



# **Introduction to Functional Programming in Python**



# Remark

- Techniques from F#.



# About speaker

- Chang HaiBin
  - Data Engineer at a Hedge Fund
  - M.Sc. Uni. of Michigan (Math)
- 
- Financial Engineer (Numerical Technologies)
  - Business Analyst (U.S. Mattress)




3 concepts



## 3 concepts:

- keep (filter)
  - change (map)
  - then (pipe-forward)
- 
- Omitted: “reduce”



keep (filter)



# **keep      (filter)**

- From 1 to 10, keep even numbers  
(remove odd numbers)
- What is the result?



# keep (filter)

- From 1 to 10, keep even numbers  
(remove odd numbers)
- [2, 4, 6, 8, 10]





# **keep      (filter)**

- From 1 to 10, keep prime numbers  
(remove non-prime)
- What is the result?



# keep (filter)

- From 1 to 10, keep prime numbers  
(remove non-prime)
- [2, 3, 5, 7]



# **keep (filter)**

- Given a list, and a criteria/condition,
- Create a new, shorter list
- Keep those that are True
- (remove those that are False)



# Remark

- You can also define the “remove” function, that does the opposite of “keep”



change      (map)



# change (map)

- From 1 to 10, change each  $x$  to  $(x * x)$
- What is the result?



# change (map)

- From 1 to 10, change each  $x$  to  $(x * x)$
- [1, 4, 9, 16, 25, 36, 49, 64, 81, 100]



# change (map)

- From 1 to 10, change each  $x$  to  $(1 / x)$
- What is the result?





# change (map)

- From 1 to 10, change each  $x$  to  $(1 / x)$
- $[1/1, \quad 1/2, \quad 1/3, \quad 1/4, \quad 1/5,$   
 $1/6, \quad 1/7, \quad 1/8, \quad 1/9, \quad 1/10]$

# change (map)

- From 1 to 10, change each  $x$  to  $(1 / x)$
- [1, 0.5, 0.3333, 0.25, 0.2, 0.1666, 0.1428, 0.125, 0.1111, 0.1]



# **change      (map)**

- Given a list, and a formula to change each element,
- Create a new list, where each result depends on the original list and the formula



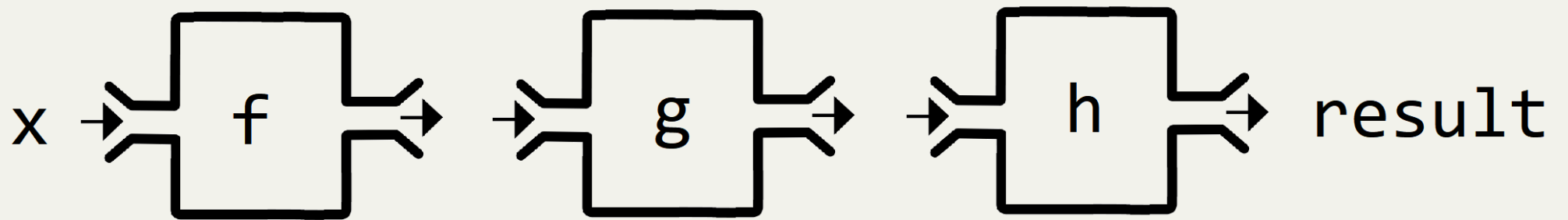
# Why?

- “keep” and “change” allows you to avoid for-loop.
  - Or at least, use for-loop implicitly.
- Allows you to work on a higher level (no need to specify details of the loop)



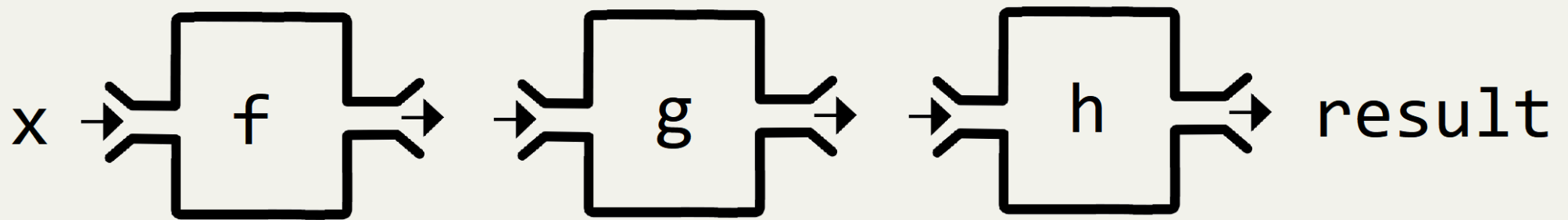
then (pipe-forward)

