



Pipes and “then” notation: Functional Programming in Python



Remark

- Techniques from F#.
- This is an update of my previous talk on “then” notation in Python



About speaker

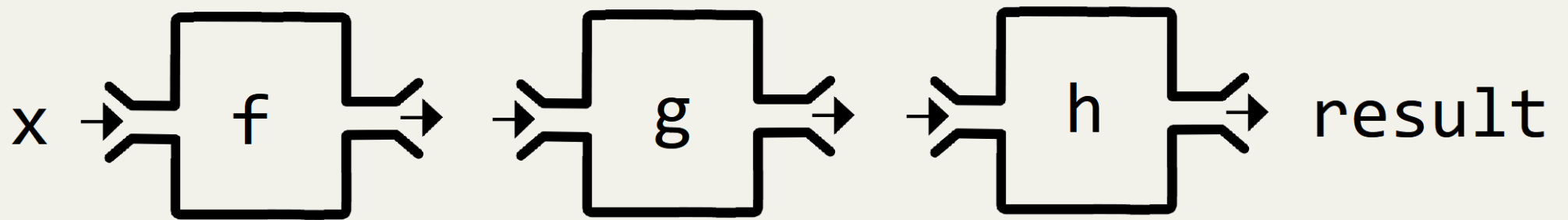
- Chang HaiBin
 - Data Engineer (Hedge Fund)
 - M.Sc. Uni. of Michigan (Math)
-
- Financial Engineer (Numerical Technologies)
 - Business Analyst (U.S. Mattress)



Previously:

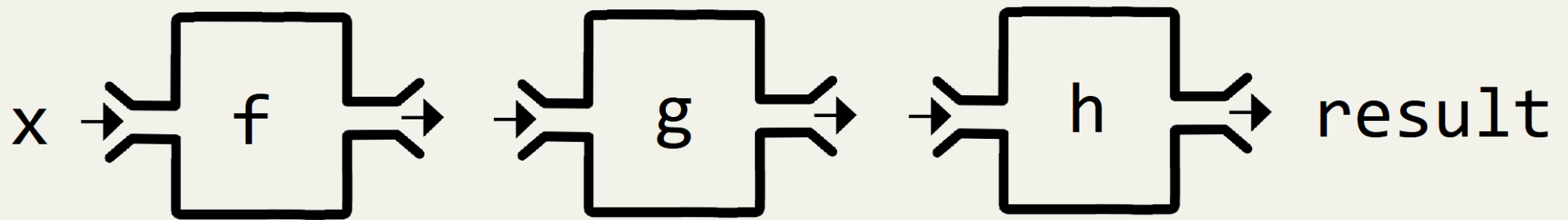
then (pipe-forward)

