155dd") # RGB hex code for a bluish color
plt.plot(x, x+3, color="#15cc55") # RGB hex code for a greenish color

plt.show()
```



```
plt.plot(x, x+1, color="blue", linewidth=0.25)
plt.plot(x, x+2, color="blue", linewidth=0.50)
plt.plot(x, x+3, color="blue", linewidth=1.00)
plt.plot(x, x+4, color="blue", linewidth=2.00)
```

```
# possible linestyle options '- ', '{', '-.', ':', 'steps'
```

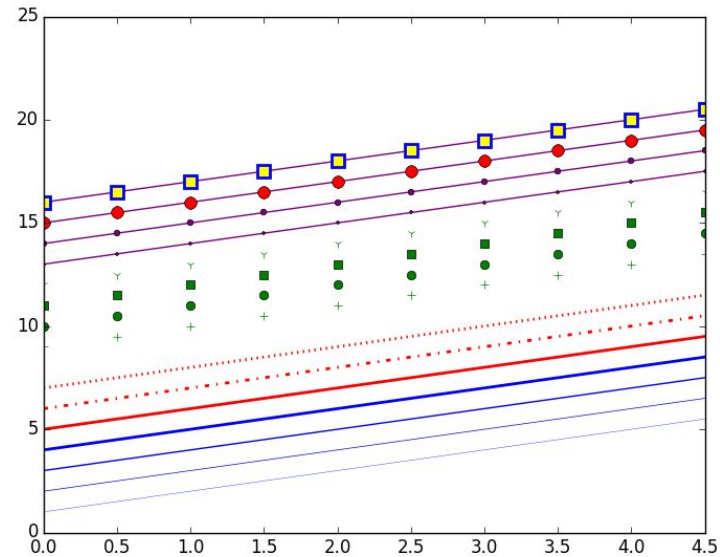
```
plt.plot(x, x+5, color="red", lw=2, linestyle='- -')
plt.plot(x, x+6, color="red", lw=2, ls='- .')
plt.plot(x, x+7, color="red", lw=2, ls=':')
```

```
# possible marker symbols: marker = '+', 'o', '*', 's', ',', '.', '1', '2', '3', '4', ...
```

```
plt.plot(x, x+ 9, color="green", lw=2, ls='*', marker='+')
plt.plot(x, x+10, color="green", lw=2, ls='*', marker='o')
plt.plot(x, x+11, color="green", lw=2, ls='*', marker='s')
plt.plot(x, x+12, color="green", lw=2, ls='*', marker='1')
```

```
# marker size and color
```

```
plt.plot(x, x+13, color="purple", lw=1, ls='- -', marker='o', markersize=2)
plt.plot(x, x+14, color="purple", lw=1, ls='- -', marker='o', markersize=4)
plt.plot(x, x+15, color="purple", lw=1, ls='- -', marker='o', markersize=8,
markerfacecolor="red")
plt.plot(x, x+16, color="purple", lw=1, ls='- -', marker='s', markersize=8,
markerfacecolor="yellow", markeredgewidth=2, markeredgcolor="blue")
```



Matplotlib.pyplot example

```
import numpy as np
import matplotlib.pyplot as plt

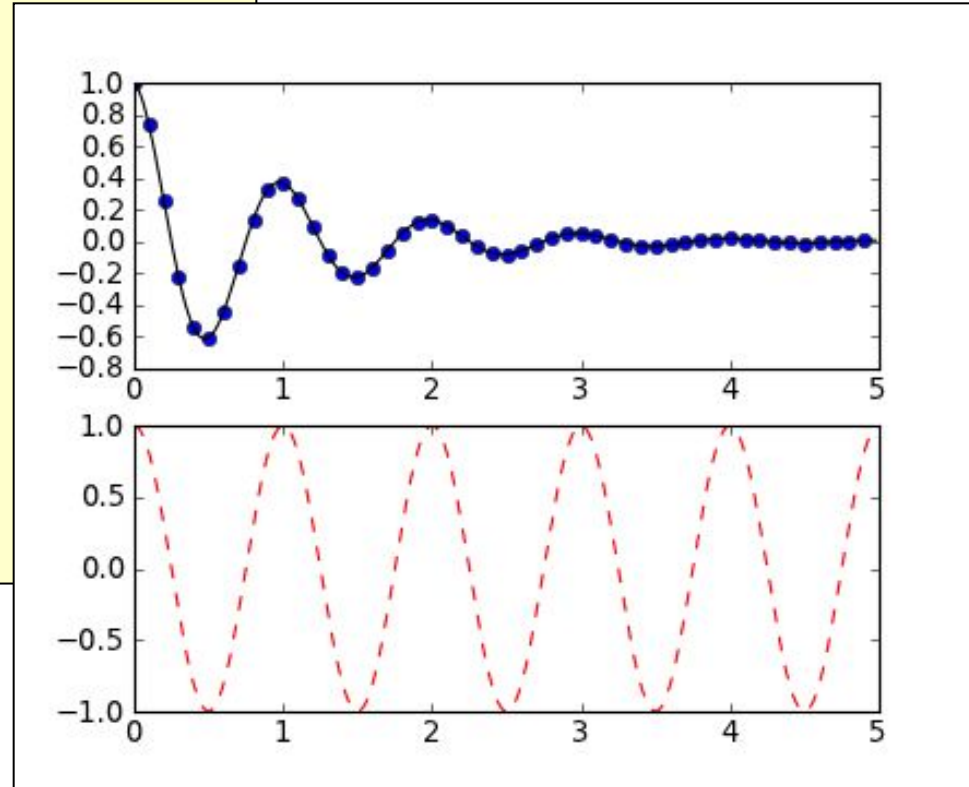
def f(t):
    return np.exp(-t) * np.cos(2*np.pi*t)

t1 = np.arange(0.0, 5.0, 0.1)
t2 = np.arange(0.0, 5.0, 0.02)

plt.subplot(211)
plt.plot(t1, f(t1), 'bo', t2, f(t2), 'k')

plt.subplot(212)
plt.plot(t2, np.cos(2*np.pi*t2), 'r--')

plt.show()
```



Matplotlib.pyplot basic example

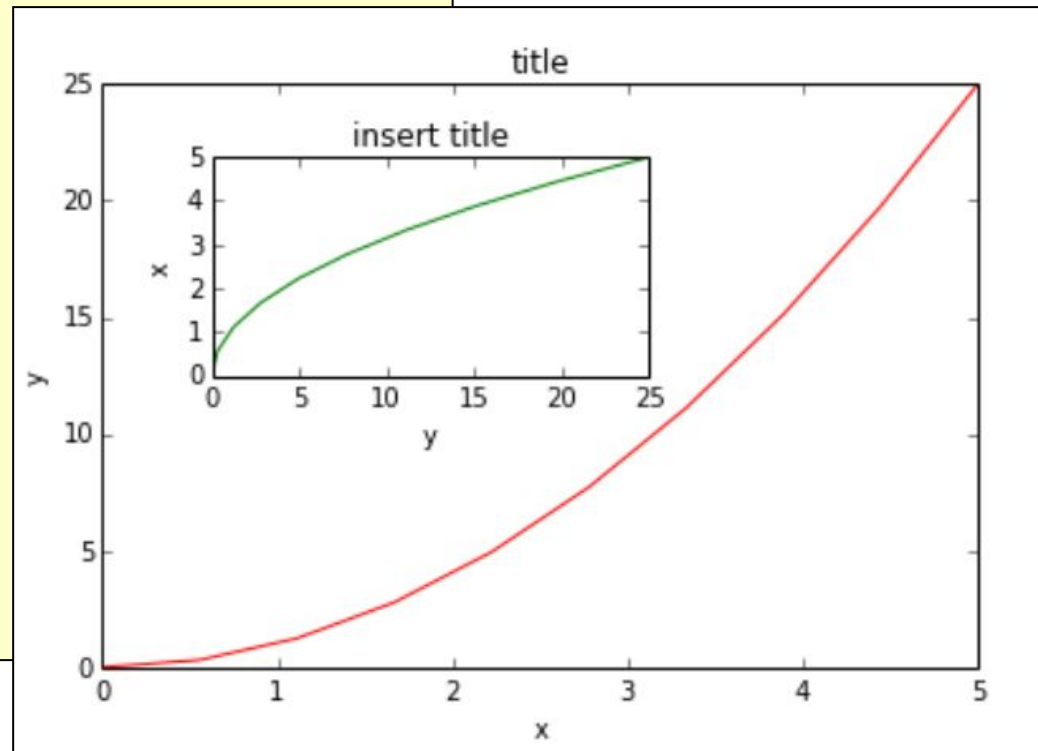
```
fig = plt.figure()