**then**



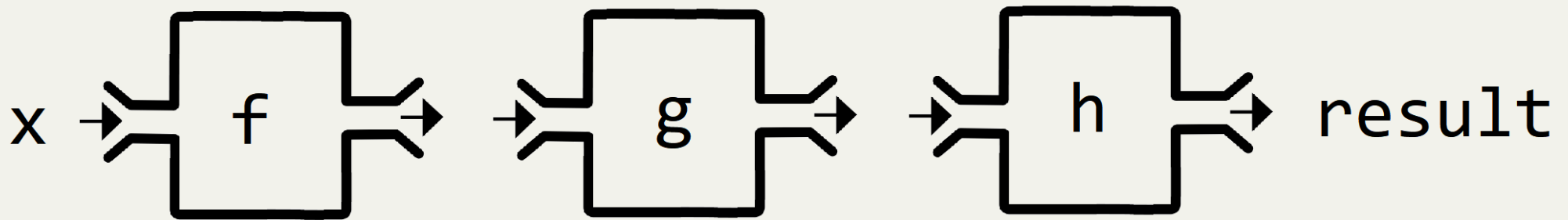
# then

- $h(g(f(x)))$



# then

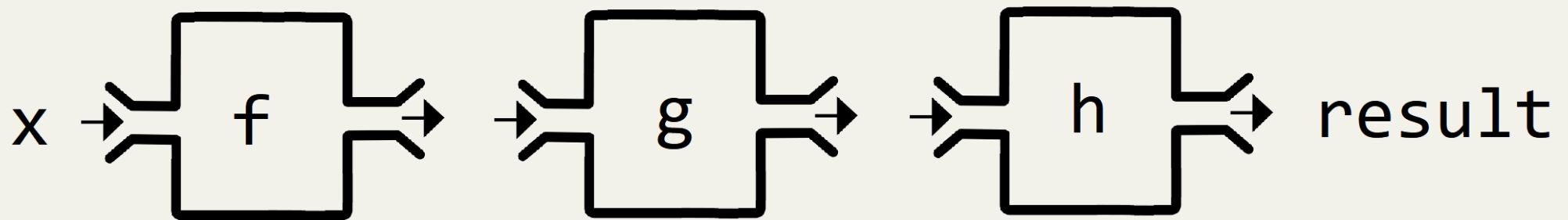
- 0. Use  $x$
- 1. Do  $f$
- 2. Do  $g$
- 3. Do  $h$





# then

- $x \setminus$   
| then |  $f \setminus$   
| then |  $g \setminus$   
| then |  $h$



# How to define “then”

```
from functools import partial

class Infix(object):
    def __init__(self, func):
        self.func = func
    def __or__(self, other):
        return self.func(other)
    def __ror__(self, other):
        return Infix(partial(self.func, other))
    def __call__(self, v1, v2):
        return self.func(v1, v2)
```

```
then = Infix(lambda x,f: f(x))
```

# (Demo) Project Euler

- Math/Programming Challenge problems.





# Question 1

- From 1 to 999, find the sum of all numbers that are either multiples of 3, or multiples of 5.

# Solution Q1

```
range(1,1000) \  
| then | keep(lambda x : x % 3 == 0 or x % 5 == 0) \  
| then | sum \  
| then | print
```

# Solution Q1


```
range(1,1000) \  
| then | keep(lambda x : x % 3 == 0 or x % 5 == 0) \  
| then | sum \  
| then | print
```

Start from 1 to 999

Then keep the numbers you want (multiples of 3 or 5)


