

Teaching programming with Jupyterhub and Nbgrader

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About me


- ▶ theoretical physicist at the Universität Augsburg
- ▶ teaching programming to physicists and materials scientists since 2010, typically 10+ students
- ▶ in two years: mandatory course for 100+ students → [nbgrader](#)
- ▶ involved in two Erasmus+ projects on education and computing
 - ▶ iCSE4school (2015–2017)
 - ▶ Jupyter@edu (2017–2019)

Jupyter@edu

- ▶ University of Silesia, Poland (Leader)
- ▶ Universität Augsburg, Germany
- ▶ Universidade Portucalense Infante D. Henrique, Portugal
- ▶ European University Cyprus, Cyprus



Erasmus+

 nbgrader

stable

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v: stable ▼

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nbgrader

nbgrader is a tool that facilitates creating and grading assignments in the Jupyter notebook. It allows instructors to easily create notebook-based assignments that include both coding exercises and written free-responses. **nbgrader** then also provides a streamlined interface for quickly grading completed assignments.

For an overview and demonstration of nbgrader's core functionality, check out the talk on nbgrader given at SciPy 2017:



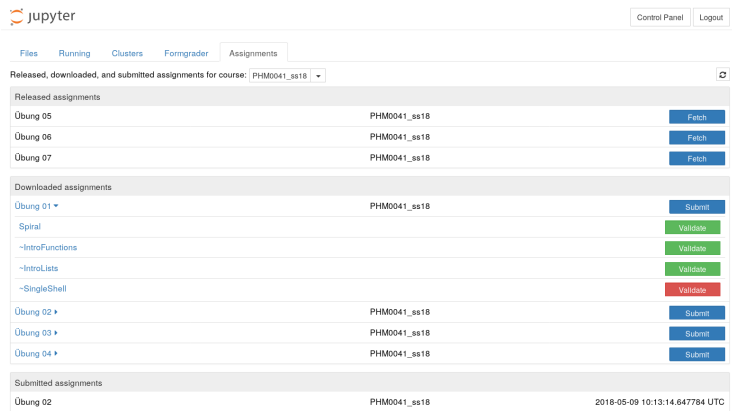
Jupyterhub and Jupyter notebooks
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Jupyterhub and Jupyter notebooks

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Jupyterhub and nbgrader



Jupyterhub interface showing the nbgrader Assignments tab. The interface displays a list of assignments for the course PHM0041_ss18, categorized into Released, Downloaded, and Submitted assignments.

Released assignments

Assignment	Course	Action
Übung 05	PHM0041_ss18	Fetch
Übung 06	PHM0041_ss18	Fetch
Übung 07	PHM0041_ss18	Fetch

Downloaded assignments

Assignment	Course	Action
Übung 01 ▾	PHM0041_ss18	Submit
Spiral		Validate
~IntroFunctions		Validate
~IntroLists		Validate
~SingleShell		Validate
Übung 02 ▶	PHM0041_ss18	Submit
Übung 03 ▶	PHM0041_ss18	Submit
Übung 04 ▶	PHM0041_ss18	Submit

Submitted assignments

Assignment	Course	Timestamp
Übung 02	PHM0041_ss18	2018-05-09 10:13:14.647784 UTC

- ▶ easily accessible interface to problem sets
- ▶ no need to install Python on local computer
- ▶ consistent working environment for all students
- ▶ *but* may be beginners should gather experience with Python on their own computer

Jupyter notebooks or something else?

Parrondo's paradox

Random numbers and fair coin

In order to play the games needed to demonstrate Parrondo's paradox, we need to simulate the flipping of a coin. This can be achieved by generating random numbers. As random numbers on a computer are usually generated by means of a deterministic algorithm, the generated numbers are actually pseudo-random numbers.

Python's standard library contains a `module` `random` which provides various ways to generate pseudo-random numbers. The basic way to generate equally distributed floats on an interval $[0.0, 1.0)$ is as follows:

```
In [ ]: import random
         random.random()
```

Call the `random` method a few times to convince yourself that a different number is obtained each time

```
In [1]: random.random()
```

In order to make the generation of the random numbers reproducible, we can set a seed. As argument, an arbitrary integer can be chosen

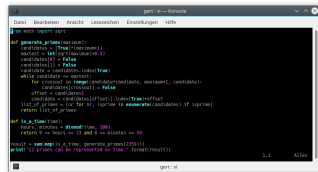
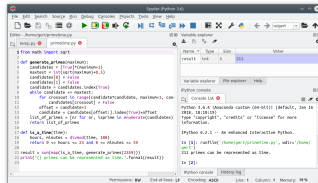
```
In [ ]: random.seed(0)
for _ in range(10):
    print(random.random())
```

