

IS IT ME
OR PYTHON
MEMORY
MANAGEMENT?

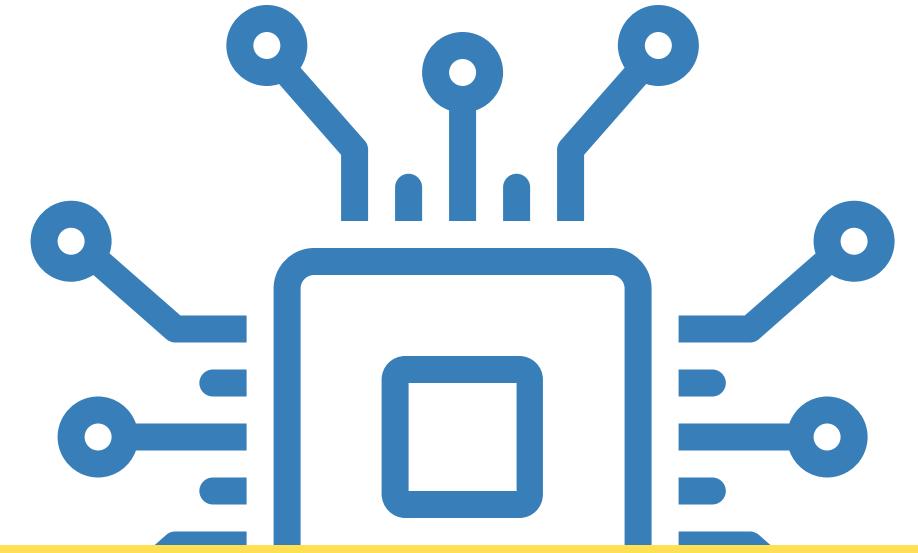


YULIIA BARABASH

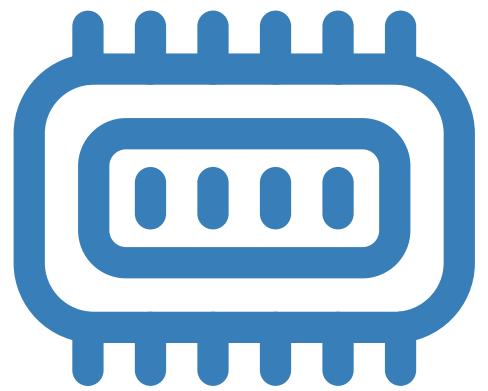
LAYSU UCHOA

CLOUD ENGINEER AT NORDCLOUD

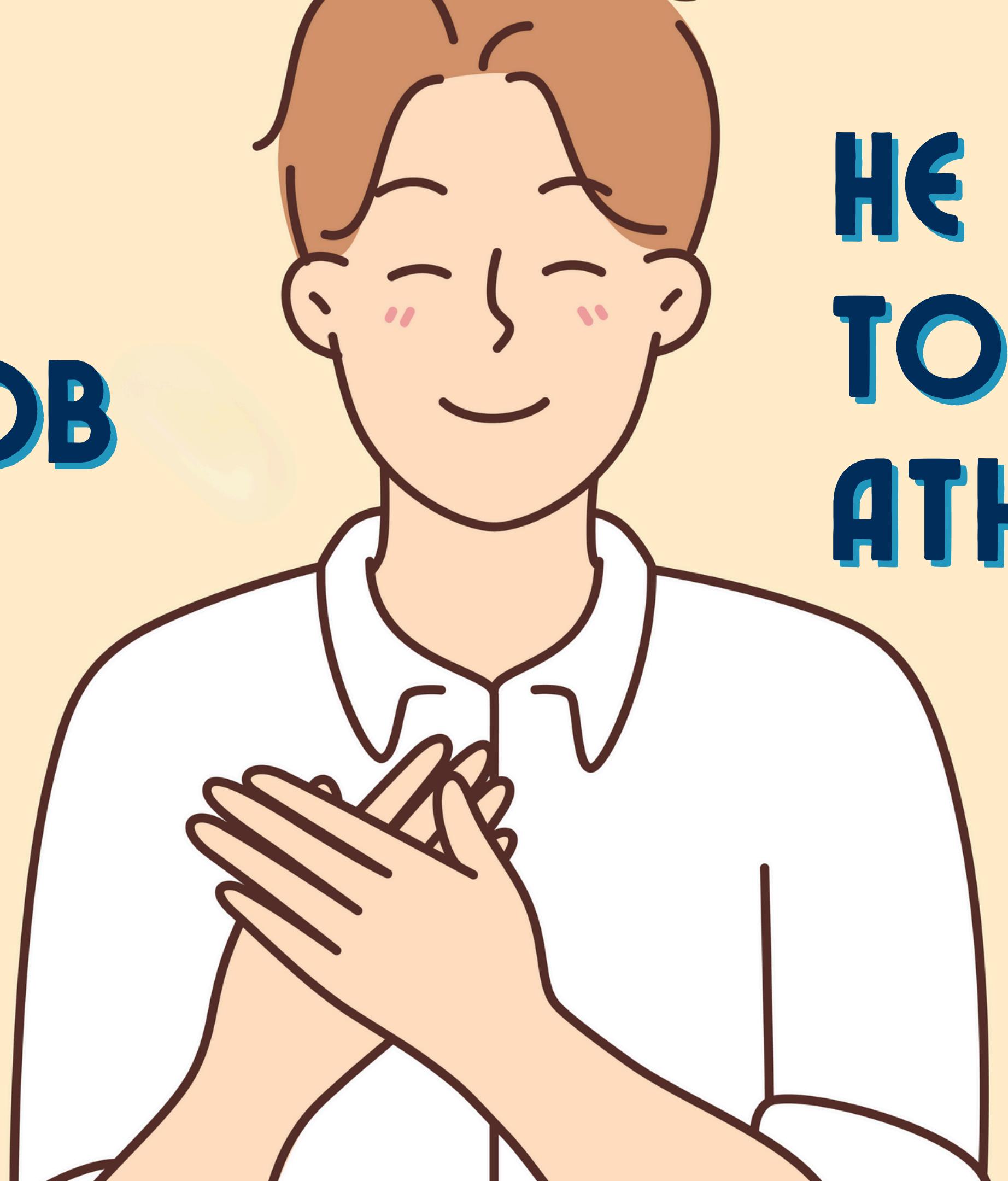




LET'S TALK ABOUT PERFORMANCE



IT IS BOB

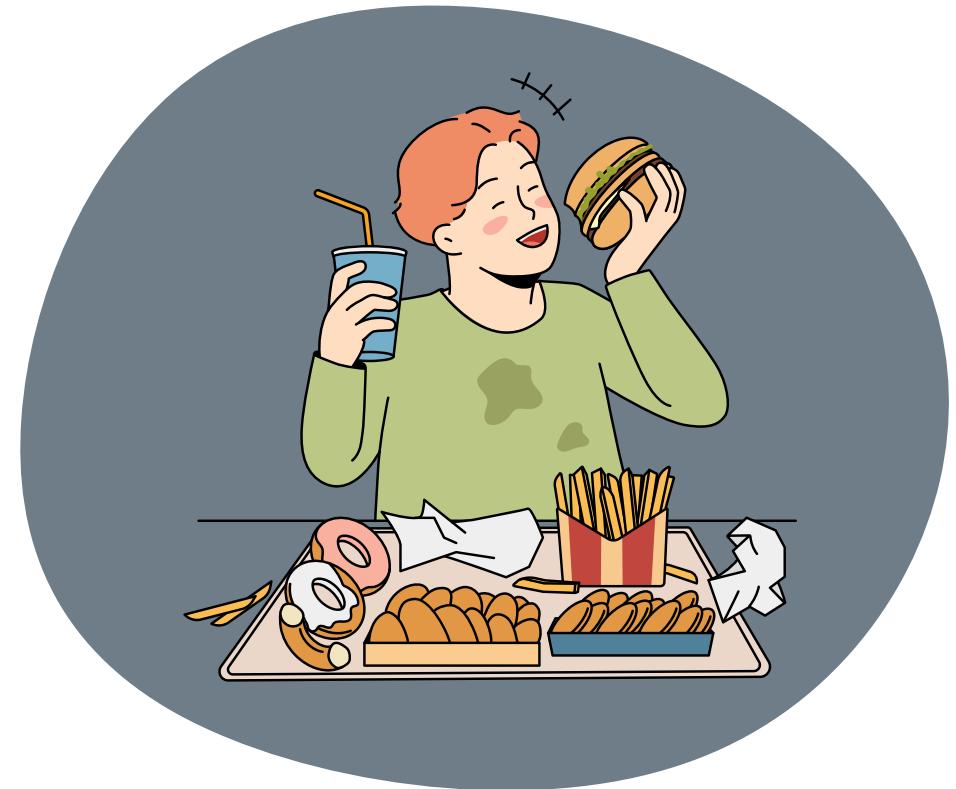


**HE WANTS
TO BE AN
ATHLETE**