Then sum up the remaining numbers

Then print the result



```
range(1,1000)
```


```
[1, 2, 3, 4, 5, ....., 999]
```



```
range(1,1000) \  
| then | keep(lambda x : x % 3 == 0 or x % 5 == 0)
```


```
[3, 5, 6, 9, 10, 12, 15, 18, 20, .....]
```





```
range(1,1000) \  
| then | keep(lambda x : x % 3 == 0 or x % 5 == 0) \  
| then | sum
```

233168



```
range(1,1000) \  
| then | keep(lambda x : x % 3 == 0 or x % 5 == 0) \  
| then | sum \  
| then | print
```

Print 233168 to console



## Question 2

- In the Fibonacci numbers:
- 1,2,3,5,8,13,21,34,55,.....
- What is the sum of even numbers less than 4 million (in the Fibonacci numbers)?

# Solution Q2

```
baseList \  
| then | keep(lambda x : x < 4000000) \  
| then | keep(lambda x : x % 2 == 0) \  
| then | sum \  
| then | print
```

Remark: Extra details in construction of baseList.



# Solution Q2

baseList

[1, 2, 3, 5, 8, 13, 21, 34, 55, 89, .....]

# Solution Q2

```
baseList \  
| then | keep(lambda x : x < 4000000)
```

```
[1, 2, 3, 5, 8, 13, 21, 34, 55, 89, ....., 3524578]
```

# Solution Q2

```
baseList \  
| then | keep(lambda x : x < 4000000) \  
| then | keep(lambda x : x % 2 == 0)
```

```
[2, 8, 34, ....., 3524578]
```

# Solution Q2

```
baseList \  
| then | keep(lambda x : x < 4000000) \  
| then | keep(lambda x : x % 2 == 0) \  
| then | sum
```

4613732



# Solution Q2

```
baseList \  
| then | keep(lambda x : x < 4000000) \  
| then | keep(lambda x : x % 2 == 0) \  
| then | sum \  
| then | print
```

Print 4613732 to Console

# Question 4

- A palindromic number reads the same both ways.  
e.g. “14241”, “927729”
- Which two 3-digit numbers, “a” and “b”, will create the largest palindrome product:
- $c = a * b$

# Solution Q4

```
number_pairs \  
| then | change(lambda a,b: a * b) \  
| then | keep(IsPalindrome) \  
| then | max \  
| then | print
```

Remark: Need slight modification for functions accepting  
Tuples.

# Question 6

- Calculate:

$$(1 + 2 + \dots + 100)^2 - (1^2 + 2^2 + \dots + 100^2)$$


$$(1 + 2 + \dots + 100)^2$$

```
LHS = \  
    range(1,101) \  
    | then | sum \  
    | then | (lambda s: s * s)
```


$$- (1^2 + 2^2 + \dots + 100^2)$$

```
RHS = \  
    range(1,101) \  
    | then | change(lambda x : x * x) \  
    | then | sum
```

# Solution Q6

```
RHS = \  
    range(1,101) \  
    | then | change(lambda x : x * x) \  
    | then | sum  
LHS = \  
    range(1,101) \  
    | then | sum \  
    | then | (lambda s: s * s)  
  
print(LHS - RHS)
```

# Question 8

- 82166370484403199890008895243450658541227588666881
- The 4 neighboring digits with the largest product is  
 $9 \times 9 \times 8 \times 9 = 5832$
- Given a 1000-digit number\*, find the largest product created by 13 adjacent digits.

• \* <https://projecteuler.net/problem=8>



# Solution Q8

```
long_string \  
| then | change (int) \  
| then | windowed(13) \  
| then | change(product) \  
| then | max \  
| then | print
```



# Solution Q8

```
long_string \  
| then | change (int)
```

```
[8,2,1,6,6,3,7,0,4,8,4,4,0,.....]
```

# Solution Q8

```
long_string \  
| then | change (int) \  
| then | windowed(13)
```

```
[[8,2,1,6,6,...], [2,1,6,6,...,...], [1,6,6,...,...,...],  
.....]
```

# Solution Q8

```
long_string \  
| then | change (int) \  
| then | windowed(13) \  
| then | change(product)
```

```
[ product1      ,      product2      ,      product3      ,  
.....]
```

# Solution Q8

```
long_string \  
| then | change (int) \  
| then | windowed(13) \  
| then | change(product) \  
| then | max
```

```
max_product
```

# Solution Q8

```
long_string \  
| then | change (int) \  
| then | windowed(13) \  
| then | change(product) \  
| then | max \  
| then | print
```

print max\_product to the Console.

