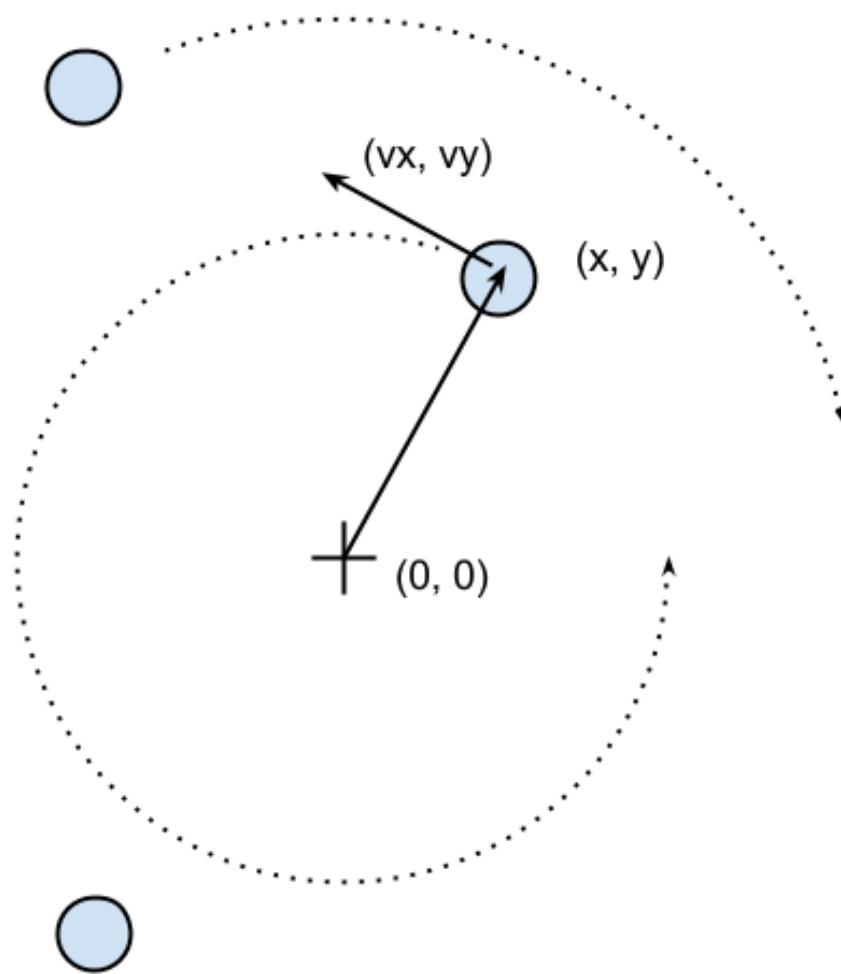
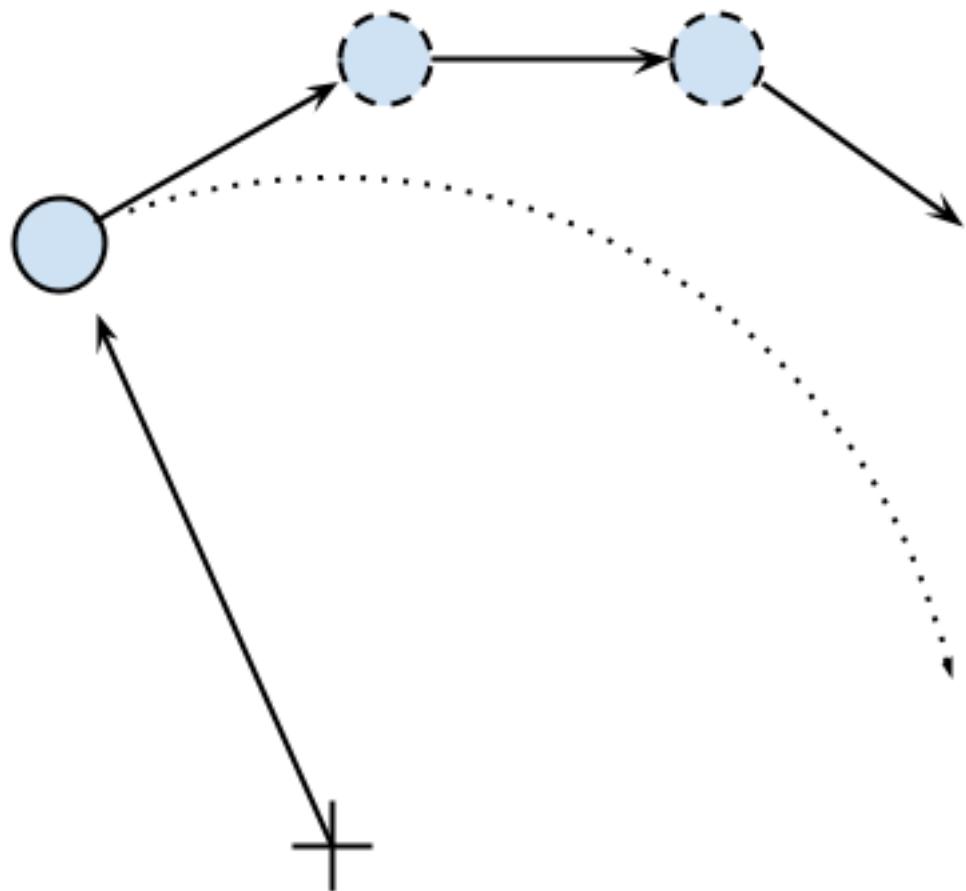
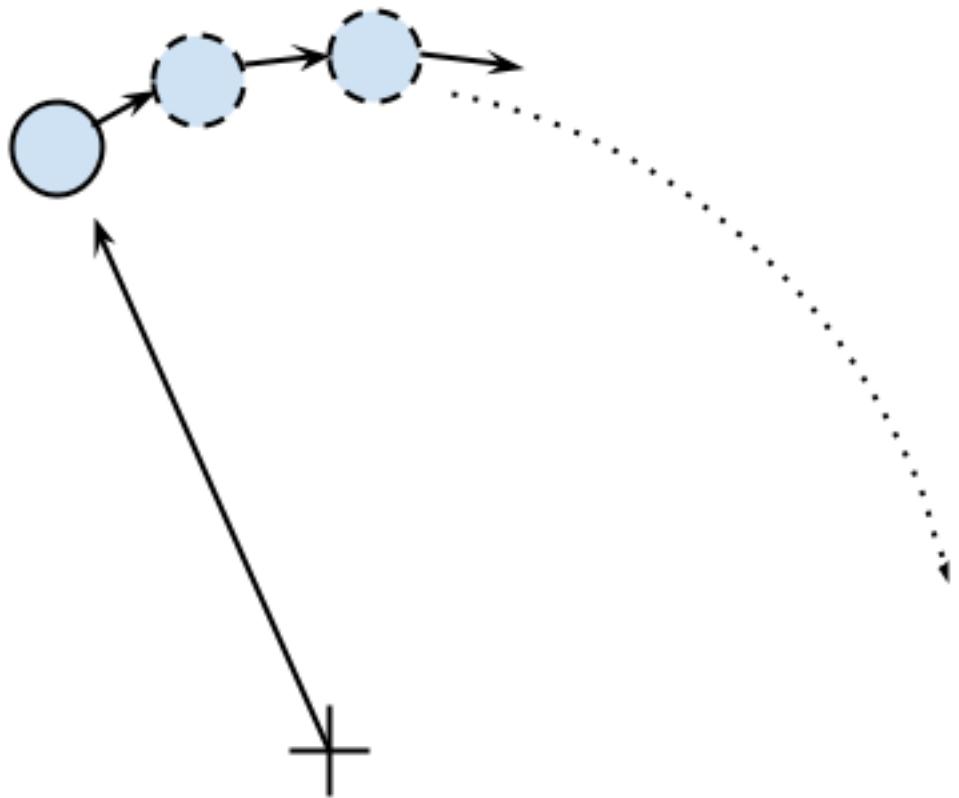


## Chapter 1: Benchmarking and Profiling





```
=====
platform linux -- Python 3.5.2, pytest-3.0.5, py-1.4.32, pluggy-0.4.0
benchmark: 3.0.0 (defaults: timer=time.perf_counter disable_gc=False min_rounds=5 min_time=5.00us max_time=1.00s calibration_precision=10 warmup=False warmup_iterations=100000)
rootdir: /home/gabriele/workspace/hiperf/chapter1, inifile:
plugins: benchmark-3.0.0
collected 2 items

test_simul.py .

----- benchmark: 1 tests -----
Name (time in ms)      Min     Max     Mean   StdDev   Median    IQR  Outliers(*)  Rounds Iterations
test_evolve      29.4716  41.1791  30.4622  2.0234  29.9630  0.7376          2;2       34           1
----- (*) Outliers: 1 Standard Deviation from Mean; 1.5 IQR (InterQuartile Range) from 1st Quartile and 3rd Quartile.
===== 1 passed in 2.52 seconds =====
```

**IPython: chapter1/codes**

```
(hperf) → codes ipython
Python 3.5.2 |Continuum Analytics, Inc.| (default, Jul 2 2016, 17:53:06)
Type "copyright", "credits" or "license" for more information.

IPython 5.1.0 -- An enhanced Interactive Python.
?          -> Introduction and overview of IPython's features.
%quickref -> Quick reference.
help       -> Python's own help system.
object?    -> Details about 'object', use 'object??' for extra details.

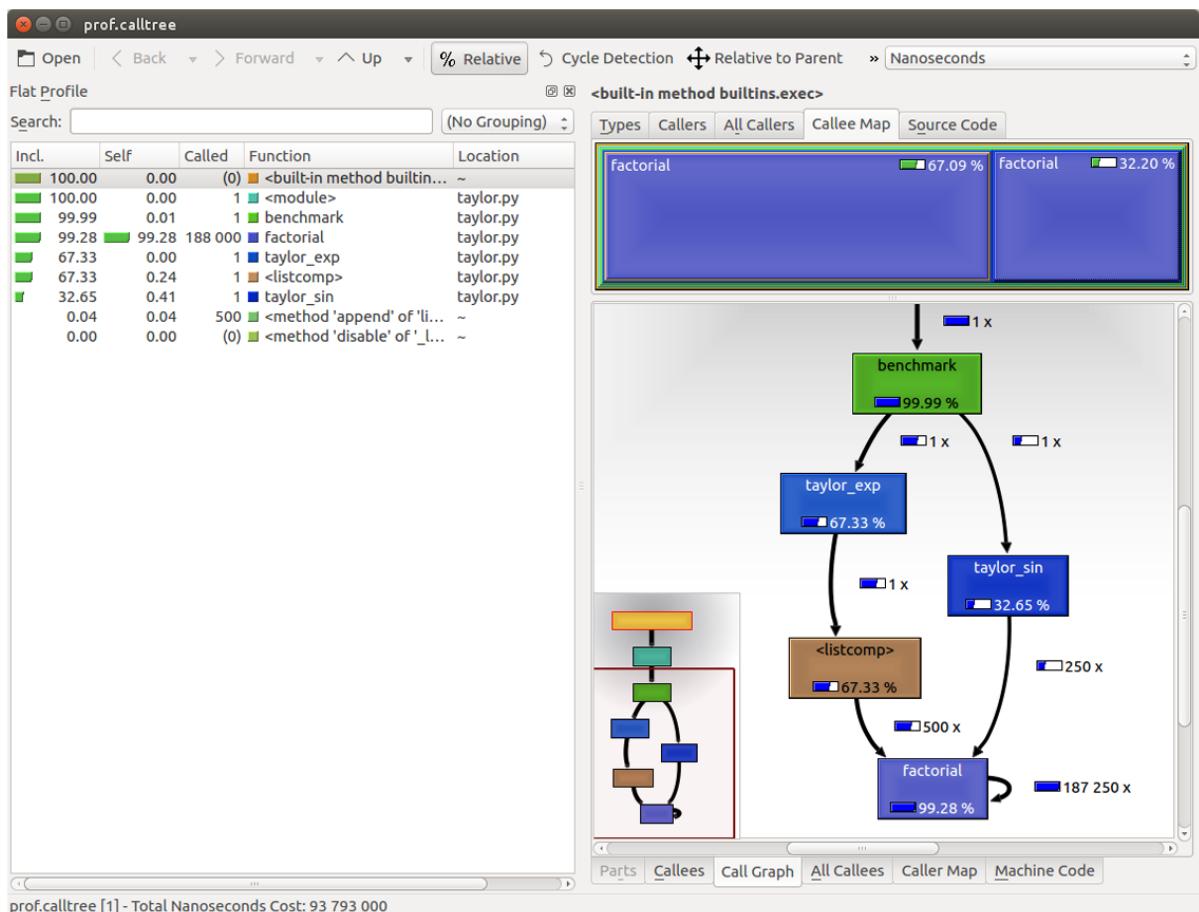
In [1]: from simul import benchmark

In [2]: %prun benchmark()
    707 function calls in 1.231 seconds

    Ordered by: internal time

    ncalls  tottime  percall  cumtime  percall filename:lineno(function)
        1    1.230    1.230    1.230    1.230 simul.py:21(evolve)
        1    0.000    0.000    0.001    0.001 simul.py:118(<listcomp>)
    300    0.000    0.000    0.000    0.000 random.py:342(uniform)
    100    0.000    0.000    0.000    0.000 simul.py:10(__init__)
    300    0.000    0.000    0.000    0.000 {method 'random' of '_random.Random' objects}
        1    0.000    0.000    1.231    1.231 {built-in method builtins.exec}
        1    0.000    0.000    1.231    1.231 <string>:1(<module>)
        1    0.000    0.000    1.231    1.231 simul.py:117(benchmark)
        1    0.000    0.000    0.000    0.000 simul.py:18(__init__)
        1    0.000    0.000    0.000    0.000 {method 'disable' of '_lsprof.Profiler' objects}

In [3]:
```



```
IPython: chapter1/codes

In [1]: %load_ext line_profiler

In [2]: from simul import benchmark, ParticleSimulator

In [3]: %lprun -f ParticleSimulator.evolve benchmark()
Timer unit: 1e-06 s

Total time: 8.66675 s
File: /home/gabriele/workspace/hiperf/chapter1/codes/simul.py
Function: evolve at line 21

Line #      Hits          Time  Per Hit   % Time  Line Contents
=====  ======  ======  ======  ======  ======
    21                      def evolve(self, dt):
    22      1            2       2.0     0.0      timestep = 0.00001
    23      1            4       4.0     0.0      nsteps = int(dt/timestep)
    24
    25  100001        12561     1.3     0.1      for i in range(nsteps):
    26  1010000       867457     0.9    10.0      for p in self.particles:
    27
    28  1000000       1859312     1.9    21.5      norm = (p.x**2 + p.y**2)**0.5
    29  1000000        972028     1.0    11.2      v_x = (-p.y)/norm
    30  1000000        921008     0.9    10.6      v_y = p.x/norm
    31
    32  1000000        982441     1.0    11.3      d_x = timestep * p.ang_vel * v_x
    33  1000000        974838     1.0    11.2      d_y = timestep * p.ang_vel * v_y
    34
    35  1000000       1058183     1.1    12.2      p.x += d_x
    36  1000000       1018915     1.0    11.8      p.y += d_y

In [4]:
```

```
IPython 5.1.0 -- An enhanced Interactive Python.
?          -> Introduction and overview of IPython's features.
%quickref -> Quick reference.
help       -> Python's own help system.
object?    -> Details about 'object', use 'object??' for extra details.

In [1]: %load_ext memory_profiler

In [2]: from simul import benchmark_memory

In [3]: %mprun -f benchmark_memory benchmark_memory()
Filename: /home/gabriele/workspace/hiperf/chapter1/codes/simul.py

Line #    Mem usage  Increment  Line Contents
=====
142      37.8 MiB    0.0 MiB  def benchmark_memory():
143      61.5 MiB    23.7 MiB      particles = [Particle(uniform(-1.0, 1.0),
144                                         uniform(-1.0, 1.0),
145                                         uniform(-1.0, 1.0))
146      61.5 MiB    0.0 MiB          for i in range(100000)]
147
148      61.5 MiB    0.0 MiB      simulator = ParticleSimulator(particles)
149      61.5 MiB    0.0 MiB      simulator.evolve(0.001)

In [4]:
```

```
IPython 5.1.0 -- An enhanced Interactive Python.
?          -> Introduction and overview of IPython's features.
%quickref -> Quick reference.
help       -> Python's own help system.
object?    -> Details about 'object', use 'object??' for extra details.

In [1]: %load_ext memory_profiler

In [2]: from simul import benchmark_memory

In [3]: %mprun -f benchmark_memory benchmark_memory()
Filename: /home/gabriele/workspace/hiperf/chapter1/codes/simul.py

Line #    Mem usage  Increment  Line Contents
=====
142      38.0 MiB    0.0 MiB  def benchmark_memory():
143      51.7 MiB    13.7 MiB      particles = [Particle(uniform(-1.0, 1.0),
144                                         uniform(-1.0, 1.0),
145                                         uniform(-1.0, 1.0))
146      51.7 MiB    0.0 MiB          for i in range(100000)]
147
148      51.7 MiB    0.0 MiB      simulator = ParticleSimulator(particles)
149      51.7 MiB    0.0 MiB      simulator.evolve(0.001)

In [4]:
```

