

No time to idle about: Profiling import time in Python

Daniel Porteous

Production Engineer

dport.me/pycon.pdf

Me!

Me!!! Daniel Porteous!

Tweeter:

@banool1

Github:

github.com/banool

Website:

dport.me



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The problem

Imports are slow, and you don't know why

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- Why are slow imports a problem?

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- Why are slow imports a problem?
 - Mainly, command line tools.

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 - Mainly, command line tools.
 - Worsens dev iteration time.

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Imports are slow, and you don't know why

- Why are slow imports a problem?
 - Mainly, command line tools.
 - Worsens dev iteration time.
- How do we fix the problem?

The problem

Imports are slow, and you don't know why

- Why are slow imports a problem?
 - Mainly, command line tools.
 - Worsens dev iteration time.
- How do we fix the problem?
 - First, understand it.

Looking at an example

Sloooooooooooooow imports z^z z^z z^z

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Sloooooooooooooow imports z^z z^z z^z

```
main.py 1 import small  
        2 import large  
        3 print("Hi Pycon AU 2019!")
```

Looking at an example

Sloooooooooooooow imports $z^z z^z z^z$

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main.py 1 import small
        2 import large
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```
small.py 1 import time
        2 time.sleep(1)
```


Looking at an example

Sloooooooooooooow imports $z^z z^z z^z$

```
main.py 1 import small
        2 import large
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```

```
small.py 1 import time
        2 time.sleep(1)
```

```
large.py 1 import time
        2 time.sleep(10)
```

Looking at an example

Sloooooooooooooow imports $z^z z^z z^z$

```
main.py 1 import small
        2 import large
        3 print("Hi Pycon AU 2019!")
```

```
small.py 1 import time
        2 time.sleep(1)
```

```
large.py 1 import time
        2 time.sleep(10)
```

```
$ time python main.py
Hi Pycon AU 2019!
```

```
real 0m11.061s
```

Looking at an example

Sloooooooooooooow imports $z^z z^z z^z$

```
main.py 1 import small
         2 import large
         3 print("Hi Pycon AU 2019!")
```

```
small.py 1 import time
         2 time.sleep(1)
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large.py 1 import time
         2 time.sleep(10)
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```
$ time python main.py
Hi Pycon AU 2019!
```

```
real 0m11.061s
```

Per module import times

A few different approaches

Per module import times

A few different approaches

- Time each import directly in your own code.

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- Time each import directly in your own code.
- Explicit time statements, context managers.

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- Time each import directly in your own code.
 - Explicit time statements, context managers.
- Modify module Finders / Loaders.

Per module import times

A few different approaches

- Time each import directly in your own code.
 - Explicit time statements, context managers.
- Modify module Finders / Loaders.
- Probes???

Per module import times

Enter 3.7

Per module import times

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- `-X importtime` in 3.7.

Per module import times

Enter 3.7

- `-X importtime` in 3.7.
- Also the `PYTHONPROFILEIMPORTTIME` environment variable.

Per module import times

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- `-X importtime` in 3.7.
 - Also the `PYTHONPROFILEIMPORTTIME` environment variable.
- Supported directly in `Python/import.c`.

Per module import times

Enter 3.7

- `-X importtime` in 3.7.
 - Also the `PYTHONPROFILEIMPORTTIME` environment variable.
- Supported directly in `Python/import.c`.
- Thanks to the community and 3.7 contributors!

Per module import times

Enter 3.7

- `-X importtime` in 3.7.
 - Also the `PYTHONPROFILEIMPORTTIME` environment variable.
- Supported directly in `Python/import.c`.
- Thanks to the community and 3.7 contributors!
 - Special thanks to Victor Stinner and Inada Naoki!!!

Back to our example

Still slow, who's the culprit!

main.py

```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```

Back to our example

Still slow, who's the culprit!

main.py	<pre>1 import small 2 import large 3 print("Hi!")</pre>	<pre>\$ python -X importtime main.py</pre>
small.py	<pre>1 import time 2 time.sleep(1)</pre>	
large.py	<pre>1 import time 2 time.sleep(10)</pre>	

Back to our example

Still slow, who's the culprit!

main.py

```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```

```
$ python -X importtime main.py
```

```
$ PYTHONPROFILEIMPORTTIME="🤠"
python main.py
```

Back to our example

Still slow, who's the culprit!

main.py	<pre>1 import small 2 import large 3 print("Hi!")</pre>	<pre>\$ python -X importtime main.py</pre>
small.py	<pre>1 import time 2 time.sleep(1)</pre>	
large.py	<pre>1 import time 2 time.sleep(10)</pre>	

Back to our example

Still slow, who's the culprit!

main.py

```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```

```
$ python -X importtime main.py
import time: self [us] | cumulative | imported package
import time: 145 | 145 | zipimport
import time: 737 | 737 | _frozen_importlib_external
import time: 73 | 73 | _codecs
import time: 6401 | 6474 | codecs
import time: 2292 | 2292 | encodings.aliases
import time: 1780 | 10545 | encodings
import time: 512 | 512 | encodings.utf_8
import time: 115 | 115 | _signal
import time: 576 | 576 | encodings.latin_1
import time: 51 | 51 | _abc
import time: 1233 | 1283 | abc
import time: 1084 | 2367 | io
import time: 77 | 77 | _stat
import time: 1144 | 1220 | stat
import time: 1073 | 1073 | genericpath
import time: 2533 | 3605 | posixpath
import time: 4793 | 4793 | _collections_abc
import time: 4456 | 14072 | os
import time: 1277 | 1277 | __builtin__
import time: 190 | 190 | _locale
import time: 639 | 829 | _bootlocale
import time: 1761 | 1761 | sitecustomize
import time: 4901 | 22838 | site
import time: 719 | 719 | time
import time: 1003709 | 1004428 | small
import time: 10003076 | 10003076 | large
Hi Pycon AU 2019!
```

Individual import times

Knowledge is power 🤔 ⌚ 🐍

Individual import times

Knowledge is power 🤔🕒🐍

```
$ python -X importtime main.py
import time: self [us] | cumulative | imported package
import time:      719 |      719 |      time
import time:  1003709 |  1004428 | small
import time: 10003076 | 10003076 | large
Hi Pycon AU 2019!
```

```
$ python -X importtime main.py
```

import time: self [us]	cumulative	imported package
import time: 145	145	zipimport
import time: 737	737	_frozen_importlib_external
import time: 73	73	_codecs
import time: 6401	6474	codecs
import time: 2292	2292	encodings.aliases
import time: 1780	10545	encodings
import time: 512	512	encodings.utf_8
import time: 115	115	_signal
import time: 576	576	encodings.latin_1
import time: 51	51	_abc
import time: 1233	1283	abc
import time: 1084	2367	io
import time: 77	77	_stat
import time: 1144	1220	stat
import time: 1073	1073	genericpath
import time: 2533	3605	posixpath
import time: 4793	4793	_collections_abc
import time: 4456	14072	os
import time: 1277	1277	__builtin__
import time: 190	190	_locale
import time: 639	829	_bootlocale
import time: 1761	1761	sitecustomize
import time: 4901	22838	site
import time: 719	719	time
import time: 1003709	1004428	small
import time: 10003076	10003076	large

Hi Pycon AU 2019!

```
$ python -X importtime main.py
```

import time: self [us]	cumulative	imported package
import time: 145	145	zipimport
import time: 737	737	_frozen_importlib_external
import time: 73	73	_codecs
import time: 6401	6474	codecs
import time: 2292	2292	encodings.aliases
import time: 1780	10545	encodings
import time: 512	512	encodings.utf_8
import time: 115	115	_signal
import time: 576	576	encodings.latin_1
import time: 51	51	_abc
import time: 1233	1283	abc
import time: 1084	2367	io
import time: 77	77	_stat
import time: 1144	1220	stat
import time: 1073	1073	genericpath
import time: 2533	3605	posixpath
import time: 4793	4793	_collections_abc
import time: 4456	14072	os
import time: 1277	1277	__builtin__
import time: 190	190	_locale
import time: 639	829	_bootlocale
import time: 1761	1761	sitecustomize
import time: 4901	22838	site
import time: 719	719	time
import time: 1003709	1004428	small
import time: 10003076	10003076	large

Hi Pycon AU 2019!

I'm not on 3.7 yet

Join the club 🤔🤔🤔

I'm not on 3.7 yet

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- import_times: https://github.com/banool/import_times

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- I made this one!

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- import_times: https://github.com/banool/import_times
- I made this one!

```
main.py 1 import small
         2 import large
         3 print("Hi!")
```

I'm not on 3.7 yet

Join the club 🤔🤔🤔

- import_times: https://github.com/banool/import_times
- I made this one!

main.py

```
1 from import_times import enable_import_times
2 enable_import_times()
3
4 import small
5 import large
6 print("Hi Pycon AU 2019!")
```

I'm not on 3.7 yet

Join the club 🤔🤔🤔

- import_times: https://github.com/banool/import_times
- I made this one!

```
$ python3.7 -X importtime main.py
import time: self [us] | cumulative | imported package
import time:      719 |         719 |      time
import time:  1003709 |   1004428 |    small
import time: 10003076 | 10003076 |    large
Hi Pycon AU 2019!
```

I'm not on 3.7 yet

Join the club 🤔🤔🤔

- import_times: https://github.com/banool/import_times
- I made this one!

```
$ python3.6 main.py
import time: self [us] | cumulative | imported package
import time: 1005667 | 1005667 | small
import time: 10008714 | 10008714 | large
Hi Pycon AU 2019!
```

Visualising the data



Visualising the data



- Default output is great! 3.7 changed the game here.
- The output still requires study.
- Visualisation is powerful because you can identify problems immediately.
- Flamegraphs are common visualisations of stack data.

Visualising the data

Structuring the data

Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

```
$ cat main.stderr | python tree.py --basic
```

Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

```
$ cat main.stderr | python tree.py --basic  
everything 38523  
  small 454  
    time 528  
  large 1496
```

Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

```
$ cat main.stderr | python tree.py --flame > main.tree
```

Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

```
$ cat main.stderr | python tree.py --flame > main.tree
```

```
$ tail -n 3 main.tree  
small 454  
small;time 528  
large 1496
```


Visualising the data

Structuring the data

```
$ python -X importtime main.py 2> main.stderr  
Hi Pycon AU 2019!
```

```
$ cat main.stderr | python tree.py --flame > main.tree
```

```
$ tail -n 3 main.tree  
small 454  
small;time 528  
large 1496
```

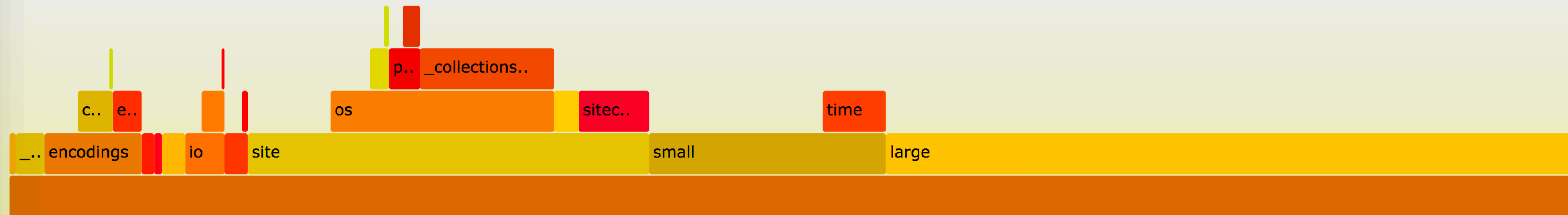
```
$ flamegraph.pl main.tree --flamechart tree > main.svg
```

Visualising the data

Structuring the data

Flame Chart

Search



Visualising the data



Visualising the data



- Tuna: <https://github.com/nschloe/tuna>

Visualising the data



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- Big thanks to Nico Schloemer!

Visualising the data



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```
$ python -X importtime main.py &> main.stderr
```

Visualising the data



- Tuna: <https://github.com/nschloe/tuna>
- Big thanks to Nico Schloemer!