then



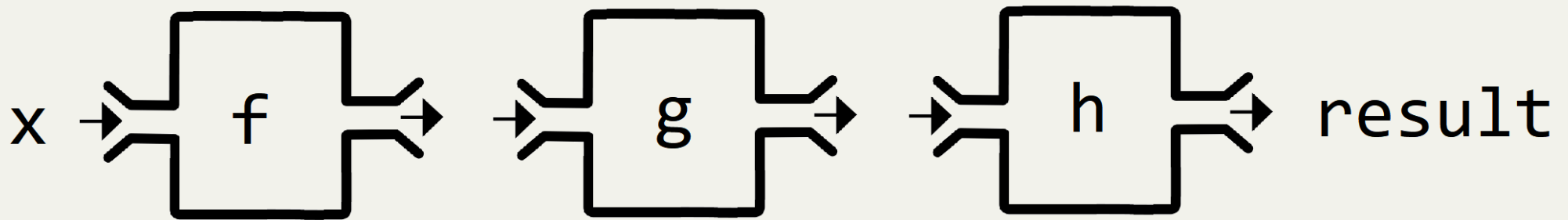
then

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



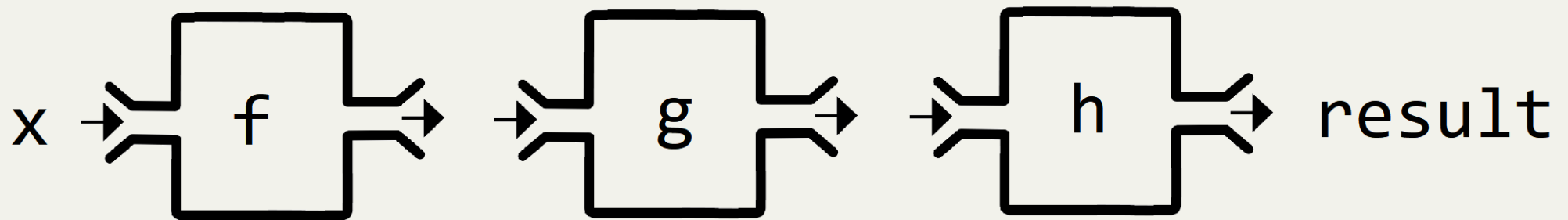
then

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



then

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



(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




Original Code


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

If we allow symbols...

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

Remark: The symbol used in F# is |>

- 
- Cannot create new symbols in Python
 - Overwrite the `|` operator to support the “`| then |`” notation

- 
- Cannot create new symbols in Python
 - Overwrite the `|` operator to support the “`|` then `|`” notation
 - But will cause trouble if other package also uses the vertical `|` operator.

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))
```



Pythonic way?

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



`*args`



Function input

```
def add(a,b,c):  
    return a + b + c
```




Function input

```
def add(a,b,c):  
    return a + b + c
```

```
x = add(1,2,3)
```

```
# x = 6
```

Function input

```
def add(a,b,c):  
    return a + b + c
```

```
x = add(1,2,3)
```

```
# x = 6
```

```
y = add(1,2)
```

```
# ERROR!
```

```
z = add(1,2,3,4,5)
```

```
# ERROR!
```



Variable number of inputs

```
def add(*args):  
    result = 0  
    for x in args:  
        result = result + x  
    return result
```

Variable number of inputs

