# Performance Improvements with Cython Kaivalya Rawal

Singapore Python User Group October 2018 Meetup

## What this talk is about

- A very brief introduction to Cython, from an amateur enthusiast's perspective
- Motivation and reasons to use Cython, based on my recent work experience with The Institute for Artificial Intelligence, University of Bremen.
- Tips on Cython optimisation and troubleshooting when working with large codebases



## What this talk is not about

- Providing a thorough outline of Cython capabilities
- Describing best practices for Cython development
- Expert insights from experienced Cython developers

### Live Demonstration 1

Fibonacci Sequence: 0, 1, 1, 2, 3, 5, 8, 13, 21, 34 ...

Generating the Nth fibonacci number: O(n)

Generating the first N fibonacci numbers:  $O(n) \rightarrow O(n^2)$ 

### Live Demonstration 1

Fibonacci Sequence: 0, 1, 1, 2, 3, 5, 8, 13, 21, 34 ...

Generating the Nth fibonacci number: O(n)

Generating the first N fibonacci numbers:  $O(n) \rightarrow O(n^2)$  for "slow version"

Demo: Speeding up "Slow Fibonacci" with Cython, to find the 34th Fibonacci number

## Programming Languages

A human-computer **contract**, ie a set of instructions a **human** can write for a **computer** to perform.

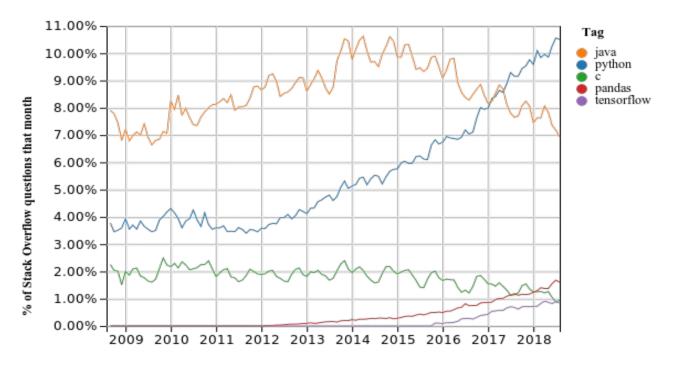
## Programming Languages

A human-computer **contract**, ie a set of instructions a **human** can write for a **computer** to perform.

(Important?) Variations:

- Compiled vs Interpreted;
- Object Oriented vs Functional;
- Static vs Dynamic;
- ...

## Programming Languages



## 2018: Programming for Humans

**Manual Memory Allocation** 

**Automatic Memory Allocation** 

Terse Syntax

Simple Syntax

**Lower Level Control** 

High Speed

Contract is "Computer Friendly"



Relatively Higher Level Language Features

**Lower Speeds** 

Contract is "Human Friendly"

contracts are increasingly human-human too

## 2018: Programming for Humans

**Manual Memory Allocation** 

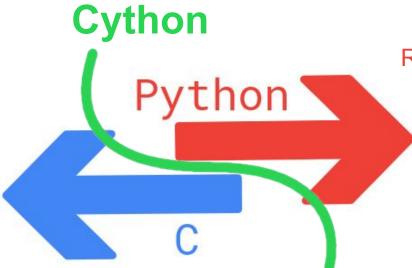
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**Simple Syntax** 

Relatively Higher Level Language Features

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Contract is "Human Friendly"

strike a balance between human and computer friendly

# Cython

A different implementation of the same contract (as CPython).

#### **Cython** ≠ **CPython**

A *superset* of Python.

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Python\* Code

**\** 

Cython Generated 'C'

Program Output

## Live Demonstration 2

Fibonacci again

#### Extra steps:

- 1. Change extension to .pyx
- 2. Create setup.py
- 3. Compile with *build\_ext --inplace*

Python\* Code

 $\downarrow$ 

Cython Generated 'C'



Program Output

## Cython - Overview

#### Examples

- 1.  $n \rightarrow int n$
- 2. c→char c
- 3. d→dict d
- 4. def fib→cpdef fib
- 5. def fib→cdef fib
- 6. class C→cdef class C
  - a. Create .pxd file
- 7. with NoGIL
- 8. Direct interfacing with C structs / procedures

## Cython - Overview

#### Examples

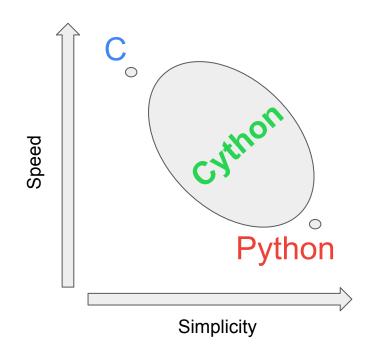
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#### Concepts

- 1. Static typing (variable)
- 2. Static typing (variable)
- 3. Static typing (variable)
- 4. Static typing (params and return)
- 5. Static typing (C only)
- 6. Static typing (attributes)
- 7. ?
- 8.

## Why use Cython?

- Customizable balance between Speed and Simplicity
- Incrementally speed up existing code, without the need for major redesigns\*
- Generation of potentially higher quality C
- Faster development times



## Cython - Optimising Large Codebases

Certainly possible: scikit-learn, scipy, pandas, pracmln, etc already use it in production

Still at version 0.30, not a complete\* superset yet! But still Turing Complete.

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Two techniques to help "cythonize" existing code:

- Annotation
- Profiling

## Live Demonstration 3

#### **Annotations**

- In a Jupyter Notebook
- In standalone files

## Annotations vs Profiling

"Python Interaction" is not a reliable metric. (80-20 rule)

Lead developer might know better than the annotation tool which parts of the code deserve optimisation.

# Annotations vs Profiling

"Python Interaction" is not a reliable metric. (80-20 rule)

Lead developer might know better than the annotation tool which parts of the code deserve optimisation.

"Premature optimization is the root of all evil" - Donald Knuth

"Never optimize without having profiled. Let me repeat this: Never optimize without having profiled your code. Your thoughts about which part of your code takes too much time are wrong."

## Live Demonstration 4

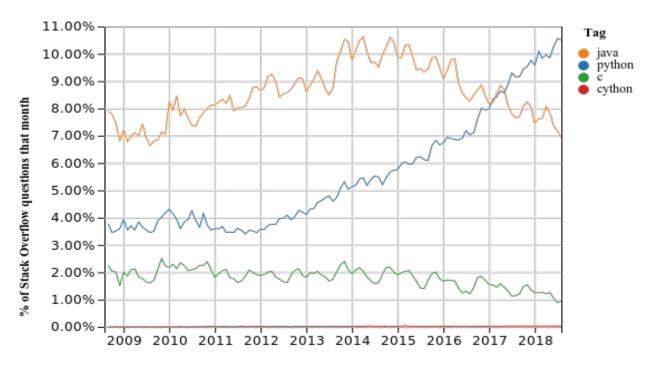
Profiling

Use built-in *cProfile* profiler

Extra steps:

- 1. Add compiler directive
- 2. External analyser cprofilev / snakeviz





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# Thank You Questions?

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