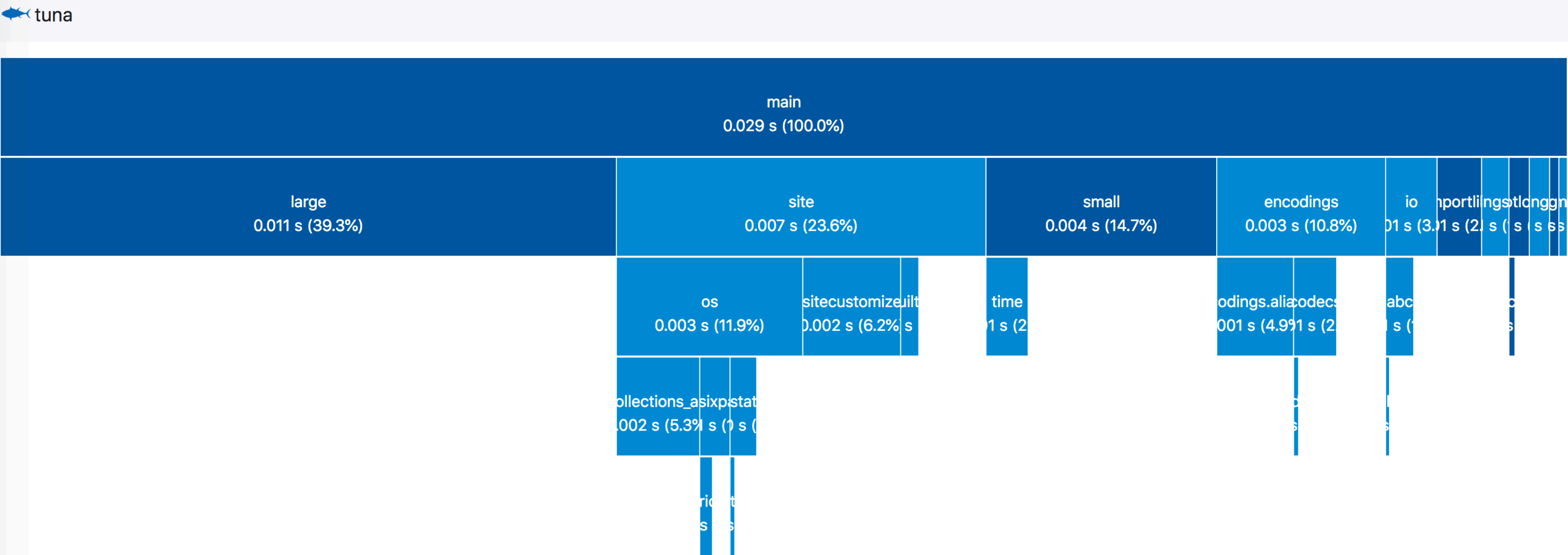
```
$ python -X importtime main.py &> main.stderr
```

```
$ tuna main.stderr
```

```
# Starts up a Python webserver
```

Visualising the data

Structuring the data



Visualising the data

Is a tree 🌳 the right data structure?

Visualising the data

Is a tree  the right data structure?

The import structure isn't strictly a tree, it's a graph

Visualising the data

Is a tree 🌳 the right data structure?

The import structure isn't strictly a tree, it's a graph

```
1 sys.modules = []
2
3 def import(module):
4     for m in module.imports:
5         if m in sys.modules:
6             continue
7         import(m)
8     sys.modules.append(m)
```

Visualising the data

Demonstrating import behaviour

Visualising the data

Demonstrating import behaviour

main.py

```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```

Visualising the data

Demonstrating import behaviour

main.py

```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```

main

Visualising the data

Demonstrating import behaviour

main.py

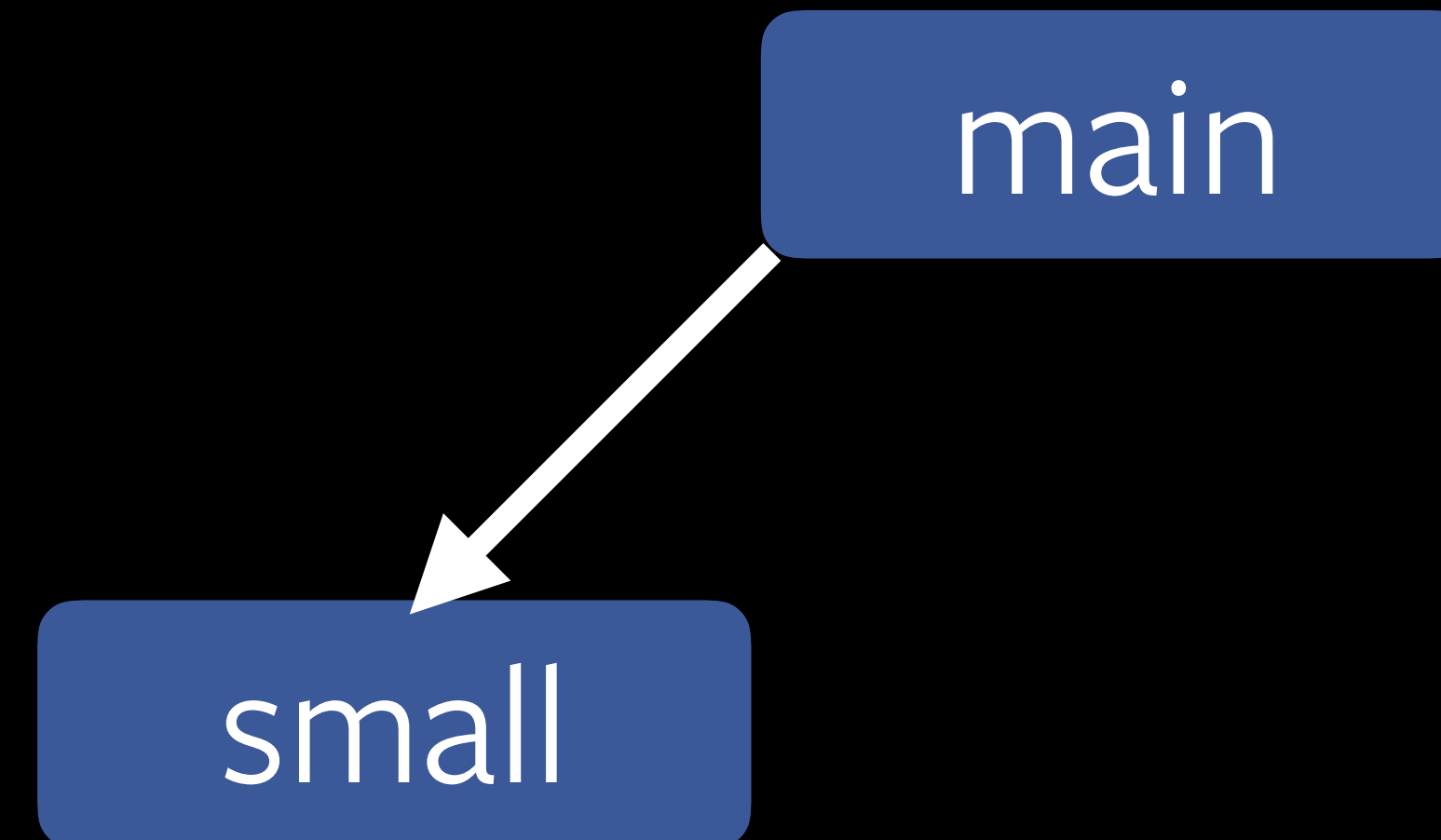
```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```



Visualising the data

Demonstrating import behaviour

main.py

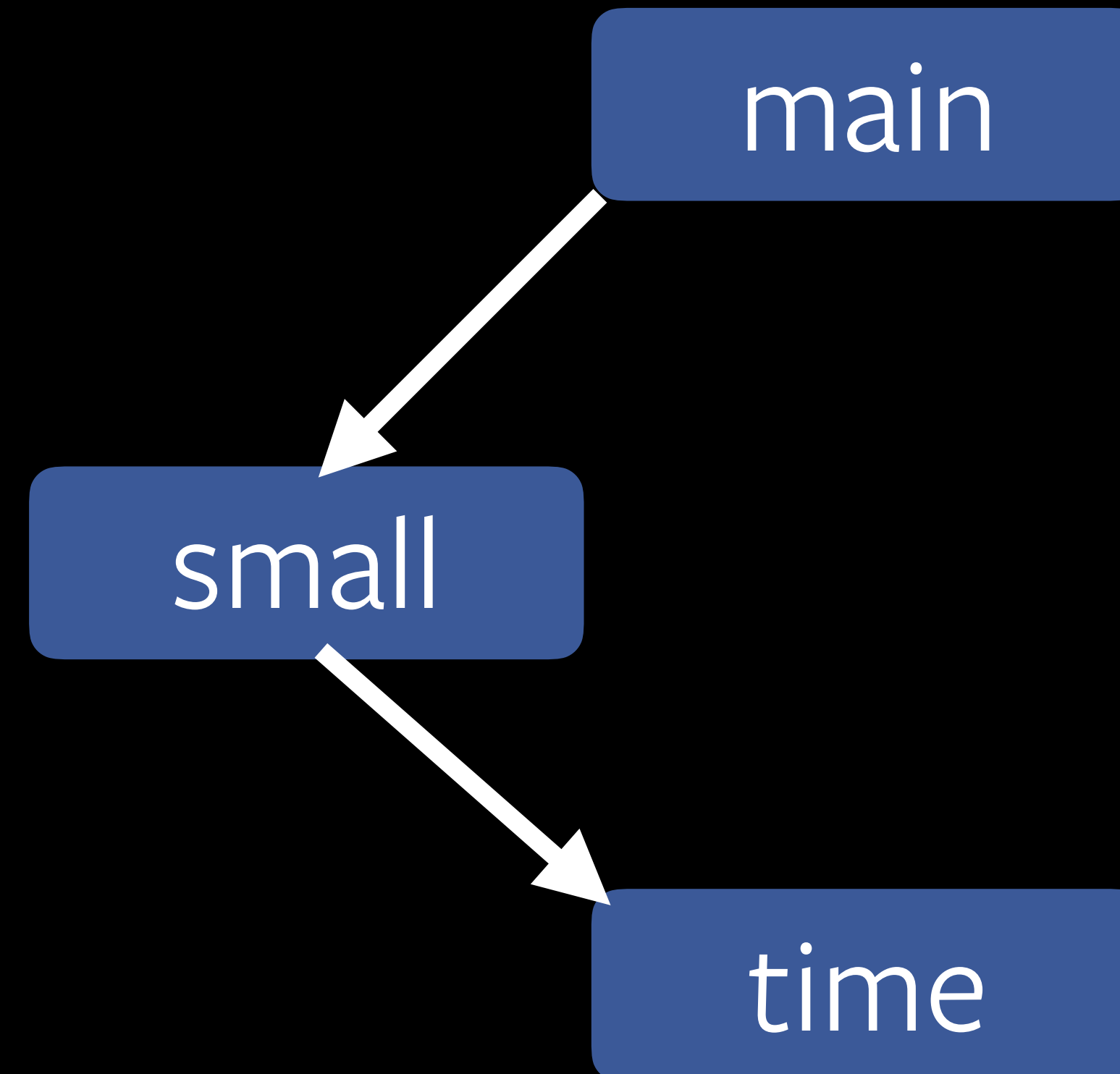
```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```