Convince yourself that the cell above always yields the same ten random numbers

Now, let us make use of what we have learned so far. We want to play a game where we flip a fair coin. We loose if the random number is smaller than 0.5, otherwise we win. Complete the following function which should return the number of winning flips for a given number of total flips.

```
In [ ]: import random

def flip_fair_coin(ntotal, seed):
    """determine the number of winning flips
    ntotal: total number of flips
    seed: seed for random number generator
    """
    # YOUR CODE HERE
    raise NotImplementedError()
```



- ▶ notebook allows to guide students through a problem set
- ▶ students might think that programming in Python implies working with a Jupyter notebook

Jupyterhub and Jupyter notebooks
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Grading

In []:

ID: julia-iteration

Autograded answer

```
def juliaiter(z0, c, threshold, maxiter):  
    """Determine number of iterations needed to cross the threshold  
  
    z0:      initial value for z  
    c:       complex number in iteration prescription  
    threshold: threshold value to be crossed by |z|  
    maxiter:  maximum of iterations  
    """  
    ### BEGIN SOLUTION  
    z = z0  
    niter = 0  
    while niter < maxiter and abs(z) <= threshold:  
        niter = niter+1  
        z = z**2 + c  
    return niter  
    ### END SOLUTION
```

Test your solution by executing the following two cells. Everything is fine if no error message is displayed.

In []:

Points: 1

ID: test-existence

Autograder tests

```
result = juliaiter(-0.3+0.4j, -0.8+0.156j, 2, 100)  
assert result is not None, 'Does your function return a result?'  
assert type(result) == type(1), 'The result should be an integer.'
```

In []:

Points: 2

ID: test-correctness

Autograder tests

```
import math  
maxiter = 100  
threshold = 2  
assert juliaiter(1, 0, threshold, maxiter) == maxiter, 'There is a problem even for c=0.'  
z0 = 1.00000001  
expected = int(math.log(math.log(threshold)/math.log(z0), 2))+1  
assert juliaiter(z0, 0, threshold, maxiter) == expected, 'There is a problem even for c=0.'  
z0 = -0.3+0.4j  
c = -0.8+0.156j  
threshold = abs(z0**8+4*z0**6*c+2*z0**4*(3*c**2+c)+4*z0**2*(c**3+c**2)+c**4+2*c**3+c**2+c)  
maxiter = 4  
assert juliaiter(z0, c, threshold+1e-6, maxiter) == maxiter, 'Wrong number of iterations'  
assert juliaiter(z0, c, threshold-1e-6, maxiter) == maxiter-1, 'Wrong number of iterations'
```

- ▶ autograded answer
- ▶ autograder tests
- ▶ manually graded answer

Functions

```
ID: julia-iteration Autograded answer
def juliaiter(z0, c, threshold, maxiter):
    """Determine number of iterations needed to cross the threshold

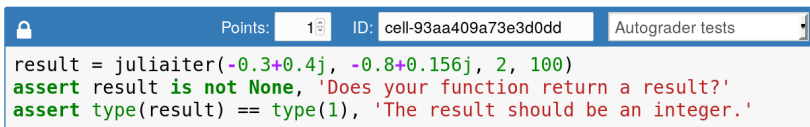
    z0:      initial value for z
    c:       complex number in iteration prescription
    threshold: threshold value to be crossed by |z|
    maxiter:  maximum of iterations

    """
    ### BEGIN SOLUTION
    z = z0
    niter = 0
    while niter < maxiter and abs(z) <= threshold:
        niter = niter+1
        z = z**2 + c
    return niter
    ### END SOLUTION
```

- ▶ need to introduce functions very early in the course
but special aspects (no arguments, no return value, default arguments, keyword arguments, ...) not needed
- ▶ students get used to logically structured code early on
but they do not do it themselves
- ▶ include docstrings to make task well defined
students get used to the idea that a function contains a docstring
but they are not writing the docstring by themselves

Grading with tests

- ▶ test-driven development
but tests are not developed by the students
- ▶ tests allow to give feedback through error messages
but students tend to rely on this feedback instead of developing their own critical view on their code
- ▶ “Stupid mistakes” will be made not only at the beginning
 - ▶ “trivial” standard tests (are results returned, do they have the correct type, ...?)
 - ▶ + tests of specific functionality which should not disclose the solution



The screenshot shows a Jupyter Notebook interface with a blue header bar. On the left is a lock icon. In the center, it says "Points: 1" with a small icon. To the right is "ID: cell-93aa409a73e3d0dd". On the far right is a button labeled "Autograder tests". Below the header, the code cell contains the following Julia code:

```
result = juliaiter(-0.3+0.4j, -0.8+0.156j, 2, 100)
assert result is not None, 'Does your function return a result?'
assert type(result) == type(1), 'The result should be an integer.'
```

The code is displayed with syntax highlighting: keywords like `assert` and `type` are green, strings are red, and numbers/variables are black. The code is currently running, as indicated by the status bar at the bottom.