```
def add(*args):  
    result = 0  
    for x in args:  
        result = result + x  
    return result
```

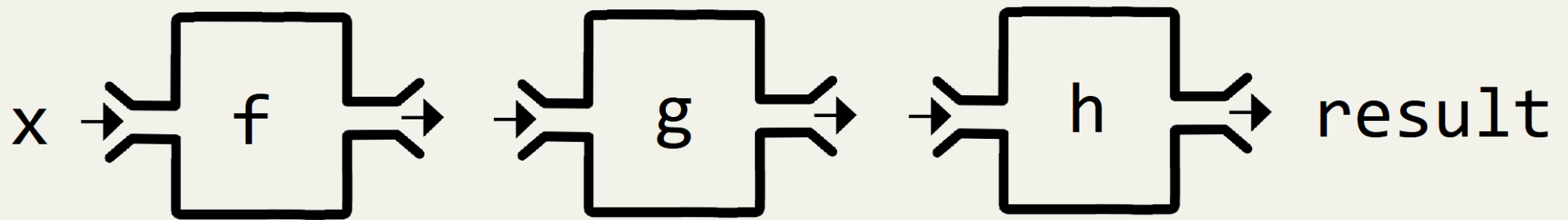
```
x = add(1,2,3)  
y = add(1,2)  
z = add(1,2,3,4,5)  
# x = 6, y = 3, z = 15
```



pipe

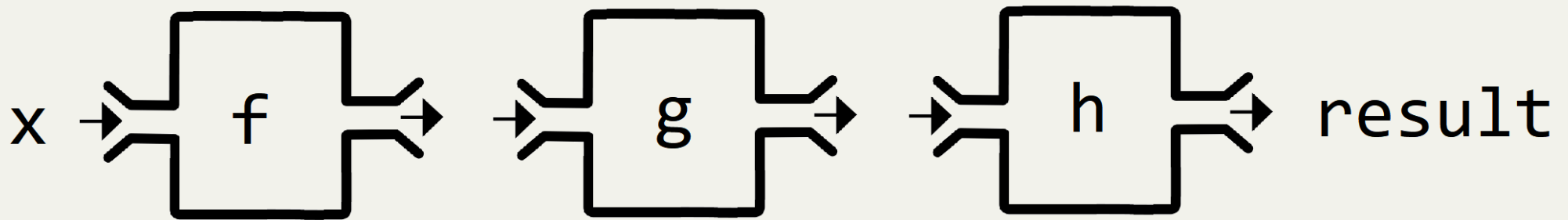
then

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



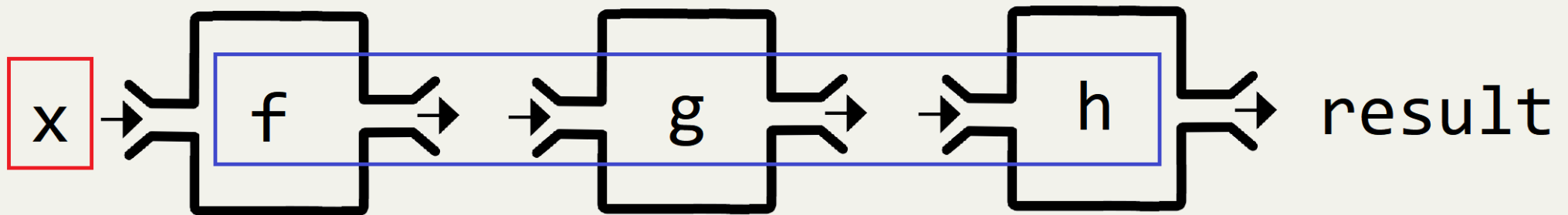
then

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



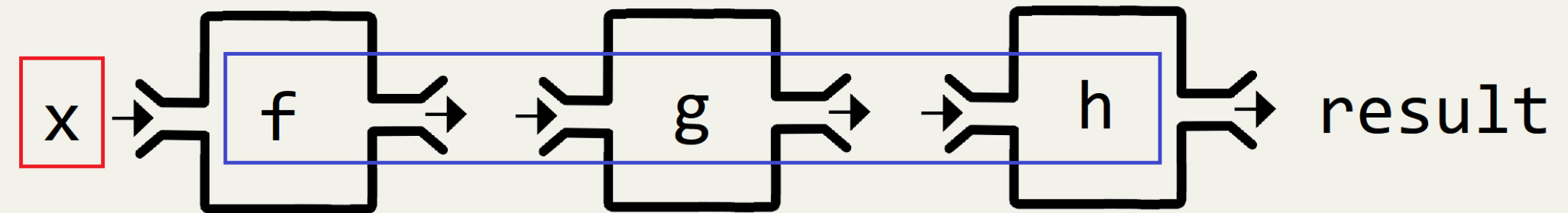
then

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



pipe