Visualising the data

Demonstrating import behaviour

main.py

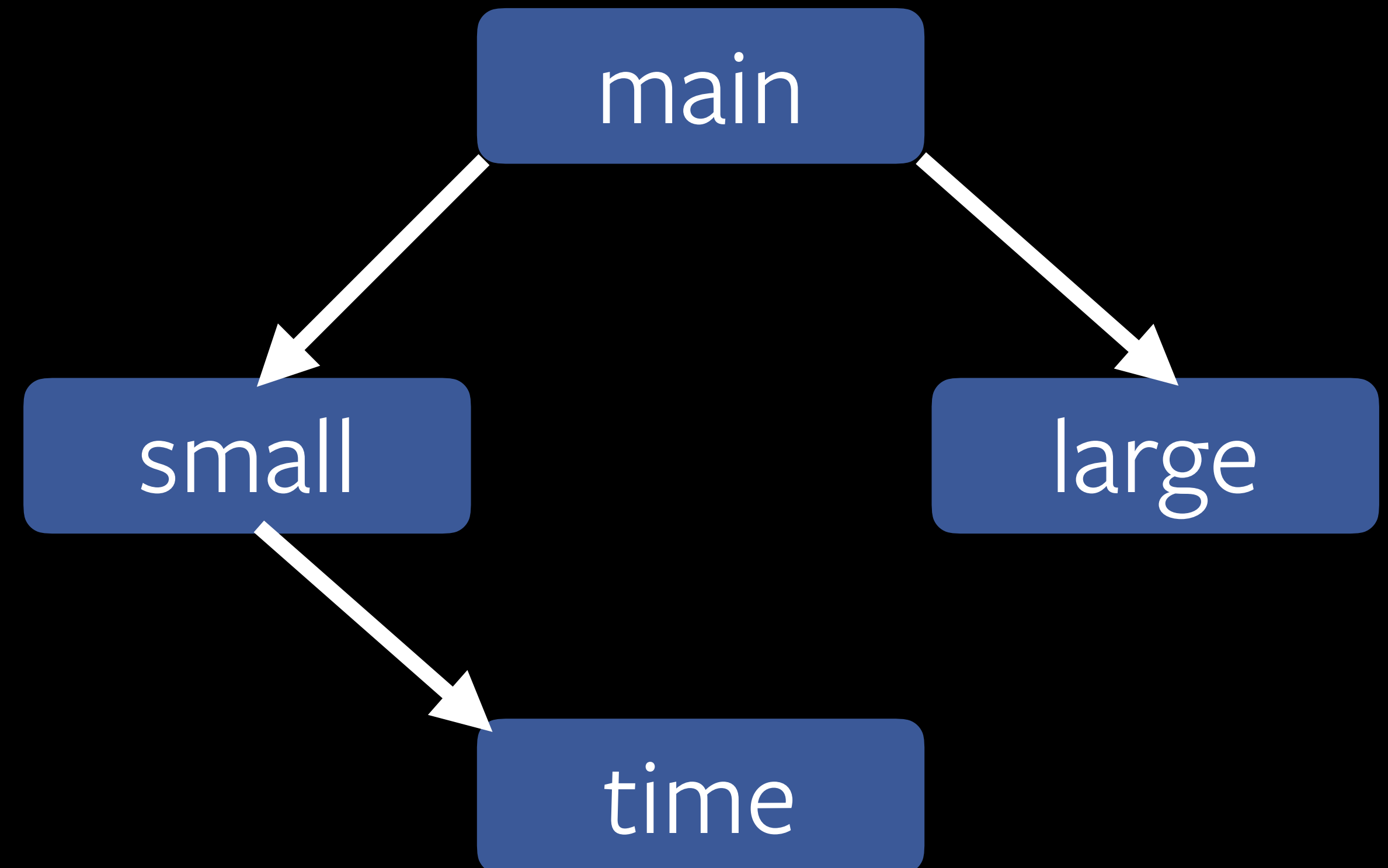
```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```



Visualising the data

Demonstrating import behaviour

main.py

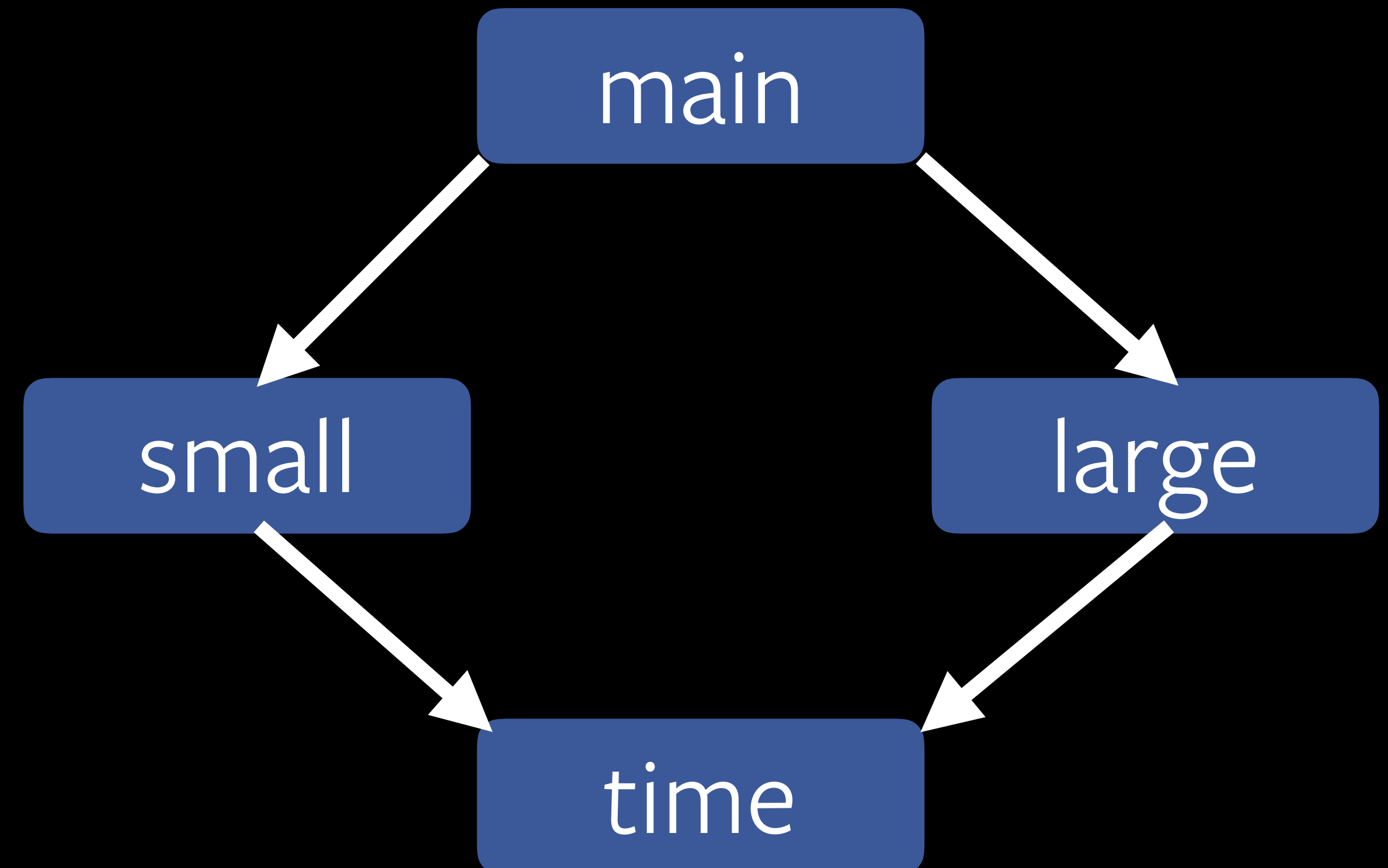
```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```



Visualising the data

Demonstrating import behaviour

main.py

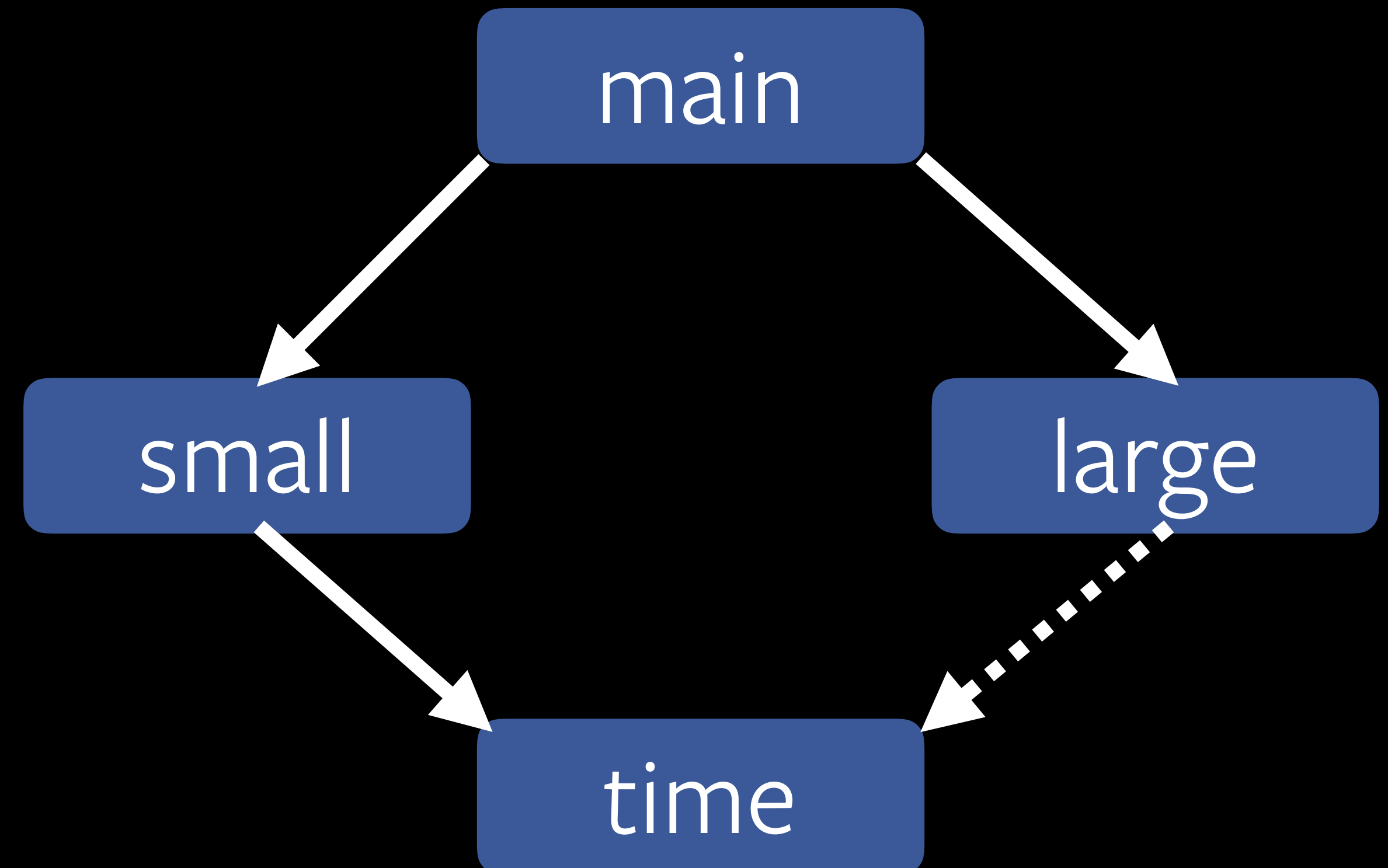
```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

