Python程序设计与数据科学导论

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课程介绍——主要内容及安排(20次课)

- ► Python程序设计 (5次课)
- Numpy、Pandas、Sicpy、Sklearn等数据分析、数据挖掘相关算法实践与对应的软件包(5次课)
- ▶ 时间序列、图像处理、自然语言处理中特征分析与提取模型介绍 (3次课)
- ► Pytorch与深度学习模型简介 (3次课)
- ▶ 图像处理、自然语言处理经典模型分析(2次课)
- ▶ 深度学习模型特征分析与验证*(2次课)

考试及成绩认定

- 平时作业成绩: 30%
- 期中成绩 (大作业):30%
- ▶ 期末考试 (笔试): 40%

课程软件环境:

- Anaconda + python + pytorch 及相关软件包
- 推荐使用pycharm或Vscode作为期中大作业的编程IDE

■ 平时作业大多用Jupytor notebook文件形式布置和提交



课程基础参考资料:

- <u>3.10.2 Documentation (python.org)</u> (Python官方文档及教程)
 - The Python Tutorial Python 3.10.2 documentation
- ► https://github.com/jakevdp/PythonDataScienceHandbook (数据科学教程)
 - <u>https://github.com/cuttlefishh/python-for-data-analysis</u> (数据分析技术教程)
- <u>https://pytorch.org/tutorials/beginner/basics/intro.html</u> (Pytorch官方文档及教程)
- https://pytorch.org/tutorials/beginner/deep learning 60min blitz.html

...

1. Introduction

1.1 Learning Programming

The Python Language

Why Use Python?

Python 2 or 3?

Enterprise Python

1.2 Python Community

Companies Using Python

Best Python Resources

Must-watch Python Videos

Podcasts

2. Development Environments

2.1 Text Editors and IDEs

Vim

Emacs

Sublime Text

PyCharm

Jupyter Notebook

2.2 Shells

Bourne-again shell (Bash)

Zsh

PowerShell

2.3 Terminal multiplexers

4. Web Development

4.1 Web Frameworks

Django

Flask

Bottle

Pyramid

TurboGears

Falcon

Morepath

Sanic

Other web frameworks

4.2 Template Engines

Jinja2

Mako

Django Templates

4.3 Web design

HTML

CSS

Responsive Design

Minification

4.4 CSS Frameworks

Bootstrap

Foundation

4.5 JavaScript

5. Web App Deployment

5.1 Hosting

Servers

Static content

Content Delivery Networks

(CDNs)

5.2 Virtual Private Servers (VPSs)

Linode

DigitalOcean

Lightsail

5.3 Platform-as-a-Service

Heroku

PythonAnywhere

AWS CodeStar

5.4 Operating systems

Ubuntu Linux

macOS

FreeBSD

Windows

5.5 Web servers

Apache HTTP Server

Nginx

Caddy

5.6 WSGI servers

课程先修要求

- 有程序设计与算法基础
- 学习过基础python编程
- 具备一定的高等代数(向量空间模型及线性变换),高等数学(导数、偏导数、卷积)及概率统计(概率、条件概率、贝叶斯分析、概率分布)等相关基础

本课程的定位:

- ► Python作为一种架构语言最需要深入理解的技术与具体实现
- ▶ 数据科学的基本方法与Python环境下的实现。几个代表性应用 领域的问题建模方案与算法实现。

▶ 深度学习框架下的数据建模思想与实现

课程组织形式:

- ▶授课
- ▶ 作业-及作业讲评
- ▶课程群交流



2022Python课程群

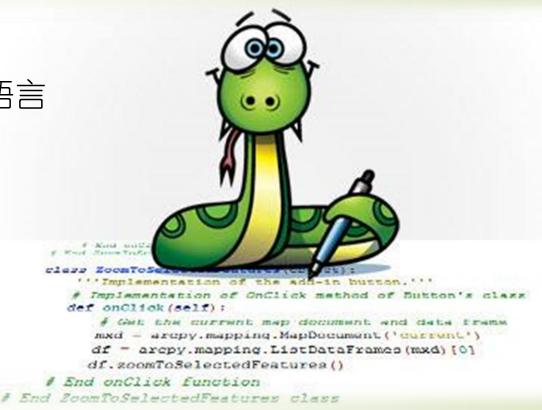


该二维码7天内(2月27日前)有效,重新 进入将更新

Python语言基础 C01

Python

- ── 是解释型、函数式、面向对象编程语言
- 有很多功能强大的软件包
- 被广泛用于数据分析及处理
- **并不适合直接实现算法密集型任务**
- 架构在各种类库上的胶水语言



Python之禅:

- Beautiful is better than ugly.
- Explicit is better than implicit.
- Simple is better than complex.
- Complex is better than complicated.
- Flat is better than nested.
- Sparse is better than dense.
- Readability counts.