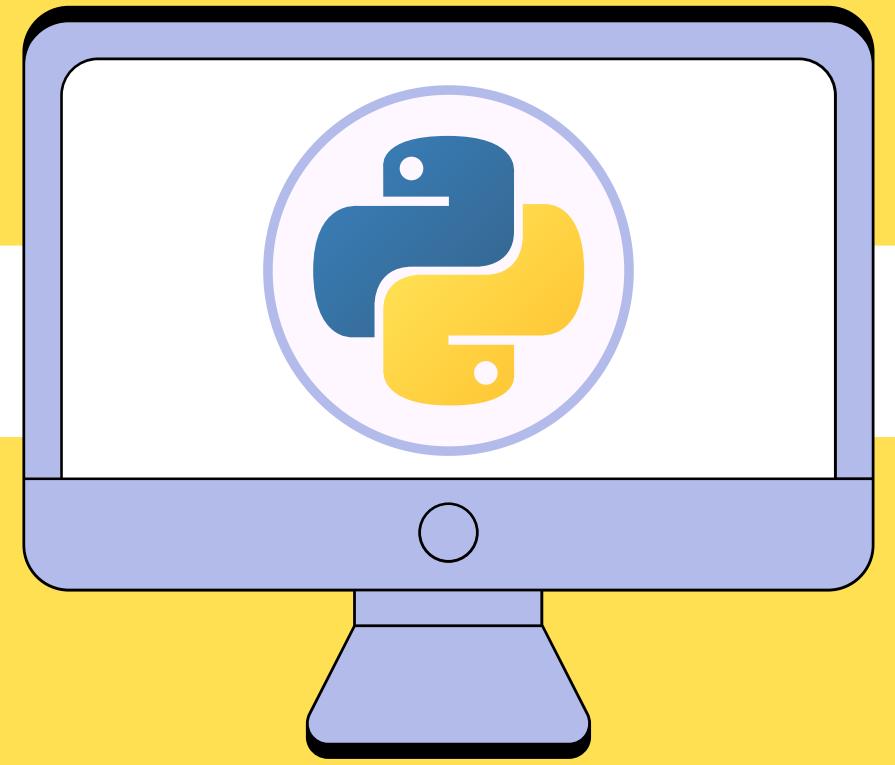


THERE IS NO SOFTWARE

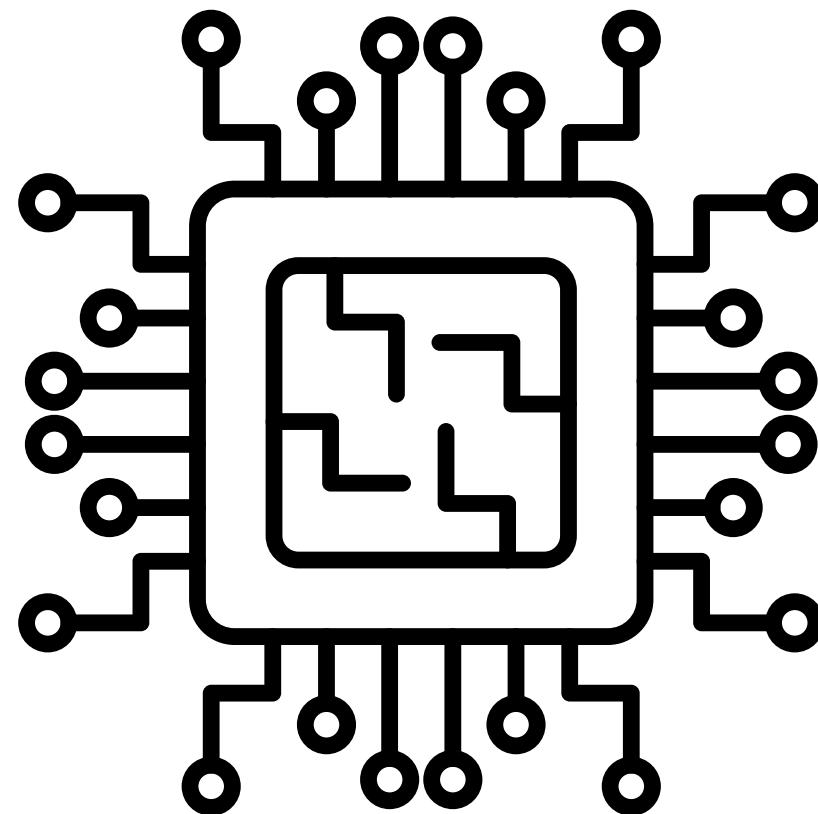


THERE IS NO SOFTWARE

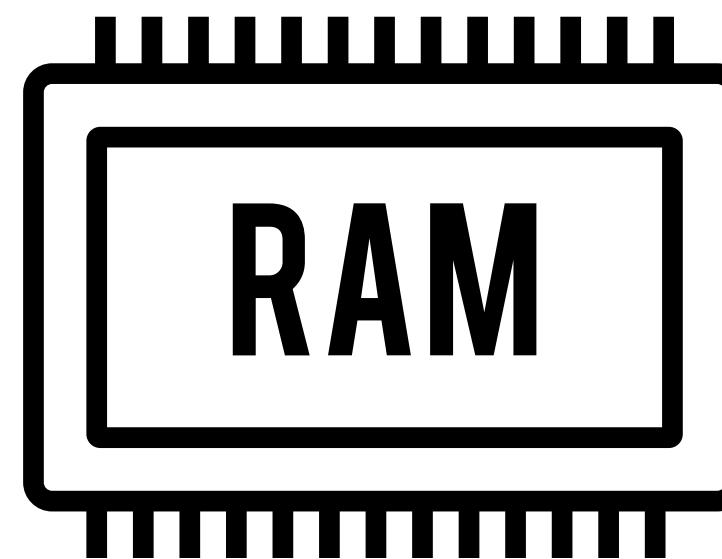
WITHOUT HARDWARE



COMPONENTS OF HARDWARE

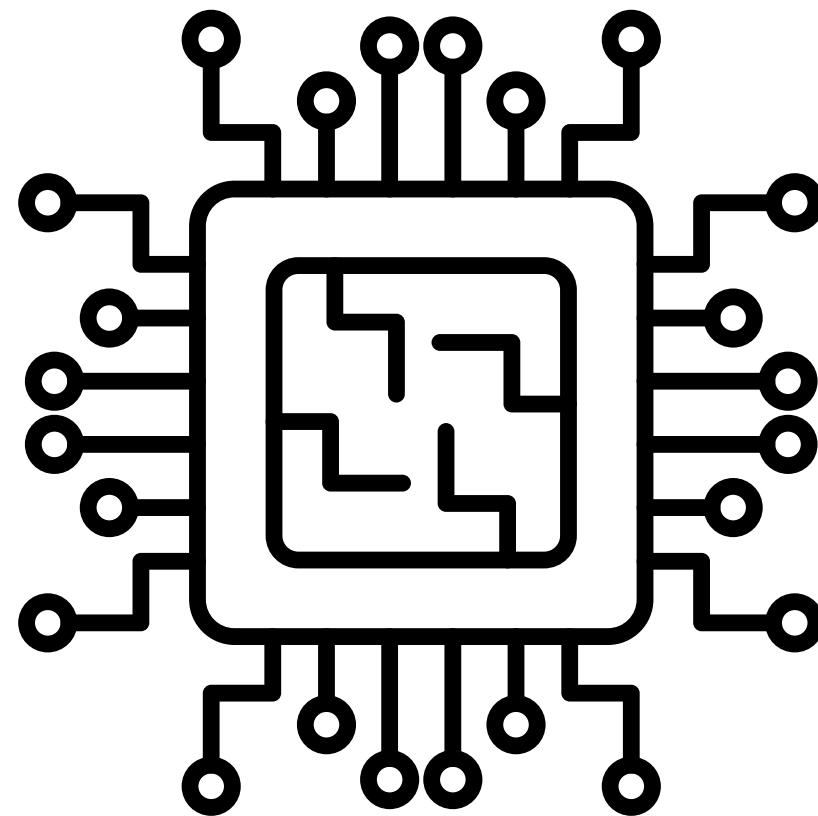


COMPUTING UNITS

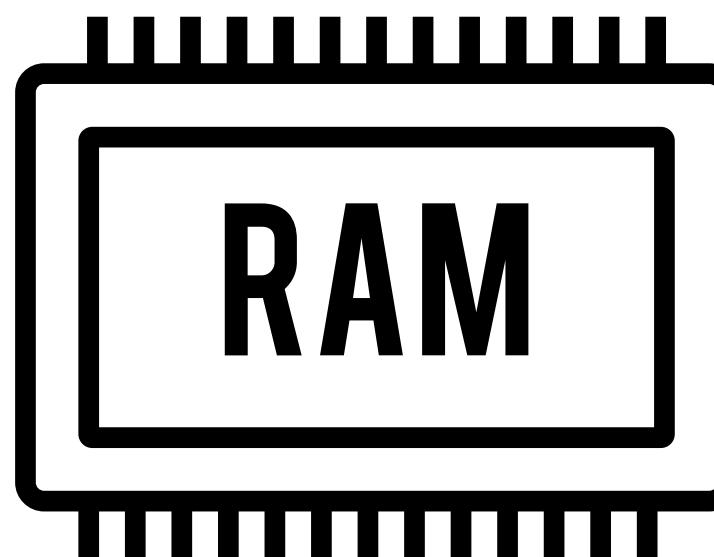
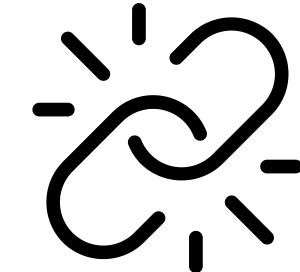