```
1 import time
2 time.sleep(10)
```



Visualising the data

Demonstrating import behaviour

main.py

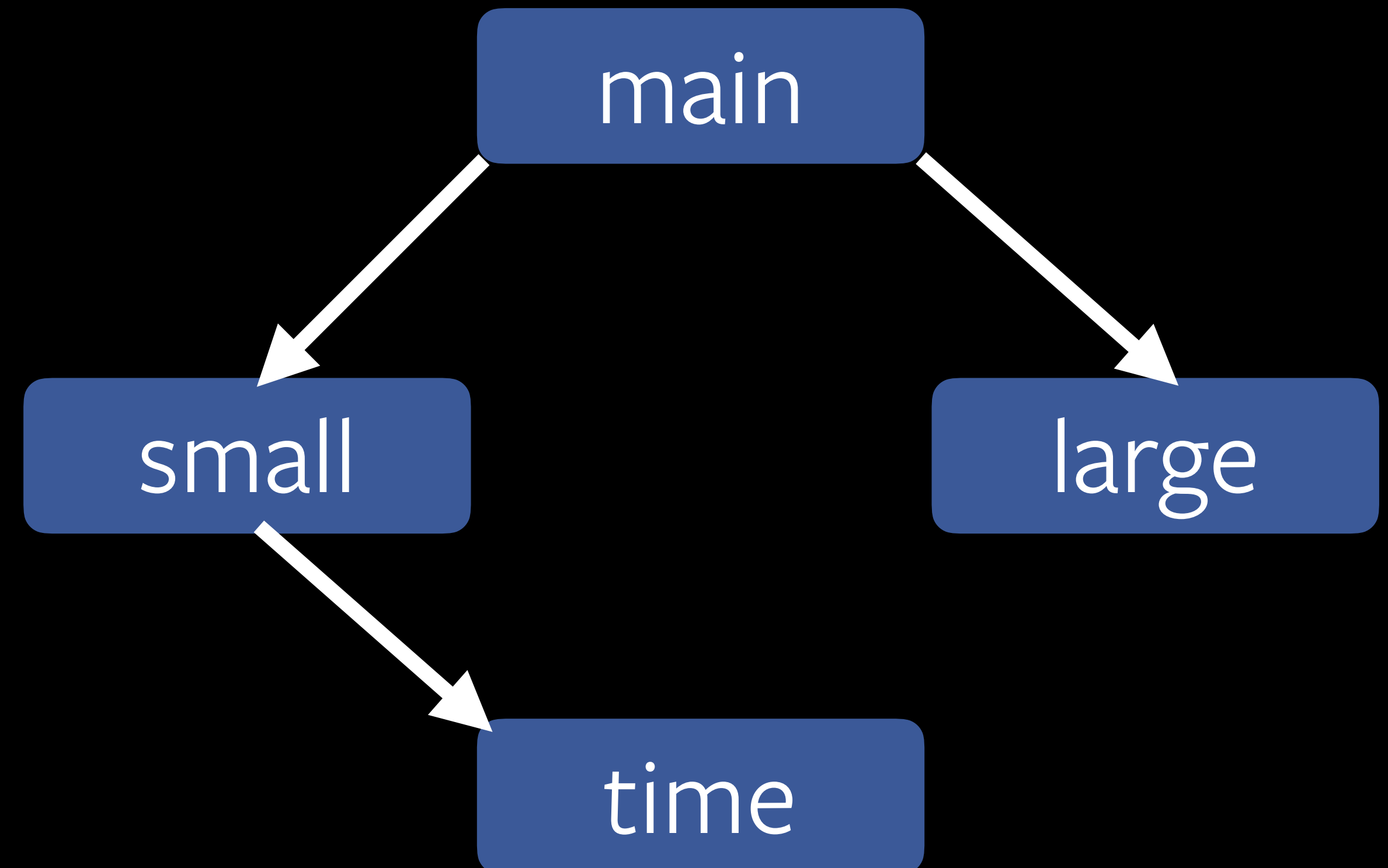
```
1 import small
2 import large
3 print("Hi!")
```

small.py

```
1 import time
2 time.sleep(1)
```

large.py

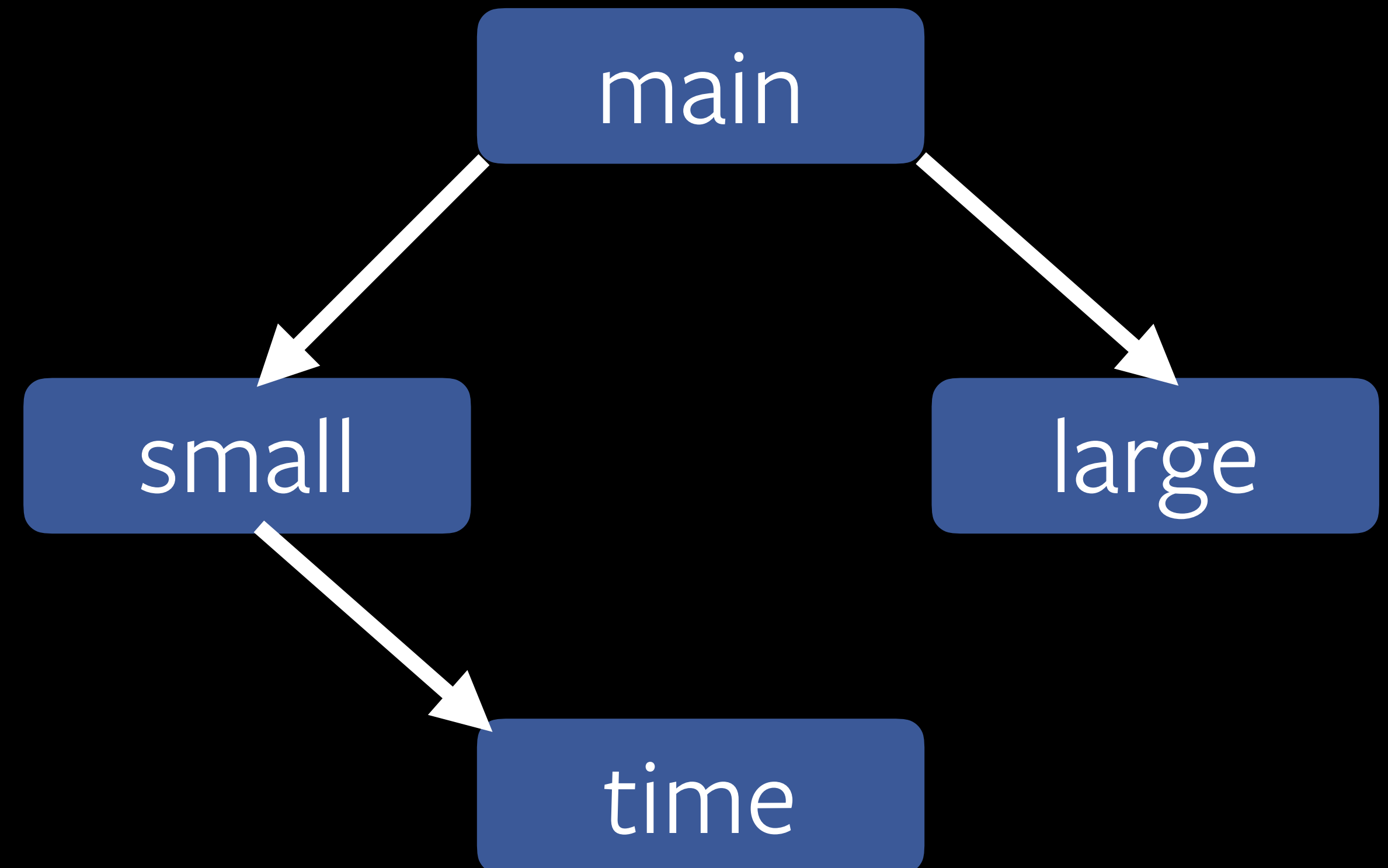
```
1 import time
2 time.sleep(10)
```



Visualising the data

Demonstrating import behaviour

self	cumulative	package
528	528	time
454	981	small
1496	1496	large



Visualising the data

Showing imports as a graph

Visualising the data

Showing imports as a graph

- Pydeps: <https://github.com/thebjorn/pydeps>

Visualising the data

Showing imports as a graph

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- Open source project that produces import graphs

Visualising the data

Showing imports as a graph

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Visualising the data

Showing imports as a graph

- Pydeps: <https://github.com/thebjorn/pydeps>
 - Open source project that produces import graphs
 - Big thanks to Bjørn Pettersen!

```
$ pydeps main.py --max-bacon 0 -o main.svg
```

Visualising the data

Showing imports as a graph

Visualising the data

Showing imports as a graph

```
main.py 1 import small
        2 import large
        3 print("Hi!")
```

```
small.py 1 import time
        2 time.sleep(1)
```

```
large.py 1 import time
        2 time.sleep(10)
```

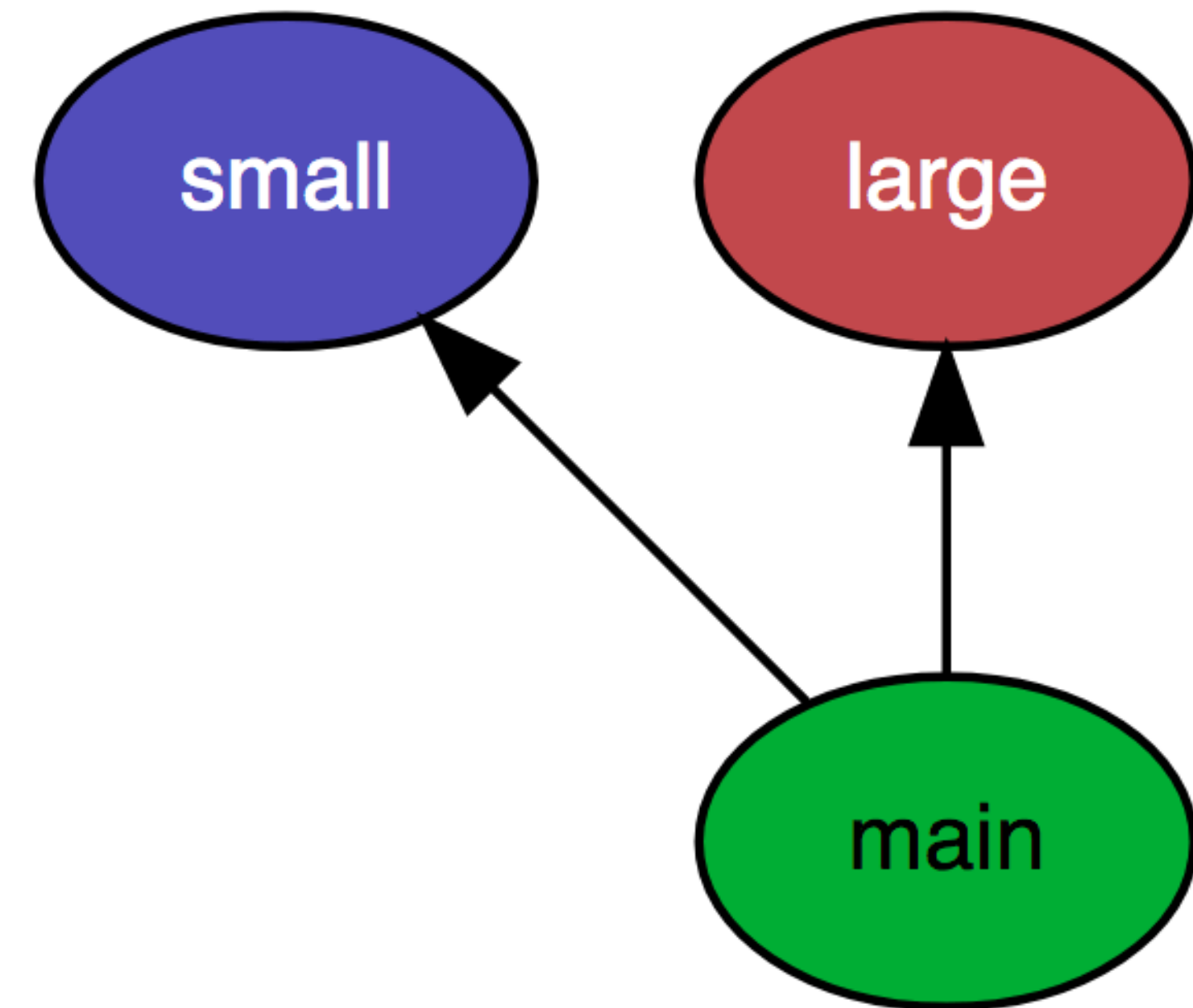
Visualising the data

Showing imports as a graph