这个感觉会输给pascal

于是类、对象的内容都是外部可见的?

一切都是对象,按名字空间管理

比如多继承方案?

类似Lambda演算的列表生成式

缩进~缩进~ 空行

列表生成式与高阶函数复合可以很酷很难读

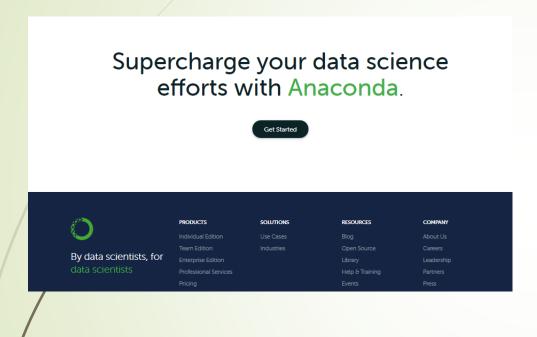
Python很容易学么?

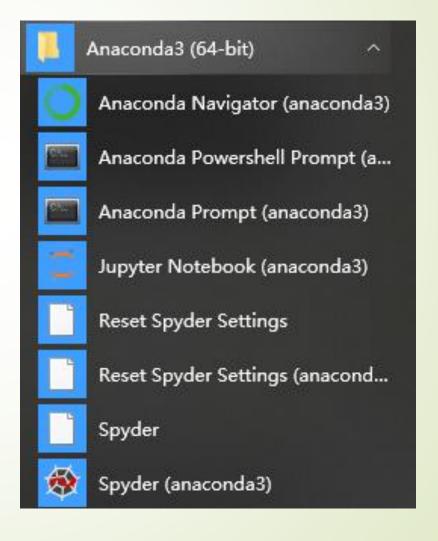
- ► 不,至少对新手来讲并不容易! 但如果从学习一种语言架构的角度看,确实是简洁而优美!
- 学会了Python语言并不等于可以熟练的用python进行编程实现。 每个特定的领域,都需要具备相关的专业知识并熟悉软件环境。

本次课内容提要

- ► Anaconda环境与Jupytor notebook介绍
- Python基本类型与表达式
- Python的容器类
- ► Python流程控制:条件分支与循环
- ▶ 容器类与迭代器
- ■函数、生成器