## Chapter 2: Pure Python Optimizations

<b>Code</b>	<b>N=10000 (μs)</b>	<b>N=20000 (μs)</b>	<b>N=30000 (μs)</b>	<b>Time</b>
list.pop()	0.50	0.59	0.58	$O(1)$
list.pop(0)	4.20	8.36	12.09	$O(N)$
list.append(1)	0.43	0.45	0.46	$O(1)$
list.insert(0, 1)	6.20	11.97	17.41	$O(N)$

<b>Code</b>	<b>N=10000 (μs)</b>	<b>N=20000 (μs)</b>	<b>N=30000 (μs)</b>	<b>Time</b>
deque.pop()	0.41	0.47	0.51	$O(1)$
deque.popleft()	0.39	0.51	0.47	$O(1)$
deque.append(1)	0.42	0.48	0.50	$O(1)$
deque.appendleft(1)	0.38	0.47	0.51	$O(1)$

<b>Code</b>	<b>N=10000 (μs)</b>	<b>N=20000 (μs)</b>	<b>N=30000 (μs)</b>	<b>Time</b>
deque[0]	0.37	0.41	0.45	$O(1)$
deque[N - 1]	0.37	0.42	0.43	$O(1)$
deque[int(N / 2)]	1.14	1.71	2.48	$O(N)$

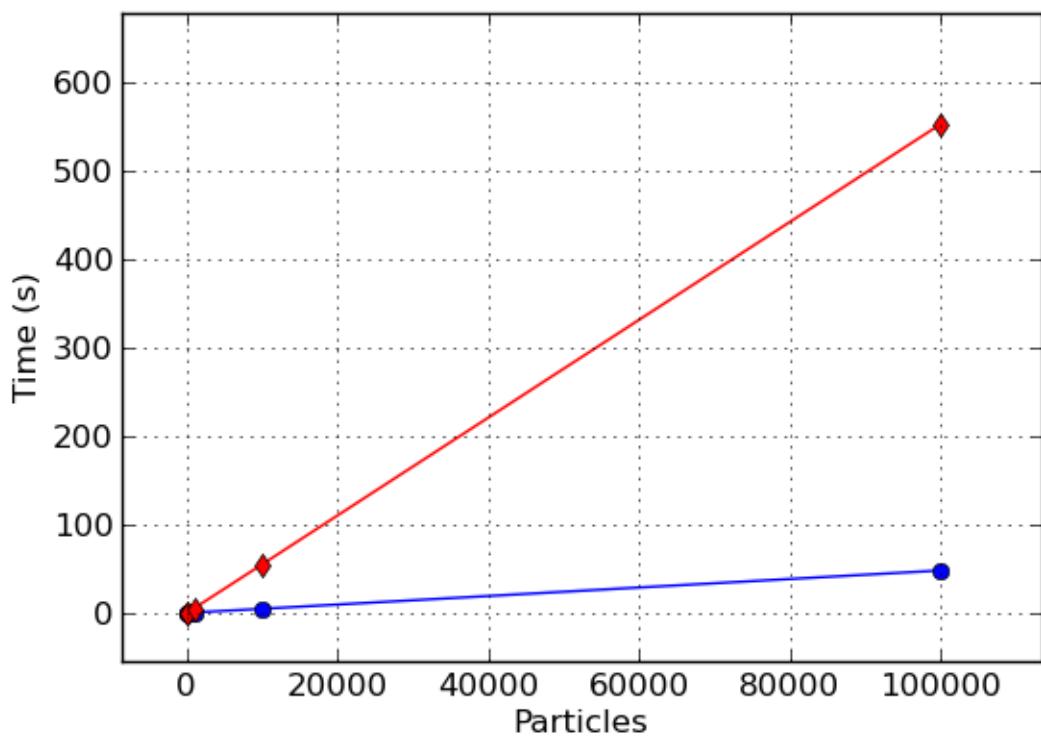
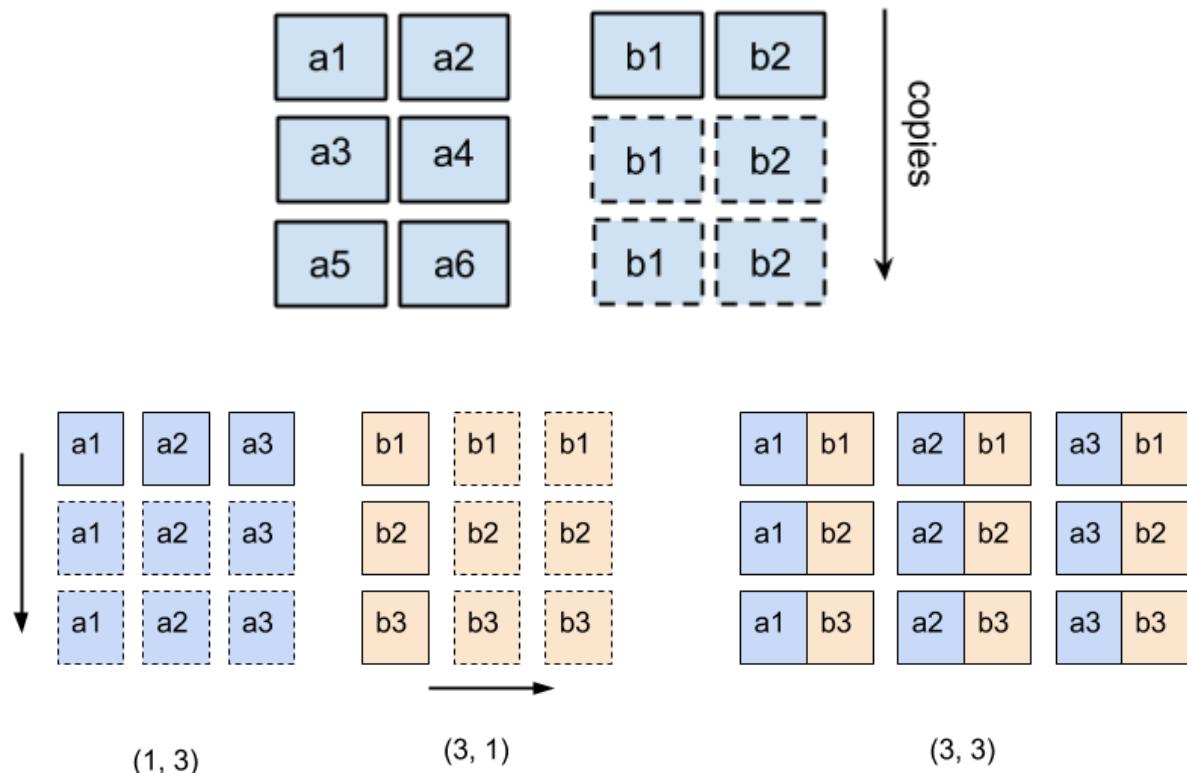
<b>Code</b>	<b>N=10000 (μs)</b>	<b>N=20000 (μs)</b>	<b>N=30000 (μs)</b>	<b>Time</b>
list.index(a)	87.55	171.06	263.17	$O(N)$
index_bisect(list, a)	3.16	3.20	4.71	$O(\log(N))$

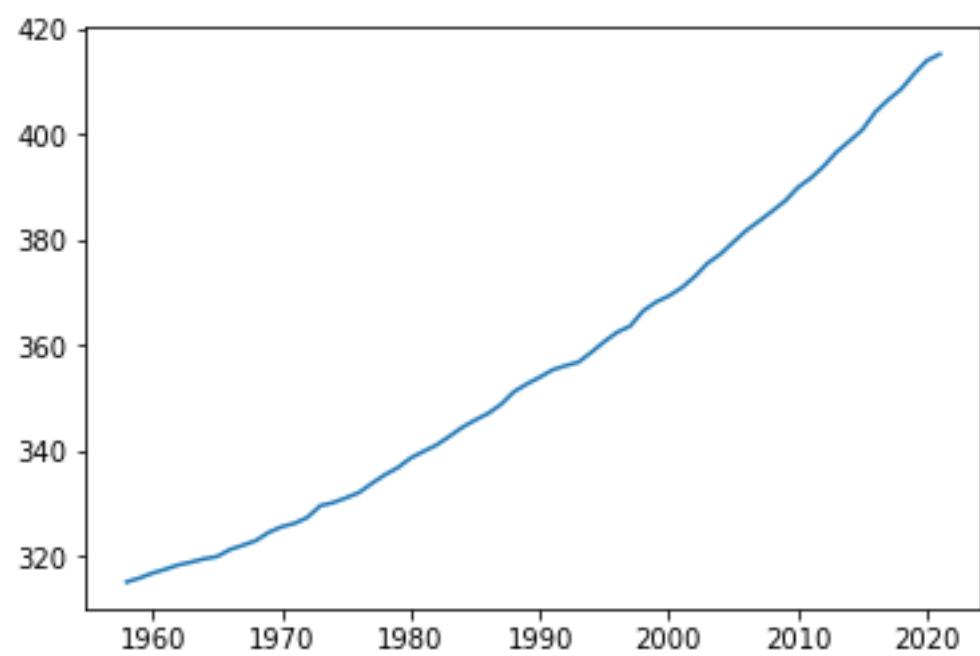
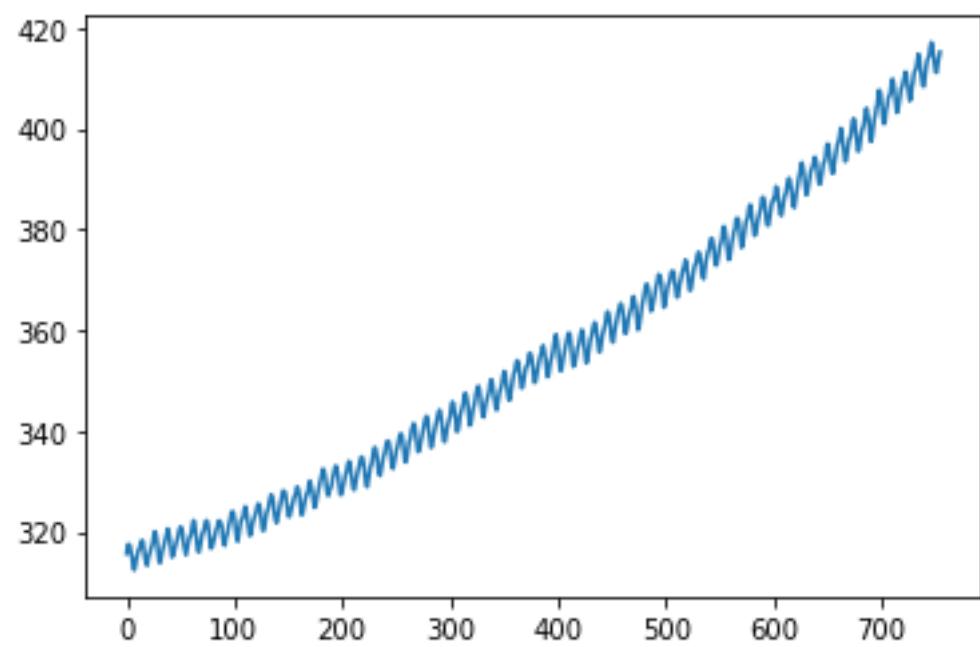
<b>Code</b>	<b>N=1000 (μs)</b>	<b>N=2000 (μs)</b>	<b>N=3000 (μs)</b>	<b>Time</b>
Counter(items)	51.48	96.63	140.26	$O(N)$
counter_dict(items)	111.96	197.13	282.79	$O(N)$
counter_defaultdict(items)	120.90	238.27	359.60	$O(N)$

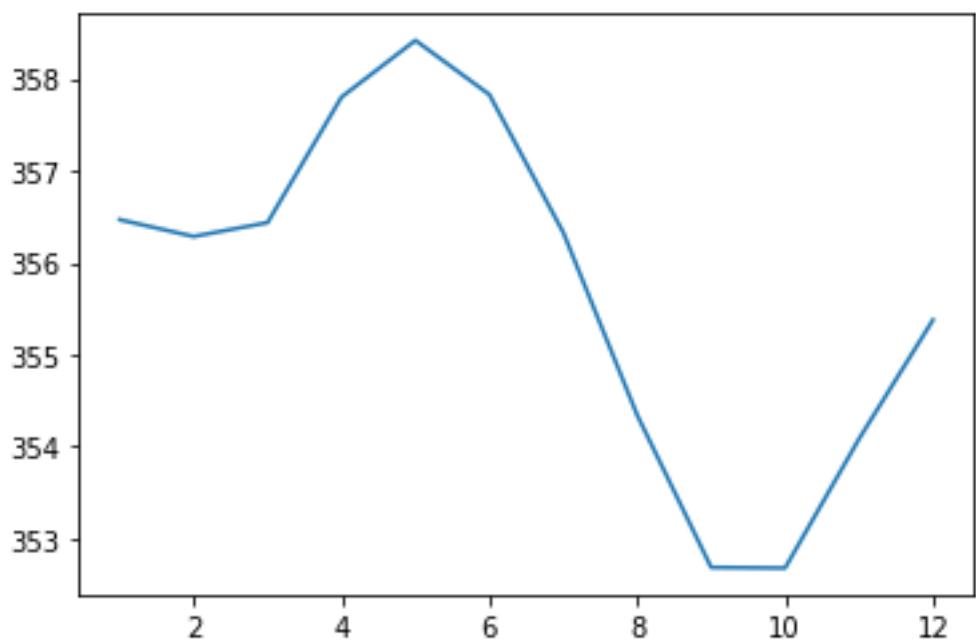
<b>Code</b>	<b>Time</b>
s.union(t)	$O(S + T)$
s.intersection(t)	$O(\min(S, T))$
s.difference(t)	$O(S)$