```
main.py 1 import small
        2 import large
        3 print("Hi!")
```

```
small.py 1 import time
         2 time.sleep(1)
```

```
large.py 1 import time
         2 time.sleep(10)
```



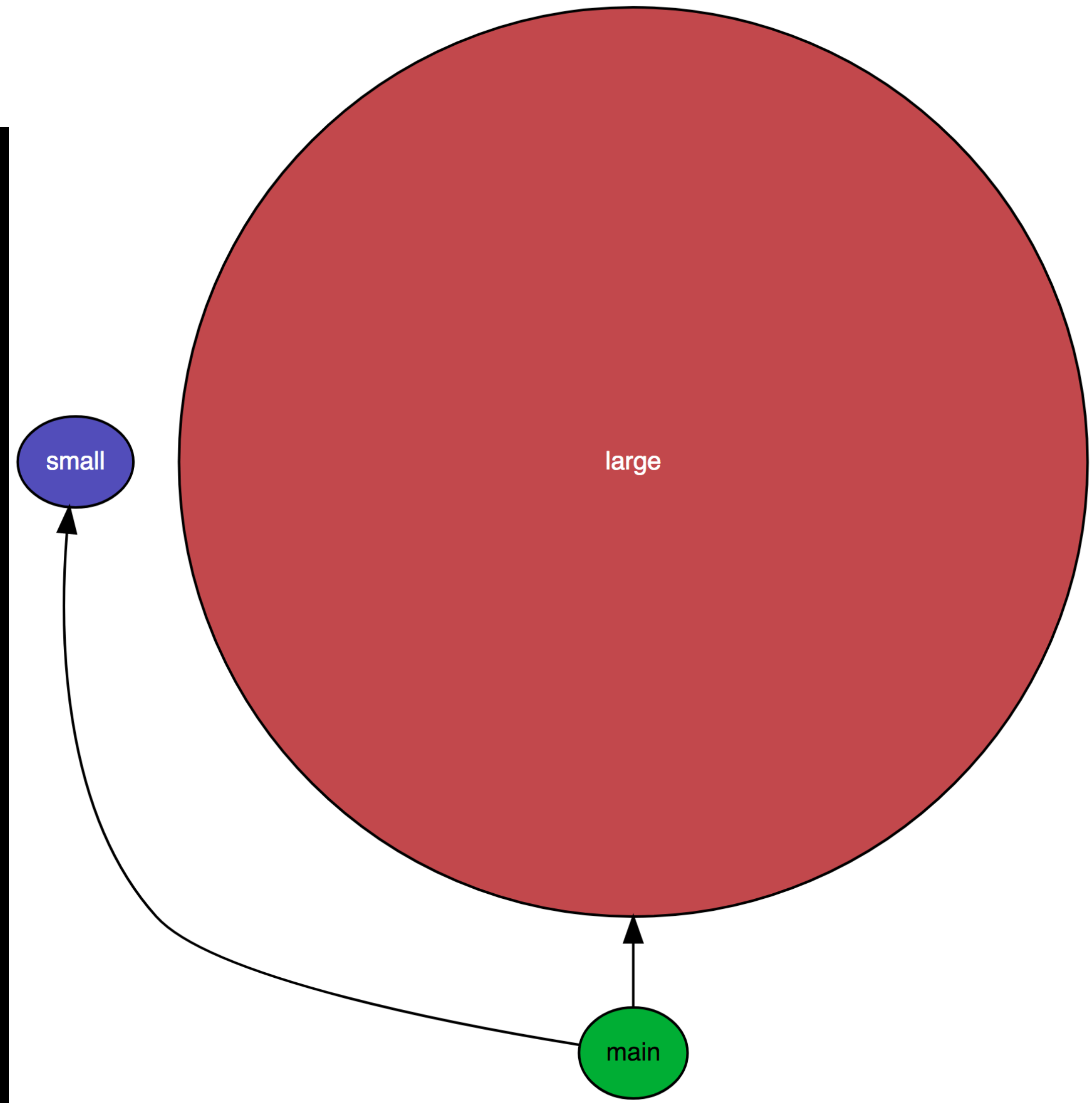
Visualising the data

Showing imports as a graph

```
main.py 1 import small
        2 import large
        3 print("Hi!")
```

```
small.py 1 import time
         2 time.sleep(1)
```

```
large.py 1 import time
         2 time.sleep(10)
```



Determining import cost

A more complicated example

Determining import cost

A more complicated example

```
main.py  1 import one  
         2 import two
```


Determining import cost

A more complicated example

```
main.py 1 import one  
        2 import two
```

```
one.py 1 from funcs import *  
       2 from constants import PI  
       3 x = complicated(PI)  
       4 confusing(oh_no_help(x))
```

Determining import cost

A more complicated example

main.py

```
1 import one
2 import two
```

one.py

```
1 from funcs import *
2 from constants import PI
3 x = complicated(PI)
4 confusing(oh_no_help(x))
```

two.py

```
1 from constants import PI
2 print(f"pi: {PI}")
```

Determining import cost

A more complicated example

main.py

```
1 import one
2 import two
```

one.py

```
1 from funcs import *
2 from constants import PI
3 x = complicated(PI)
4 confusing(oh_no_help(x))
```

two.py

```
1 from constants import PI
2 print(f"pi: {PI}")
```

funcs.py

```
2 time.sleep(0.3)
3
4 def complicated(a):
5     pass
6 def confusing(b):
7     pass
8 def oh_no_help(c):
9     pass
```

Determining import cost

A more complicated example

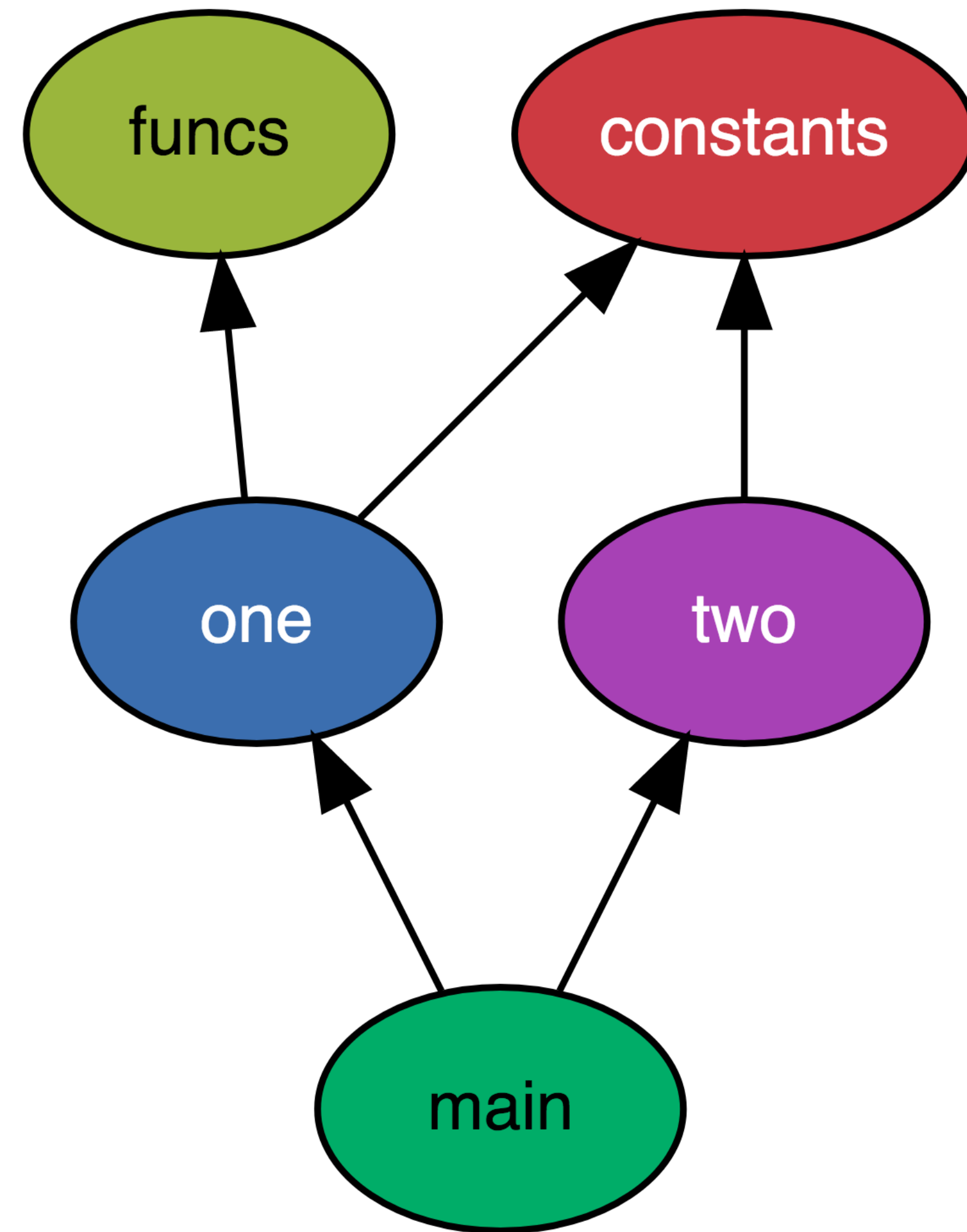
```
main.py 1 import one
        2 import two