Anaconda







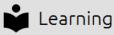
如何安装



Sign in to Anaconda Cloud







Community

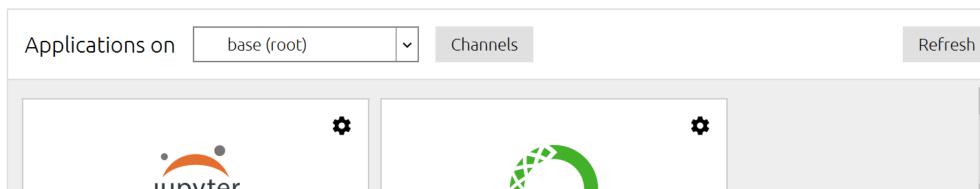
Documentation

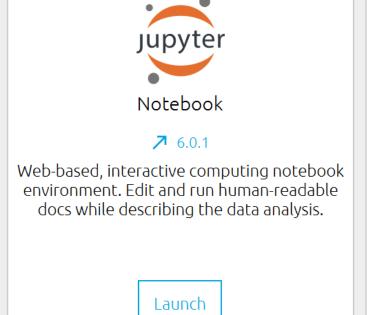
Developer Bloa

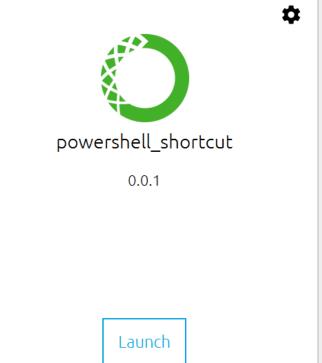




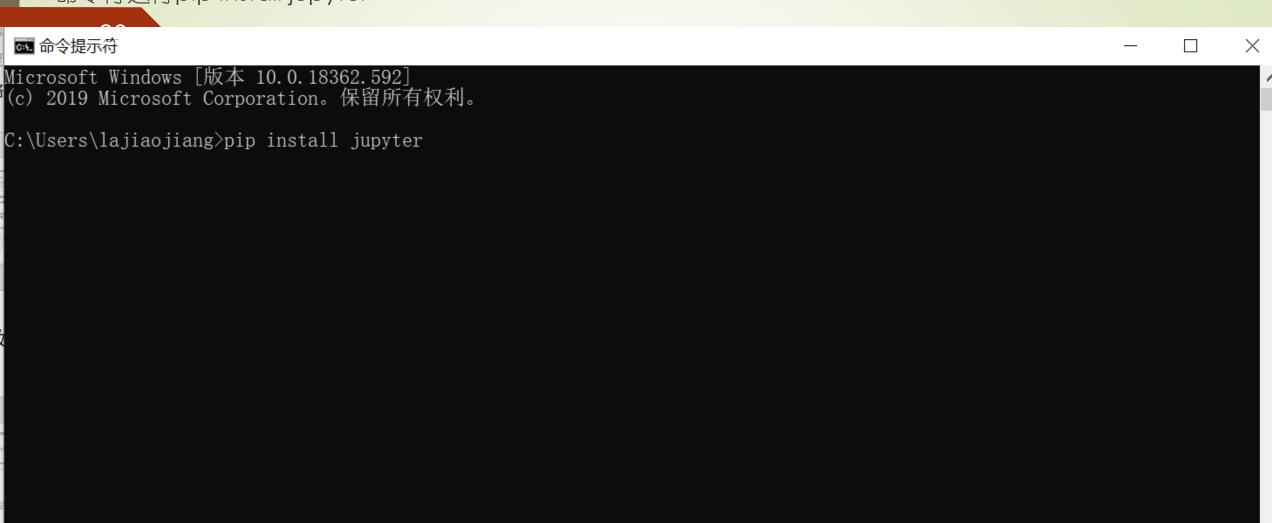








命令行运行pip install jupyter



如何运行

命令行运行jupyter notebook

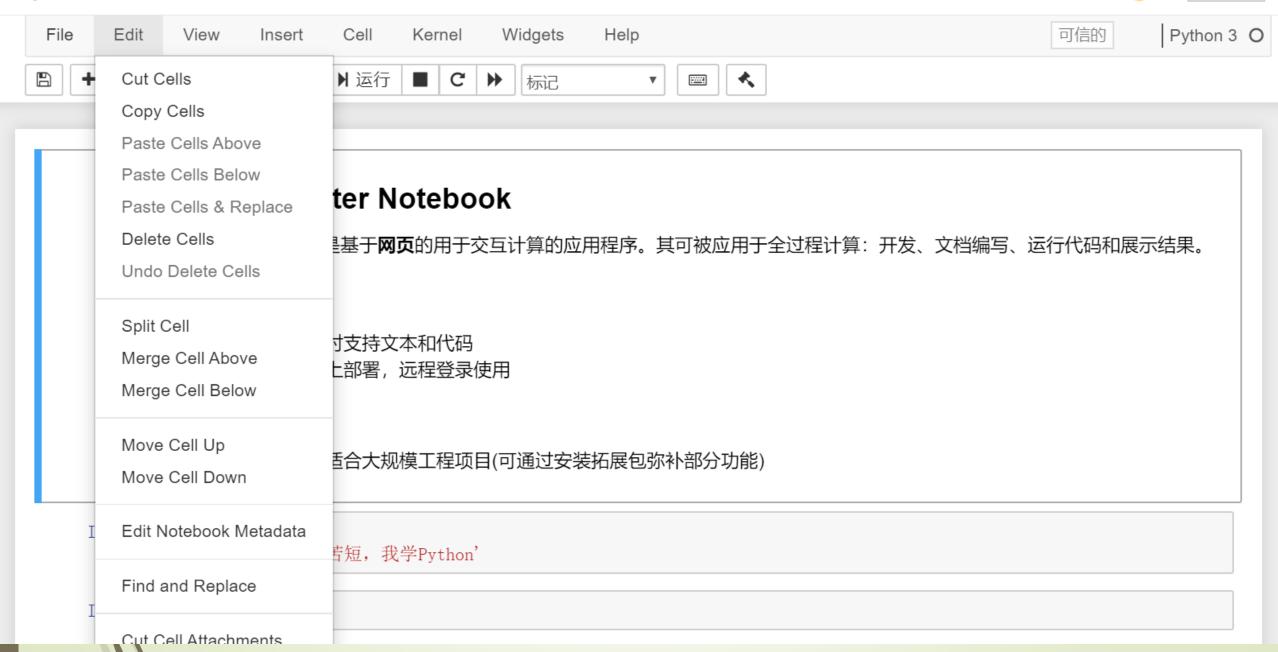
```
■ 命令提示符 - jupyter notebook
Microsoft Windows [版本 10.0.18362.592]
(c) 2019 Microsoft Corporation。保留所有权利。
C:\Users\lajiaojiang>jupyter notebook
[I 17:46:39.322 NotebookApp] [jupyter_nbextensions_configurator] enabled 0.4.1
[I 17:46:39.366 NotebookApp] JupyterLab extension loaded from D:\anaconda\lib\site-packages\jupyterlab
[I 17:46:39.366 NotebookApp] JupyterLab application directory is D:\anaconda\share\jupyter\lab
[I 17:46:39.370 NotebookApp] Serving notebooks from local directory: E:/Jupyter
[I 17:46:39.370 NotebookApp] The Jupyter Notebook is running at:
[I 17:46:39.370 NotebookApp] http://localhost:8888/?token=8b43fb6b40f87511a583e61df312717620612aaf1c8d3c87
[I 17:46:39.370 NotebookApp] or http://127.0.0.1:8888/?token=8b43fb6b40f87511a583e61df312717620612aaf1c8d3c87
[I 17:46:39.370 NotebookApp] Use Control-C to stop this server and shut down all kernels (twice to skip confirmation).
C 17:46:39.414 NotebookApp
   To access the notebook, open this file in a browser:
       file:///C:/Users/lajiaojiang/AppData/Roaming/jupyter/runtime/nbserver-628-open.html
   Or copy and paste one of these URLs:
       http://localhost:8888/?token=8b43fb6b40f87511a583e61df312717620612aaf1c8d3c87
    or http://127.0.0.1:8888/?token=8b43fb6b40f87511a583e61df312717620612aaf1c8d3c87
```