MEMORY UNITS

COMPONENTS OF HARDWARE

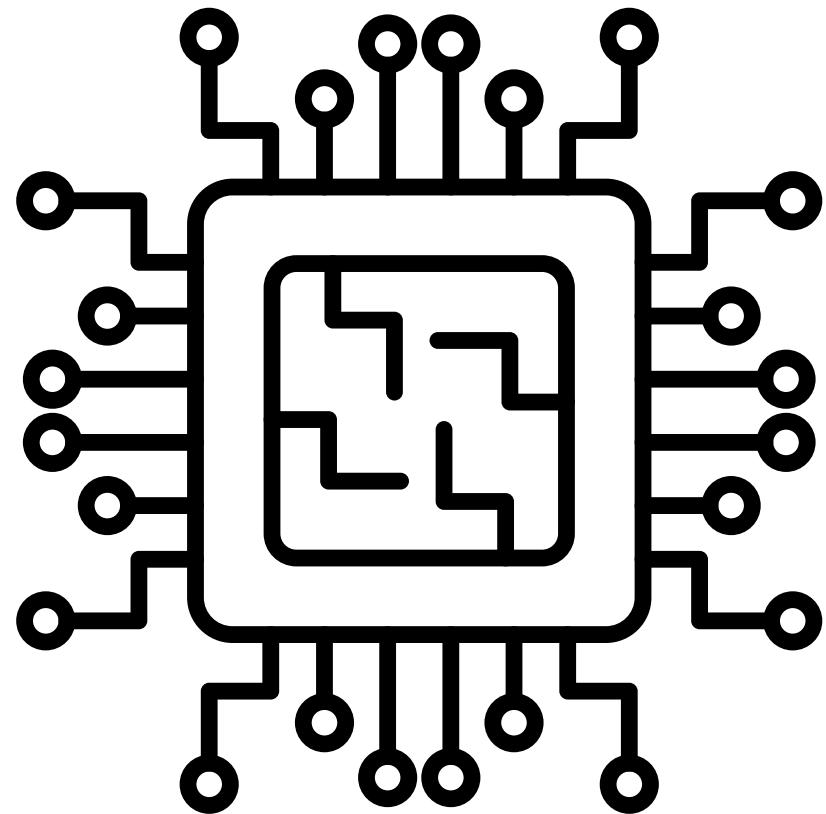


COMPUTING UNITS



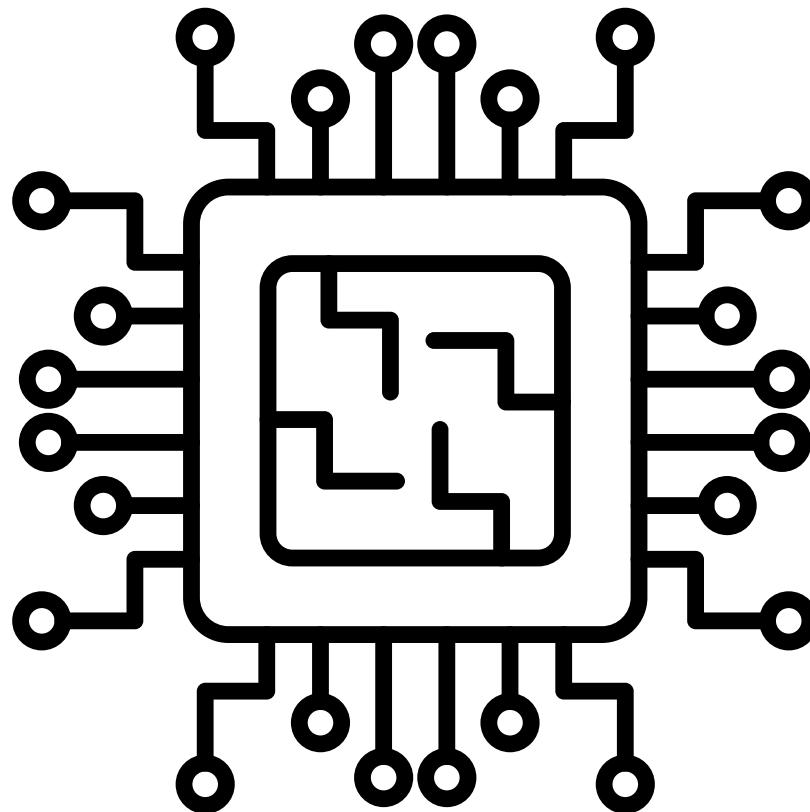
MEMORY UNITS

COMPONENTS OF HARDWARE



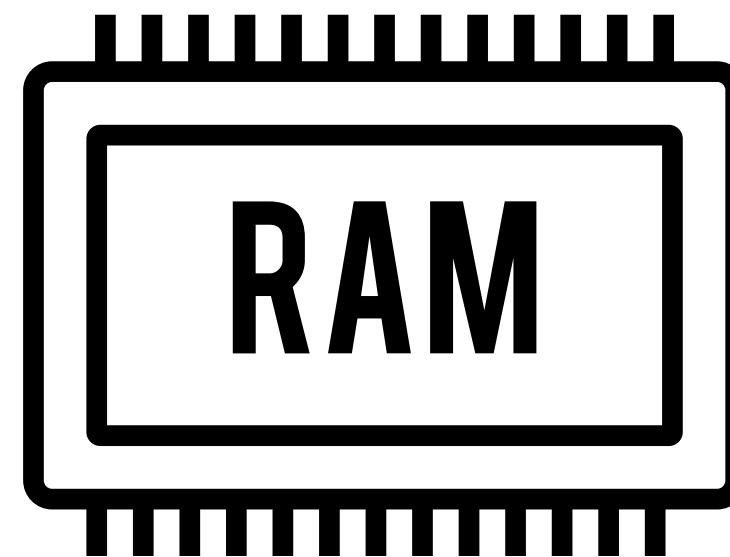
COMPUTING UNITS

COMPUTING UNITS



- Responsible for execution of operations
- Influence by:
 - n. of machine code instructions
 - execution speed of instructions
- Types:
 - CPU
 - GPU