Algorithm	N=10000 ( $\mu$ s)	N=20000 ( $\mu$ s)	N=30000 ( $\mu$ s)	Time
Trie	17.12	17.27	17.47	O(S)
Linear scan	1978.44	4075.72	6398.06	O(N)

## Chapter 3: Fast Array Operations with NumPy and Pandas







```
[7]: ds = xr.Dataset.from_dataframe(df)
ds
```

```
[7]: xarray.Dataset
```

► Dimensions: **(month: 12, year: 64)**

▼ Coordinates:

year	(year)	int64	1958 1959 1960 ... 2019 2020 2021
------	--------	-------	-----------------------------------

month	(month)	int64	1 2 3 4 5 6 7 8 9 10 11 12
-------	---------	-------	----------------------------

▼ Data variables:

co2	(year, month)	float64	nan nan 315.7 317.4 ... nan nan nan
-----	---------------	---------	-------------------------------------

► Attributes: (0)



```
[9]: ds['co2'][:10, :5]
```

```
[9]: xarray.DataArray 'co2' (year: 10, month: 5)
```

```
array([[  nan,  nan, 315.7 , 317.45, 317.51],
       [315.58, 316.49, 316.65, 317.72, 318.29],
       [316.43, 316.98, 317.58, 319.03, 320.04],
       [316.89, 317.7 , 318.54, 319.48, 320.58],
       [317.94, 318.55, 319.68, 320.57, 321.02],
       [318.74, 319.07, 319.86, 321.38, 322.25],
       [319.57, 320.01, 320.74, 321.84, 322.26],
       [319.44, 320.44, 320.89, 322.14, 322.17],
       [320.62, 321.6 , 322.39, 323.7 , 324.08],
       [322.33, 322.5 , 323.04, 324.42, 325. ]])
```

▼ Coordinates:

year	(year)	int64	1958	1959	1960	...	1965	1966	1967		
month	(month)	int64	1	2	3	4	5				

► Attributes: (0)

```
[11]: ds.mean(dim='month')
```

```
[11]: xarray.Dataset
```

► Dimensions: (year: 64)

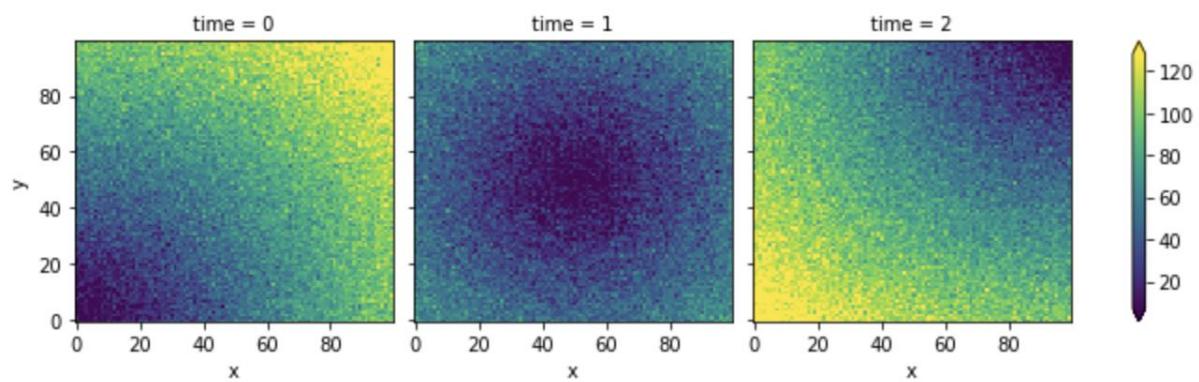
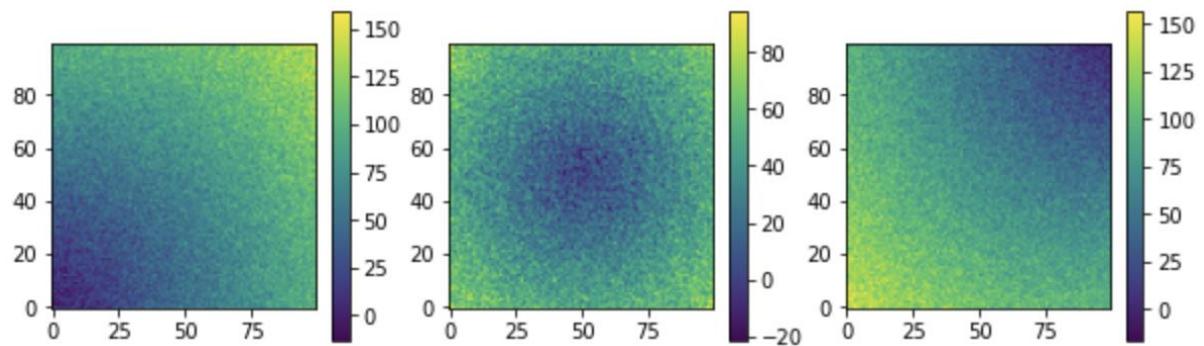
▼ Coordinates:

year	(year)	int64	1958	1959	1960	...	2019	2020	2021		
------	--------	-------	------	------	------	-----	------	------	------	--	--

▼ Data variables:

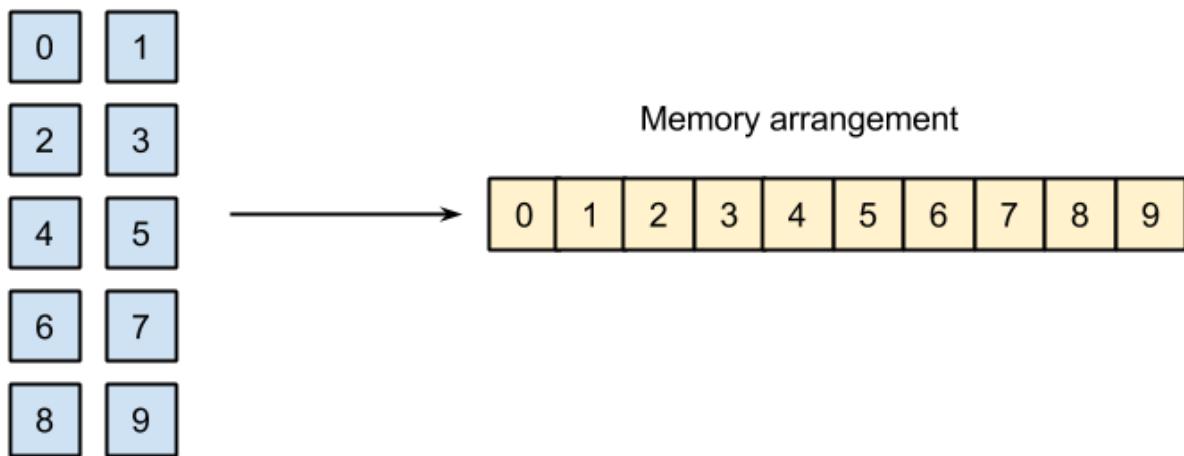
co2	(year)	float64	315.2	316.0	316.9	...	413.9	415.2			
-----	--------	---------	-------	-------	-------	-----	-------	-------	--	--	--

► Attributes: (0)



Index type	N=10000	N=20000	N=30000	Time
Unique	12.30	12.58	13.30	$O(1)$
Non-unique	494.95	814.10	1129.95	$O(N)$
Non-unique (sorted)	145.93	145.81	145.66	$O(\log(N))$

## Chapter 4: C Performance with Cython



```
generated for it.

Raw output: cevolve.c

+01: import numpy as np
02: cimport cython
03: from libc.math cimport sqrt
04:
+05: def c_evolve(double[:, :] r_i,double[:] ang_speed_i,
06:                 double timestep,int nsteps):
07:     cdef int i
08:     cdef int j
+09:     cdef int nparticles = r_i.shape[0]
10:     cdef double norm, x, y, vx, vy, dx, dy, ang_speed
11:
12:
+13:     for i in range(nsteps):
+14:         for j in range(nparticles):
+15:             x = r_i[j, 0]
+16:             y = r_i[j, 1]
+17:             ang_speed = ang_speed_i[j]
18:
+19:             norm = sqrt(x ** 2 + y ** 2)
20:
+21:             vx = (-y)/norm
+22:             vy = x/norm
        if (unlikely(_pyx_v_norm == 0)) {
            #ifdef WITH_THREAD
            PyGILState_STATE __pyx_gilstate_save = PyGILState_Ensure();
            #endif
            PyErr_SetString(PyExc_ZeroDivisionError, "float division");
            #ifdef WITH_THREAD
            PyGILState_Release(__pyx_gilstate_save);
            #endif
            {__pyx_filename = __pyx_f[0]; __pyx_lineno = 22; __pyx_clineno = __LINE__; goto __pyx_L1_error;}
        }
        __pyx_v_vy = (_pyx_v_x / __pyx_v_norm);

23:             dx = timestep * ang_speed * vx
+24:             dy = timestep * ang_speed * vy
25:
26:
+27:             r_i[j, 0] += dx
+28:             r_i[j, 1] += dy
29:
```

```
In [15]: %%cython -a
import numpy as np

cdef int max(int a, int b):
    return a if a > b else b

cdef int chebyshev(int x1, int y1, int x2, int y2):
    return max(abs(x1 - x2), abs(y1 - y2))

def c_benchmark():
    a = np.random.rand(1000, 2)
    b = np.random.rand(1000, 2)

    for x1, y1 in a:
        for x2, y2 in b:
            chebyshev(x1, x2, y1, y2)
```

Out[15]:  
Generated by Cython 0.25.2

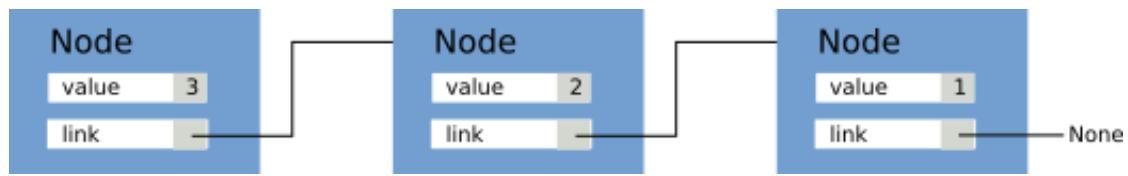
**Yellow lines** hint at Python interaction.  
Click on a line that starts with a "+" to see the C code that Cython generated for it.

```
+01: # cython: profile=True
+02: import numpy as np
03:
+04: cdef int max(int a, int b):
+05:     return a if a > b else b
06:
+07: cdef int chebyshev(int x1, int y1, int x2, int y2):
+08:     return max(abs(x1 - x2), abs(y1 - y2))
09:
+10: def c_benchmark():
+11:     a = np.random.rand(1000, 2)
+12:     b = np.random.rand(1000, 2)
13:
+14:     for x1, y1 in a:
+15:         for x2, y2 in b:
+16:             chebyshev(x1, x2, y1, y2)
```

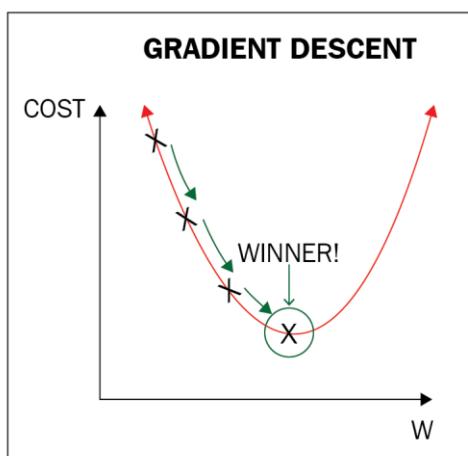
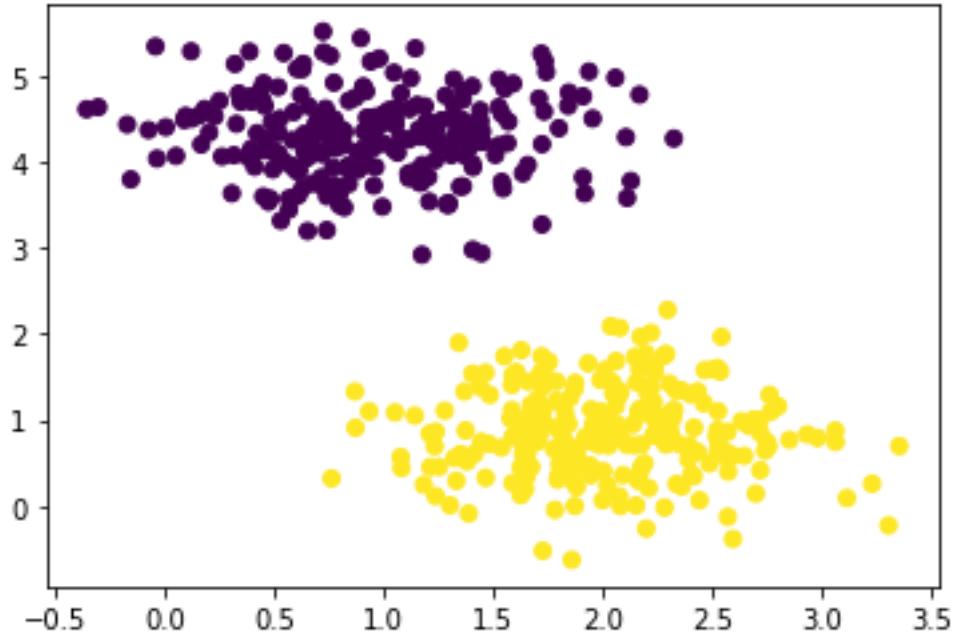
In [22]: %prun c\_benchmark()