菜单介绍





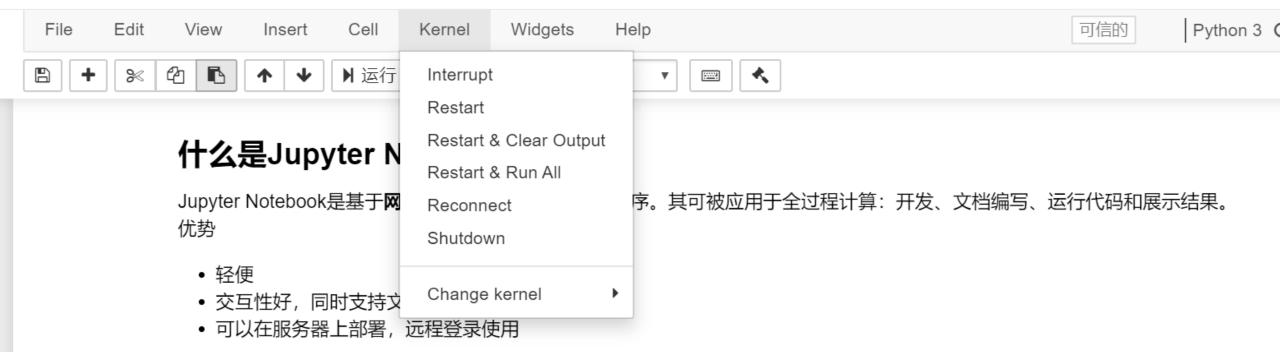
Logout



Jupyter Jupyter Notebook简介 最后检查: 1 天前 (自动保存)



Logout



劣势

• 功能简单,不适合大规模工程项目(可通过安装拓展包弥补部分功能)

```
In [1]: #廣示交互性
string = '人生苦短,我学Python'
```

Notebook 编辑与常用快捷键

```
单元编辑:

ctrl+enter 运行当前cell;
shift+enter 运行当前cell并跳到下一个cell;
ctrl+[向左缩进;
ctrl+]向右缩进
```

两种编辑模式:

内容编辑:

安装拓展包

pip install jupyter_contrib_nbextensions jupyter contrib nbextension install

vter-latex-envs>=1.3.8->jupyter contrib nbextensions) (0.1.7)