axes1 = fig.add_axes([0.1, 0.1, 0.8, 0.8]) # main axes
axes2 = fig.add_axes([0.2, 0.5, 0.4, 0.3]) # inset axes

x = numpy.linspace(0, 5, 10)
y = x ** 2

# main figure
axes1.plot(x, y, 'r')
axes1.set_xlabel('x')
axes1.set_ylabel('y')
axes1.set_title('title')

# insert
axes2.plot(y, x, 'g')
axes2.set_xlabel('y')
axes2.set_ylabel('x')
axes2.set_title('insert title');
```



Matplotlib.pyplot basic example

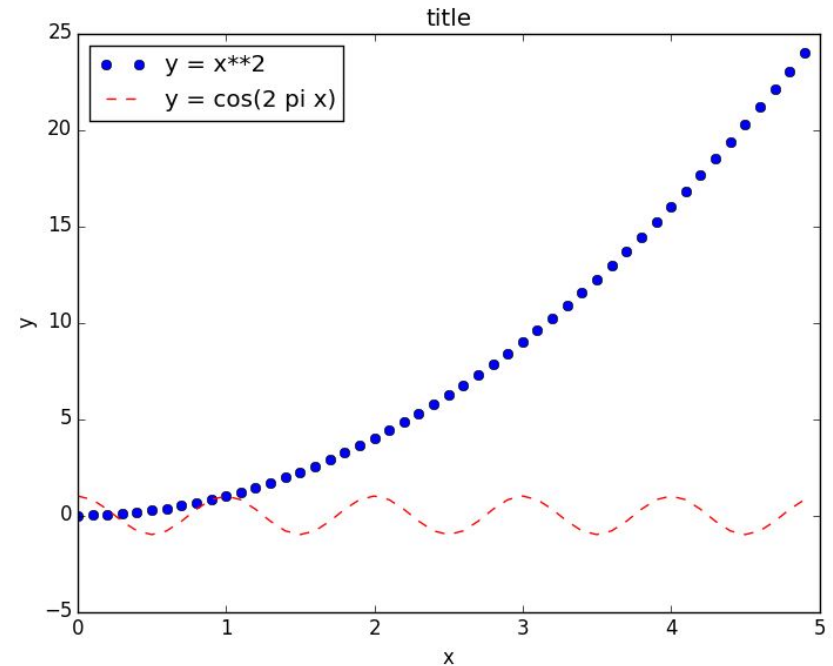
Labels and legends and titles

```
import numpy as np
import matplotlib.pyplot as plt

x = np.arange(0.0, 5.0, 0.1)

plt.plot(x, x**2, 'bo', label='y = x**2')
plt.plot(x, np.cos(2*np.pi*x), 'r--',
label='y = cos(2 pi x)')
plt.legend(loc=0)
plt.xlabel('x')
plt.ylabel('y')
plt.title('title')

plt.show()
```



```
plt.legend(loc=0) # let matplotlib decide
plt.legend(loc=1) # upper right corner
plt.legend(loc=2) # upper left corner
plt.legend(loc=3) # lower left corner
plt.legend(loc=4) # lower right corner
```

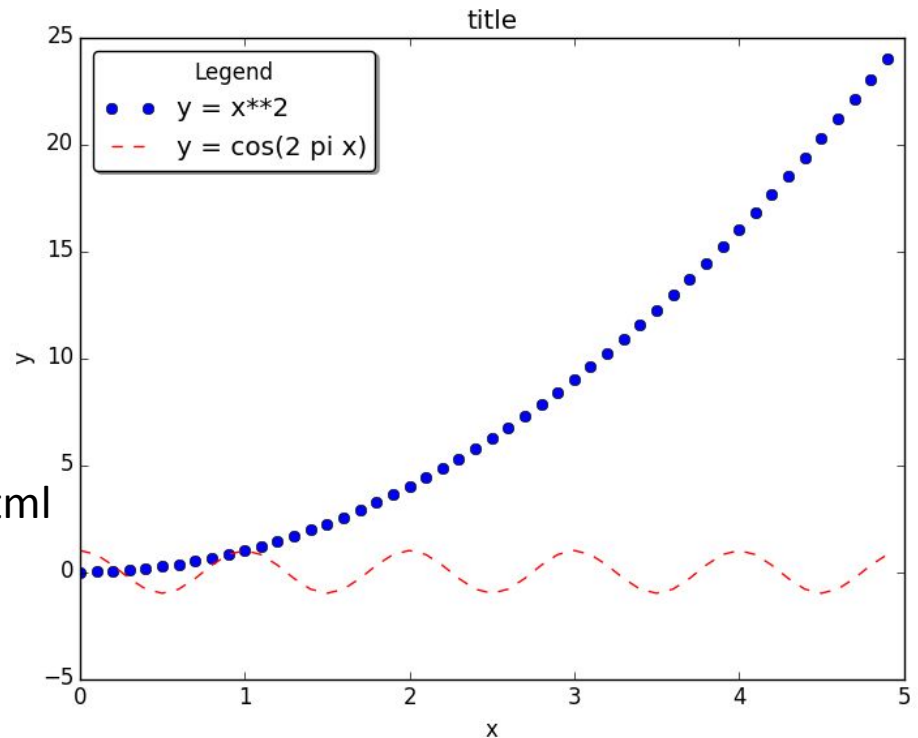


```
import numpy as np
import matplotlib.pyplot as plt

x = np.arange(0.0, 5.0, 0.1)

plt.plot(x, x**2, 'bo', label='y = x**2')
plt.plot(x, np.cos(2*np.pi*x), 'r--', label='y = cos(2 pi x)')
plt.legend(loc=0, fancybox=True, shadow=True, title='Legend')
plt.xlabel('x')
plt.ylabel('y')
plt.title('title')

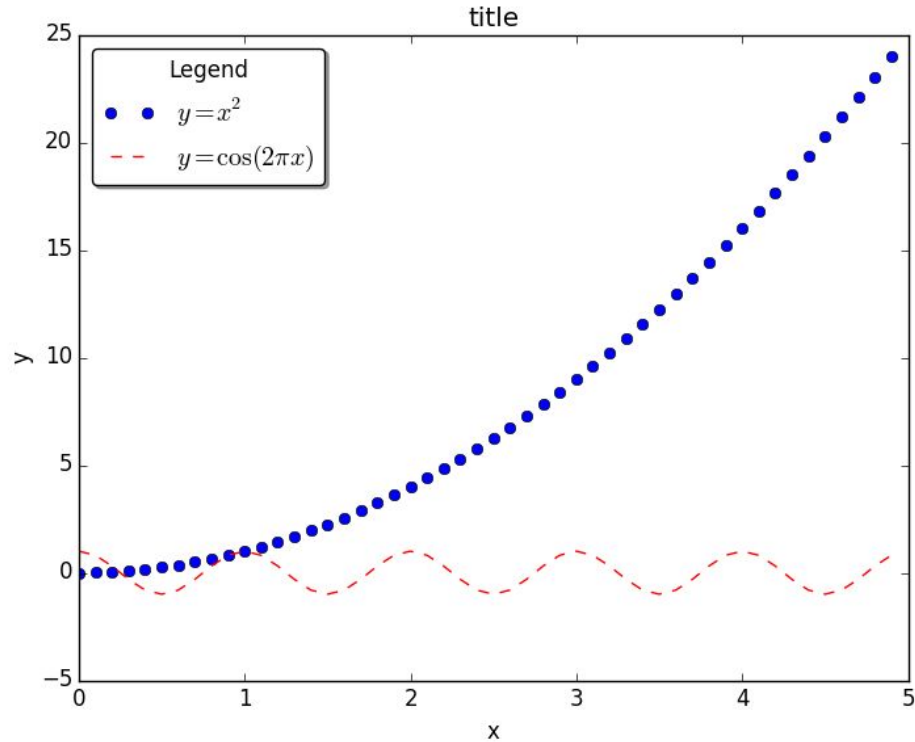
plt.show()
```



http://matplotlib.org/api/pyplot_api.html
#matplotlib.pyplot.legend

Matplotlib.pyplot basic example