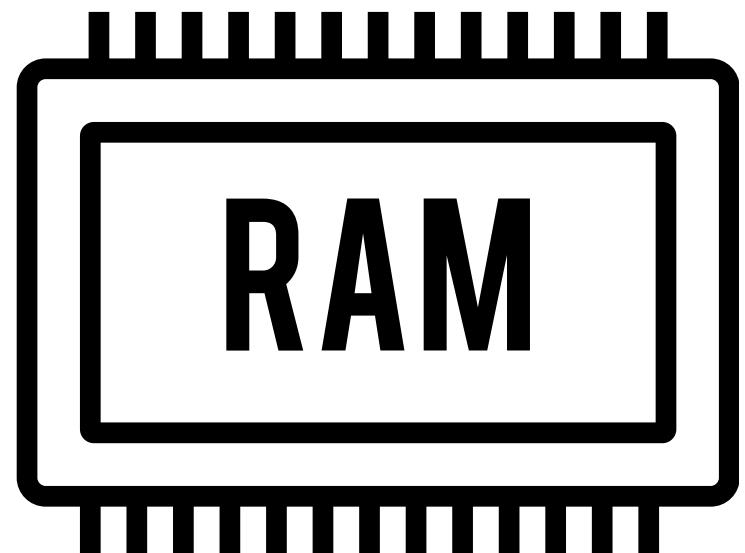
COMPONENTS OF HARDWARE



MEMORY UNITS

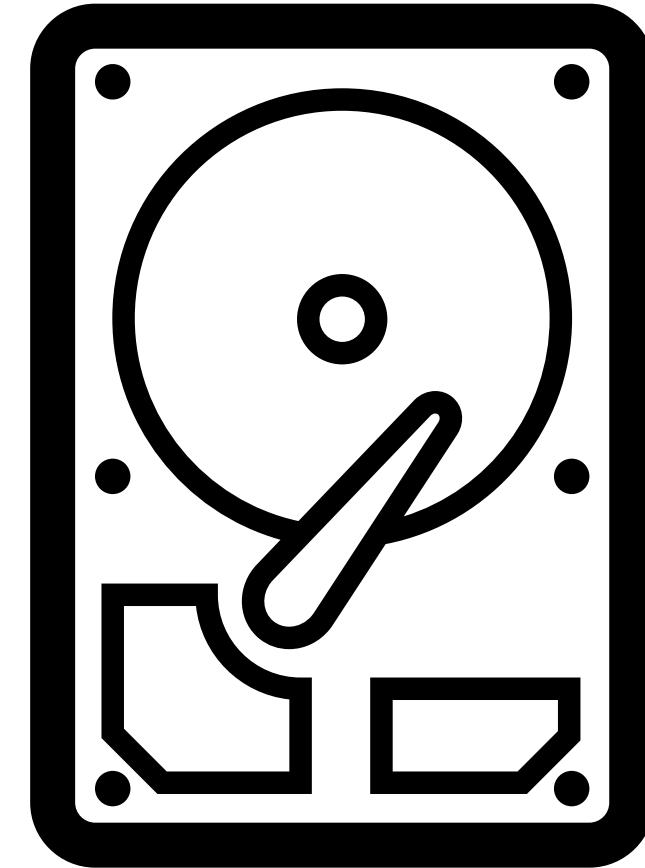
MEMORY UNITS

- Storing data and information
- Influence by:
 - Latency/architecture of memory units
- Types:
 - Hard Disk Drive(HDD)
 - Solid State Drive(SSD)
 - RAM
 - Cache L1/L2/L3

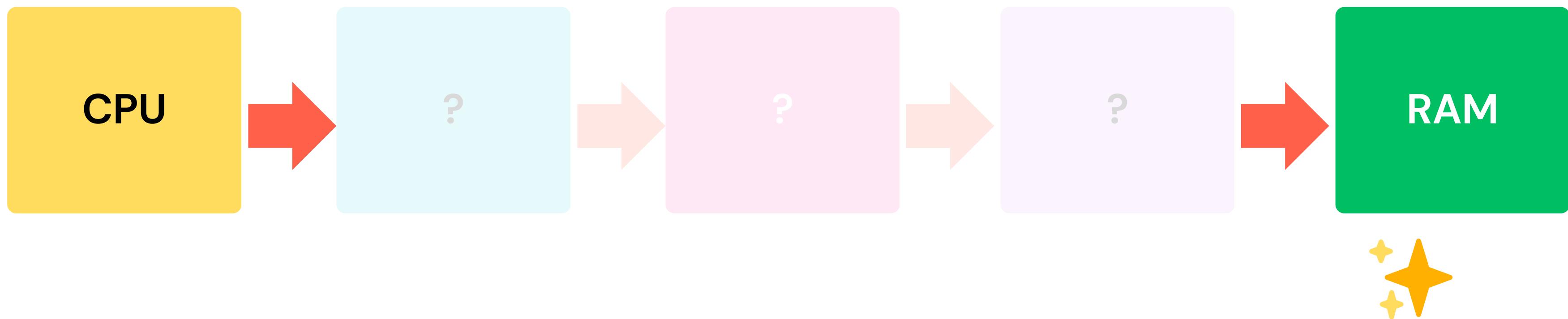


HARD DISK DRIVE(HDD)/SOLID-STATE DRIVE(SSD)

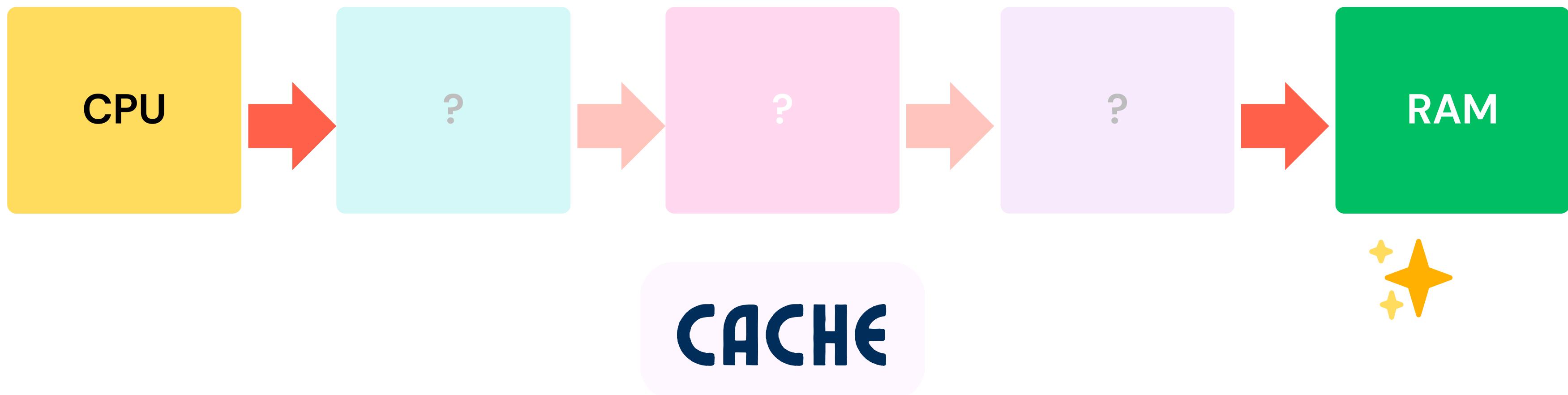
- Long-term storage
- Responsible for store the files and data needed for execution
- Lower speed write/read operations compare to RAM
- Reading and Writing Files