C:\Users\lajiaojiang>jupyter contrib nbextension install

```
kequirement already satisfied: pywin32/=1.0; sys platform == win32 in d:\anaconda\lib\site-packages (from jupyter-clie
nt>=5.3.1->notebook>=4.0->jupyter contrib nbextensions) (223)
Requirement already satisfied: python-dateutil>=2.1 in d:\anaconda\lib\site-packages (from jupyter-client>=5.3.1->notebo
ok>=4.0->jupyter contrib nbextensions) (2.8.0)
Requirement already satisfied: jedi>=0.10 in d:\anaconda\lib\site-packages (from ipython->jupyter-latex-envs>=1.3.8->jup
vter contrib nbextensions) (0.15.1)
Requirement already satisfied: backcall in d:\anaconda\lib\site-packages (from ipython->jupyter-latex-envs>=1.3.8->jupyt
er contrib nbextensions) (0.1.0)
Requirement already satisfied: colorama; sys platform == "win32" in d:\anaconda\lib\site-packages (from ipython->jupyter
-latex-envs>=1.3.8->jupyter contrib nbextensions) (0.4.1)
Requirement already satisfied: pickleshare in d:\anaconda\lib\site-packages (from ipython->jupyter-latex-envs>=1.3.8->ju
pyter contrib nbextensions) (0.7.5)
Requirement already satisfied: prompt-toolkit<2.1.0,>=2.0.0 in d:\anaconda\lib\site-packages (from ipython->jupyter-late
x-envs>=1.3.8->jupyter contrib nbextensions) (2.0.10)
Requirement already satisfied: attrs>=17.4.0 in d:\anaconda\lib\site-packages (from jsonschema!=2.5.0,>=2.4->nbformat>=4
.4- nbconvert \geq 4.2- jupy ter contrib nbextensions) (19.2.0)
Requirement already satisfied: pyrsistent>=0.14.0 in d:\anaconda\lib\site-packages (from jsonschema!=2.5.0,>=2.4->nbform
at>=4.4->nbconvert>=4.2->jupyter contrib nbextensions) (0.15.4)
Requirement already satisfied: parso>=0.5.0 in d:\anaconda\lib\site-packages (from jedi>=0.10->ipython->jupyter-latex-en
vs>=1.3.8->jupyter contrib nbextensions) (0.5.1)
Requirement already satisfied: wcwidth in d:\anaconda\lib\site-packages (from prompt-toolkit<2.1.0,>=2.0.0->ipython->jup
```

filter:

Configurable nbextensions

by description, section, or tags

disable configuration for nbextensions without explicit compatibility (they may break your notebook environment, but can be useful to show	for nbextension
development)	

☐ (some) LaTeX environments for Jupyter	☐ 2to3 Converter	☐ AddBefore	
□ Autopep8	☐ AutoSaveTime	☐ Autoscroll	
☐ Cell Filter	☐ Code Font Size		
	☐ Codefolding in Editor	☐ CodeMirror mode extensions	
☐ Collapsible Headings	☐ Comment/Uncomment Hotkey	☑ contrib_nbextensions_help_item	
□ datestamper	☐ Equation Auto Numbering	☐ ExecuteTime	
☐ Execution Dependencies	☐ Exercise	☐ Exercise2	
☐ Export Embedded HTML	☐ Freeze	☐ Gist-it	
☐ Help panel	☐ Hide Header	☐ Hide input	
☐ Hide input all	☐ Highlight selected word	☐ highlighter	
☑ Hinterland	☐ Initialization cells	☐ isort formatter	
	☐ Keyboard shortcut editor	☐ Launch QTConsole	
☐ Limit Output	☐ Live Markdown Preview	☐ Load TeX macros	

修改默认愿置

命令行运行jupyter notebook --generate-config生成配置文件

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```
■ 命令提示符 - jupyter notebook --generate-config
Requirement already satisfied: python-dateutil>=2.1 in d:\anaconda\lib\site-packages (from jupyter-client>=5.3.1->notebo
ok>=4.0->jupyter contrib nbextensions) (2.8.0)
Requirement already satisfied: jedi>=0.10 in d:\anaconda\lib\site-packages (from ipython->jupyter-latex-envs>=1.3.8->jup
yter contrib nbextensions) (0.15.1)
Requirement already satisfied: backcall in d:\anaconda\lib\site-packages (from ipython->jupyter-latex-envs>=1.3.8->jupyt
er contrib nbextensions) (0.1.0)
Requirement already satisfied: colorama; sys_platform == "win32" in d:\anaconda\lib\site-packages (from ipython->jupyter
-latex-envs>=1.3.8->jupyter contrib nbextensions) (0.4.1)
Requirement already satisfied: pickleshare in d:\anaconda\lib\site-packages (from ipython->jupyter-latex-envs>=1.3.8->ju
pyter contrib nbextensions) (0.7.5)
Requirement already satisfied: prompt-toolkit<2.1.0,>=2.0.0 in d:\anaconda\lib\site-packages (from ipython->jupyter-late
x-envs\geq=1.3.8-\geqjupyter contrib nbextensions) (2.0.10)
Requirement already satisfied: attrs>=17.4.0 in d:\anaconda\lib\site-packages (from jsonschema!=2.5.0,>=2.4->nbformat>=4
.4- hbconvert \geq 4.2- jupy ter contrib nbextensions) (19.2.0)
Requirement already satisfied: pyrsistent>=0.14.0 in d:\anaconda\lib\site-packages (from jsonschema!=2.5.0,>=2.4->nbform
at>=4.4->nbconvert>=4.2->jupyter contrib nbextensions) (0.15.4)
Requirement already satisfied: parso>=0.5.0 in d:\anaconda\lib\site-packages (from jedi>=0.10->ipython->jupyter-latex-en
vs > = 1.3.8 - jupyter contrib nbextensions) (0.5.1)
Requirement already satisfied: wcwidth in d:\anaconda\lib\site-packages (from prompt-toolkit<2.1.0,>=2.0.0->ipython->jup
yter-latex-envs>=1.3.8->jupyter contrib nbextensions) (0.1.7)
C:\Users\lajiaojiang>jupyter notebook --generate-config
Overwrite C:\Users\lajiaojiang\.jupyter\jupyter notebook config.py with default config? [y/N]
```