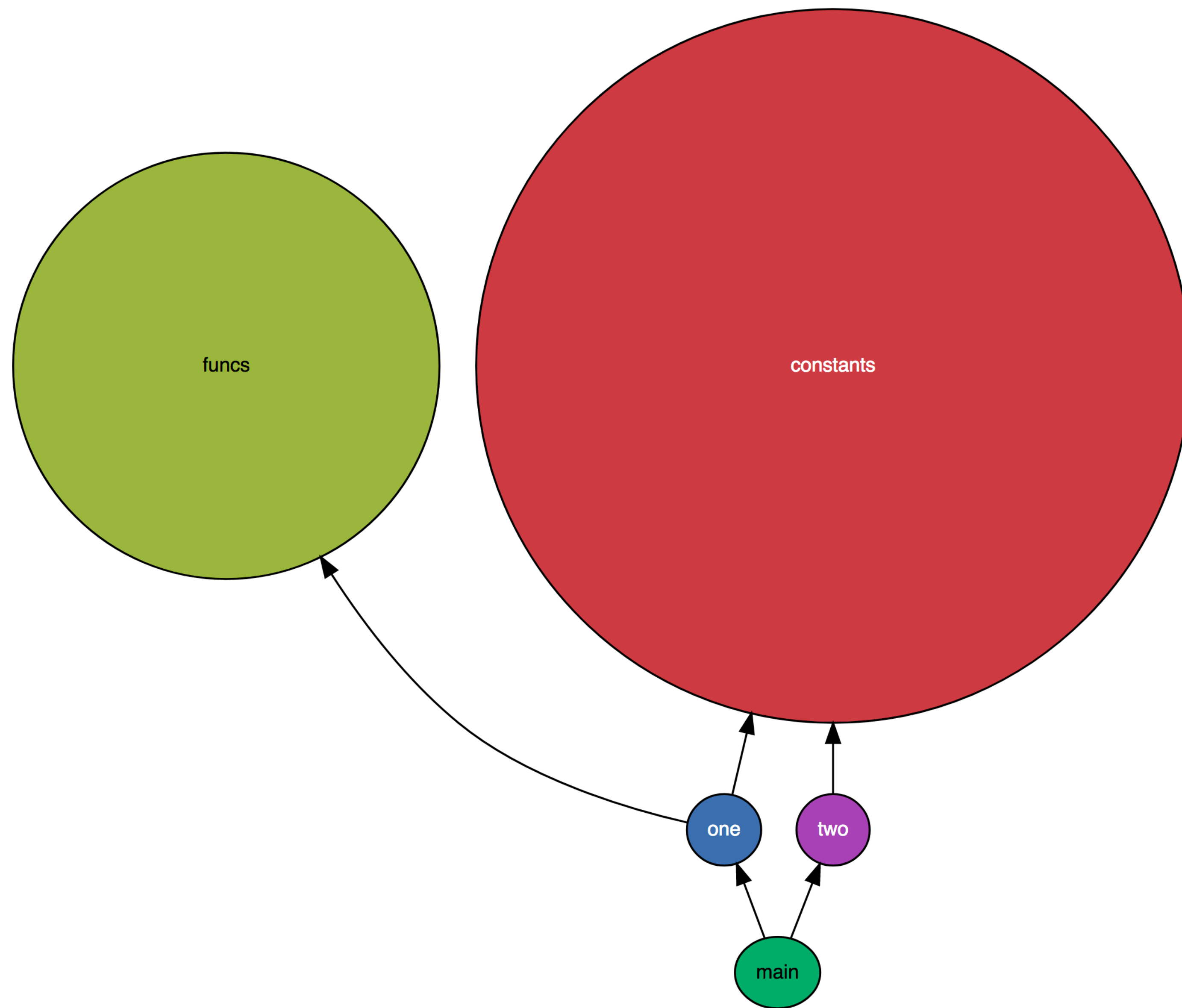
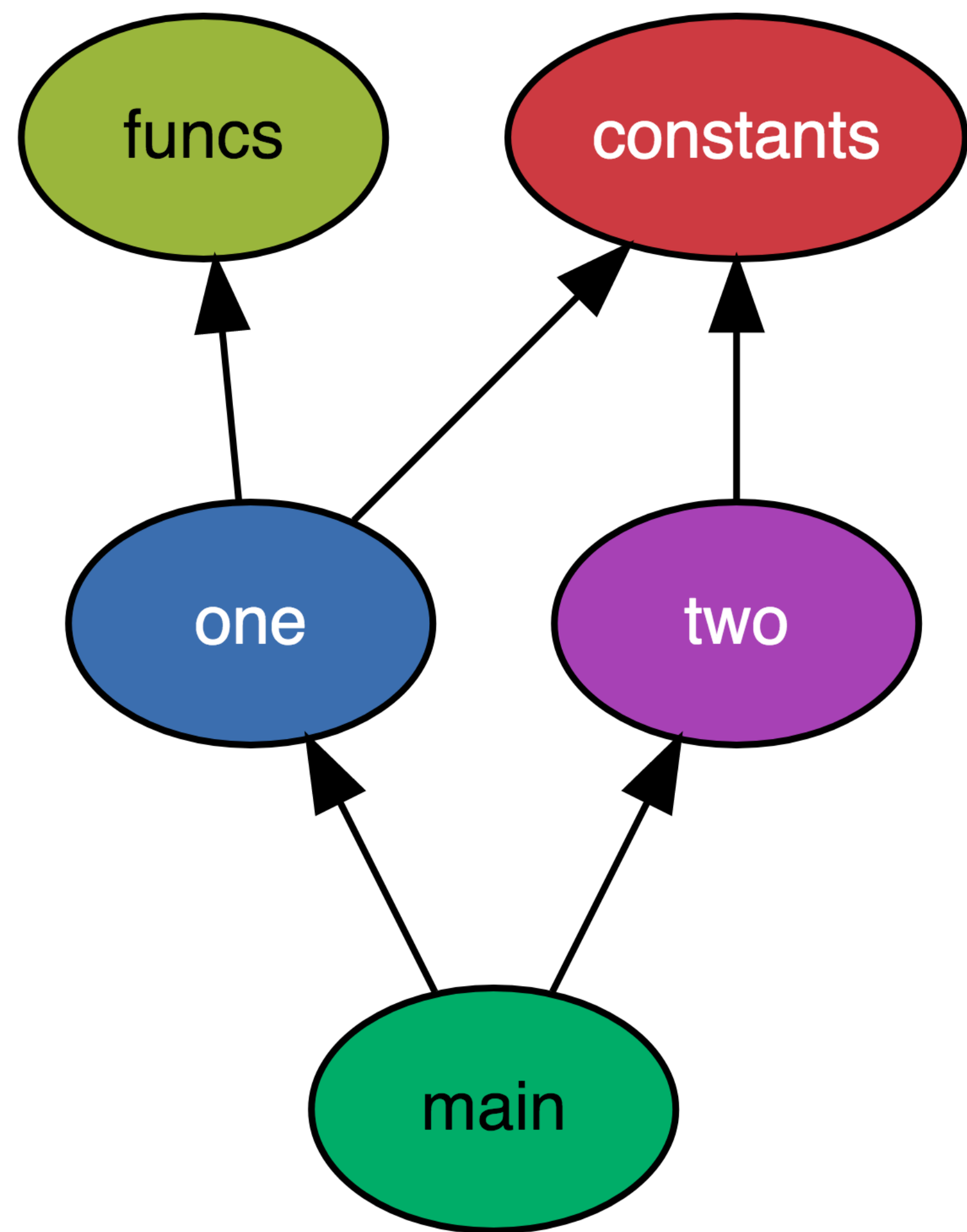
one.py  1 from funcs import *
        2 from constants import PI
        3 x = complicated(PI)
        4 confusing(oh_no_help(x))

two.py  1 from constants import PI
        2 print(f"pi: {PI}")

constants.py 2 time.sleep(0.5)
              3 PI = 3.14

funcs.py 2 time.sleep(0.3)
          3
          4 def complicated(a):
          5     pass
          6 def confusing(b):
          7     pass
          8 def oh_no_help(c):
          9     pass
```



Determining import cost

Connectedness metrics