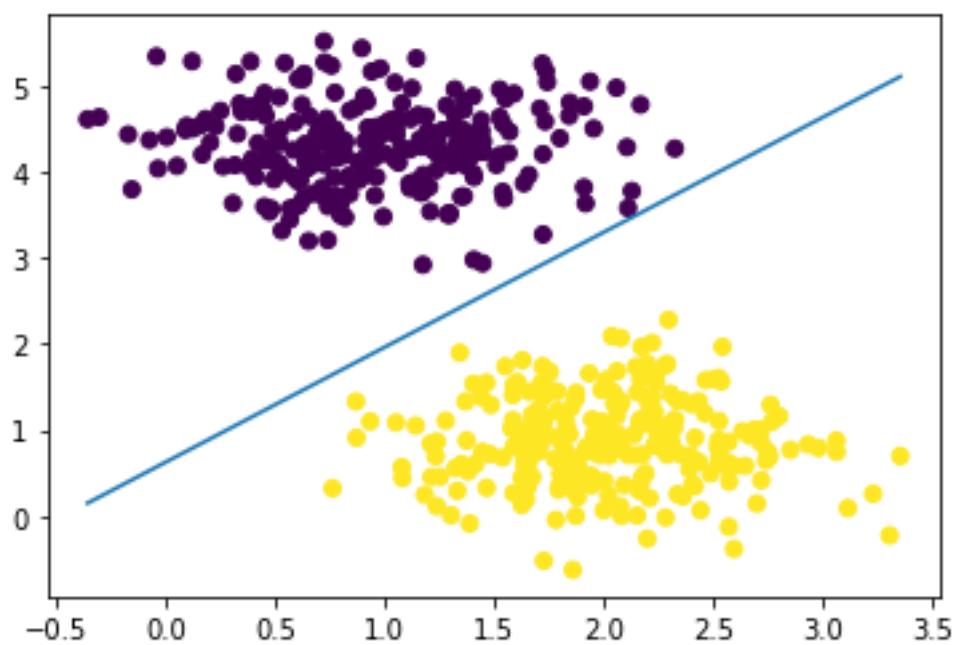
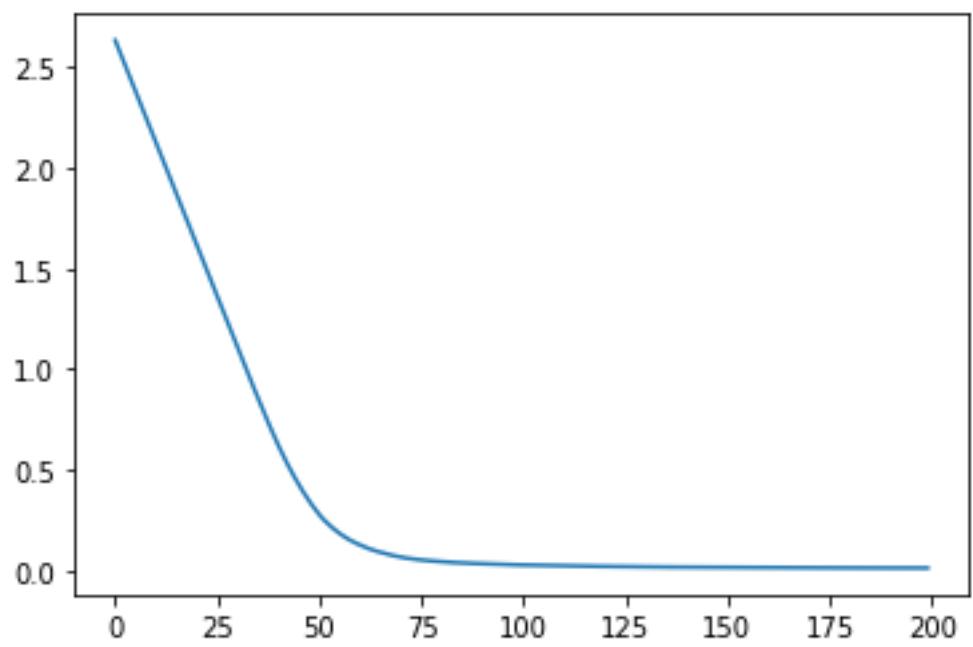
	ncalls	tottime	percall	cumtime	percall	filename:lineno(function)
rk)	1	1.127	1.127	1.370	1.370	_cython_magic_c7d6eab16ab5658137c9af8534d5caf.pyx:10(c_benchma
	10000000	0.191	0.000	0.243	0.000	_cython_magic_c7d6eab16ab5658137c9af8534d5caf.pyx:7(chebyshev)
	10000000	0.052	0.000	0.052	0.000	_cython_magic_c7d6eab16ab5658137c9af8534d5caf.pyx:4(max)
	1	0.000	0.000	1.370	1.370	<string>:1(<module>)
	1	0.000	0.000	1.370	1.370	{built-in method builtins.exec}
	1	0.000	0.000	1.370	1.370	{_cython_magic_c7d6eab16ab5658137c9af8534d5caf.c_benchmark}
	1	0.000	0.000	0.000	0.000	{method 'disable' of '_lsprof.Profiler' objects}

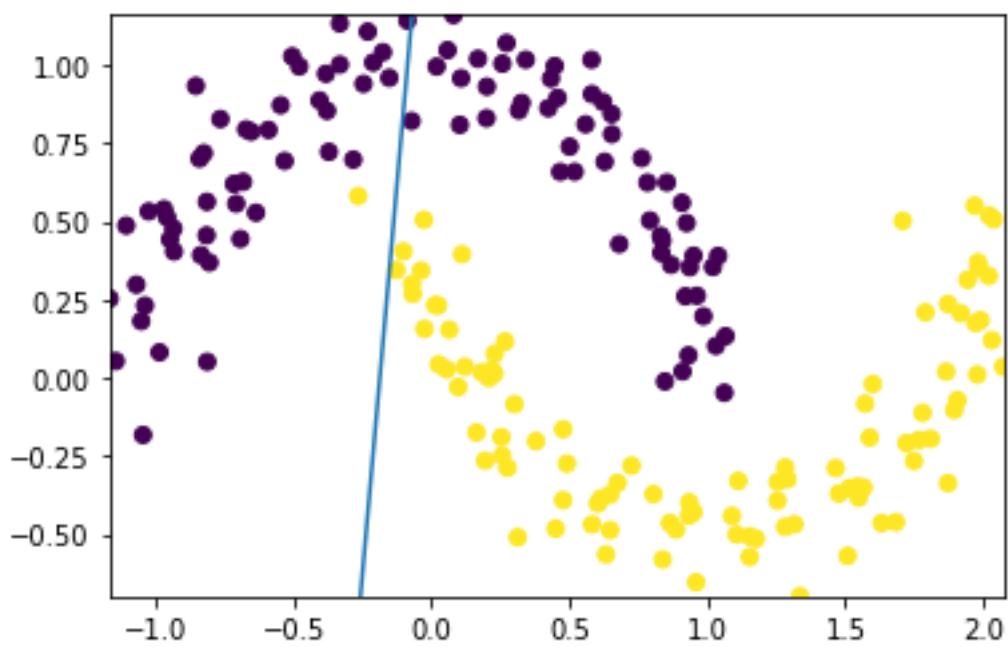
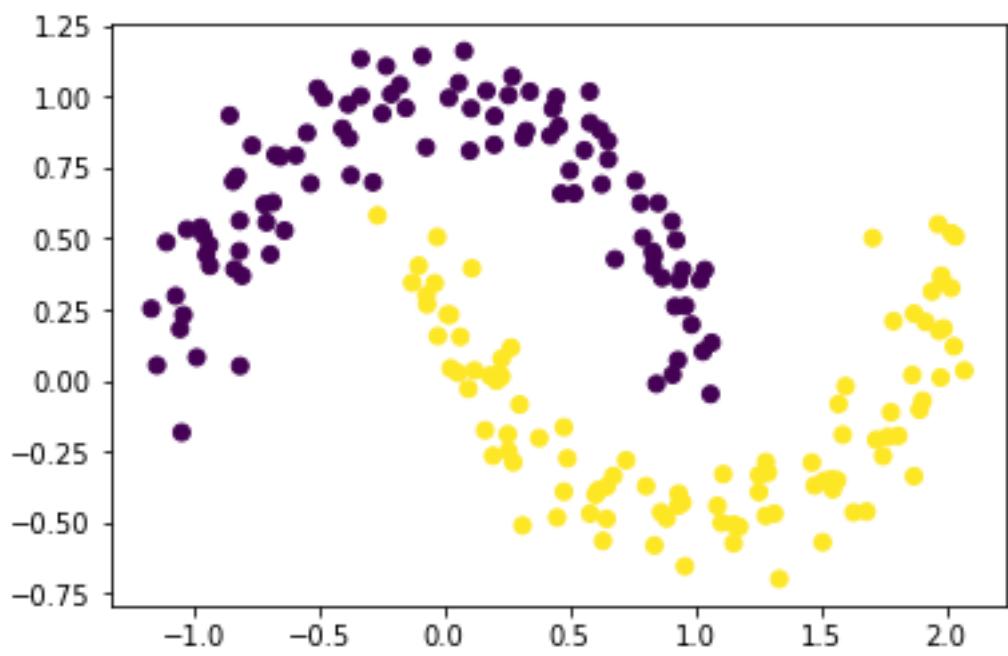
## Chapter 5: Exploring Compilers

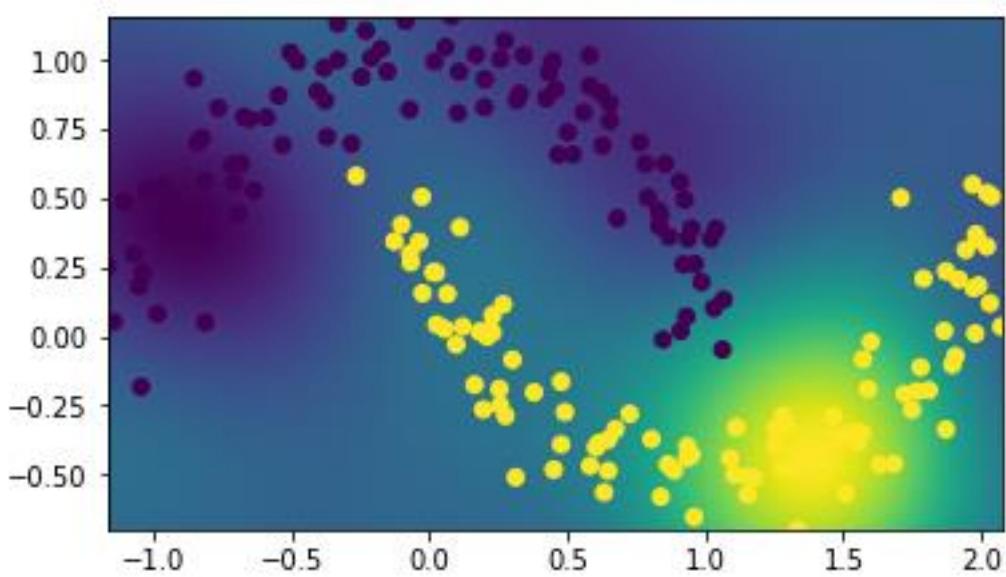
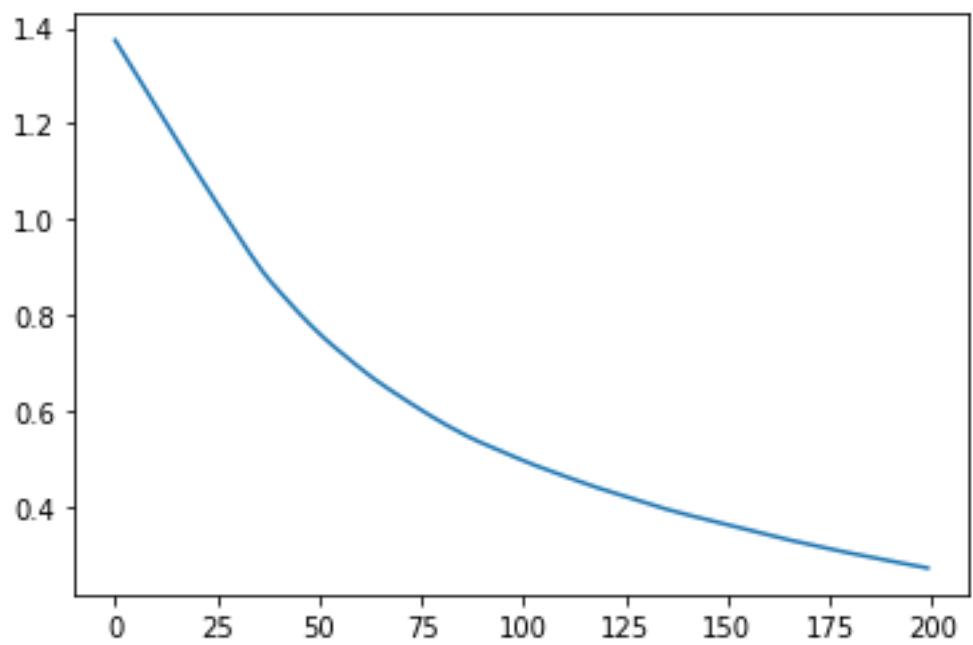


## Chapter 6: Automatic Differentiation and Accelerated Linear Algebra for Machine Learning

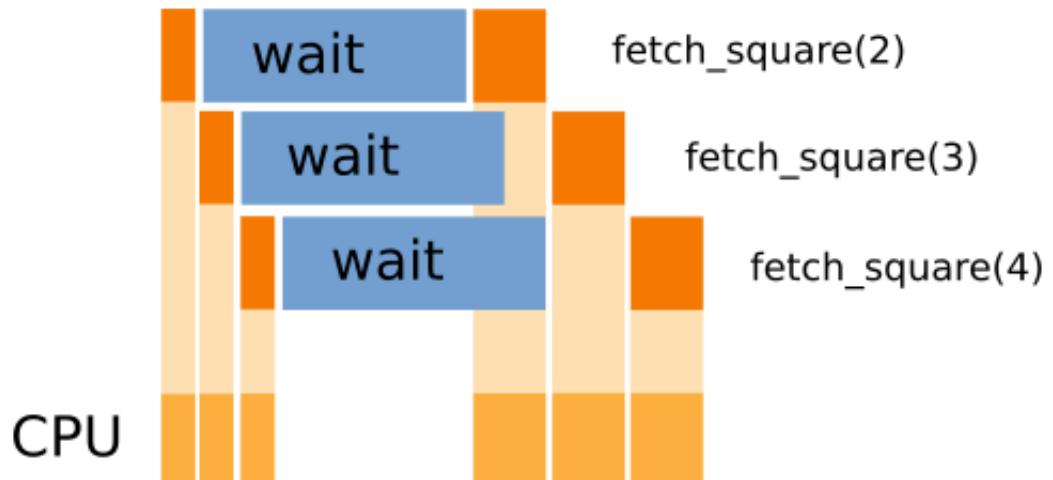
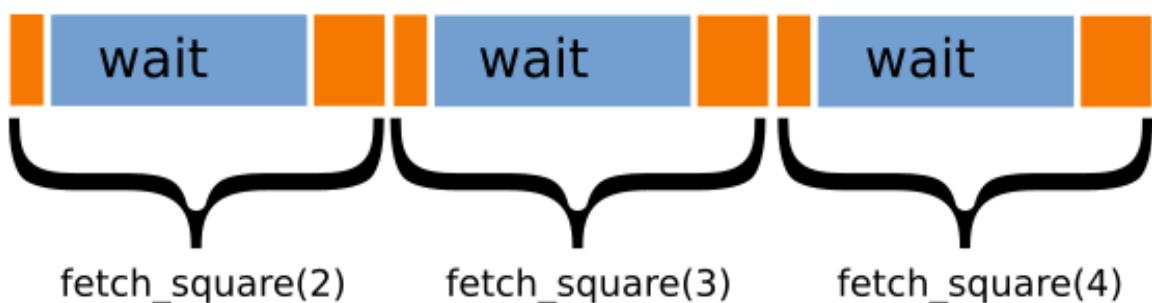
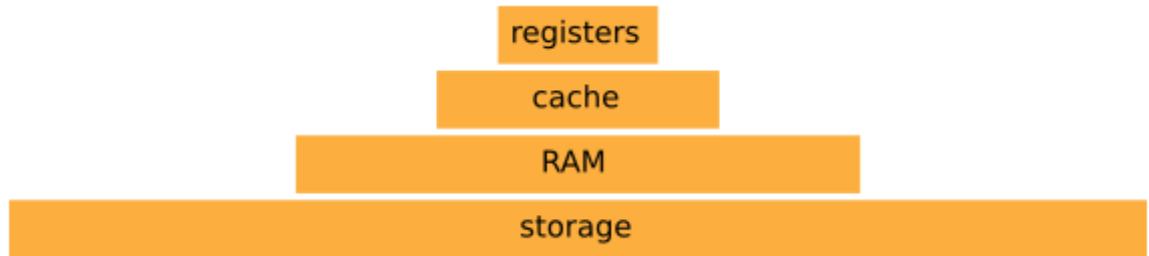