```
## Dict of Python modules to load as notebook server extensions. Entry values can # be used to enable and disable the loading ofthe extensions. The extensions # will be loaded in alphabetical order. #c.NotebookApp.nbserver_extensions = {}

## The directory to use for notebooks and kernels.

c.NotebookApp.notebook_dir = 'E:/Jupyter'
```

Whather to onen in a browser after starting. The specific browser used is

进入python的内容:

- ▶基本数据类型
- →表达式
- ▶流程控制

Python的基础数据类型与算数表达式

- ▶整数、浮点数、(复数)
- →字符串

整数


```
type(i1)
```

int

True

整数支持位运算:

x y	x和y按位或	负数的二进制采用有符号位 补码表示
χΛy	x和y按位 <i>异或</i>	
x & y	×和y按位与	
x << n	x 左移 n 位	负数不支持移位运算
x >> n	x 右移 n 位	
~X	x 逐位取反	

浮点数

```
      num1 = 101.1
      # 64位浮点数编码

      num2 = 100.00000000000000
      # 会产生精度误差

      print(num1-num2)
      num1 = 101.00000000000000

      num2 = 100.00000000000000
      # 会有截断误差

      print(num1-num2)
      # 科学计数法

      print(num1 / num2)
      # 科学计数法
```

- 1. 09999999999943
- 1.0
- 1. 01e+202

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表达式计算

2

变量类型?

变量类型不需 要预先定义

```
a = 2 + 10 # 变量名直接使用,解释性语言特色
print("a=", (a + 1) /3) # 表达式做函数参数
b = 3**2 + 1.3 # ** 乘方运算
print("b=", b)
```

Integers可以任意长度,由内存大小决定 floating point number精确到15位十进制小数

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内置算数运算	结果	注释	完整文档
x + y	x和y的和		
х - у	x和y的差		
x * y	x 和 y 的乘积		
х / у	x和y的商		
x // y	x和y的商数	(1)	
х % у	x / y 的余数	(2)	
-x	x 取反		
+X	x 不变		
abs(x)	x 的绝对值或大小		abs()
int(x)	将 x 转换为整数	(3)(6)	int()
float(x)	将 x 转换为浮点数	(4)(6)	float()
complex(re, im)	一个带有实部 re 和虚部 im 的复数。im 默认为0。	(6)	complex()
c.conjugate()	复数 c 的共轭		
divmod(x, y)	(x // y, x % y)	(2)	divmod()
pow(x, y)	x的y次幂	(5)	pow()
х ** у	x的y次幂	(5)	

https://docs.python.org/zh-cn//3/library/stdtypes.html#numeric-types-int-float-long-complex

41 字符串

```
, , ,
单引号-双引号 表达字符串常量
连续三个引号开启一段注释
st1 = '"Hello"'
st2 = "Python!"
print(st1+ ' '+ st2)
"Hello" Python!
```

str = 'Do U have a nice vacation?' str += '\n' + "No I don\'t." # 反斜杠转义字符 print (str)

字符流与简单输入输出操作:

```
print("Hello, I'm iPython!") 控制台输出
# Input, assignment
name = input('What is your name?\n')
print ('Hi, %s.' % name)
Hello, I'm iPython!
What is your name?
                                                       交互输入
 Jeff Hu
```

Hi, Jeff Hu.

条件表达式与分支 (if-elif) 语句

- →布尔类型与逻辑表达式
 - ■not非; and与; or或
- ▶比较运算
- → 分支语句

Booleans 布尔类型

```
1 t, f = True, False ← 多赋值操作,
2 print (type(t)) # Prints "<type 'bool'>"
<class 'bool'>
  print (t and f) # Logical AND;
2 print (t or f) # Logical OR;
3 print (not t) # Logical NOT;
4 print (t != f) # Logical XOR;
False
True
False
True
```

布尔表达式以及短路运算

s1 = ''
s2 = s1 or 'abc'
s2

123

'abc'

比较 (关系) 运算

<	严格小于
/ <=	小于或等于
>	严格大于
>=	大于或等于
_ ==	等于
!=	不等于
is	是同一个对象 (标识)
is not	不是同一个对象(标识)

比较(关系)运算与分支流程控制:

```
x = int(input("Please enter an integer: "))
  47
           if x < 0: ← 冒号: 开启一个程序块
               X = 0
缩进-程序块延续
                print('Negative changed to zero')
Tab或四个空格
           elif x = 0:
               print('Zero')
            elif x\%2 == 1:
            print('Single')
            else:
                print('Other') — 语句间隔是直接换行,句尾没有分号
               print("in the block")
        12 | print ('out of the block')
         Please enter an integer: 11
         Single
         out of the block
```

Python的复合类型

- ▶ 序列类型:
 - ■列表 List, 元组tuple, range, 字符串 string
 - ▶ 迭代器, 生成器
- 集合 set
- 词典 dict

列表 List

- → 对应物理概念: 系列、序列
- ► 特点: 类型兼容性好、结构灵活、可容纳复合类型 引用主导,数据隔离性不好,容易出错

List (列表)

len(a) = 4

不同类型能混在一起

```
1 a = [1, 2, 'aaa', 1.23] # 可以大体理解为一个泛类型的数据对象数组
2 print('a = ', a)
4 print("a[1] = ", a[1], "; a[2] = ", a[2])
5 print('len(a) = ', len(a))
a = [1, 2, 'aaa', 1.23] 双引号单引号对都表示字符串
a[1] = 2 ; a[2] = aaa
```

► List对象常用方法:增、删、查、改

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添加元素 append()

```
# 空列表
  a = []
  a. append (20. 5)
                          尾部添加元素
  a. append (30)
  a.append('hello wrold!')
6 print(a)
[20.5, 30, 'hello wrold!']
```

插入元素 insert()

```
a. insert(2, 'beautiful') = 第3个位置(下标从0开始)处插入元素
print(a)
 print(a)
[20.5, 30, 'beautiful', 'hello wrold!']
[20.5, 30, 'beautiful', 24, 'hello wrold!']
```

► List对象常用方法: 删、改

NameError: name 'a' is not defined

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```
a = [1, 2, 3, 4] #新列表
   del a[2] # 删除下标为2的元素
                                 按下标直接读写访问
   a[2] = 10
   print(a)
   a. clear() # 清空列表
   print(a)
10 del a # 删除列表对象
   print(a)
 [1, 2, 10]
                                     Traceback (most recent call last)
 NameError
 <ipython-input-34-5cac9423a08a> in <module>()
      9
     10 del a # 删除列表对象
 ---> 11 print (a)
```

► List对象常用方法: 查找、定位

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判断是否在list中

```
1  a = [1,3,5,7,9]
2  print(1 in a)
3
4  d = a.index(5)
5  print ('a.index(5) = ', d)
6  # print ('a.index(4) = ', a.index(4)) # ValueError: 4 is not in list
```

True

```
a. index(5) = 2
```

1 #### count()

```
fruits = ['orange', 'apple', ['apple', 'banana'], 'kiwi', 'apple', 'banana'
fruits.count('apple')
```

Tuple (元组)

- 和List不同在于,一旦初始化后不可更改
- 元组虽不可变,但其中嵌套元素可变(因为本身只是引用)

```
1  t = (1,2)
2  print(t)
4  print(t[1])
(1, 2)
```

```
(1, 2)
2
```

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```
#元组展开
  2 a = tuple('1234') # 展开为一个tuple
  3 print(a)
  4
  5 c, d, *_ = a # unpack
  6 c, d
  ('1', '2', '3', '4')
('1', '2')
     # 元组 合并
  \begin{bmatrix} 2 \\ 3 \end{bmatrix} t2 = (3, 4)
  4 \mid t = (1, 2, 3)
  6 print(t+t2)
  (1, 2, 3, 3, 4)
```

List切片

 $1 \quad a = [1, 2, 3, 4, 5]$

2

 $3 \mid b = a[1:3]$

4 c = a[1:-1]

 $5 \mid d = a[1:]$

6

7 print (b)

8 print(c)

9 print(d)

[2, 3]

[2, 3, 4]

[2, 3, 4, 5]

: 1 d = a[::2] 2 3 d

[1, 3, 5]

str切片

• 字符串不可更改内容

1 string = "ursoooo cute!"
2
3 string[1:4]

'rso'

tuple切片

```
1 t = (1, 2, 3, 4, 5, 6)
2 3 t1 = t[1:3]
4 5 t1
```

(2, 3)

57 string对象常用方法: string对象可读,可下标访问,但不可修改

```
1 str = 'abcd'

2 print (str[1])