```
$ pydeps main.py --connectedness
2 constants
1 funcs
1 one
1 main
1 two
0 __main__
```

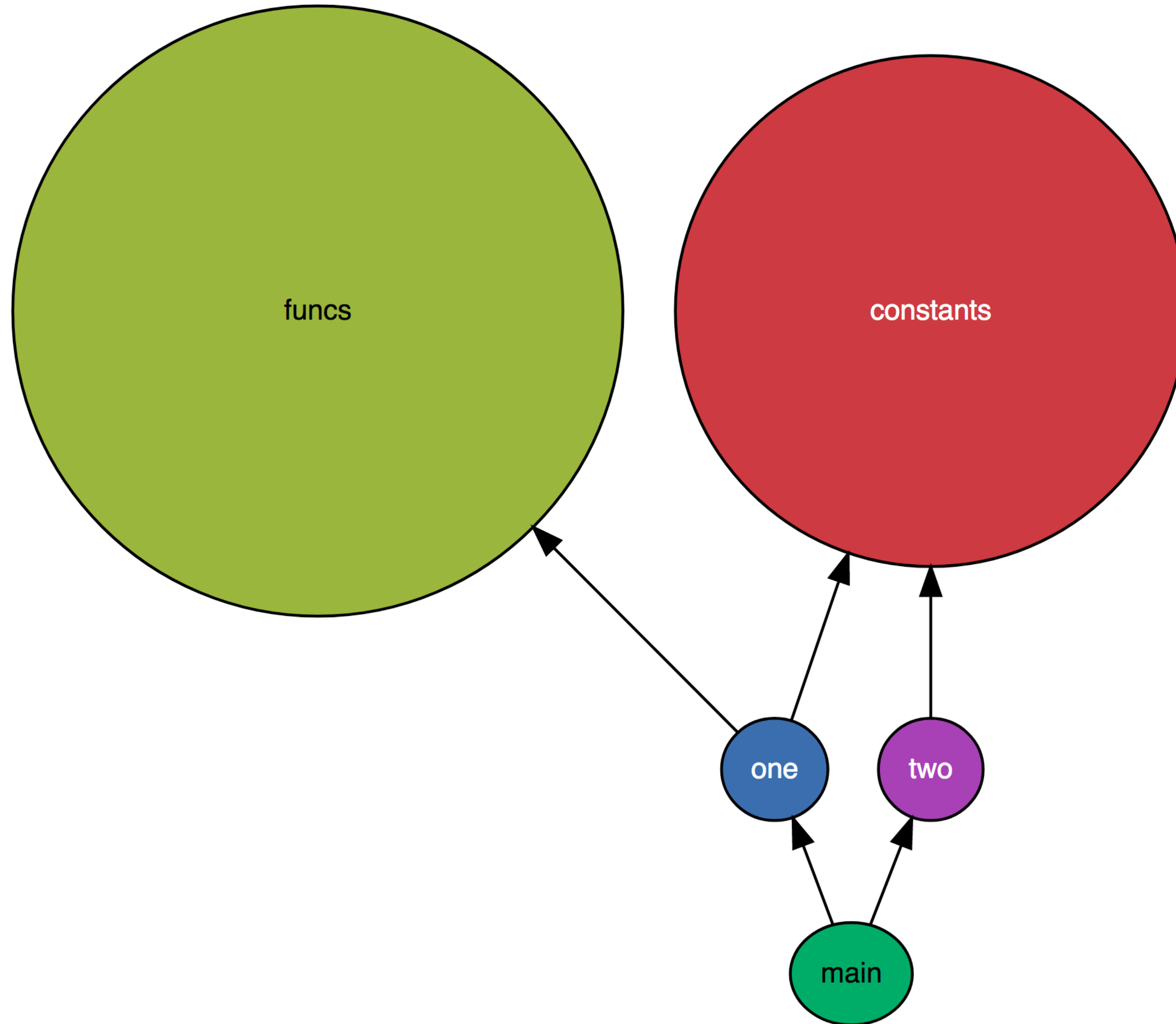

Determining import cost

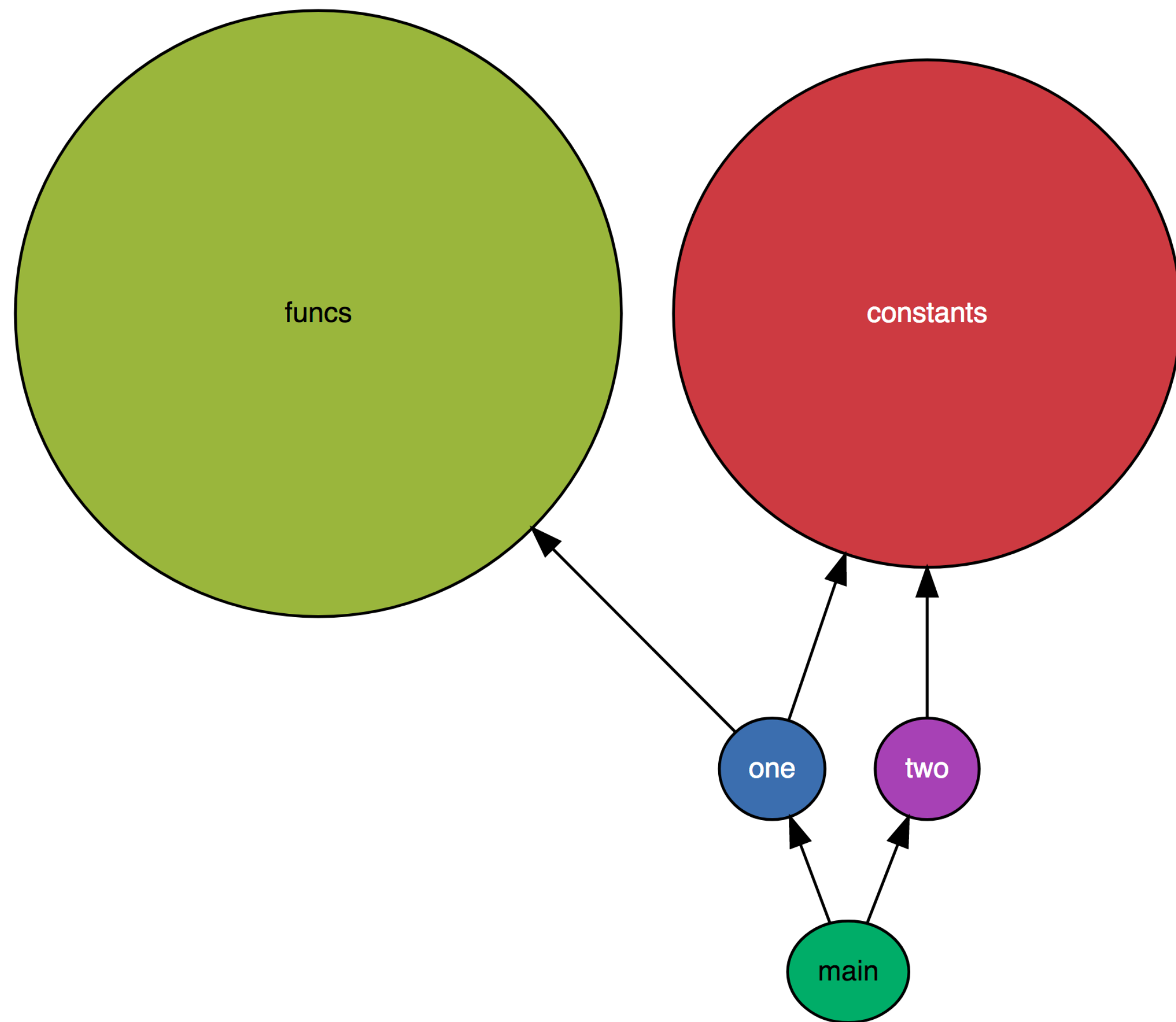
Proposing a node cost function with connectedness

Determining import cost

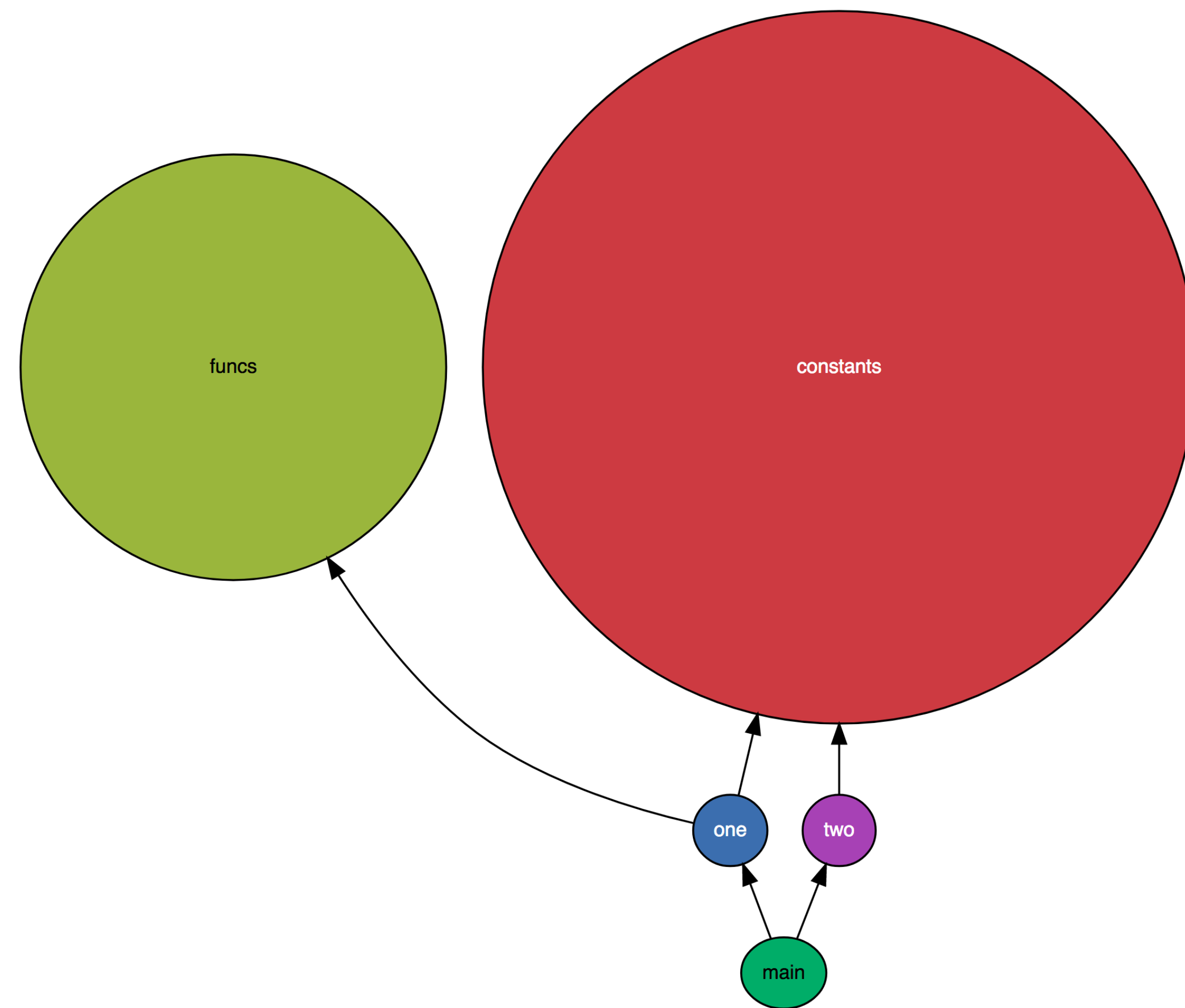
Proposing a node cost function with connectedness

$$\frac{\text{<import time>}}{\text{<num times imported>}}$$





Import time + Connectedness



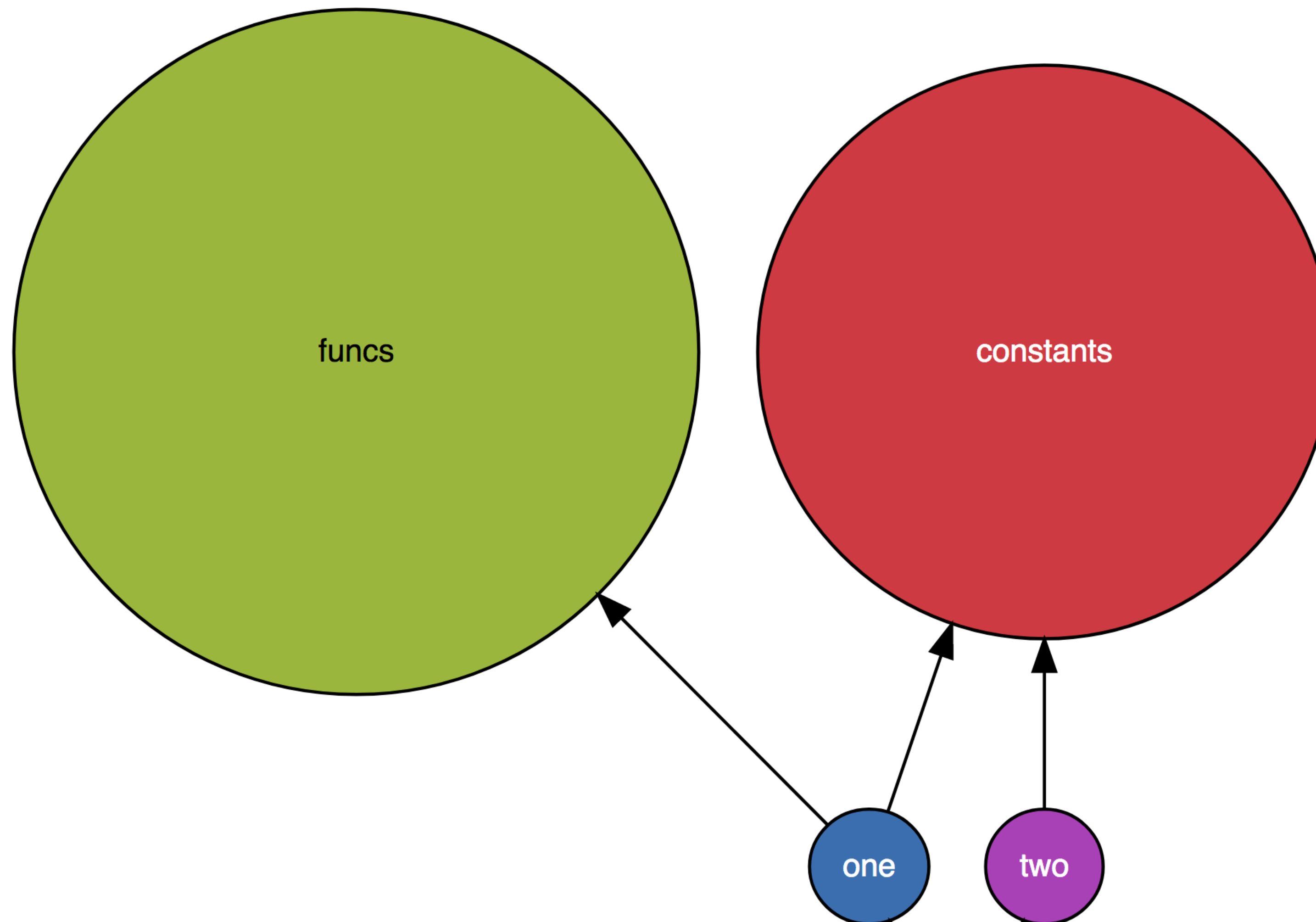
Import time

Visualising the data

Consider unique attribute access

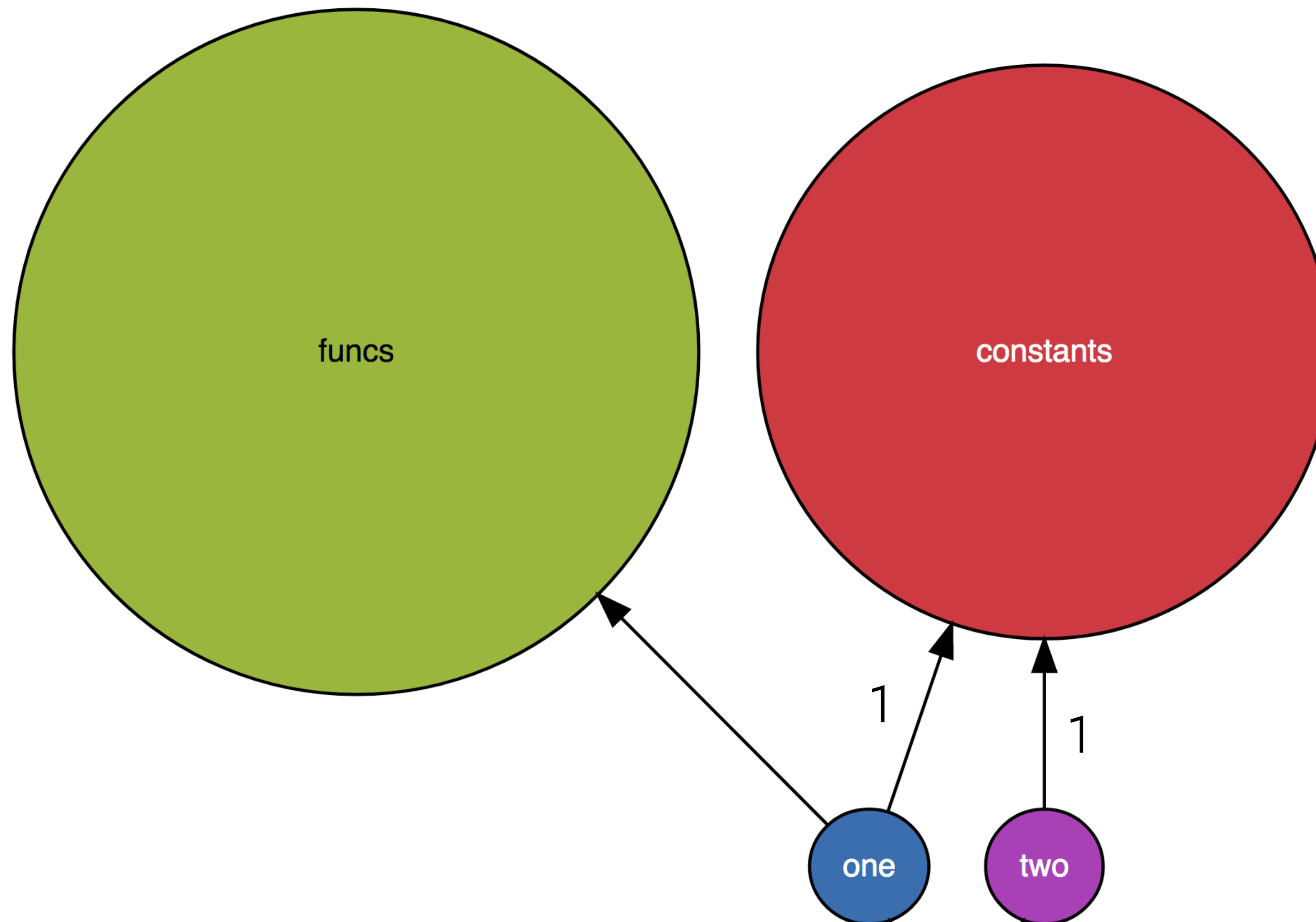
Visualising the data

Consider unique attribute access



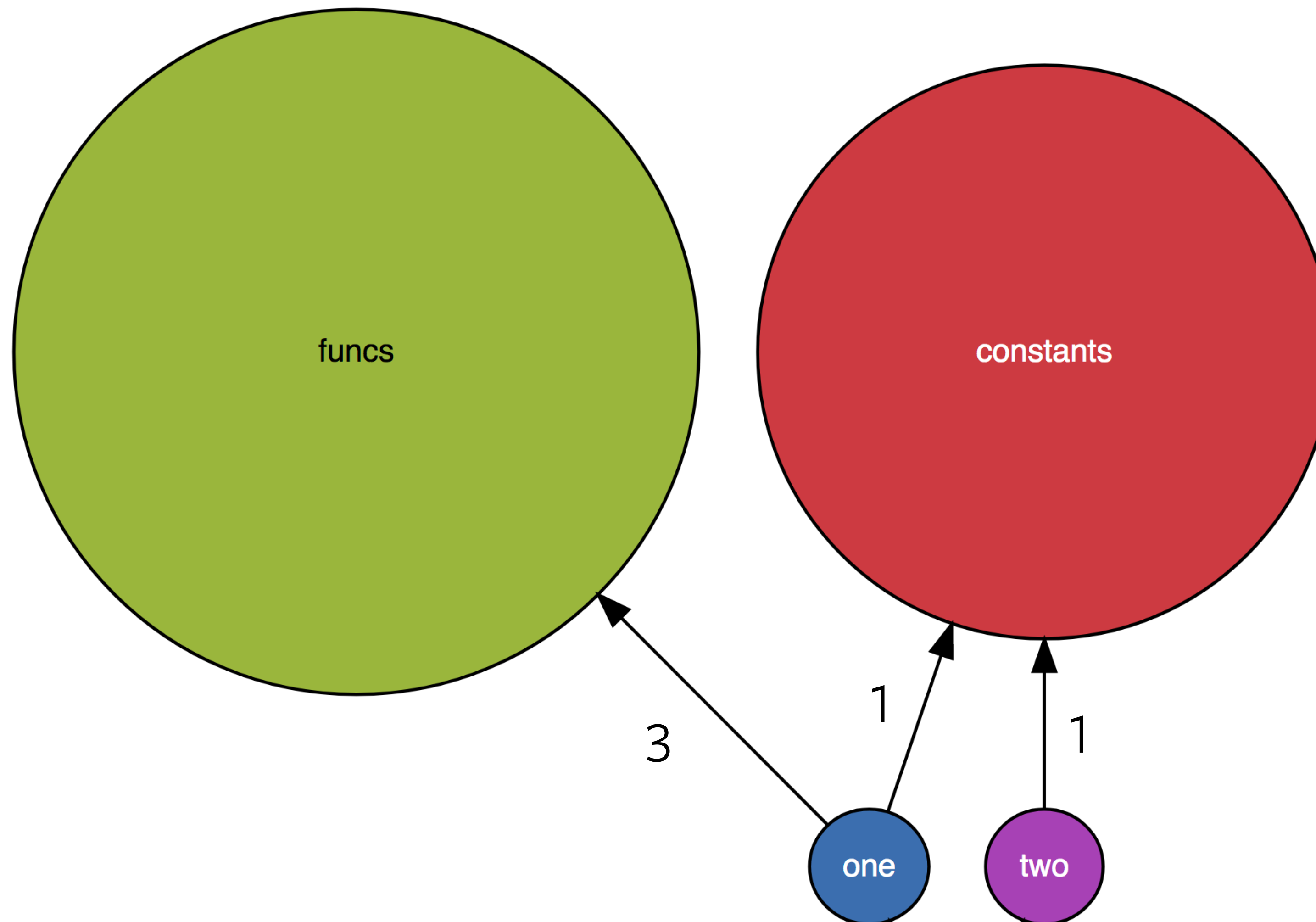
Visualising the data

Consider unique attribute access



Visualising the data

Consider unique attribute access



Visualising the data

A node cost function with connectedness and unique attribute access

Visualising the data

A node cost function with connectedness and unique attribute access