COMPONENTS OF HARDWARE

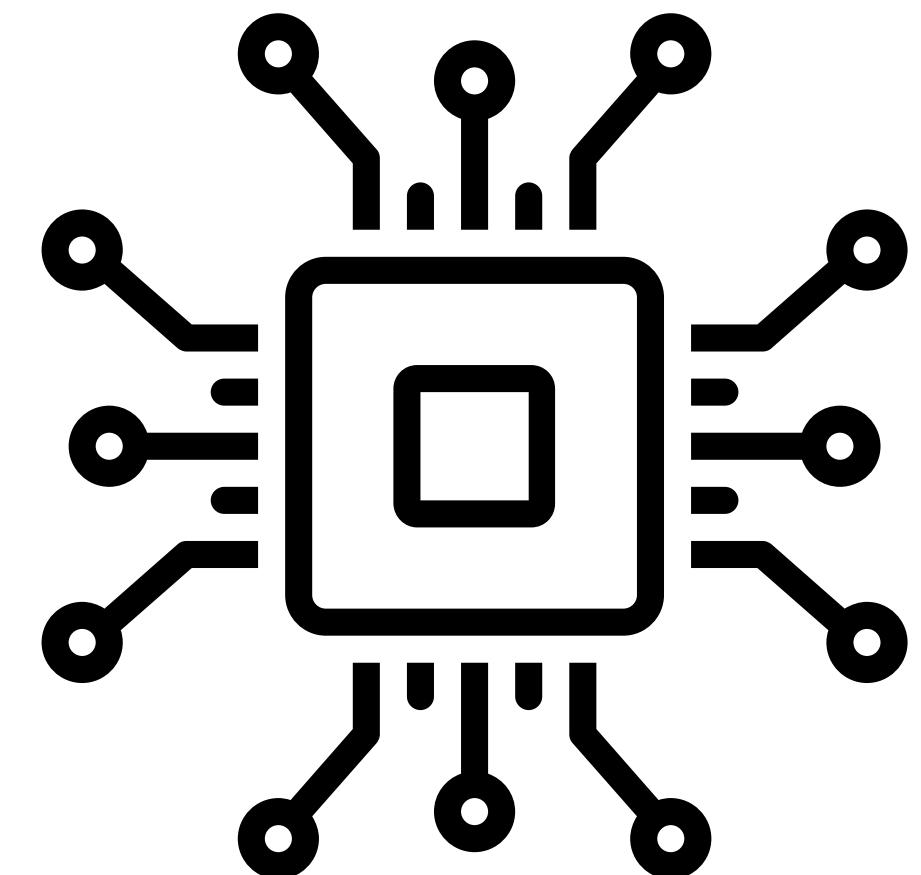


COMPONENTS OF HARDWARE



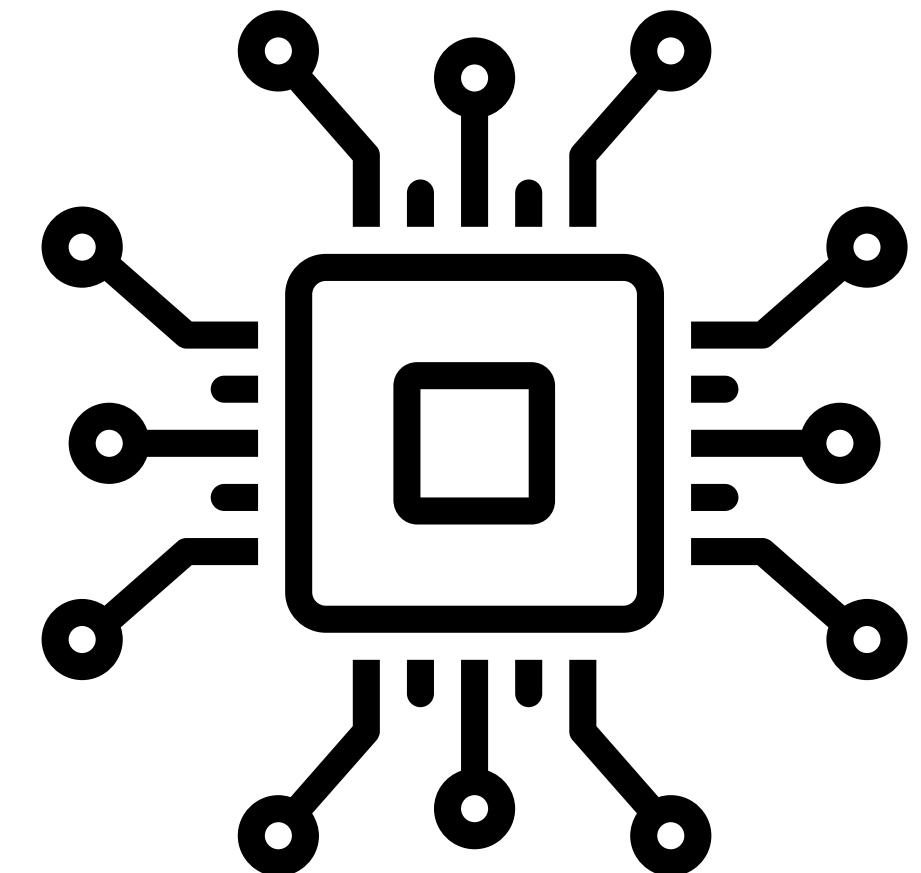
CACHE L1/L2/L3

- Store most frequently used data by CPU
- Fastest and smallest type of memory ✨
- Store most often executed instructions
- Cache Hit / Miss 

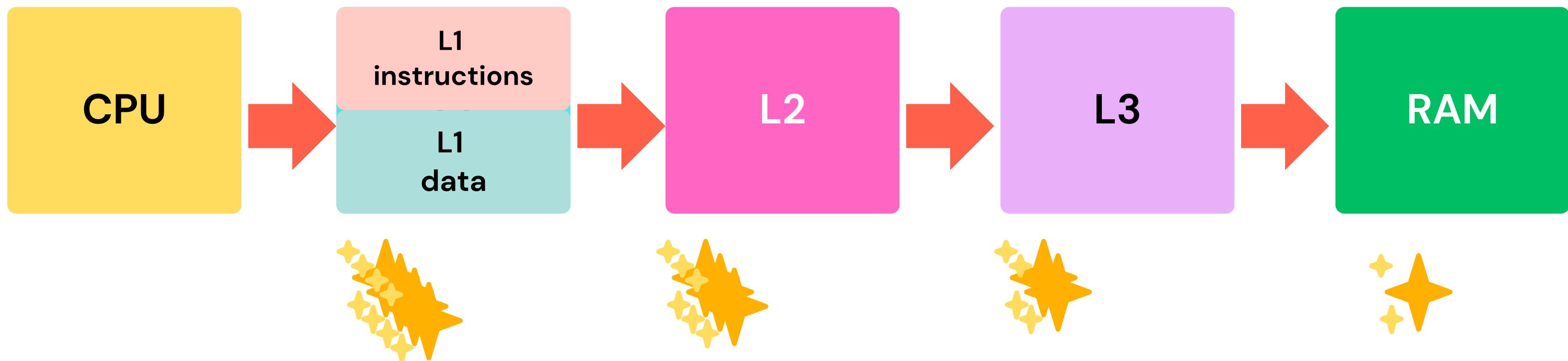


RANDOM ACCESS MEMORY (RAM)

- Short-term memory
- Stores data and objects that are currently being used by program
- It stores Python private heap space



COMPONENTS OF HARDWARE



PYTHON



ABSTRACTION LAYER

HDD / SSD

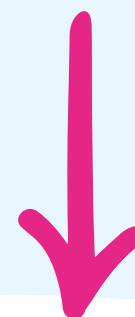
RAM

CACHE
L1 / L2 / L3

PYTHON



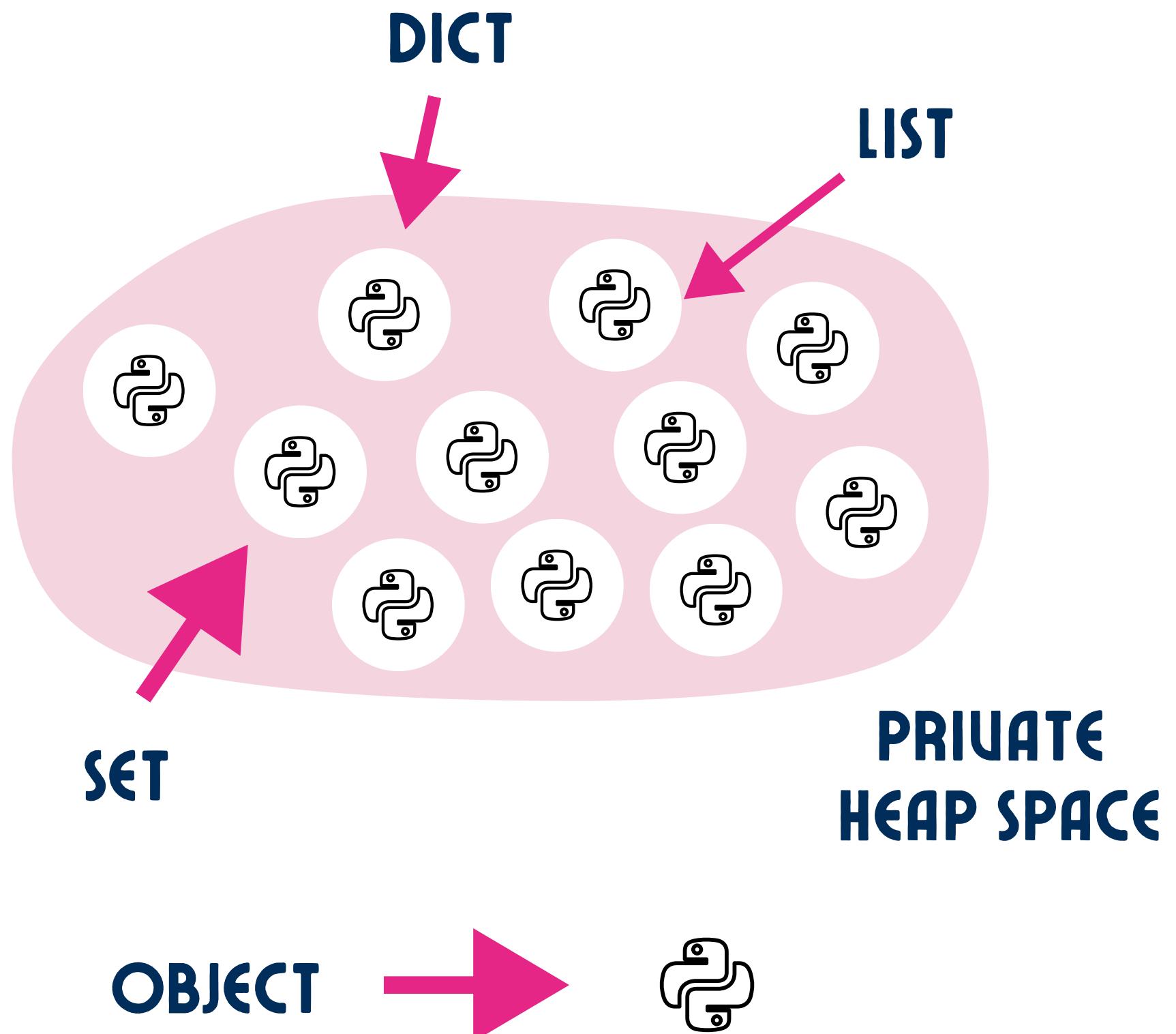
ABSTRACTION LAYER



RAM

PYTHON PRIVATE HEAP SPACE

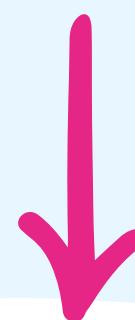
- Part of memory that is managed by Python
- Everything is object in Python
- Python's memory manager and garbage collector