```
def pipe(x, *fs):
```

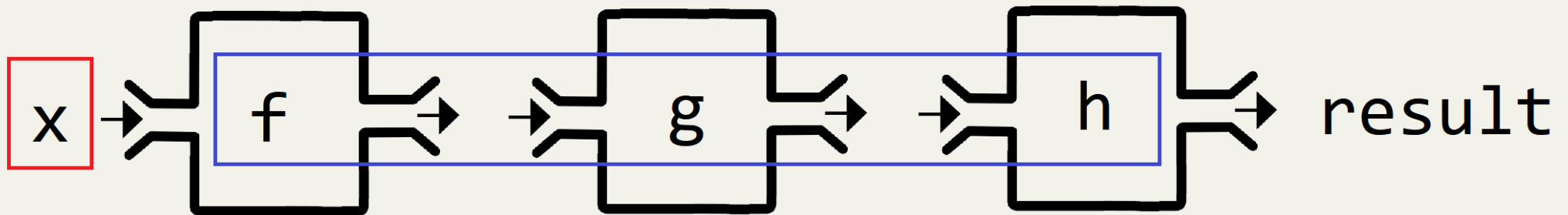


pipe

```
def pipe(x, *fs):
```

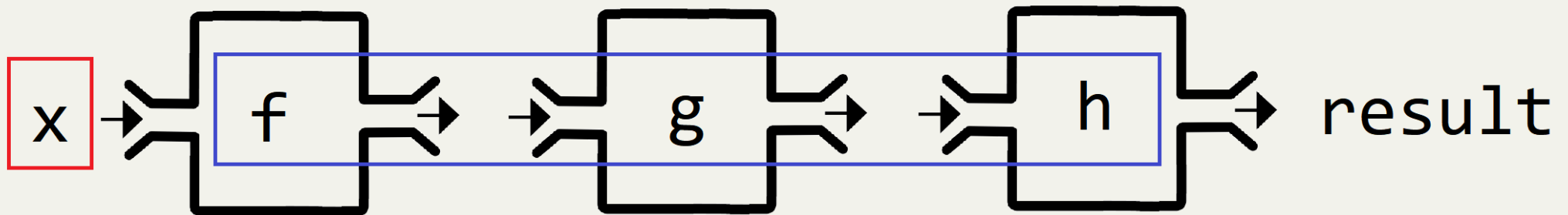
More than 1 apple -> apples
More than 1 computer -> computers

More than 1 function (functions are usually denoted “f” in math) -> fs



pipe

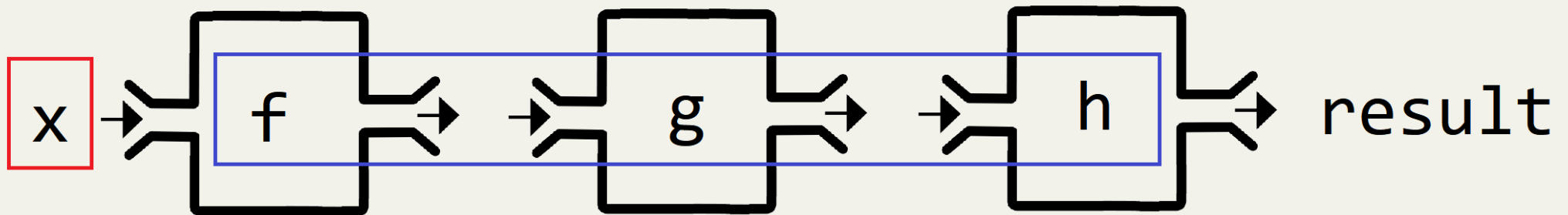
```
def pipe(x, *fs):  
    temp = x  
    for f in fs:  
        temp = f(temp)  
    return temp
```



How to use it?

```
def pipe(x, *fs):
```

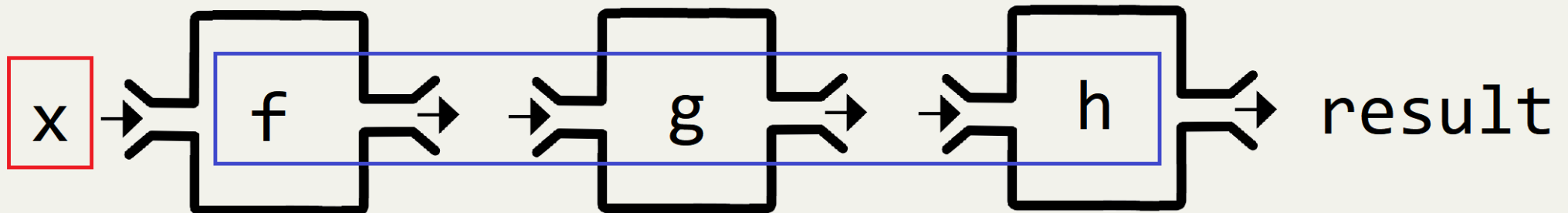
```
    result = pipe(x, f, g, h)
```



How to use it?