3 str[1] = 'q'

b
```

TypeError: 'str' object does not support item assignment

■ string对象常用方法: https://docs.python.org/3/library/stdtypes.html#string-methods

```
str = 'Do U have a nice sleep?'
58
      2 str += '\n' + "No I don\'t." ← 反斜杠的用法和C语言一致
      3 print (str)
      Do U have a nice sleep?
      No I don't.
       s = " 11123123abc" #str. strip([chars]) 去前导空格以及特殊符号
      2 \mid s = s. strip(' ')
      3 print(s)
       print(s.strip('1')) = 这里s的前导'1'并没有真正去除,表达式是一个新对象
       print('s. find = ', s. find('23'))
      7 i = s. find('23', 4) # 从特定下标开始定位串
      11123123abc
      23123abc
      s. find = 3
```

str.split(sep=None, maxsplit=-1)

Return a list of the words in the string, using sep as the delimiter string. If maxsplit is given, at most maxsplit splits are done (thus, the list will have at most
maxsplit+1 elements). If maxsplit is not specified or -1, then there is no limit on the number of splits (all possible splits are made).

```
]: s = 'ab, cde, fgh, ijk'

print(s. split(',')) # 切分开這号分割的串

print(s. split(',', maxsplit= 2))

['ab', 'cde', 'fgh', 'ijk']
['ab', 'cde', 'fgh, ijk']
```

str.join(iterable)

Join a list of words into a string.

```
delimiter = ':'

mylist = ['Brazil', 'Russia', 'India', 'China']

print(delimiter.join(mylist))

Brazil:Russia:India:China
```

迭代器与循环

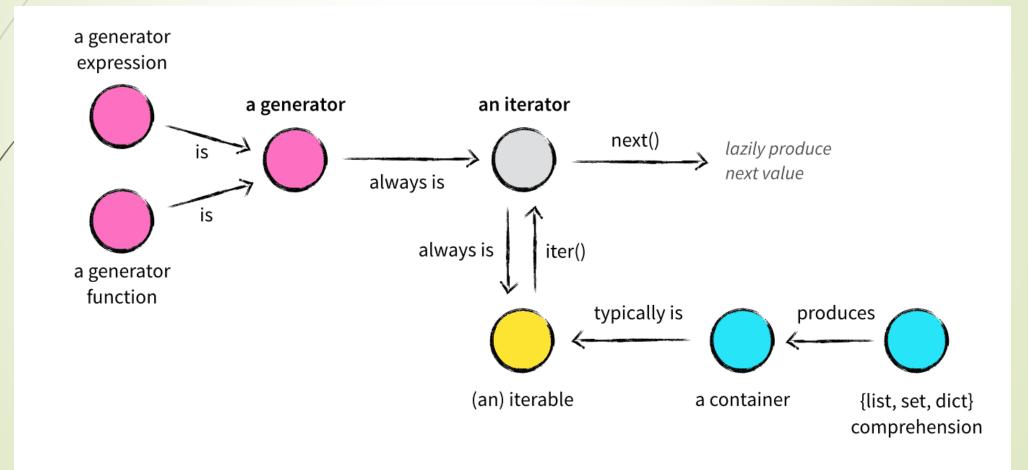
■Iter类型

61 Range(start, end, step) 左闭右开

5050 100 ← 语句块 (for) 并不产生独立的命名空间

生成器、迭代器

- ► 在Python中,依托循环结构与生成表达式惰性产生数据的对象被称为生成器: generator
- ► Python的Iterator对象表示的是一个数据流,Iterator对象可以被next()函数调用并不断返回下一个数据



●生成器

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```
1 g = (x * x for x in range(4))
   print(g)
4 # print(g[3]) $'generator' object is not subscriptable
<generator object <genexpr> at 0x0000019DEB305E58>
   for n in g:
       print(n)
```

迭代器:

54 迭代器不但可以作用于for循环,还可以被next()函数不断调用并返回下一个值,直到最后抛出StopIteration错误表示无法继续返回下一个值。

```
x = [1, 2, 3]
                                   x = [1, 2, 3]
     y = iter(x)
                                  \mathbf{x}1 = \begin{bmatrix} & # & if & x1 & not & define \end{bmatrix}
                                3 \mid y = iter(x)
     print(next(y), next(y))
  1 2
                                   for i in y:
    type(x)
                                          x1. append(i)
list
                                    print (x1)
    type(y)
                               [1, 2, 3]
list iterator
```

How for loop actually works

```
# create an iterator object from that iterable
iter_obj = iter(iterable)
# infinite loop
while True:
  try:
    # get the next item
    element = next(iter_obj)
    # do something with element
  except StopIteration:
    # if StopIteration is raised, break from loop
    break
```

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