```
plt.plot(x, x**2, 'bo', label='$y = x^2$')  
plt.plot(x, np.cos(2*np.pi*x), 'r--', label='$y = \cos(2 \pi x)$')  
#plt.plot(x, np.cos(2*np.pi*x), 'r--', label=r'$y = \cos(2 \pi x)$')
```



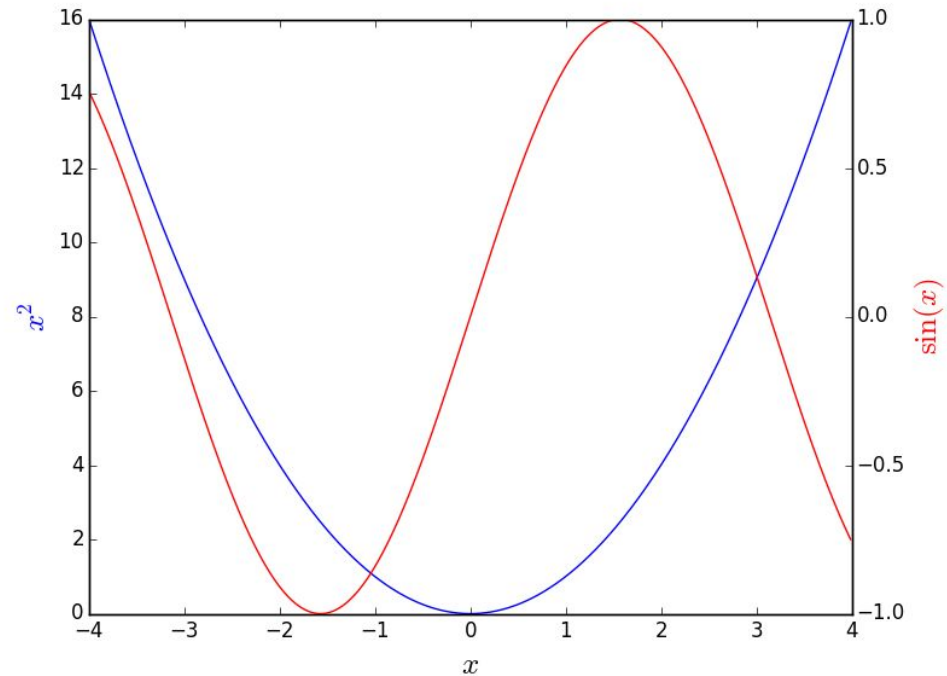
Matplotlib.pyplot basic example

```
x = np.arange(-4.0, 4.0, 0.01)

plt.plot(x, x**2, color='blue')
plt.xlabel('$x$', fontsize=18)
plt.ylabel('$x^2$', color='blue', fontsize=18)

ax2 = plt.twinx()
ax2.plot(x, np.sin(x), color='red')
ax2.set_ylabel('$\sin(x)$', color='red', fontsize=18)

plt.show()
```



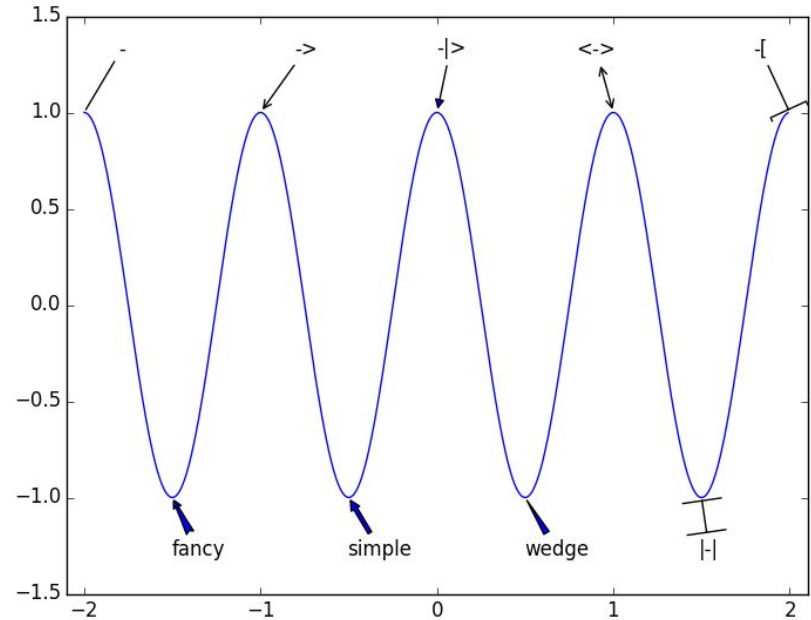
Overwhelming annotation

```
x = np.arange(-2.0, 2.0, 0.01)
plt.plot(x, np.cos(2*np.pi*x))
plt.xlim(-2.1, 2.1)
plt.ylim(-1.5, 1.5)
```

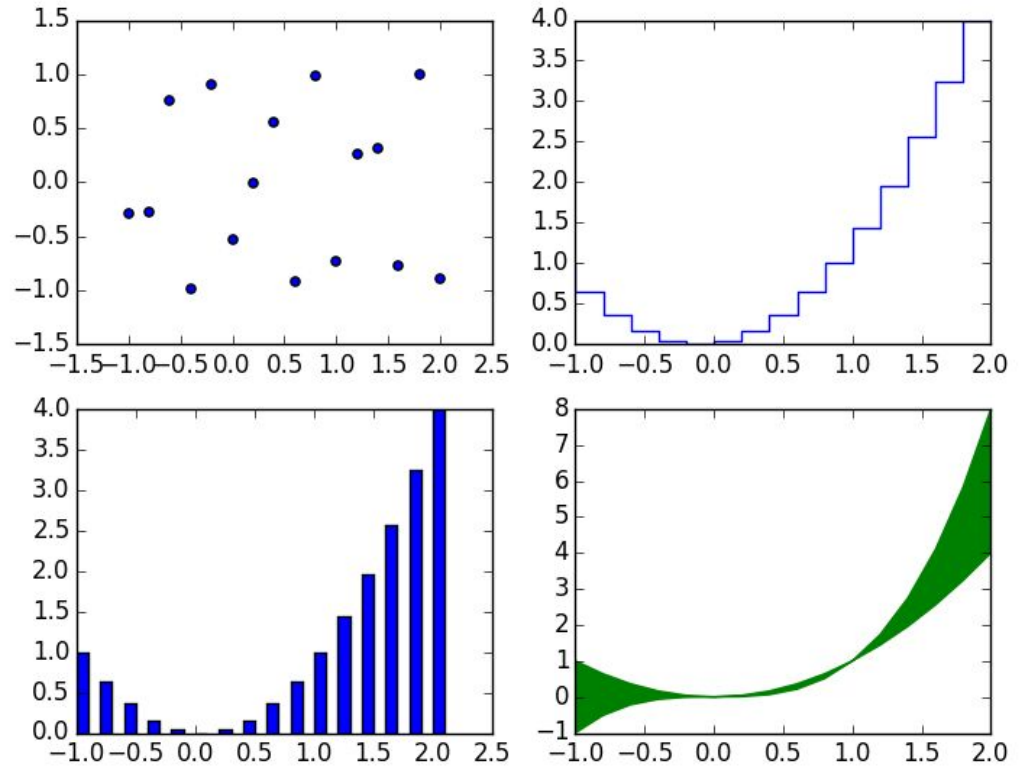
```
plt.annotate('-', xy=(-2,1), xytext=(-1.8,1.3), arrowprops=dict(arrowstyle='-'))
plt.annotate('->', xy=(-1,1), xytext=(-0.8,1.3), arrowprops=dict(arrowstyle='->'))
plt.annotate('-|>', xy=(0,1), xytext=(0,1.3), arrowprops=dict(arrowstyle='-|>'))
plt.annotate('<->', xy=(1,1), xytext=(0.8,1.3), arrowprops=dict(arrowstyle='<->'))
plt.annotate('-|', xy=(2,1), xytext=(1.8,1.3), arrowprops=dict(arrowstyle='-|'))
```