Jupyterhub and Jupyter notebooks
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Coping with heterogeneity

- ▶ students without programming experience and (sometimes) code writing apprehension
- ▶ students with knowledge in another programming language
code often does not look very pythonic
example: loop over objects vs. loop over indices

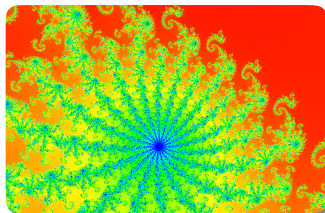
students with programming experience should not be bored and should obtain an interesting result from their code

- ▶ *but* scientific applications are often considered as an extra mental burden

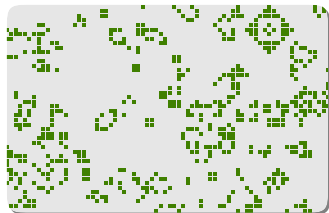
Examples of problem sets

99	72	43	44	45	46	47	48	49	50	8
98	71	42	21	22	23	24	25	26	51	8
97	70	41	20	7	8	9	10	27	52	8
96	69	40	19	6	1	2	11	28	53	8
95	68	39	18	5	4	3	12	29	54	8
94	67	38	17	16	15	14	13	30	55	8
93	66	37	36	35	34	33	32	31	56	8

selected problems from
Project Euler (projecteuler.net)



Julia set

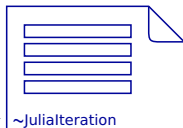
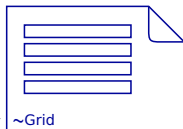
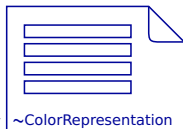


Conway's game of life

3.14159265358979323846264
3383279502884197169399375
1058209749445923078164062
8620899862803482534211706
7982148086513282306647093
8446095505822317253594081
2848111745028410270193852

π to a few thousand digits

Branching paths



should not set the gridsize too large. It is a good idea to start e.g. with a 100×100 grid. Once your code is working, you can increase the number of grid points. For practical purposes, it makes sense to define a threshold for the absolute value of z beyond which you assume that the series for a given starting value z_0 diverges. A good value could be 2. You should also limit the number of iterations. Here, a good value could be 600. Feel free to play around with these values once your code works.

If you want to tackle the problem without any further help, you can jump over the following three points which are intended to give you some help by splitting the complete problem into smaller parts.

1. [Representation of a number by a color](#)
2. [Equally spaced numbers on a grid](#)
3. [Iteration prescription](#)

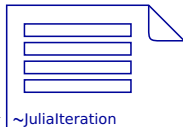
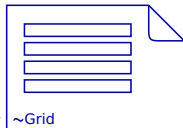
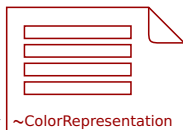
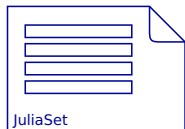
```
In [ ]: %matplotlib inline
import matplotlib.pyplot as plt
import numpy as np

def plot(data, ndim, cmap):
    """Create a 2d graphics from a list of data points

    data: list of ndim2 data between 0 and 1
    ndim: side length of grid
    cmap: matplotlib color map mapping interval from 0 to 1 to color

    """
```

Branching paths



```
def colorbar(cmapname):  
    gradient = np.linspace(0, 1, 256)  
    gradient = np.vstack((gradient, gradient))  
    fig = plt.imshow(gradient, aspect=0.05, extent=(0, 1, 0, 1), cmap=plt.  
    fig.axes.get_yaxis().set_visible(False)  
  
    def display_color(x, cmapname):  
        rgbcolor = cm.get_cmap(name=cmapname)(float(x), bytes=True, alpha=False)  
        print(rgbcolor)  
        return SVG('<svg height="100" width="100">  
                    <rect x="1" y="1" width="50" height="50" fill="rgb(  
                    </svg>'.format(*rgbcolor))
```

We start with one of the colormaps provided by the matplotlib library called hot:

In [3]: `colorbar('hot')`



In the following cell, you can change the argument of the function `display_color` between 0 and 1 and explore how the color changes.

