Functional Programming with Python

Why It’s Good To Be Lazy?

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Agenda

1. Different programming paradigms
2. Functional programming in general
3. Functional features in Python
Algorithm

- How to explain your granny what is programming?
- Algorithm is a recipe how to cook a program
- Actually computers work this way (machine language)
- Called *imperative programming*
Functional programming

- *Functional programming* is a more abstract approach
- Program seen as evaluations of mathematical functions
- More focused on **what** to compute than **how** to compute
Features of functional languages

- Functions as *first-class* objects
- Support for *high-order* functions
- Recursion used instead of loop constructs (*tail recursion* often optimized)
- Lists as basic data structures (see Lisp)
- **Avoiding side effects** (no shared state)
Functional Programming with Python

Introduction

Functional programming

Benefits of stateless programs

- Idempotent (*pure*) functions
- Order of evaluation not defined
- Lazy evaluation possible
- Optimizations
- Concurrent processing
- Easier to test and debug

Side effects can’t be eliminated, but can be isolated (*monads*)
Theoretical models

**Turing machine** (Alan Turing)

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**Lambda λ calculus** (Alonzo Church)

\[
\text{TRUE} := \lambda x y . x \\
\text{FALSE} := \lambda x y . y
\]

Computationally equivalent (Church-Turing thesis)
What about the real world?

- Functional programming is not mainstream
- But it widens your perspective on programming
- Pure functional programming is difficult
- Languages borrow concepts from the functional world
- Recent revival due to a need for concurrency (Erlang)
Python is **not** a functional language

But has some functional features...
First-class functions

Lambda defines an anonymous function

def square(x):
    return x**2

equivalent to

square = lambda x: x**2

Unfortunately no multi-line lambdas (like blocks in Ruby)
First-class functions

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equivalent to

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Closures

Closure is a function with bound variables

```python
def build_taxer(rate):
    def taxer(amount):
        return amount * (float(rate) / 100)
    return taxer

vat1 = build_taxer(22)
vat2 = build_taxer(7)
```

Closure can be seen as a “functional object”
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Closure can be seen as a “functional object”
Prime numbers

Definition

Natural number \( n \) is prime iff

\[ \neg \exists k \in [2, n) : n \equiv 0 \mod k \]

How to translate this into code?
```python
def is_prime(n):
    k = 2
    while k < n:
        if n % k == 0:
            return False
        k += 1
    return True
```

- List of statements to execute one after another
- Not obvious if and when the loop ends
- Local side effects
Imperative primes

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Map, filter and reduce

High-order functions operating on lists (sequences)

- Apply a function to every element
  ```python
  map(lambda x: x**2, range(1,5))
  -> [1, 4, 9, 16]
  ```
Map, filter and reduce

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- Select elements matching the predicate
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  \text{filter}(\lambda x: x\%2==0, \text{range}(10))
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  \rightarrow [0, 2, 4, 6, 8]
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Map, filter and reduce

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  ```

- Cumulatively reduce elements to a single value
  ```python
  reduce(lambda x,y: x+y, [7, 3, 12])
  -> 22
  ```
Why map and reduce are so useful?

- Can simplify complex loops
- Can be chained
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- Many computations can be reduced to those (not only numeric ones)
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- Can simplify complex loops
- Can be chained
- Many computations can be reduced to those (not only numeric ones)
- Can be easily distributed (see Google’s MapReduce)
Primes, second approach

```python
def is_prime(n):
    len(filter(lambda k: n%k==0, range(2,n))) == 0

def primes(m):
    filter(is_prime, range(1,m))
```

- Clear intention: “Is the list of non-trivial divisors empty?”
- High-order functions can be composed
- No side effects
- return omitted for readability
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List comprehensions

But we can do better!

- *List comprehensions* borrowed from Haskell
  \[ [i**2 \text{ for } i \text{ in } \text{range}(1,10) \text{ if } i\%2==0] \]
  \[ \rightarrow [4, 16, 36, 64] \]
- Inspired by mathematical notation (slight difference)
  \( \{i^2 \mid i \in \mathbb{N}, i \in [1,10] : i \equiv 0 \mod 2 \} \)
- Can replace map and filter (even lambda)
- Simplifies complex chains (more dimensions)
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- Can replace map and *filter* (even lambda)

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Primes, third approach

def is_prime(n):
    True not in [n%k==0 for k in range(2,n)]

def primes(m):
    [n for n in range(1,m) if is_prime(n)]

- Is there any problem with the last two versions?
Primes, third approach

```python
def is_prime(n):
    True not in [n%k==0 for k in range(2,n)]

def primes(m):
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```

- Is there any problem with the last two versions?
- Do we have to go through the whole list?
Generators, iterators and streams

It is said that good programmers are lazy...

- **Iterators** are lazy sequences
- **Generator expressions** help building iterators
  
  ```python
  (i**2 for i in xrange(1,10) if i%2==0)
  -> <generator object at 0x12c4850>
  ```
- Map and filter will be lazy in Python 3000
- Called **streams** in the functional world
Prime numbers, fourth approach

```python
def is_prime(n):
    True not in (n%k==0 for k in xrange(2,n))

is_prime(100000000)
-> False
```

- Lazy evaluation
Prime numbers, fourth approach

def is_prime(n):
    True not in (n%k==0 for k in xrange(2,n))

is_prime(100000000)
-> False

- Lazy evaluation
Can do even better with Python 2.5!

- `any(seq)` returns true if at least one element of the sequence is true (∃, exists)
- `all(seq)` returns true if all elements of the sequence are true (∀, for all)

Short-circuit lazy evaluation, like with logical operators
Primes, grand finale

```python
def is_prime(n):
    not any(n%k==0 for k in xrange(2,n))
```

Does this look familiar?
Primes, grand finale

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Natural number $n$ is *prime* iff

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Tadam!
Summary

- Functional programming allows you to describe the problem in a more abstract way
- Learning functional approach widens your perspective on programming
- It’s worth applying when it makes sense
- Python has some useful functional features
- Python 3000 is getting more lazy
The wizard book

http://mitpress.mit.edu/sicp/
Thank you

May the \( \lambda \) be with You!
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