```
plt.annotate('fancy', xy=(-1.5,-1), xytext=(-1.5,-1.3), arrowprops=dict(arrowstyle='fancy'))
plt.annotate('simple', xy=(-0.5,-1), xytext=(-0.5,-1.3), arrowprops=dict(arrowstyle='simple'))
plt.annotate('wedge', xy=(0.5,-1), xytext=(0.5,-1.3), arrowprops=dict(arrowstyle='wedge'))
plt.annotate('|-|', xy=(1.5,-1), xytext=(1.5,-1.3), arrowprops=dict(arrowstyle='|-|'))
```

```
plt.show()
```



Matplotlib.pyplot basic example



```
x = np.linspace(-1.0, 2.0, 16)

plt.subplot(221)
plt.scatter(x, np.sin(50 * x + 12))

plt.subplot(222)
plt.step(x, x**2)

plt.subplot(223)
plt.bar(x, x**2, width=0.1)

plt.subplot(224)
plt.fill_between(x, x**2, x**3, color='green')

plt.show()
```

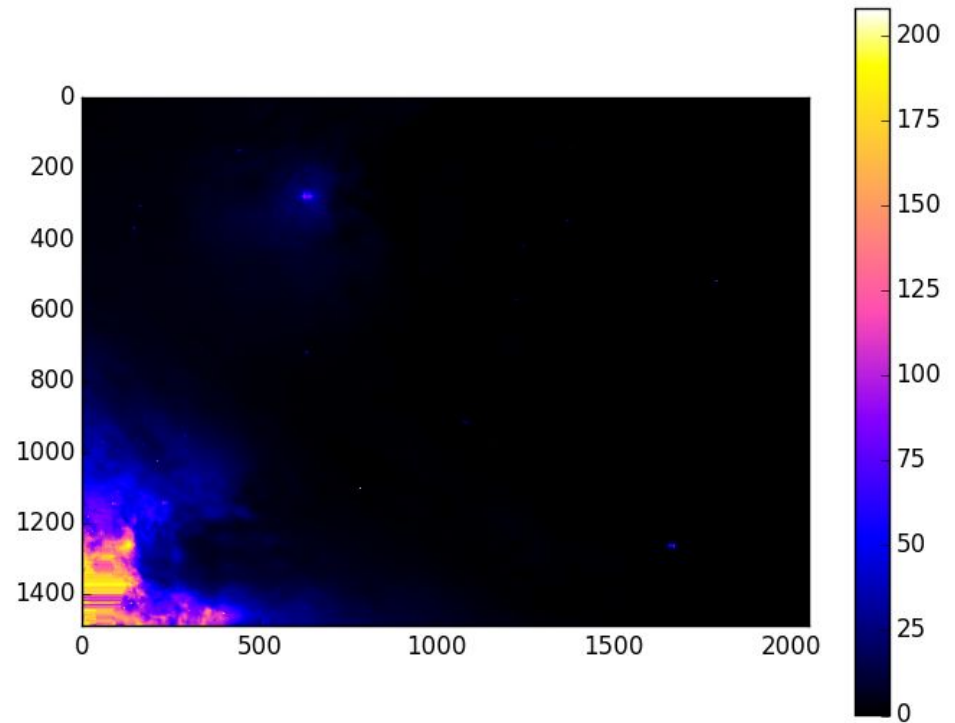
Matplotlib.pyplot basic example

```
import matplotlib.pyplot as plt
import pyfits

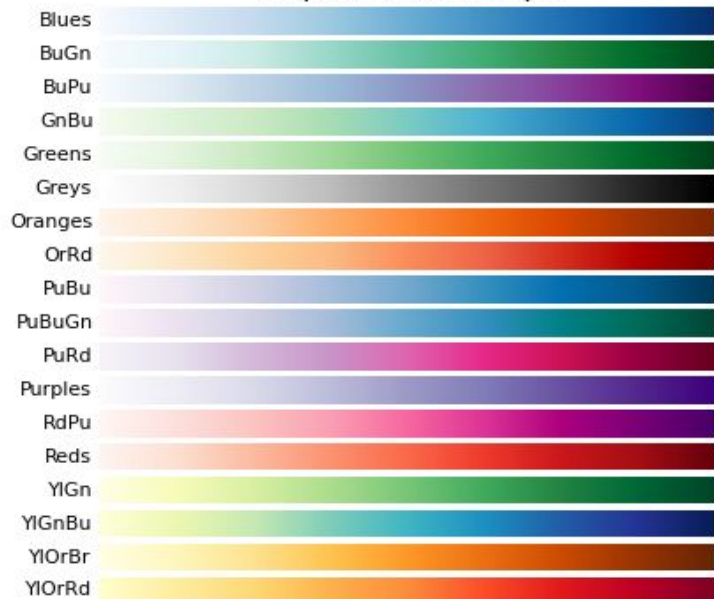
data = pyfits.getdata('frame-g-006073-4-0063.fits')

plt.imshow(data, cmap='gnuplot2')
plt.colorbar()