# Question 9

- Find the positive integers,  $a, b, c$ , that satisfy:
  - $a < b < c$
  - $a + b + c = 1000$
  - $a^2 + b^2 = c^2$

# Solution Q9


```
all_pairs \  
| then | change(lambda a,b: (a,b,1000 - a - b)) \  
| then | keep(lambda a,b,c: a < b < c) \  
| then | keep(lambda a,b,c: a * a + b * b == c * c) \  
| then | print
```

Remark: Need modification for functions accepting  
Tuples.





## Non-math example 1



```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime \  
    | then | sqlDB.fetchall \  
    | then | change(lambda sales: sales.country.upper()) \  
    | then | keep(lambda sales: sales.country = ‘SG’) \  
    | then | sumby(lambda sales: sales.amount) \  
    | then | (lambda totalsale: totalsale * 0.2)
```


Remark: Demonstration only. Actual code may differ.  
(e.g. when using upper())



commission = \


“select \* from salesDB where date = ‘%Y-%m-%d’”

“select \* from salesDB where date = ‘%Y-%m-%d’”




```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime
```

```
“select * from salesDB where date = ‘2019-07-08’”
```




```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime \  
    | then | sqlDB.fetchall
```

```
[( $200, ‘SG’ ), ( $160, ‘my’ ), ( $300, ‘sg’ ), ..... ]
```




```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime \  
    | then | sqlDB.fetchall \  
    | then | change(lambda sales: sales.country.upper())
```

```
[( $200, ‘SG’ ), ( $160, ‘MY’ ), ( $300, ‘SG’ ), .....]
```



```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime \  
    | then | sqlDB.fetchall \  
    | then | change(lambda sales: sales.country.upper()) \  
    | then | keep(lambda sales: sales.country = ‘SG’)
```


```
[( $200, ‘SG’ ), ( $300, ‘SG’ ), ( $500, ‘SG’ ) ]
```



```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime \  
    | then | sqlDB.fetchall \  
    | then | change(lambda sales: sales.country.upper()) \  
    | then | keep(lambda sales: sales.country = ‘SG’) \  
    | then | sumby(lambda sales: sales.amount)
```

\$1000






```
commission = \  
    “select * from salesDB where date = ‘%Y-%m-%d’” \  
    | then | today.strftime \  
    | then | sqlDB.fetchall \  
    | then | change(lambda sales: sales.country.upper()) \  
    | then | keep(lambda sales: sales.country = ‘SG’) \  
    | then | sumby(lambda sales: sales.amount) \  
    | then | (lambda totalsale: totalsale * 0.2)
```

\$200



## Non-math example 2



```
data_count = \  
    local_folder \  
    | then | os.listdir \  
    | then | remove(lambda name: name in bad_set) \  
    | then | change(count_num_lines) \  
    | then | sum
```



(Optional Topic) reduce



# (Optional) reduce

```
start = 0
for x from 1 to 5:
    start = start + x
print(start)
```

# 15



# (Optional) reduce

```
start = 1000
for x from 1 to 5:
    start = start + x
print(start)
```

# 1015

Starting value matters!



# (Optional) reduce

```
start = 1000
for x from 1 to 15:
    start = start + x
print(start)
```

# 1120

Range of value matters!



# (Optional) reduce

```
start = 1000
for x from 1 to 15:
    start = start * x
print(start)
```

```
# 1307674368000000
```

Formula matters!






# **(Optional) reduce**

Given:

1. A starting value
2. A list of elements
3. A transition formula that updates the starting value

We can calculate the final value after accumulating over the whole list.



## (Optional Topic) Infix Operator


$$3 + 4$$

The + symbol connects the left number  
and right number


$$3 * 4$$

The \* symbol connects the left number  
and right number



exp1    |    then    |    exp2

The | then | symbol connects the left  
expression and right expression



exp1  
| then | exp2

The | then | symbol connects the top  
expression and bottom expression



# Summary

- keep (filter)
- change (map)
- then (pipe-forward)



Q&A