## Chapter 7: Implementing Concurrency

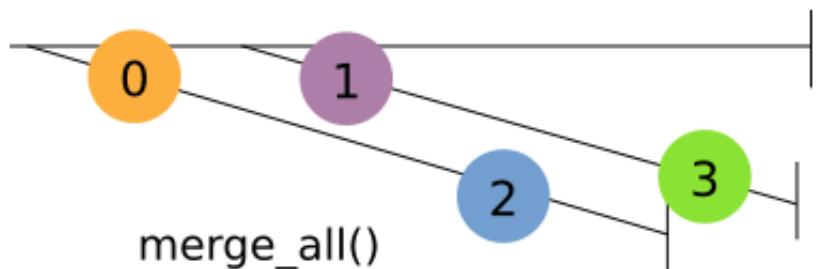
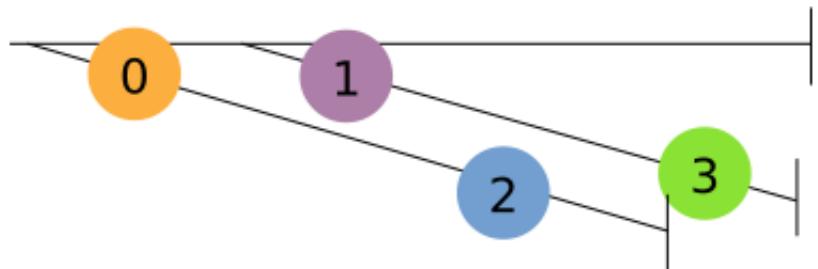




`map(lambda x: x**2)`



`groupby(lambda x: x % 2)`



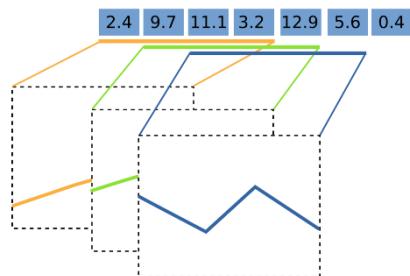
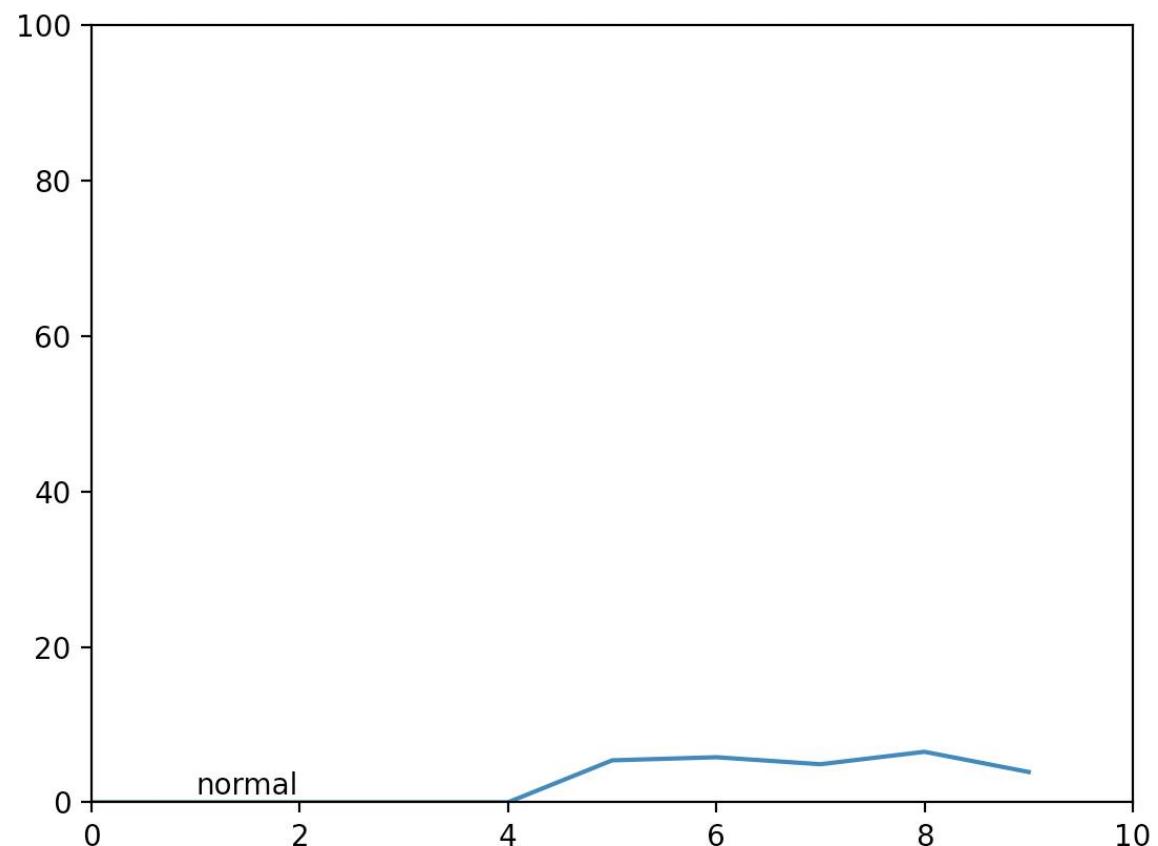
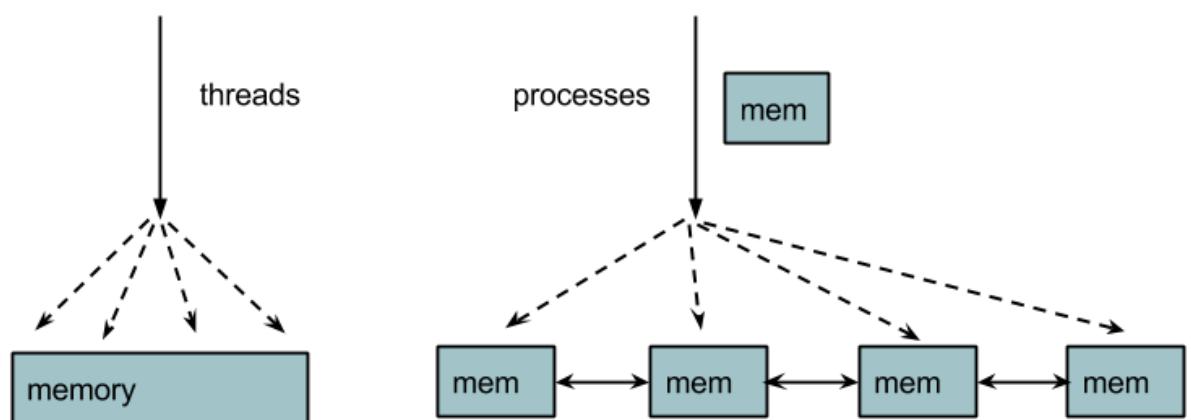
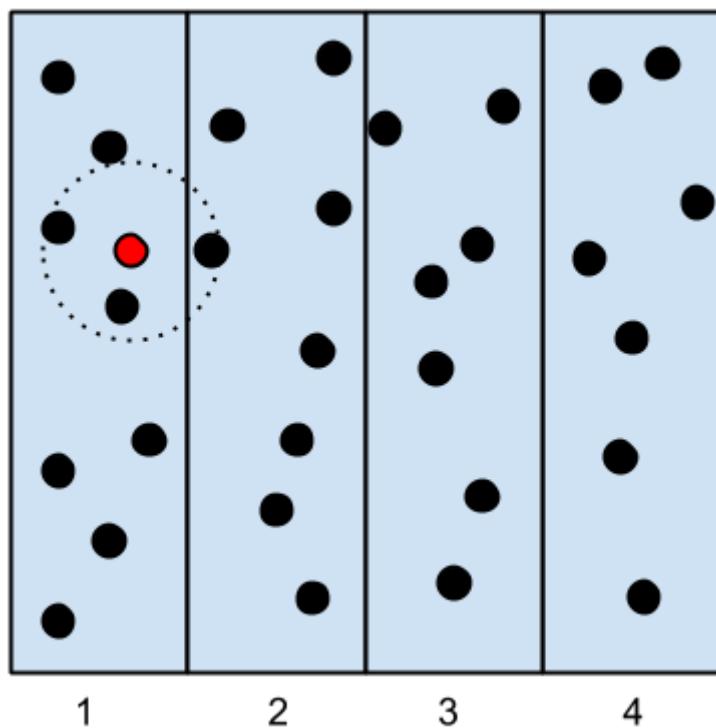


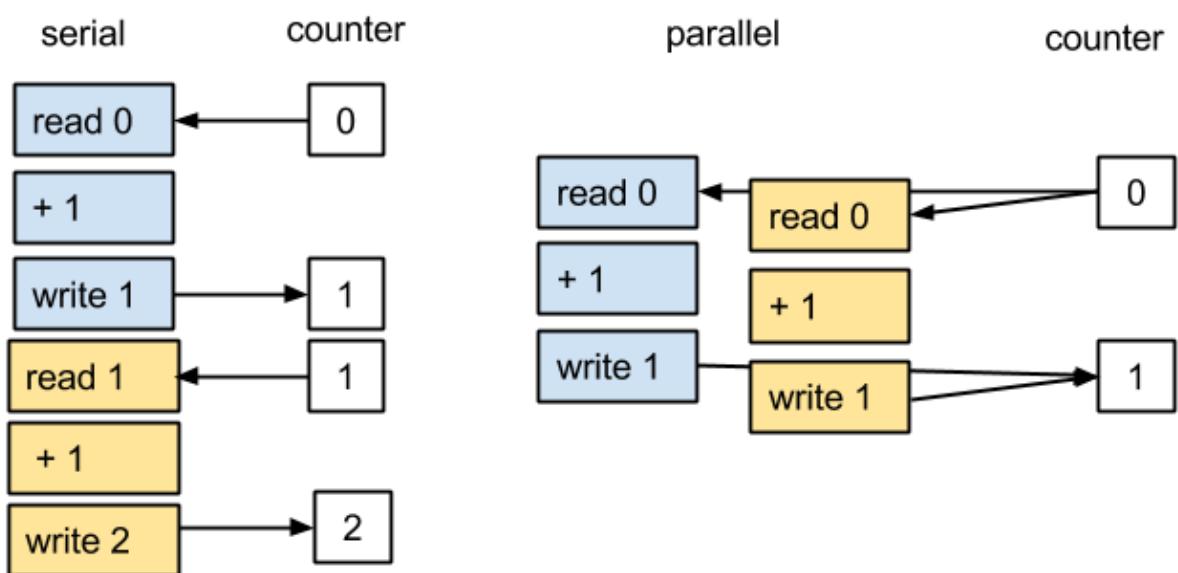
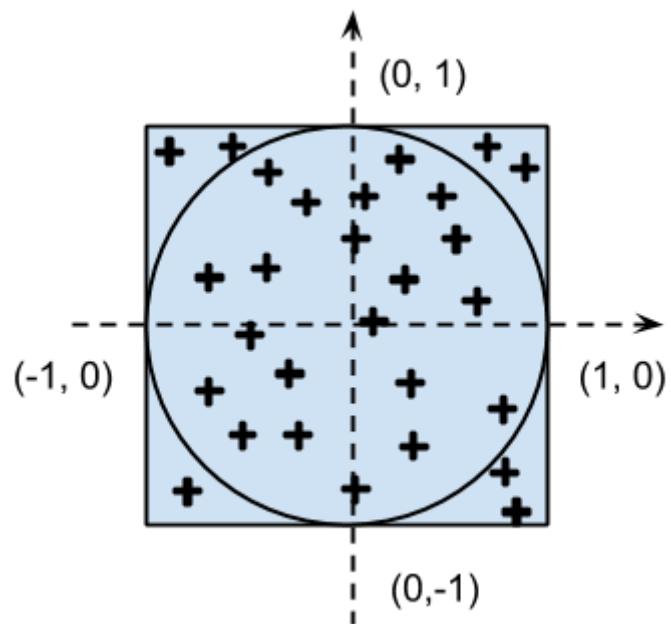
Figure 1



x=6.57 y=16.8

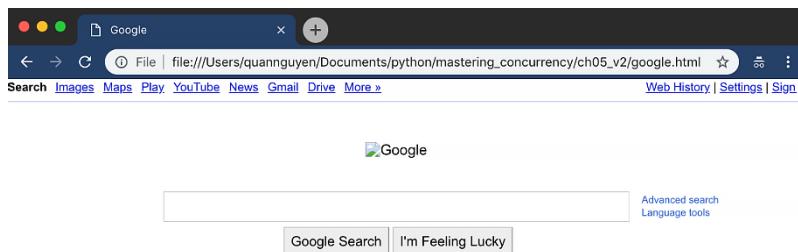
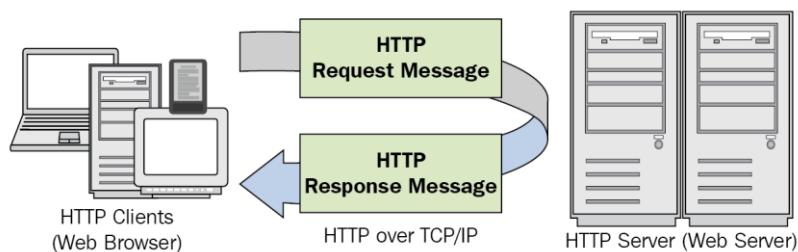
## Chapter 8: Parallel Processing