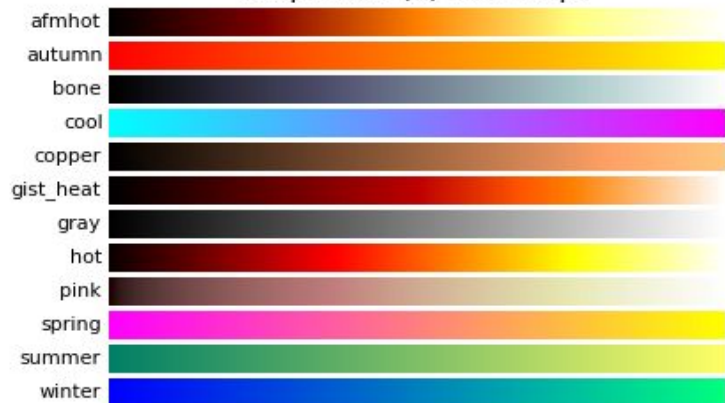
plt.show()
```



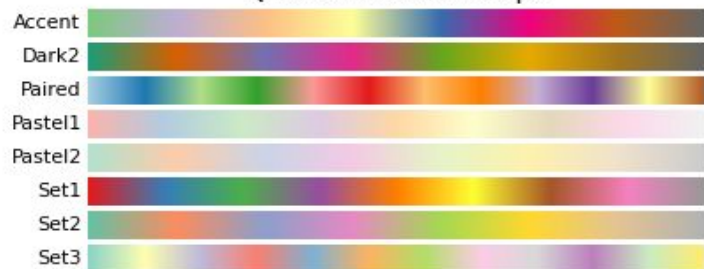
Sequential colormaps



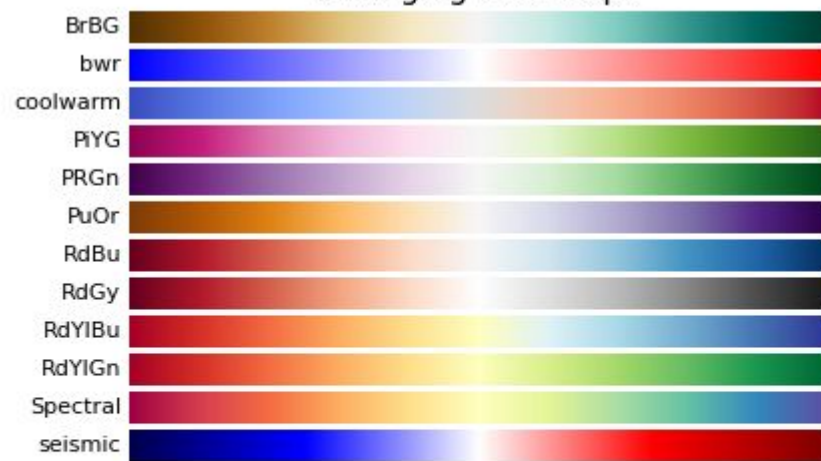
Sequential (2) colormaps



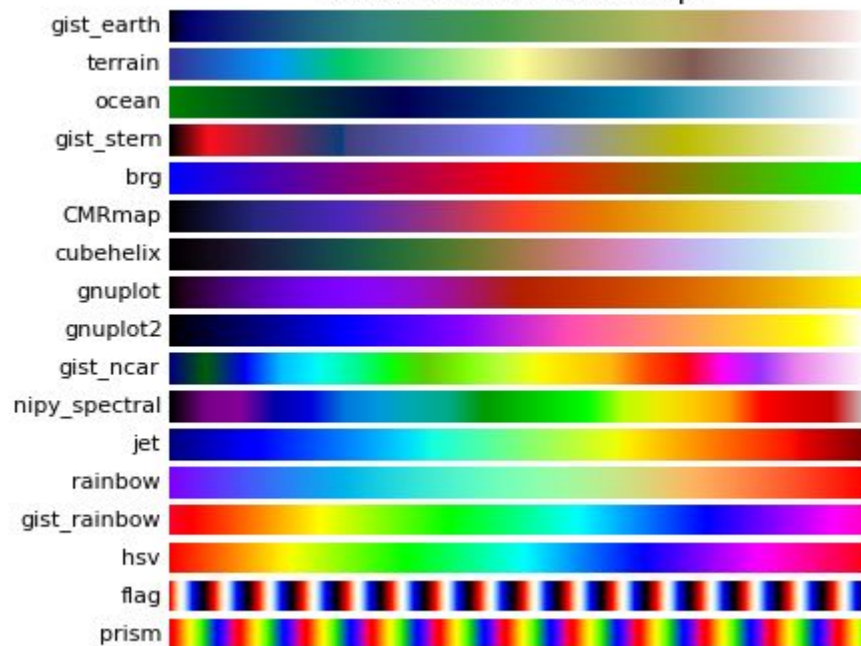
Qualitative colormaps



Diverging colormaps



Miscellaneous colormaps



```
# plt.show()

plt.savefig('filename', orientation='landscape', format='eps')

# orientation='portrait'
#           'landscape'

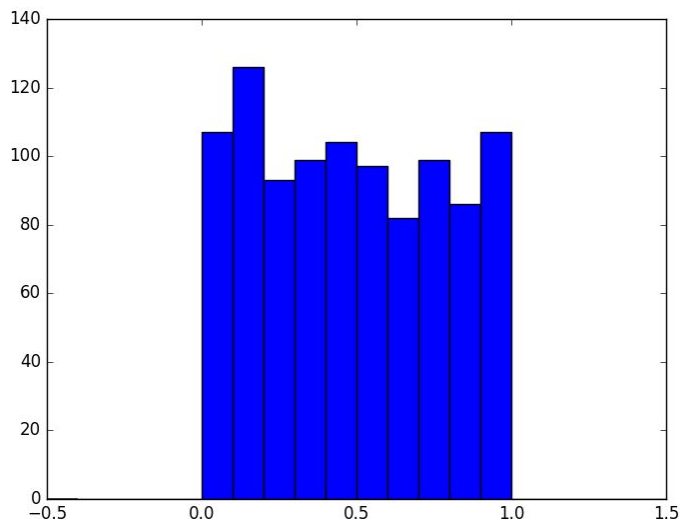
# format='png' (по умолчанию)
#           'pdf'
#           'eps'
#           'ps'
#           'jpeg'
#           'svg'
```


Пакет SciPy

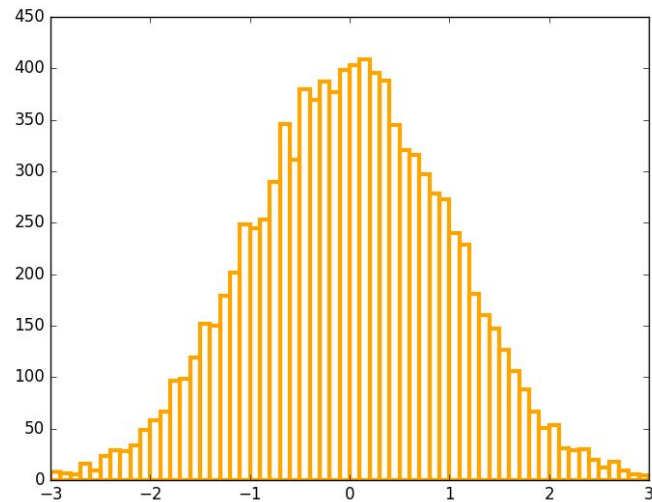
Генерация и визуализация случайных последовательностей

- Субмодуль `numpy.random` включает векторные версии нескольких различных генераторов случайных чисел.

```
>>> from numpy.random import *
>>> import matplotlib.pyplot as plt
>>> x=rand(1000)
>>> bins=linspace(-0.5,1.5,21)
>>> plt.hist(x,bins)
>>> plt.xlim(-0.5,1.5)
>>> plt.savefig('plot1.png')
>>> plt.show()
```



```
>>> from numpy.random import *
>>> import matplotlib.pyplot as plt
>>> x=randn(10000)
>>> bins=linspace(-3,3,61)
>>> plt.hist(x,bins,fill=0,lw=2,ec='orange')
>>> plt.xlim(-3,3)
>>> plt.savefig('plot2')
>>> plt.show()
```



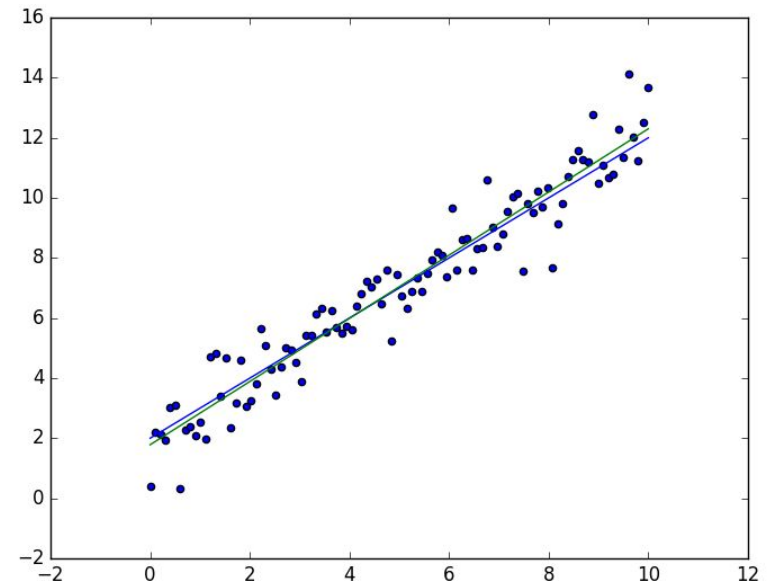
Data Modeling and Fitting

- `curve_fit` – метод, позволяющий аппроксимировать набор точек некоторой функциональной зависимостью, основанный на минимизации невязки

```
>>> import numpy as np
>>> from scipy.optimize import curve_fit
>>> import matplotlib.pyplot as plt