```
def pipe(x, *fs):
```

```
    result = pipe(x,  
                  f,  
                  g,  
                  h)
```





Compare with “then” notation

Original “then” Code

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

pipe-notation

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

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


pipe-notation

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

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

pipe-notation

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

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



Demo



Pros and Cons

Reminder: Symbols

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

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

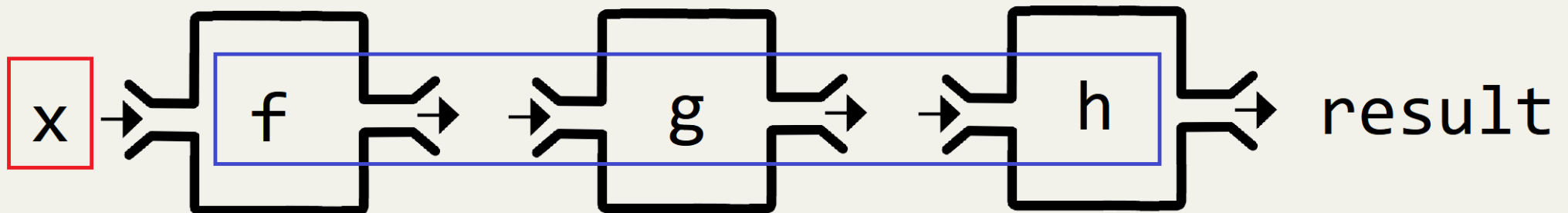
comparison

“then” arrow notation:

$x \rightarrow f \rightarrow g \rightarrow h$

Pipe notation:

`pipe(x, f, g, h)`



analogy

“then” arrow notation:

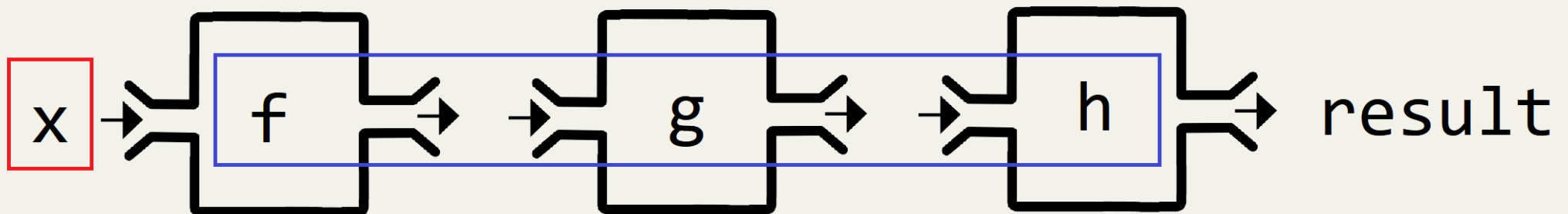
$x \rightarrow f \rightarrow g \rightarrow h$

$1 + 2 + 3 + 4$

Pipe notation:

`pipe(x, f, g, h)`

`add (1, 2, 3, 4)`





“then” feels natural

- “then”: $1 + 2 + 3 + 4$
- Pipe: `add(1,2,3,4)`

“then” feels natural

- “then”: $1 + 2 + 3 + 4$
- Pipe: `add(1,2,3,4)`
- “then” is easier to chain:
- $1 + 2 + 3 + 4 + 5 = (1 + 2 + 3 + 4) + 5$

“then” feels natural

- “then”: $1 + 2 + 3 + 4$
- Pipe: `add(1,2,3,4)`
- “then” is easier to chain:
- $1 + 2 + 3 + 4 + 5 = (1 + 2 + 3 + 4) + 5$
- `add(1,2,3,4,5) = add(add(1,2,3,4),5)`
- Infix notation “+” feels natural, e.g. like primary school math

“then” has clear direction

- “then”: $x \rightarrow f \rightarrow g \rightarrow h$
- Pipe: `add(x, f, g, h)`

“then” has clear direction

- “then”: $x \rightarrow f \rightarrow g \rightarrow h$
- Pipe: `add(x, f, g, h)`
- Visually $x \rightarrow f \rightarrow g \rightarrow h$ looks clearer

“then” has clear direction

- “then”: $x \rightarrow f \rightarrow g \rightarrow h$
- Pipe: `add(x, f, g, h)`
- Visually $x \rightarrow f \rightarrow g \rightarrow h$ looks clearer
- `add(x, f, g, h)` does not convey the order visually

Pipe is more Pythonic

- “then”: $x \rightarrow f \rightarrow g \rightarrow h$
- Pipe: `add(x, f, g, h)`

Pipe is more Pythonic

- “then”: $x \rightarrow f \rightarrow g \rightarrow h$
- Pipe: `add(x, f, g, h)`
- Python does not allow new symbol.
- Implemented in this way:
- `x |then| f |then| g |then| h`

Pipe is more Pythonic

- “then”: $x \rightarrow f \rightarrow g \rightarrow h$
- Pipe: `add(x, f, g, h)`
- Python does not allow new symbol.
- Implemented in this way:
- `x |then| f |then| g |then| h`
- Leads to conflict if there are other uses of vertical `|` as well.

Pipe easy implementation