In [4]: `display_color(0.9, 'hot')`

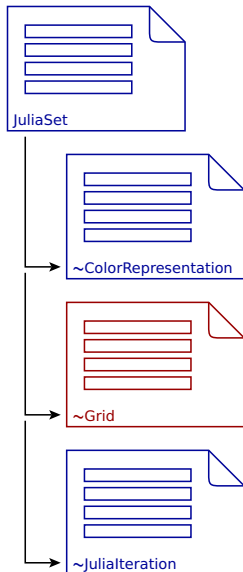
(255, 255, 156)

Out[4]:

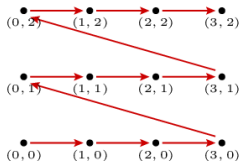


The matplotlib library provides many more colormaps, like e.g. [viridis](#). Take a look at [Colormaps in Matplotlib](#) for more information. Try out a couple of other colormaps.

Branching paths



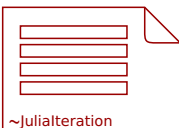
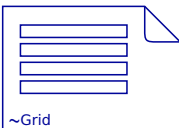
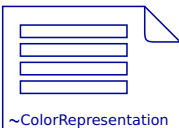
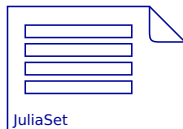
If the code for generating a one-dimensional grid is working, you are ready to extend it to two-dimensional grids. Walk the grid horizontally before making a vertical step like indicated in the following figure.



The output in this case should be the list [(0, 0), (1, 0), (2, 0), (3, 0), (0, 1), (1, 1), (2, 1), (3, 1), (0, 2), (1, 2), (2, 2), (3, 2)].

```
In [ ]: def grid2d(xmin, xmax, nxpts, ymin, ymax, nypts):  
    """Generate a list of coordinate tuples (x, y) on a two-dimensional grid.  
    The points are equally spaced in each of the two directions between  
    (and including) the respective bounds. The grid is first walked along  
    the horizontal (x) direction, then along the vertical (y) direction.  
  
    xmin: lower bound in horizontal direction  
    xmax: upper bound in horizontal direction  
    nxpts: number of points in horizontal direction  
    ymin: lower bound in vertical direction  
    ymax: upper bound in vertical direction  
    nypts: number of points in vertical direction  
    """
```

Branching paths



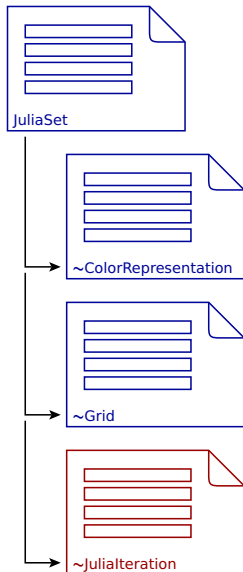
```
In [ ]: def juliaiter(z0, c, threshold, maxiter):  
        """Determine number of iterations needed to cross the threshold  
  
        z0:      initial value for z  
        c:       complex number in iteration prescription  
        threshold: threshold value to be crossed by |z|  
        maxiter: maximum of iterations  
        """  
        # YOUR CODE HERE  
        raise NotImplementedError()
```

Test your solution by executing the following two cells. Everything is fine if no error message is displayed.

```
In [ ]: result = juliaiter(-0.3+0.4j, -0.8+0.156j, 2, 100)  
        assert result is not None, 'Does your function return a result?'  
        assert type(result) == type(1), 'The result should be an integer.'
```

```
In [ ]: import math  
        maxiter = 100  
        threshold = 2  
        assert juliaiter(1, 0, threshold, maxiter) == maxiter, 'There is a problem e  
        z0 = 1.0000001  
        expected = int(math.log(math.log(threshold)/math.log(z0), 2))+1  
        assert juliaiter(z0, 0, threshold, maxiter) == expected, 'There is a problem  
        z0 = -0.3+0.4j  
        c = -0.8+0.156j  
        threshold = abs(z0**8+4*z0**6*c+2*z0**4*(3*c**2+c)+4*z0**2*(c**3+c**2)+c**4+  
        maxiter = 4  
        assert juliaiter(z0, c, threshold+1e-6, maxiter) == maxiter, 'Wrong number c  
        assert juliaiter(z0, c, threshold-1e-6, maxiter) == maxiter-1, 'Wrong number
```

Branching paths



- ▶ individual path through problem possible
- ▶ *but* notebooks are opened in new tabs, it is easy to lose track