>>> def func(x, a, b):
>>>     return a * x + b
>>> x = np.linspace(0, 10, 100)
>>> y = func(x, 1, 2)
>>> yn = y + 0.9 * np.random.normal(size=len(x))
>>> abopt, abcov = curve_fit(func, x, yn)
>>> print abopt
>>> print abcov
```

```
[ 1.05170285  1.78315256]
[[ 0.00085998 -0.0042999 ]
 [-0.0042999  0.02881076]]
```



Data Modeling and Fitting

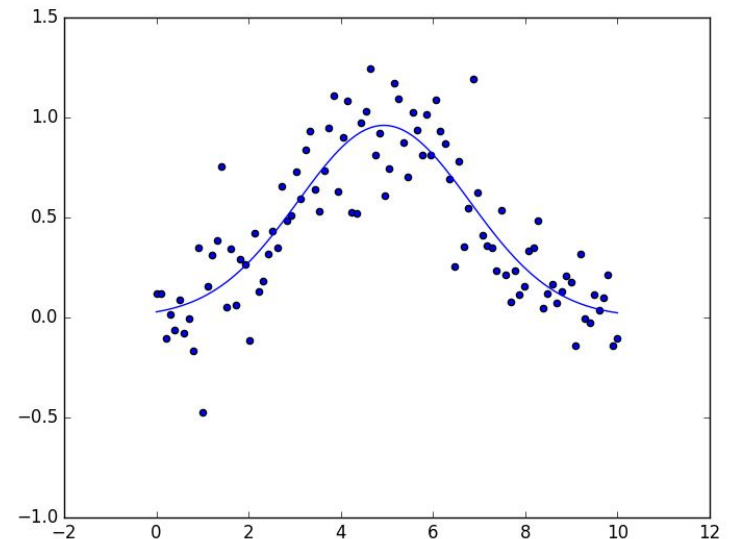
- `curve_fit` – метод, позволяющий аппроксимировать набор точек некоторой функциональной зависимостью, основанный на минимизации невязки

```
>>> import numpy as np
>>> from scipy.optimize import curve_fit
>>> import matplotlib.pyplot as plt

>>> def func(x, a, b, c):
>>>     return a*np.exp(-(x-b)**2/(2*c**2))
>>> x = np.linspace(0, 10, 100)
>>> y = func(x, 1, 5, 2)
>>> yn = y + 0.2 * np.random.normal(size=len(x))
>>> abopt, abcov = curve_fit(func, x, yn)
>>> print abopt
>>> print abcov

[ 0.96080062  4.93407373 -1.85655036]
[[ 1.83508136e-03  1.88545100e-06  2.38610451e-03]
 [ 1.88545100e-06  9.11757267e-03  8.51863087e-06]
 [ 2.38610451e-03  8.51863087e-06  9.23829956e-03]]
```

$$a * \exp\left(\frac{-(x - \mu)^2}{2\sigma^2}\right)$$



- функция **fsolve** – решение уравнений

fsolve (<функция>, <стартовая точка>)

```
>>> import numpy as np
>>> from scipy.optimize import fsolve
>>> x=fsolve(lambda x:np.sin(x)-x/10,np.pi/2)
>>> print x
>>> # Проверка
>>> print np.sin(x)-x/10
[ 2.85234189]
[ -1.11022302e-16]
```

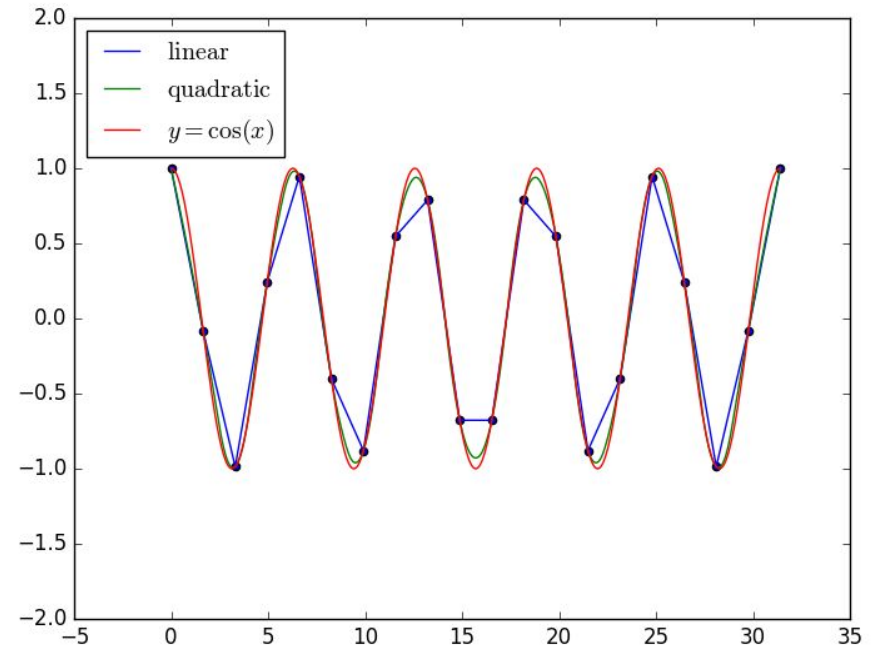
Interpolation

```
>>> import matplotlib.pyplot as plt
>>> import numpy as np
>>> from scipy.interpolate import interp1d

>>> x = np.linspace(0, 10 * np.pi, 20)
>>> y = np.cos(x)
>>> fl = interp1d(x, y, kind='linear')
>>> fq = interp1d(x, y, kind='quadratic')

>>> xint = np.linspace(x.min(), x.max(), 1000)
>>> yintl = fl(xint)
>>> yintq = fq(xint)

>>> plt.scatter(x,y)
>>> plt.plot(xint,yintl,label='$\\rm linear$')
>>> plt.plot(xint,yintq, label='$\\rm quadratic$')
>>> plt.plot(xint,np.cos(xint),label='$y = \\cos(x)$')
>>> plt.legend(loc=2)
>>> plt.ylim(-2,2)
>>> plt.savefig('plot5.png')
>>> plt.show()
```



Интегрирование

Субмодуль `scipy.integrate` обеспечивает стандартные методы численного интегрирования.

```
>>> from scipy.integrate import *  
  
[<интеграл>, <ошибка>] = quad(f(x), xmin, xmax)  
inf изображает бесконечный предел интегрирования
```

```
>>> import numpy as np  
>>> from scipy.integrate import *  
>>> f = quad(np.sin, 0, np.pi)  
>>> print f  
(2.0, 2.220446049250313e-14)  
  
>>> def func(x):  
    return np.exp(-x**2)  
>>> f = quad(func, -np.inf, np.inf)  
>>> print f  
(1.7724538509055159, 1.4202636756659625e-08)  
  
>>> f = quad(lambda x: np.exp(-x**2), -np.inf, np.inf)  
>>> print f  
(1.7724538509055159, 1.4202636756659625e-08)
```

Интегрирование

```
>>> import numpy as np
>>> from scipy.integrate import *

>>> x=np.linspace(0,np.pi,10)
>>> f = trapz(np.sin(x),x)
>>> print f
1.97965081122

>>> f = simps(np.sin(x),x)
>>> print f
1.99954873658
```


Решение дифференциальных уравнений

Функция odeint