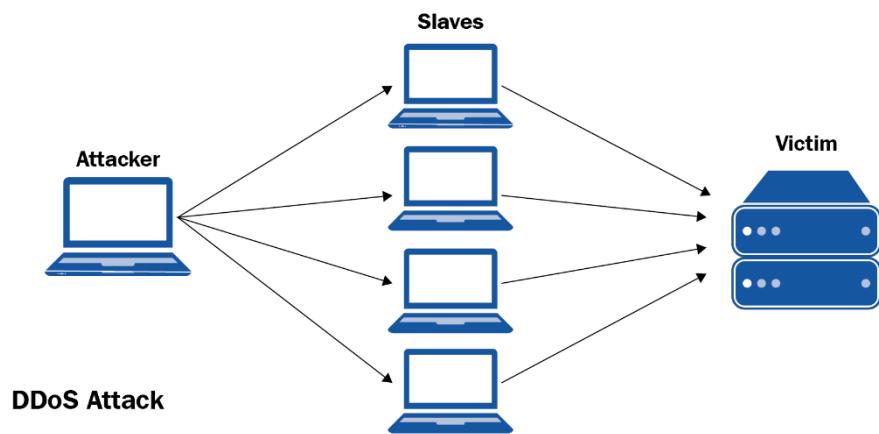
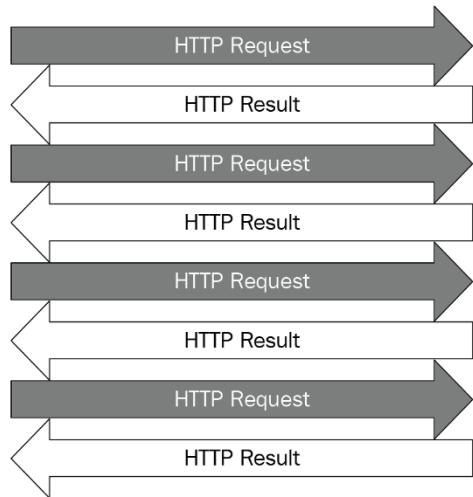




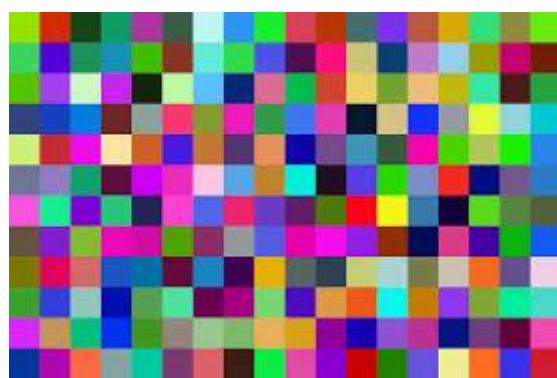
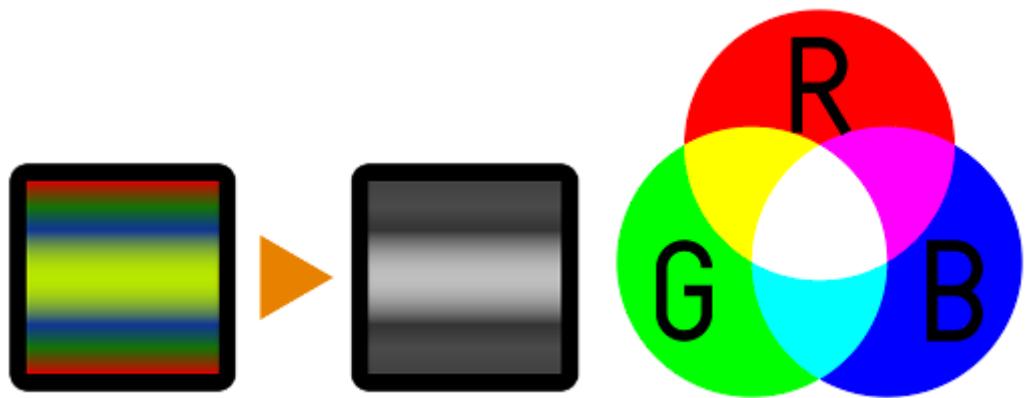
# Chapter 9: Concurrent Web Requests

```
index.html      reuseheader.html      reusefooter.html      menu.html      events.html      styles.css
1
2 <div class="topNavTop">
3     <p>Welcome to Chilli restaurant</p>
4     <div class="topNavRight">
5         
6         <p>416-455-3221</p>
7         
8         <p>info@company.com</p>
9         
10    </div>
11 </div>
12 <div class="topNavBottom">
13     
14     <div class="topNavRightBottom">
15         <a href="index.html">HOME</a>
16         <a href="menu.html">MENU</a>
17         <a href="events.html">EVENTS</a>
18         <a href="#contact">CONTACT</a>
19     </div>
20 </div>
Line 1, Column 1
1 misspelled word Tab Size: 4
```

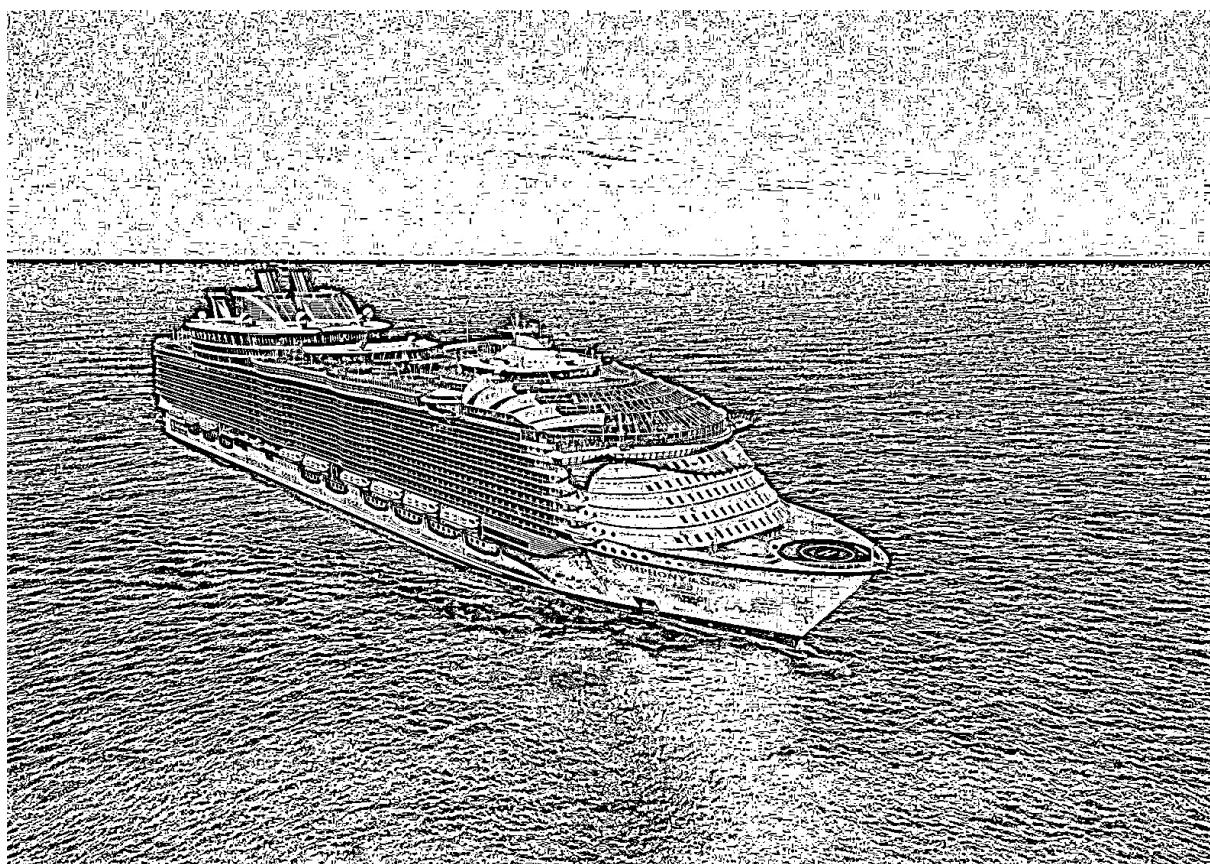
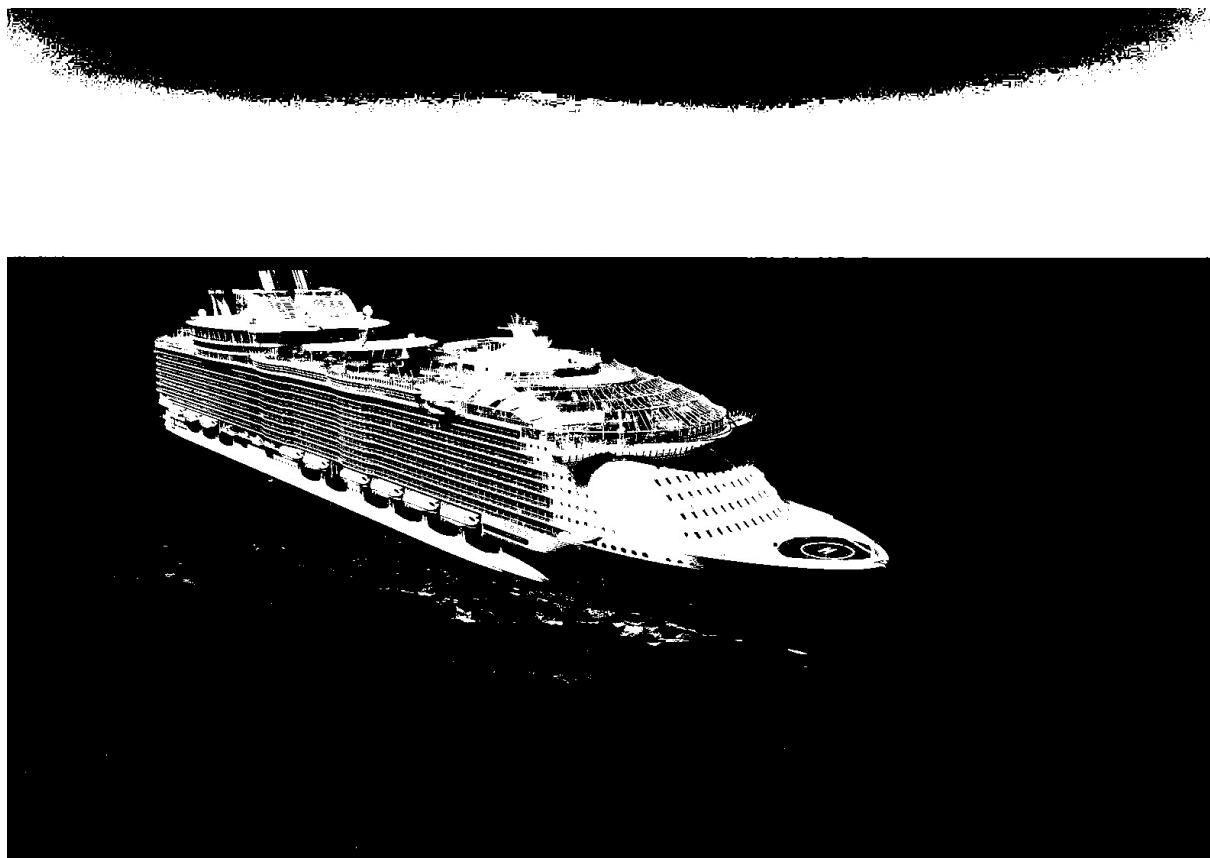


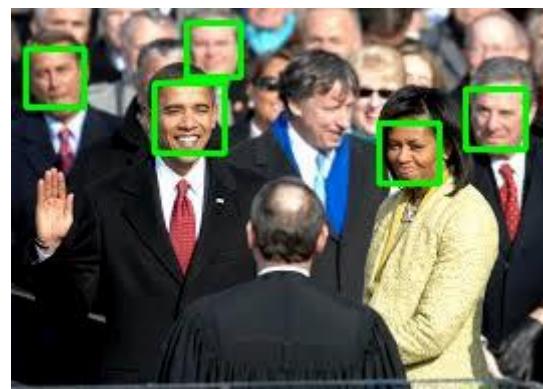
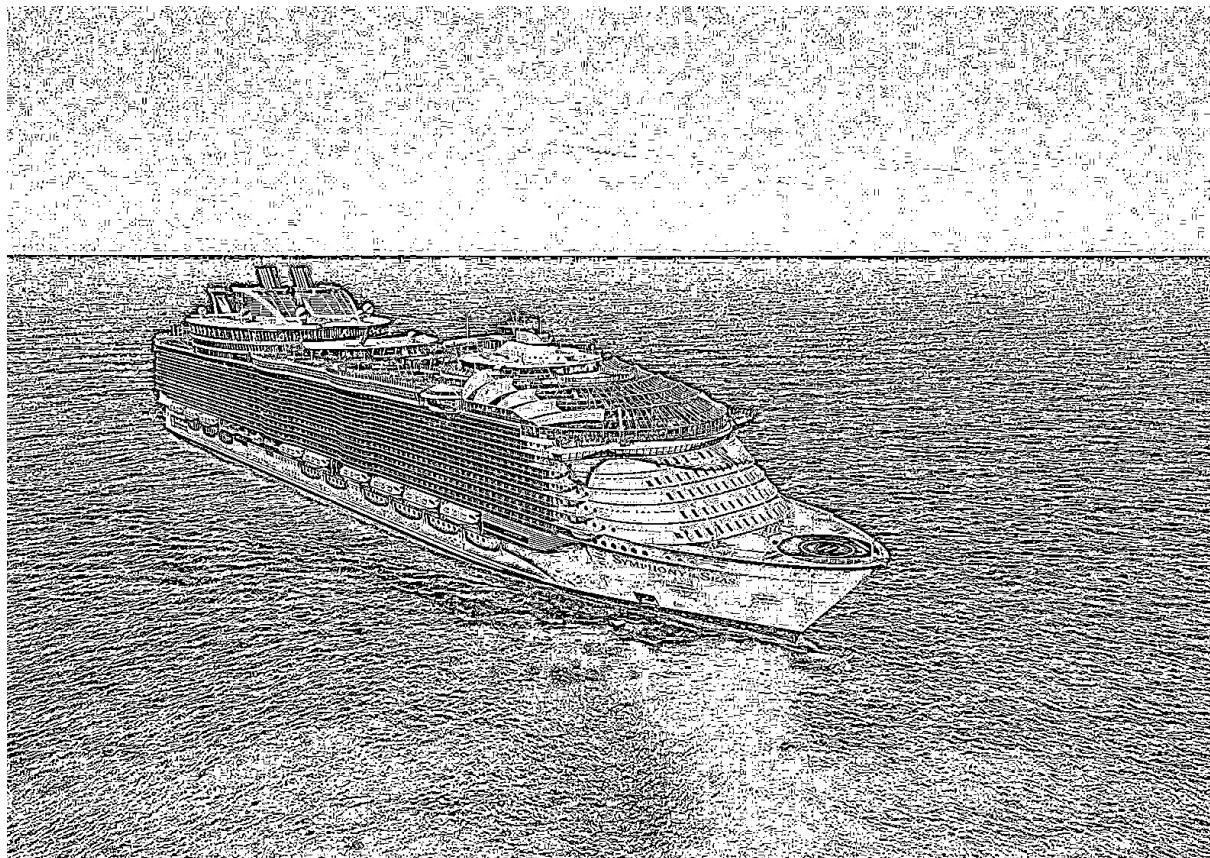