```
def pipe(x,*fs):  
    temp = x  
    for f in fs:  
        temp = f(temp)  
    return temp
```


Compare this to implementation of then (see next slide)

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))
```



List of instructions
using the * notation



* notation

- The star * notation allows more flexibility.
- (Double-edged sword)



Example

```
def product(xs):  
    .....
```

Create a function that takes a list of numbers, and calculate the product.



Example

```
def product(xs):  
    temp = 1  
    for x in xs:  
        temp = temp * x  
    return temp
```




Example

```
def product(xs):  
    return pipe(  
        1,  
        *[mult_with(x) for x in xs]  
    )
```

```
def mult_with(x):  
    return lambda y: x * y
```

Example

```
def product(xs):  
    return pipe(  
        1,  
        *[mult_with(x) for x in xs]  
    )
```



Arbitrary number
of steps/instructions

```
def mult_with(x):  
    return lambda y: x * y
```




Example: Project Euler Q5



Project Euler Q5

What is the smallest integer that can be divided (no remainder) by all numbers from 1 to 20?



Remark

Assume that you know how to calculate the LCM (lowest common multiple) of two numbers,

Which you can calculate with HCF/GCD (Highest Common Factor/
Greatest Common Divisor) of two numbers

Which you can calculate using Euclid's algorithm.



Project Euler Q5

What is the smallest integer that can be divided (no remainder) by all numbers from 1 to 20?



Project Euler Q5

What is the smallest integer that can be divided (no remainder) by all numbers from 1 to 20?

A

Step A: 1,2



Project Euler Q5

What is the smallest integer that can be divided (no remainder) by all numbers from 1 to 20?

A -> B

Step A: 1,2

Step B: 1,2,3

Project Euler Q5

What is the smallest integer that can be divided (no remainder) by all numbers from 1 to 20?

A -> B -> C

Step A: 1,2

Step B: 1,2,3

Step C: 1,2,3,4

etc.



Solution 1

```
temp = 1
for x in range(1,21):
    temp = lcm(temp,x)
return temp
```




Solution 2

```
pipe(  
    1,  
    *[lcm_with(x) for x in range(1,21)]  
)
```



How does it work?



Example

```
def f1(x): return x + 1
def f2(x): return x + 2
def f3(x): return x + 3
```


```
pipe(
    100,
    f1,
    f2,
    f3
)
```



Example

```
def f1(x): return x + 1
def f2(x): return x + 2
def f3(x): return x + 3
fs = [f1, f2, f3]
```

```
pipe(
    100,
    *fs
)
```



Conclusion

pipe-notation

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

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



* notation

```
pipe(  
    1,  
    *[lcm_with(x) for x in range(1,21)]  
)
```



Implementation

```
def pipe(x,*fs):  
    temp = x  
    for f in fs:  
        temp = f(temp)  
    return temp
```




Q&A