```
odeint(f(x, t), x0, <вектор t>)
```

В качестве примера рассмотрим систему с сухим трением:

$$\frac{dv}{dt} = -K \operatorname{sign}(v) + F(t),$$

где v – скорость тела, $F(t)$ – внешняя силы и K – коэффициент трения.

Чтобы не использовать разрывную функцию sign , заменим ее арктангенсом:

$$\frac{dv}{dt} = -\frac{2K}{\pi} \arctan(\alpha v) + F(t),$$

где α – большой коэффициент.

Решение дифференциальных уравнений

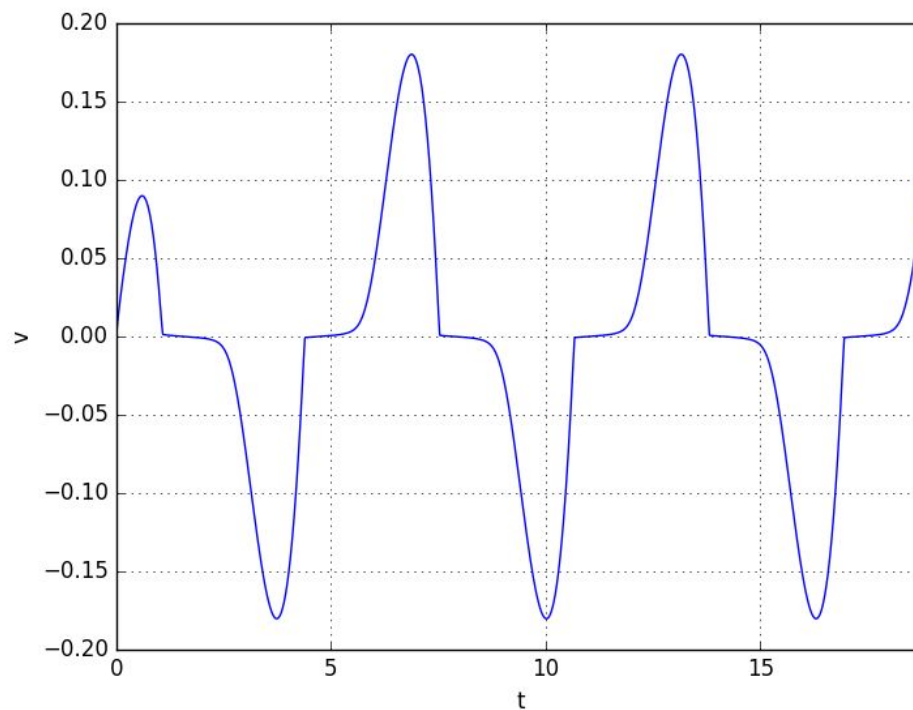
Функция `integrate.odeint`

```
>>> import numpy as np
>>> import matplotlib.pyplot as plt
>>> from scipy.integrate import odeint

>>> t = np.linspace(0, 6*np.pi, 10000)
>>> def f(v, t):
>>>     return -(2/np.pi)*np.arctan(1000*v)+1.2*np.cos(t)

>>> v = odeint(f, 0, t)

>>> plt.plot(t, v)
>>> plt.xlabel('t')
>>> plt.ylabel('v')
>>> plt.xlim(0, 6*np.pi)
>>> plt.grid()
>>> plt.savefig('plot6')
```



Решение дифференциальных уравнений

Функция integrate.odeint

В качестве примера уравнения второго порядка, рассмотрим уравнение движения нелинейного осциллятора:

$$\frac{d^2x}{dt^2} + \omega^2(1 - \xi x^2)x = F \cos(\omega t),$$

где ξ – фактор нелинейности. Разделим уравнение на два первого порядка:

$$\begin{aligned}\frac{dx}{dt} &= v, \\ \frac{dv}{dt} + \omega^2(1 - \xi x^2)x &= F \cos(\omega t),\end{aligned}$$

(v – скорость) и запишем в стандартном виде:

$$\frac{d}{dt} \begin{pmatrix} x \\ v \end{pmatrix} = \begin{pmatrix} v \\ -\omega^2(1 - \xi x^2)x + F \cos(\omega t) \end{pmatrix}.$$

Решение дифференциальных уравнений

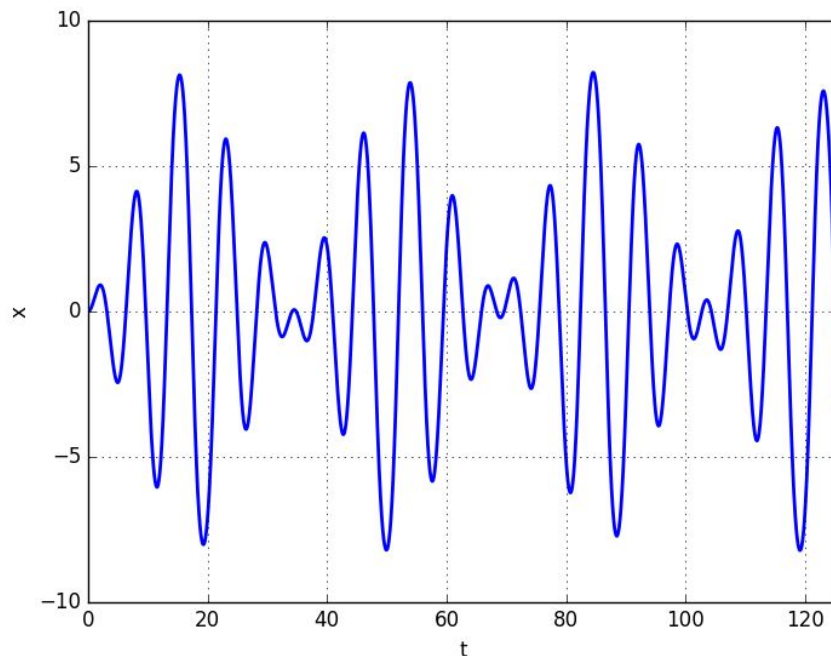
Функция `integrate.odeint`

```
>>> import numpy as np
>>> import matplotlib.pyplot as plt
>>> from scipy.integrate import *

>>> t = np.linspace(0,40*np.pi,10000)
>>> def f(y,t):
>>>     x,v = y
>>>     return [v, -(1-x**2/100)*x+np.cos(t)]

>>> result = odeint(f,[0,0],t)
>>> x = result[:,0]
>>> v = result[:,1]