```
<import time>
```

```
<num times imported> + <unique attributes accessed>
```

Visualising the data

A node cost function with connectedness and unique attribute access

```
<import time>
```

```
<num times imported> + <unique attributes accessed>
```

constants.py

$$\frac{0.5}{2 + 1} = 0.166$$

Visualising the data

A node cost function with connectedness and unique attribute access

```
<import time>
```

```
<num times imported> + <unique attributes accessed>
```

constants.py

$$\frac{0.5}{2 + 1} = 0.166$$

funcs.py

$$\frac{0.3}{1 + 3} = 0.075$$

Visualising the data

A node cost function with connectedness and unique attribute access

```
<import time>
```

```
<num times imported> + <unique attributes accessed>
```

 constants.py 

$$\frac{0.5}{2 + 1} = 0.166$$

funcs.py

$$\frac{0.3}{1 + 3} = 0.075$$

Improving import time

Finally!

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- Restructure imports

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- Avoid doing work at module level

Improving import time

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- Restructure imports
- Avoid doing work at module level
 - Try lazy instantiation

```
1 class Expensive:
2     def beegyoshi(self):
3         return "!!!"
```

```
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5 e = Expensive()
```

```
1 class Expensive:
2     def beegyoshi(self):
3         return "!!!"

7 class LazyWrapper:
8     def __init__(self, clazz, *args, **kwargs):
9         self.clazz = clazz
10        self.args = args
11        self.kwargs = kwargs
12        self.instance = None
13
14    def __getattr__(self, attr):
15        if self.instance is None:
16            self.instance = self.clazz(*self.args, **self.kwargs)
17        return getattr(self.instance, attr)
18
19 e = LazyWrapper(Expensive)
```

Improving import time

Finally!

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Improving import time

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Improving import time

Finally!

- Restructure imports
- Avoid doing work at module level
 - Try lazy instantiation
- Lazy imports
 - Import module within function that uses it
 - Demand Import (<https://pypi.org/project/demandimport/>)

Improving import time

Demand import

main.py

Improving import time

Demand import

```
main.py  1 import one  
        2 import two
```

Improving import time

Demand import

```
main.py 1 import demandimport
        2 demandimport.enable()
        3
        4 import one
        5 import two
```

Improving import time

Demand import

```
main.py 1 import demandimport
        2 demandimport.enable()
        3
        4 import one
        5 import two
```

```
$ python main.py
```

```
Delaying import of one for __main__ (level 0) situation #1
```

```
Delaying import of two for __main__ (level 0) situation #1
```

Improving import time

Demand import

```
main.py 1 import demandimport
        2 demandimport.enable()
        3
        4 import one
        5 import two
```

Improving import time

Demand import

```
main.py 1 import demandimport
        2 demandimport.enable()
        3
        4 import one
        5 import two
        6
        7 print(one.x)
```

Improving import time

Demand import

```
$ python main.py
Delaying import of one for __main__ (level 0) situation #1
Delaying import of two for __main__ (level 0) situation #1
Triggered to import one for __main__
Delaying import of time for funcs (level 0) situation #1
Triggered to import time for funcs
Delaying import of time for constants (level 0) situation #1
Triggered to import time for constants
None
```

Summary

We made it!

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- How to get import times in 3.7 and < 3.7

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- Suggestions for how to fix it

Summary

We made it!

- How to get import times in 3.7 and < 3.7
- Different methods for visualising this data
 - As a tree and a graph
 - Taking into account additional parameters
- Suggestions for how to fix it
 - Import restructuring, lazy instantiation and importing

Thanks to these great folks



- Lachlan for helping me prepare
- The Pycon AU team!!
- All of you lovely people 😊

Questions?

Twitter

@banool1

Website

dport.me

Github

github.com/banool

Tools you (yes you!) can use

Tool / Resource	Link	Use	Version
<code>-X importtime</code>	Native in 3.7	Get import time data	3.7+
<code>import_times</code>	github.com/banool/import_times	Get import time data (not as good)	3.4+
Tuna	github.com/nschloe/tuna	Show import time data in a flame graph / icicle chart format	3.7+
Pydeps	github.com/thebjorn/pydeps	Show import graph. Import time functionality only on my fork right now	2.7+
<code>demandimport</code>	pypi.org/project/demandimport/	Delay all module import to first attribute access	2.7+
All code used in this talk + more	github.com/banool/pycon-au-2019	See the many rabbitholes I fell down while writing this talk	3.7+

facebook

BLAH

BLAAAAHHHHHHH

- BLAAHHHH!!!!