PYTHON



ABSTRACTION LAYER

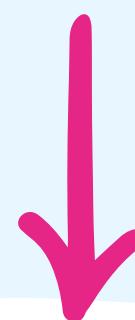


RAM

PYTHON



MEMORY MANAGER



RAM

MEMORY MANAGER

- Manages memory inside private heap space
- Allocate and free space depends on state of application
- Garbage collector works alongside the memory manager

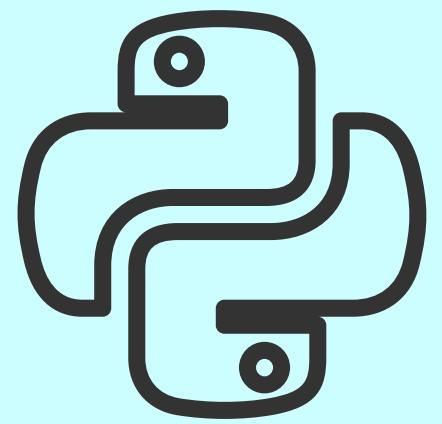


RECAP

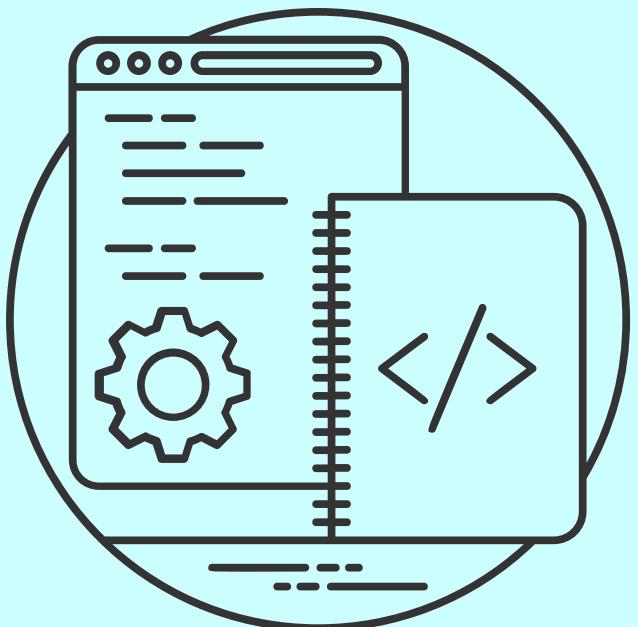
- Performance depends on execution environment
- Main components:
 - computing units
 - memory units
 - communication between them
- Types of memory
 - Hard Disk Drive (HDD)/Solid-State Drive (SSD)
 - Random Access Memory (RAM)
 - Cache L1/L2/L3
- All objects are stored in private heap space
- Private heap space is managed by memory manager

**BUT HOW MEMORY
MANAGER KNOWS
WHAT TO DO**





INSIDE PYTHON



MEMORY ALLOCATION STRATEGY

MEMORY ALLOCATION STRATEGY

Reference counting



123

MEMORY ALLOCATION STRATEGY

Reference counting



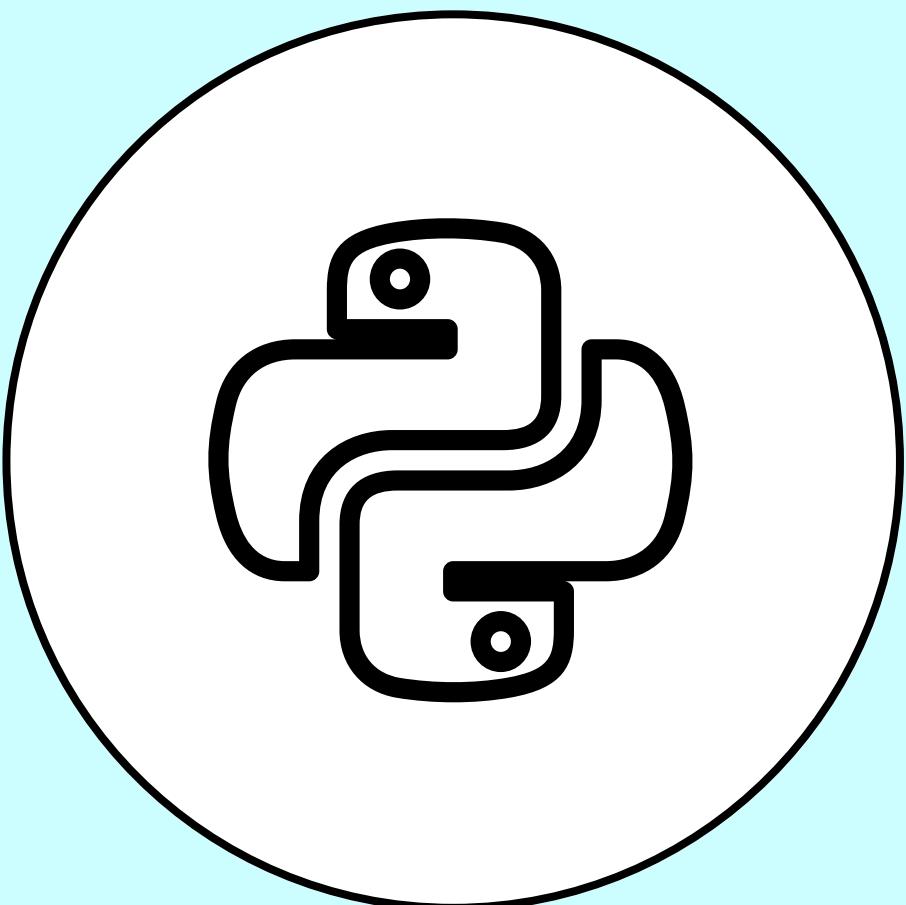
1 2 3

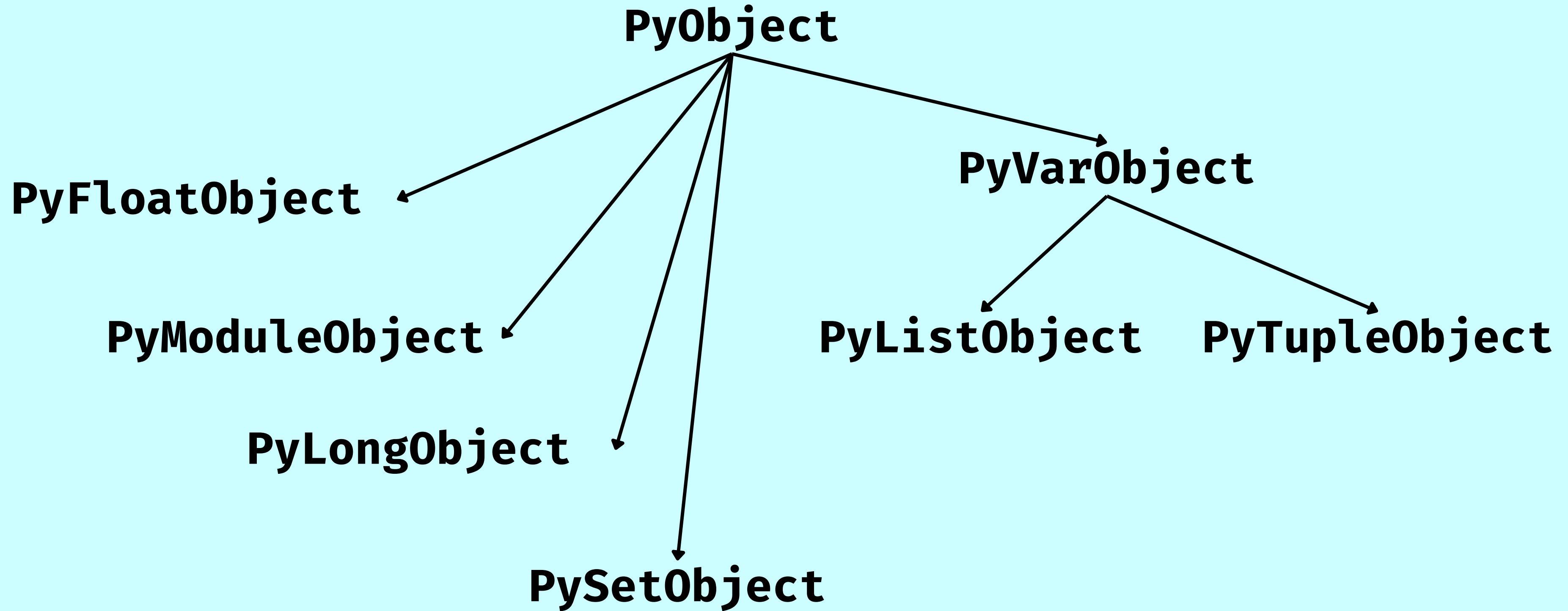
Generational garbage
collection



EVERYTHING IS OBJECT

- Representations for:
 - code
 - function
 - none
 - integers
 - containers data type
 - so on