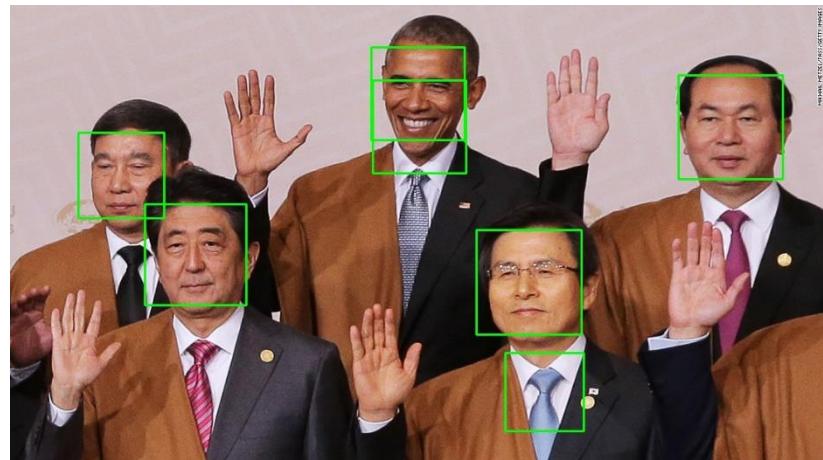
## Chapter 10: Concurrent Image Processing





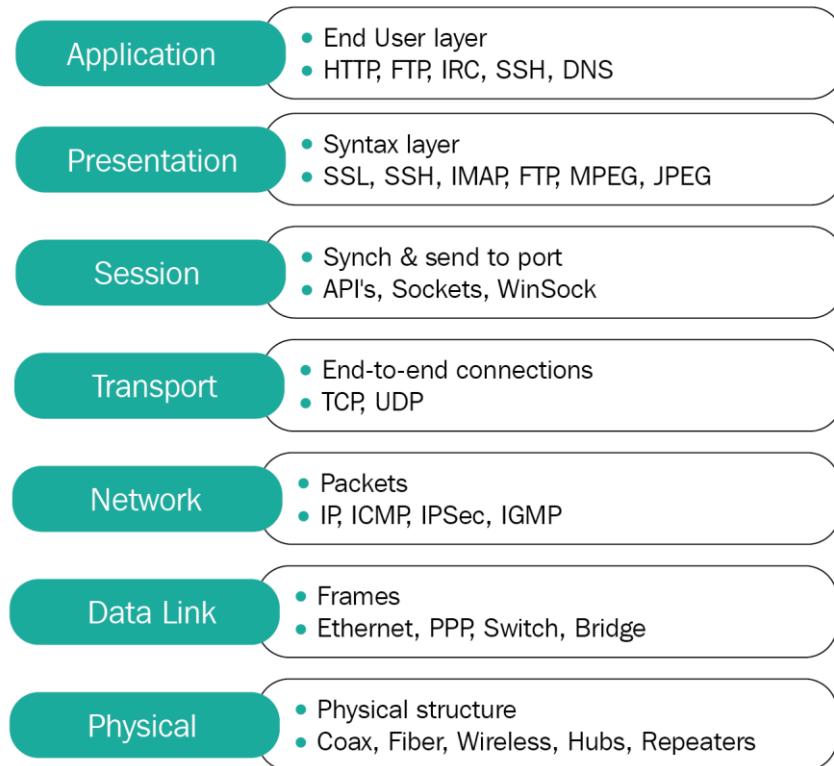


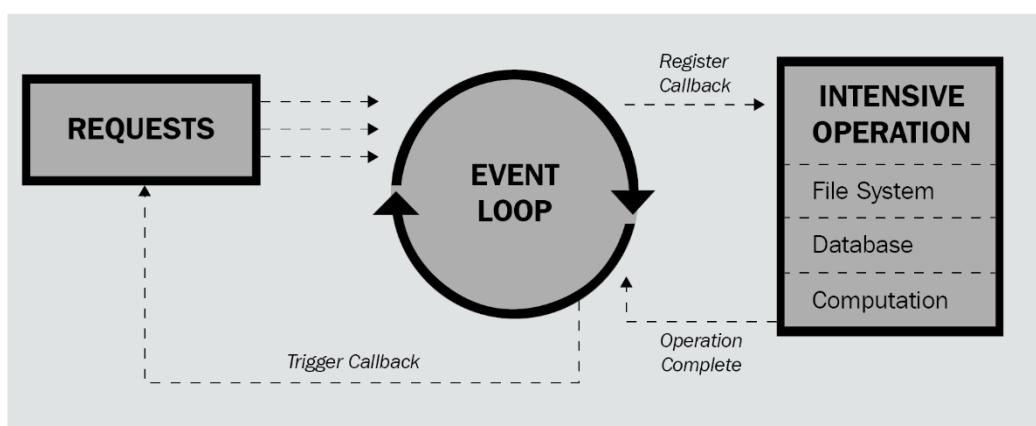
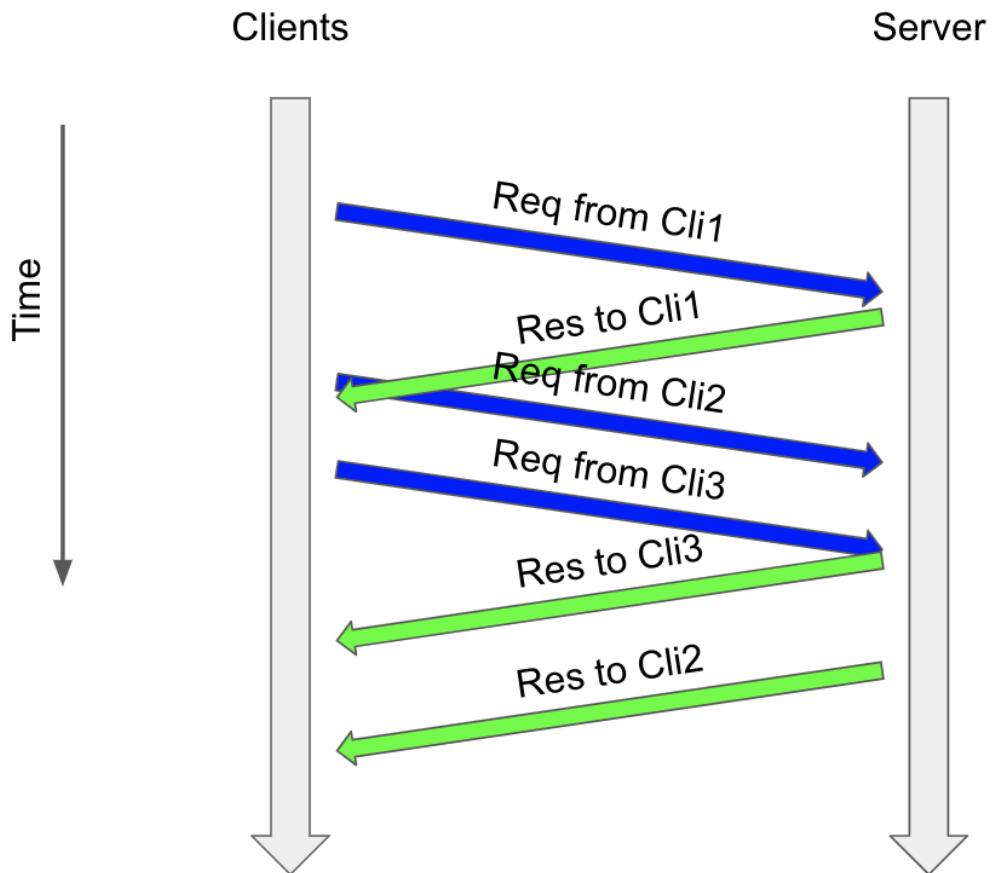




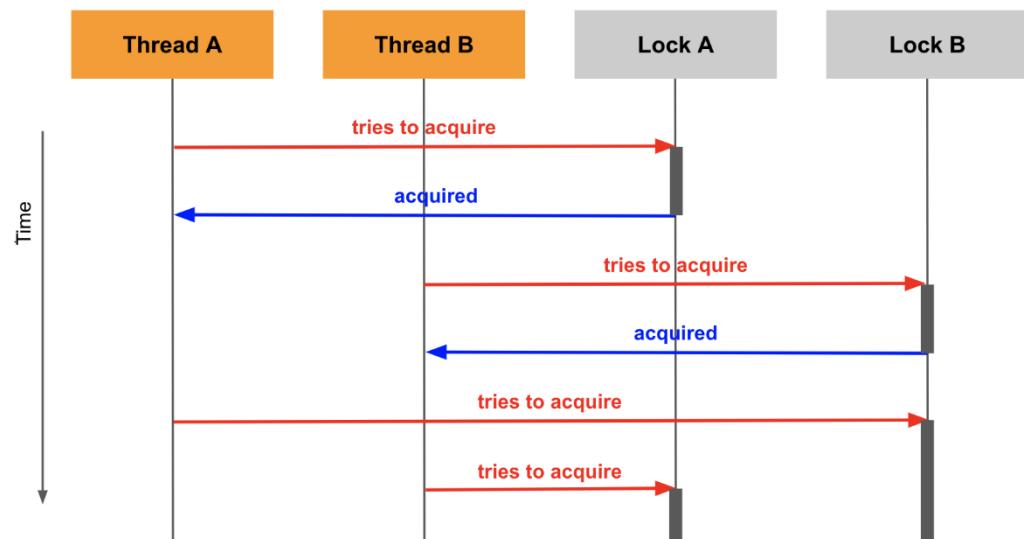
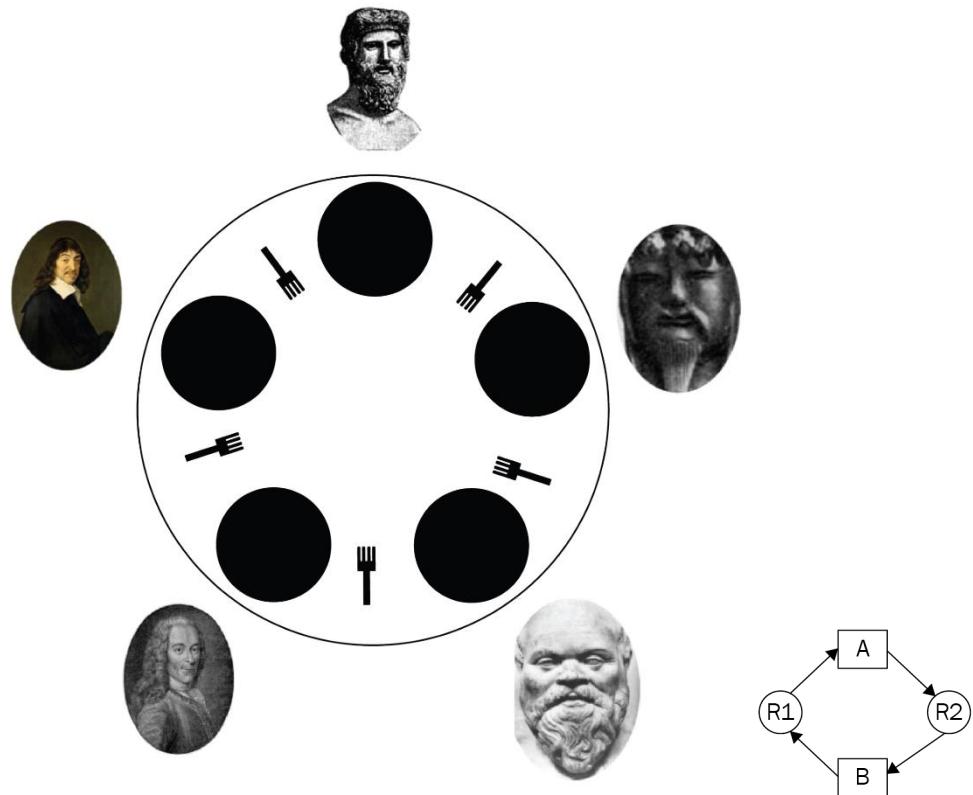
# Chapter 11: Building Communication Channels with asyncio

## 7 Layers of the OSI Model

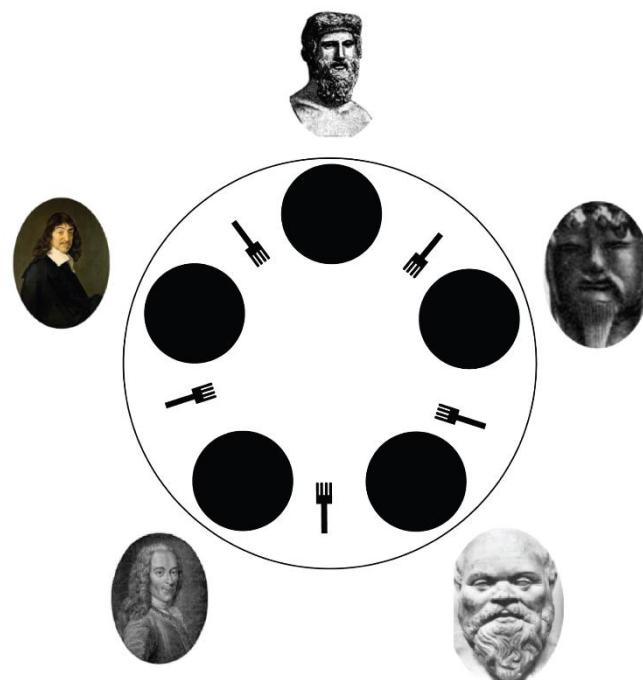
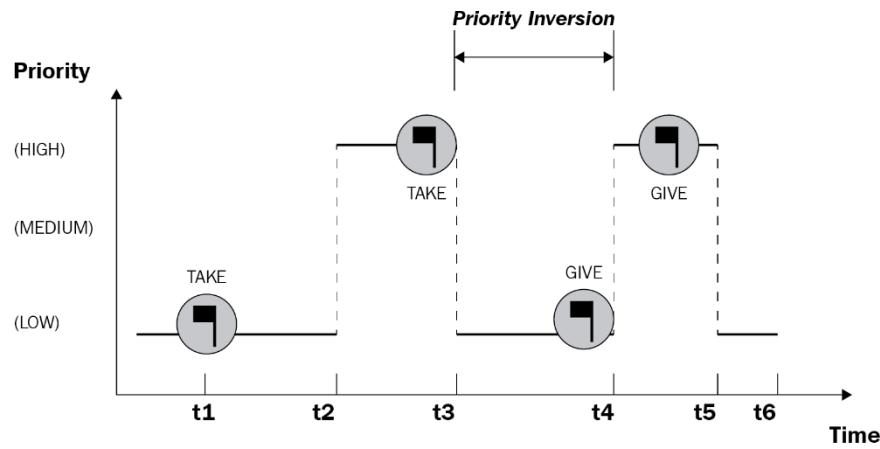