>>> plt.plot(t,x,lw=2)
>>> plt.xlabel('t')
>>> plt.ylabel('x')
>>> plt.xlim(0,40*np.pi)
>>> plt.grid()
>>> plt.savefig('plot7')
```

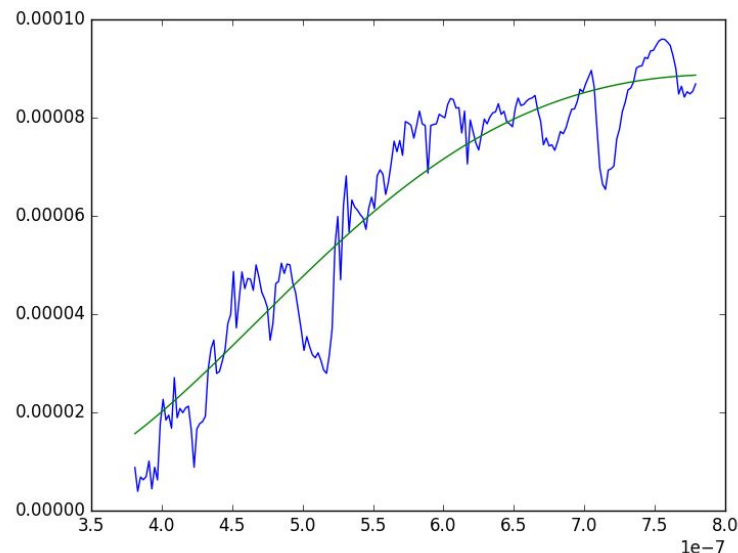


- На языке программирования Python для спектра звезды, полученного при наблюдениях в оптическом диапазоне (spec_star.txt), определить температуру звезды, используя аппроксимацию спектра законом излучения черного тела. Построить исходный спектр и спектр АЧТ для полученных температуры и интенсивности.
- В файле spec_star.txt первая колонка соответствует длине волны [Å] вторая – интенсивности на данной длине волны.

$$B_{\lambda}(T) = \frac{2\pi c^2 h}{\lambda^5 \left(e^{\frac{hc}{\lambda k T}} - 1 \right)} \quad \text{Вт/м}^3 = \text{Дж}/(\text{м}^3 \text{с})$$

Результат:
lgT=3.6

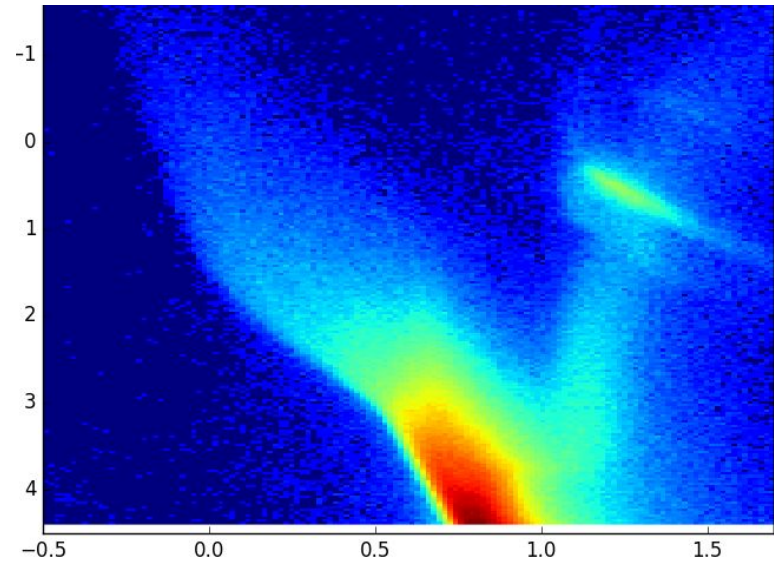
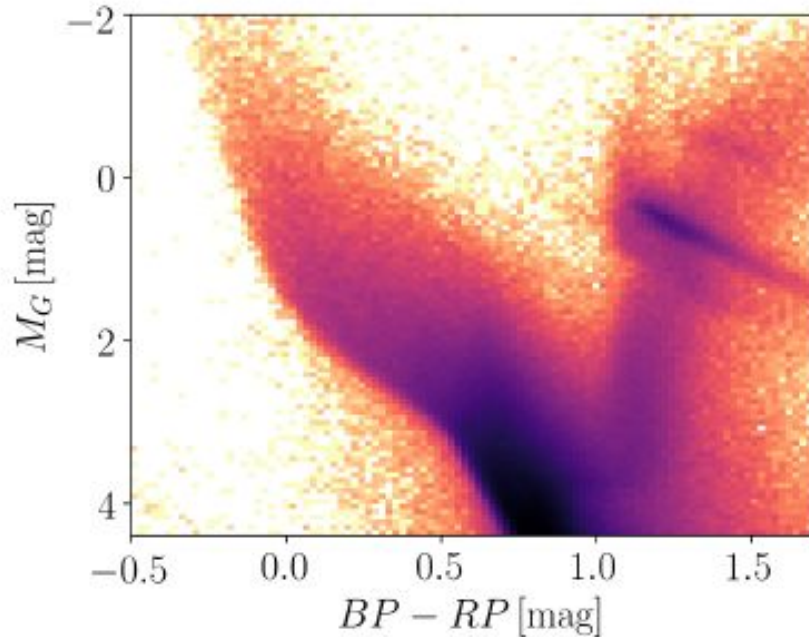
c = 2.997925e8
k = 1.380622e-23
h = 6.626196e-34



GAIA DR2

<http://gea.esac.esa.int/archive/>

Сделать выборку звезд в окрестности Солнца (≤ 0.5 пк) из



`parallax_over_error >= 5`

`M_G <= 4.4 (m_G = phot_g_mean_mag)`

`BP-RP <= 1.7 ((phot_bp_mean_mag - phot_rp_mean_mag))`

`parallax >= 2.`

Абсолютная звёздная величина



$$m = M + 5 \lg(R/10 \text{ пк})$$

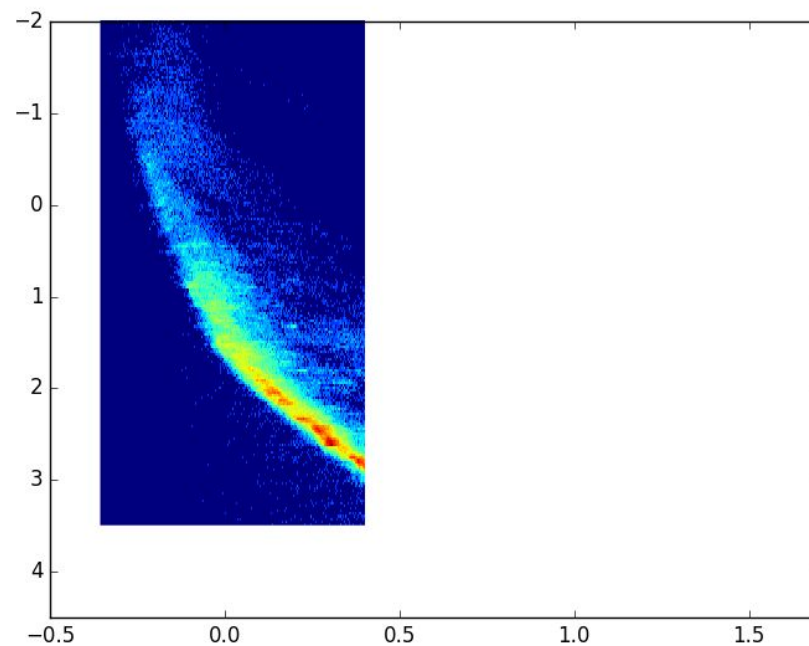
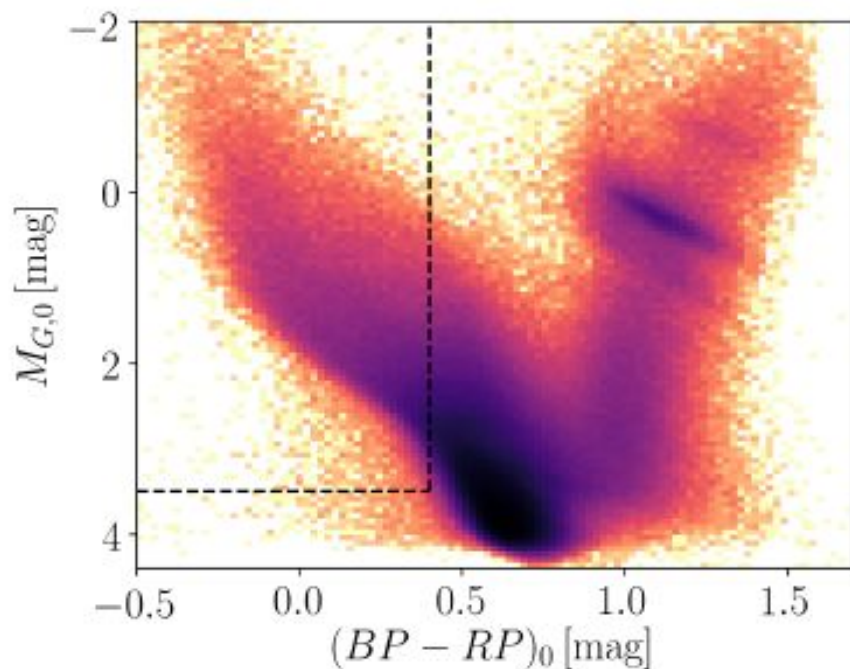
$$m = M - 5 + 5 \lg R \text{ (пк)}$$

$$M = m + 5 - 5 \lg R = m + 5 + 5 \lg p(\text{''})$$

$$m - M = -5 + 5 \lg R \quad \text{модуль расстояния}$$

GAIA DR2

Сделать выборку молодых звезд в окрестности Солнца (≤ 0.5 пк) с учетом экстинкции (a_g , $e_{bp_min_rp}$) из `gaiadr2.gaia_source`.



Numpy, matplotlib

```
data = np.genfromtxt('name.csv', delimiter=',', skip_header=1,  
usecols=(1,2))
```

```
plt.hist2d(ra, dec, bins=1000, norm=mcolors.PowerNorm(gamma))
```

$0 < \text{gamma} < 1$