FLOAT OBJECT

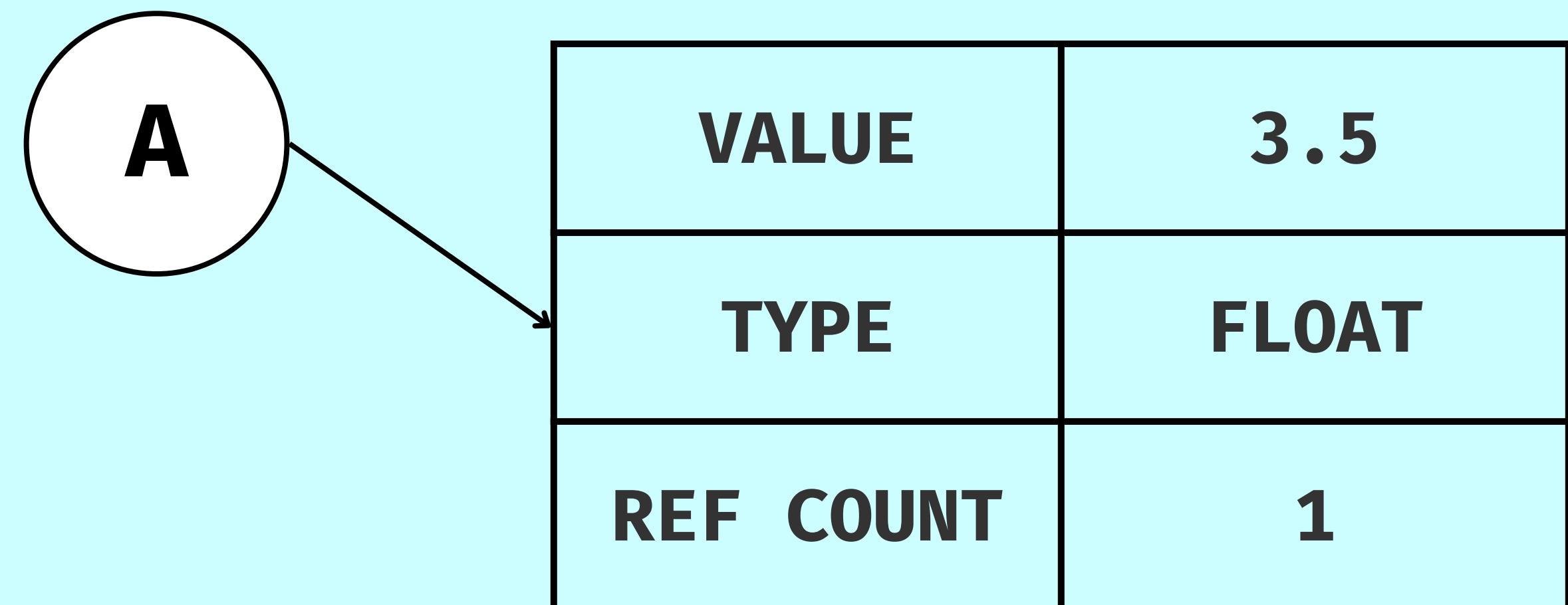
A = 3.5

- Floats are represented as PyFloatObject
- Type and Ref Count are inherited from PyObject

VALUE	3.5
TYPE	FLOAT
REF COUNT	1

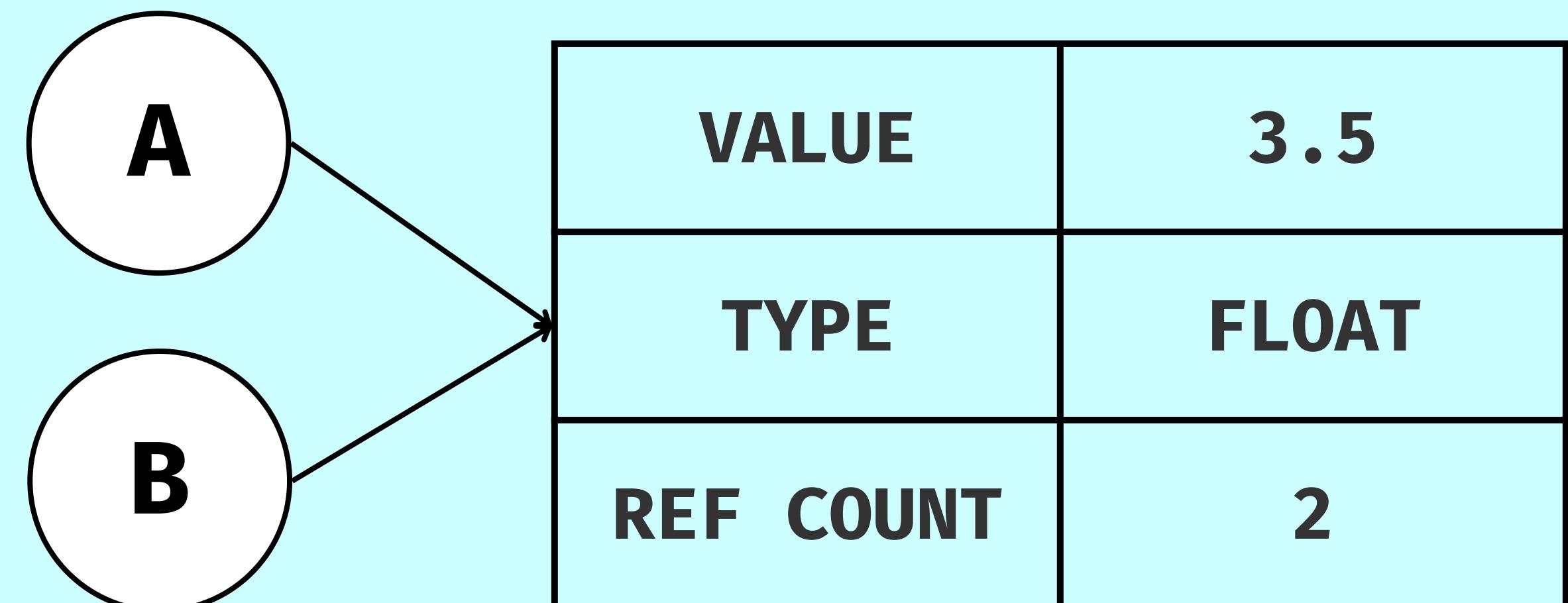
VARIABLES IN PYTHON

- References to the actual object in memory
- Think of them as names or labels that point to the actual object in memory



VARIABLES IN PYTHON

- References to the actual object in memory
- Think of them as names or labels that point to the actual object in memory