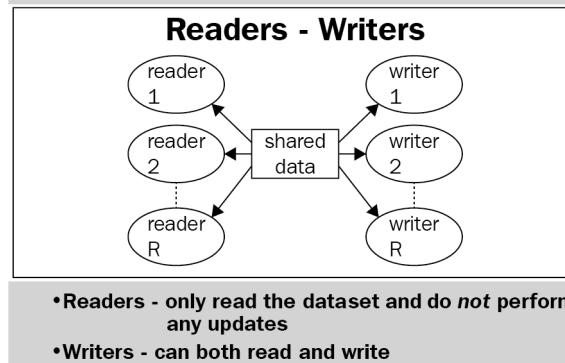
# Chapter 12: Deadlocks



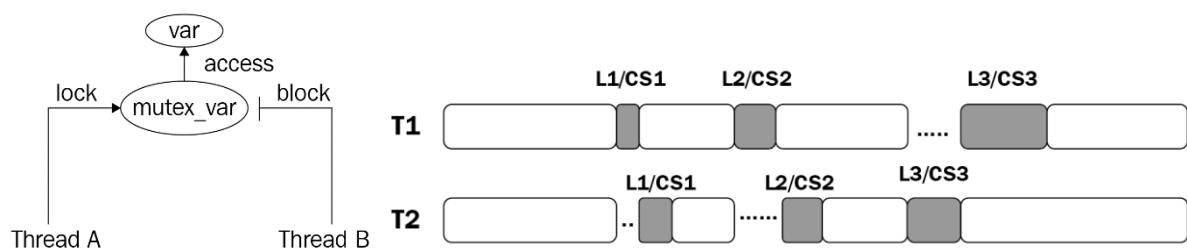
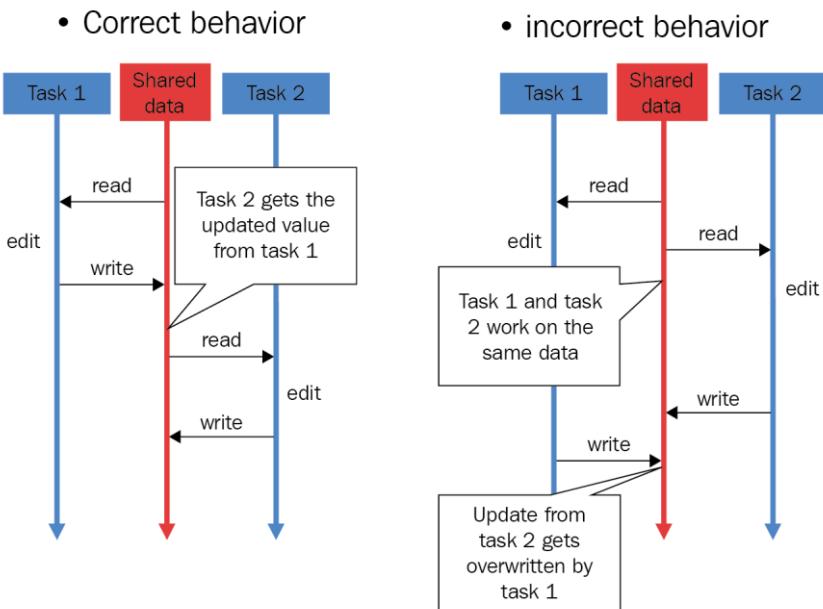
## Chapter 13: Starvation



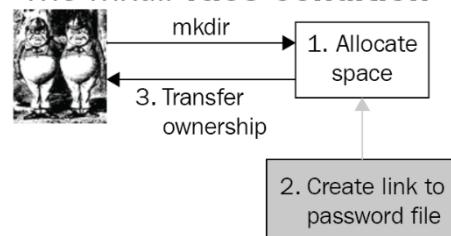
Activity of readers and writers on shared data:



# Chapter 14: Race Conditions

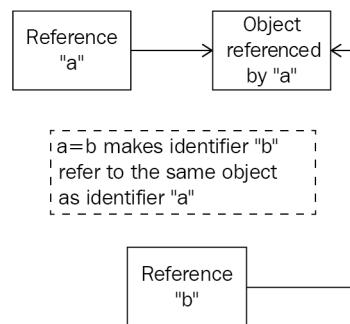


## □ The mkdir race condition



# Chapter 15: The Global Interpreter Lock

"a" is actually a reference to the object



## **Chapter 16: The Factory Pattern**

***\*\*no images\*\****

## Chapter 17: The Builder Pattern

***\*\*no images\*\****

## Chapter 18: Other Creational Patterns

***\*\*no images\*\****

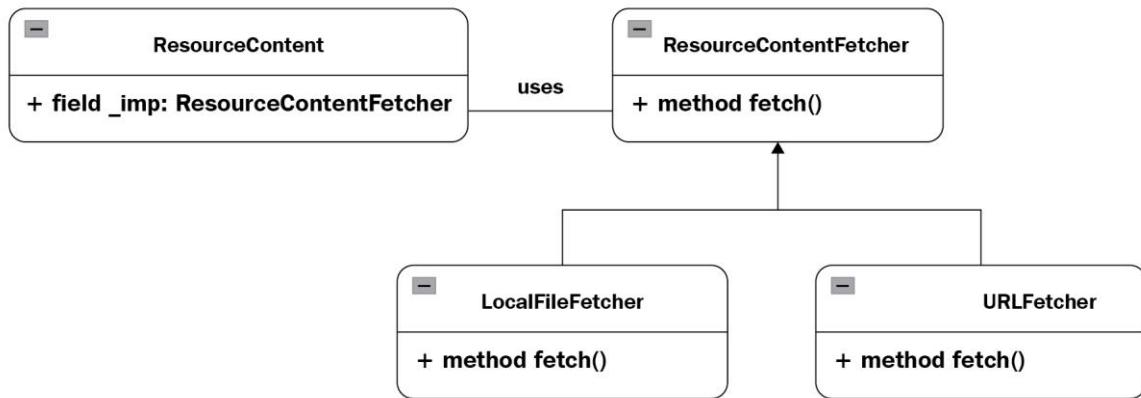
## Chapter 19: The Adapter Pattern

***\*\*no images\*\****

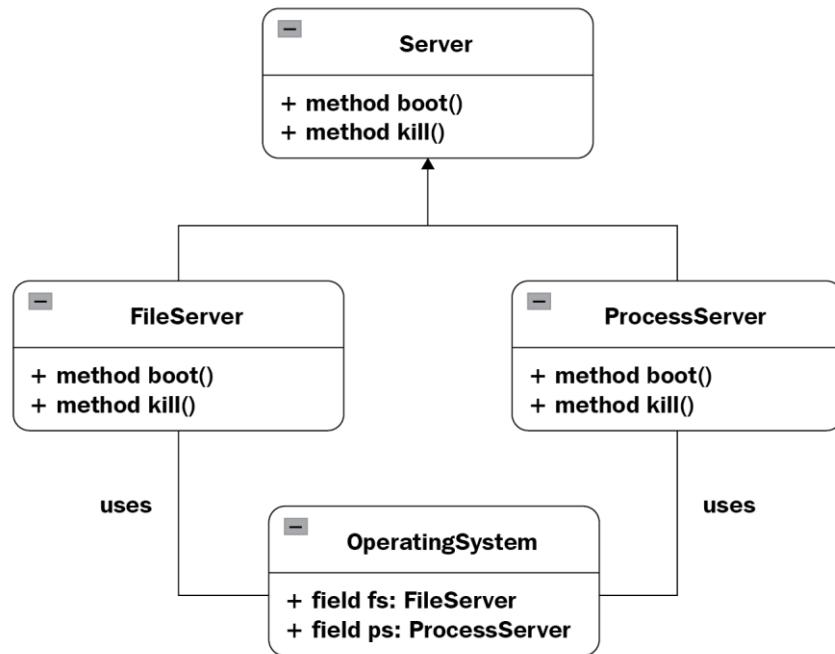
## Chapter 20: The Decorator Pattern

***\*\*no images\*\****

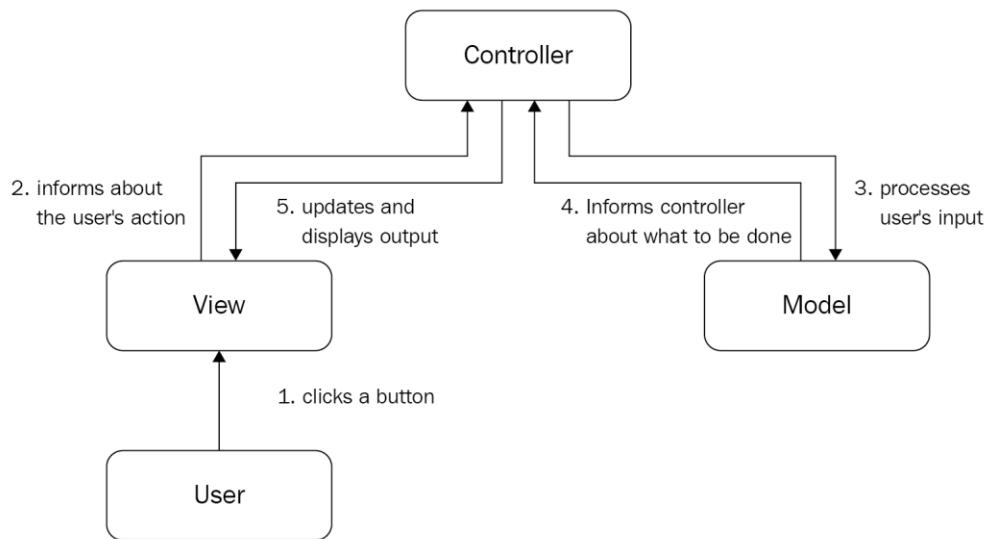
# Chapter 21: The Bridge Pattern



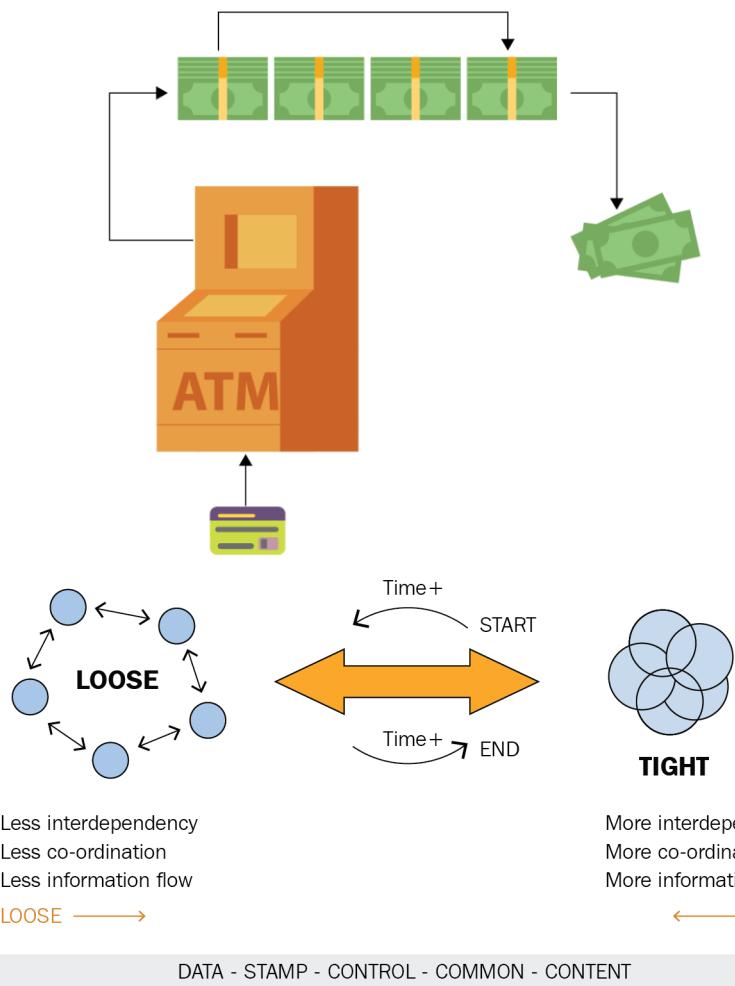
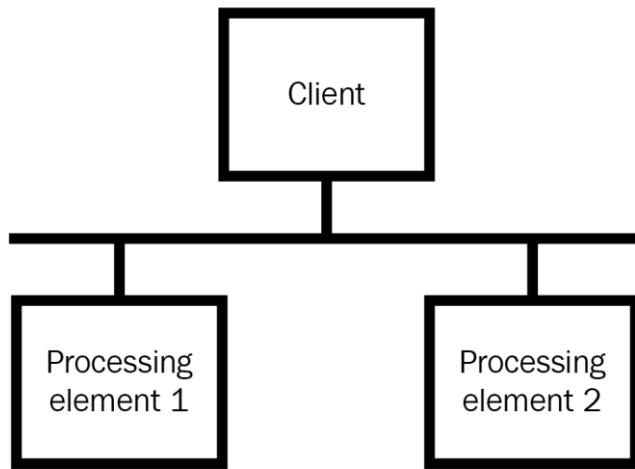
## Chapter 22: The Façade Pattern

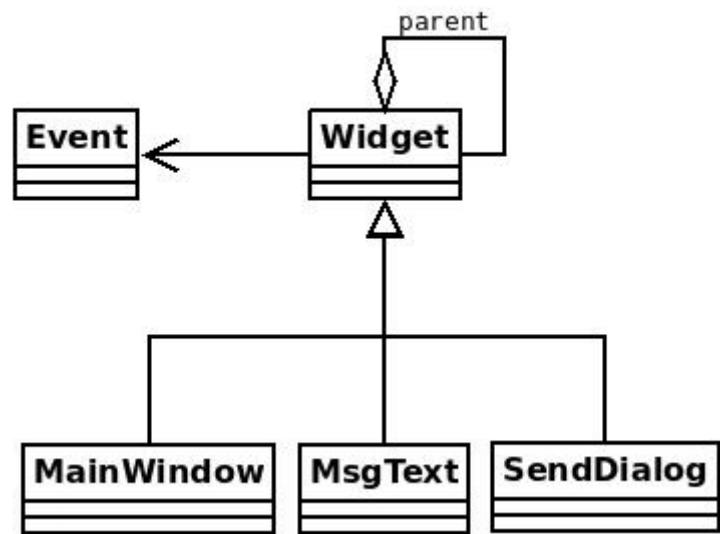


## Chapter 23: Other Structural Patterns



## Chapter 24: The Chain of Responsibility Pattern





## Chapter 25: The Command Pattern

***\*\*no images\*\****

## Chapter 26: The Observer Pattern

***\*\*no images\*\****