B = 3.5

EXAMPLE

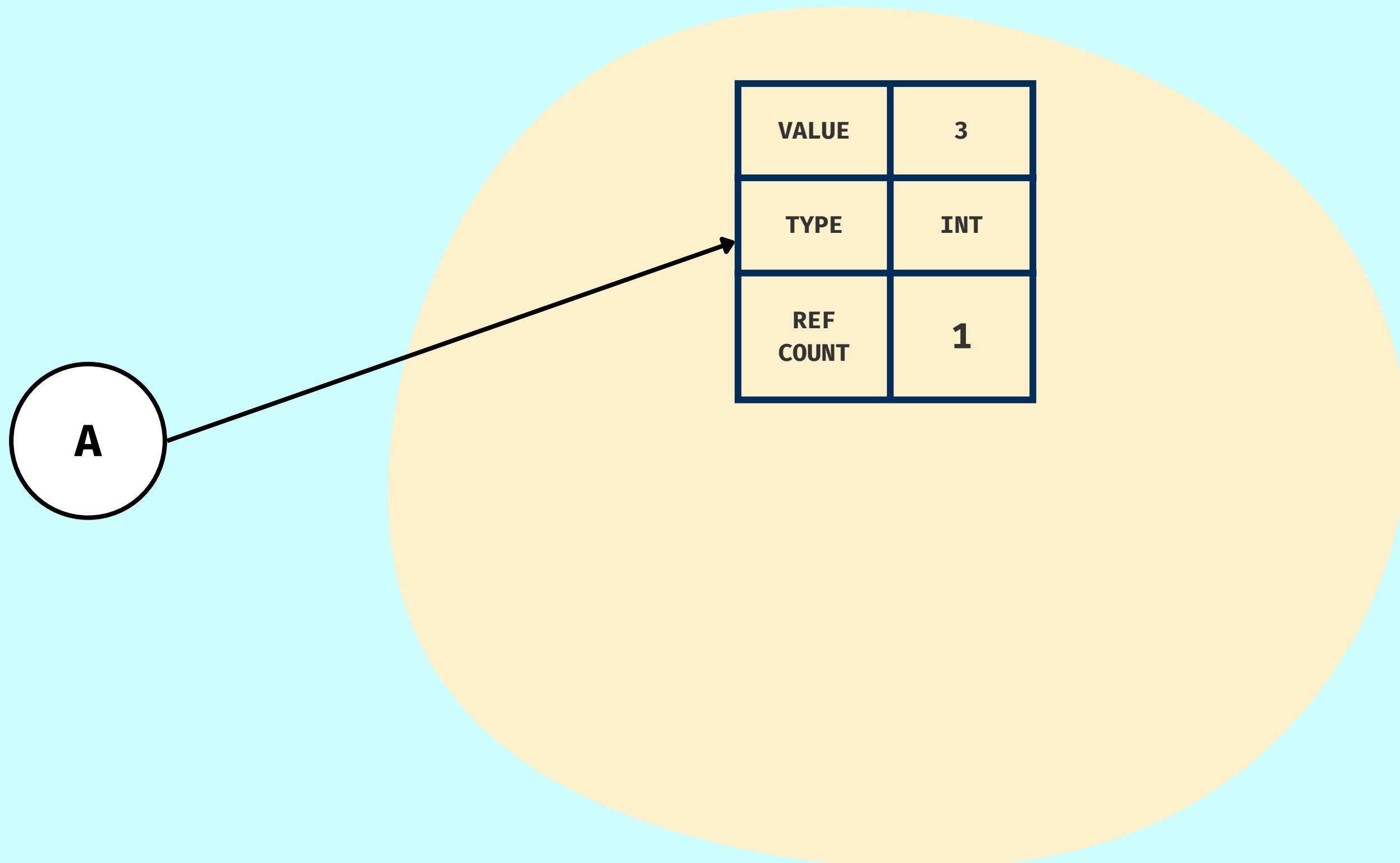
a = 3

a = 6

EXAMPLE

a = 3

a = 6

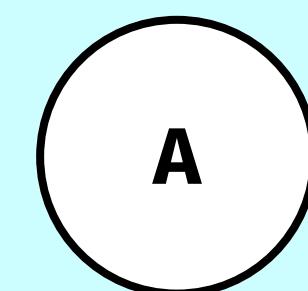


private heap

EXAMPLE

a = 3

a = 6



VALUE	3
TYPE	INT
REF COUNT	0

VALUE	6
TYPE	INT
REF COUNT	1

private heap

LIST OBJECT

- Lists are represented as PyListObject

B = [1, 2]

TYPE	LIST
REF COUNT	1
SIZE	2
ALLOCATED	3
VEC POINTERS	[0x17ac]

The diagram illustrates the memory structure of a PyListObject. A table shows the object's metadata: TYPE (LIST), REF COUNT (1), SIZE (2), ALLOCATED (3), and VEC POINTERS ([0x17ac]). An arrow points from the VEC POINTERS cell to a box divided into three sections. The first section contains the value [0x14af], the second section contains [0x16hk], and the third section is empty.

TYPE	LIST
REF COUNT	1
SIZE	2
ALLOCATED	3
VEC POINTERS	[0x17ac]

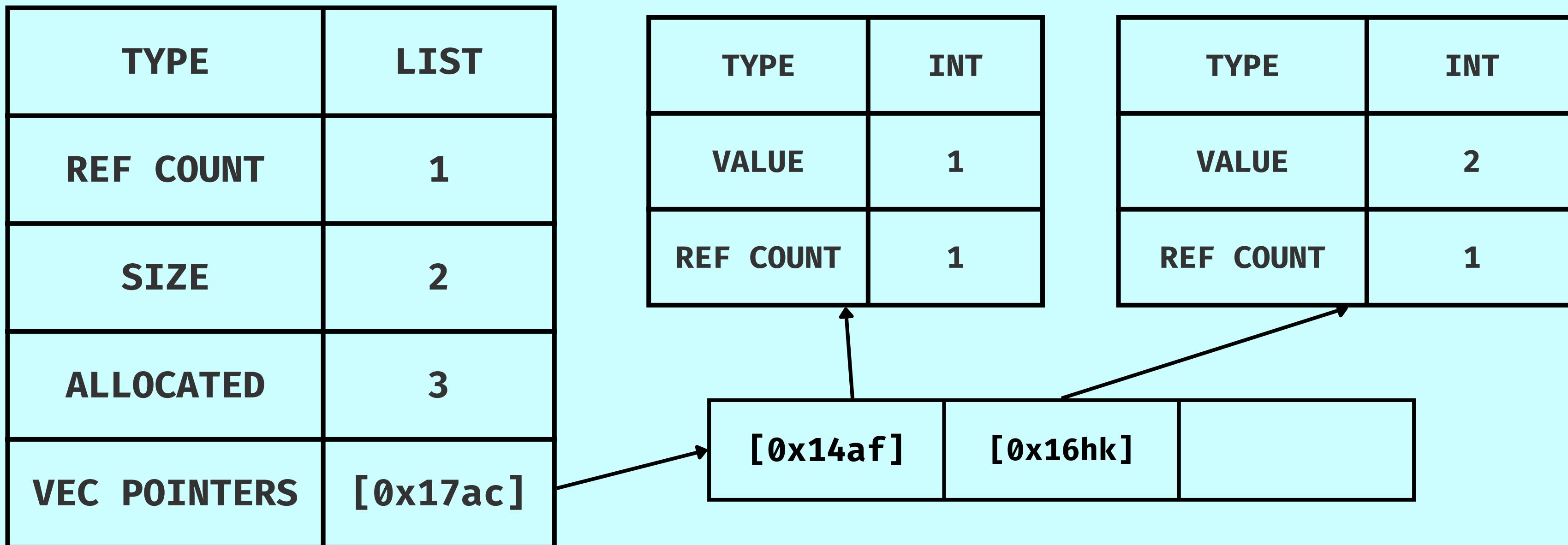
[0x14af]

[0x16hk]

LIST OBJECT

- Lists are represented as `PyListObject`

`B = [1, 2]`

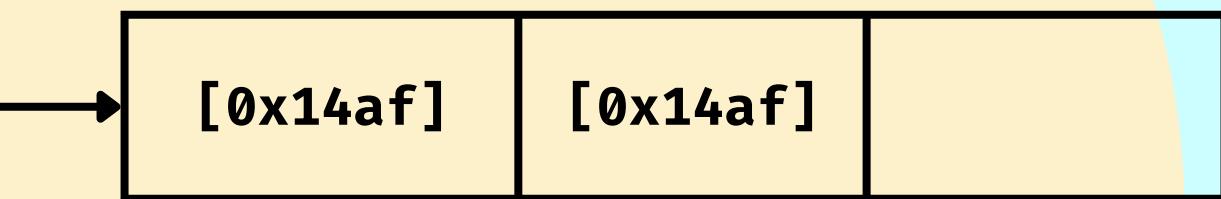


EXAMPLE

b = [1, 2]

B

TYPE	LIST
REF COUNT	1
SIZE	2
ALLOCATED	3
VEC POINTER	[0X435434]



private heap

EXAMPLE

b = [1, 2]

b.append(b)

B

TYPE	LIST
REF COUNT	2
SIZE	3
ALLOCATED	3
VEC POINTER	[0X435434]

[0x14af]	[0x13ad]	[0x16ad]
----------	----------	----------

private heap

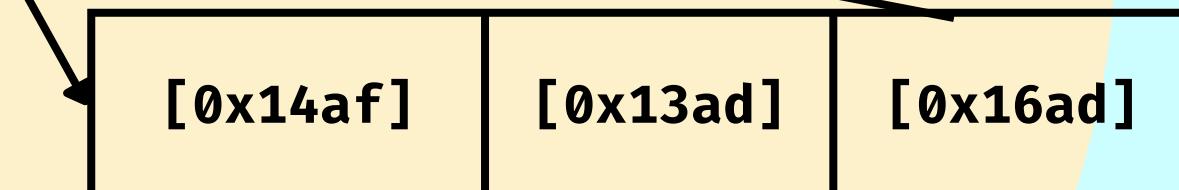
EXAMPLE

b = [1, 2]

b.append(b)

del b

TYPE	LIST
REF COUNT	1
SIZE	2
ALLOCATED	3
VEC POINTER	[0X435434]



private heap

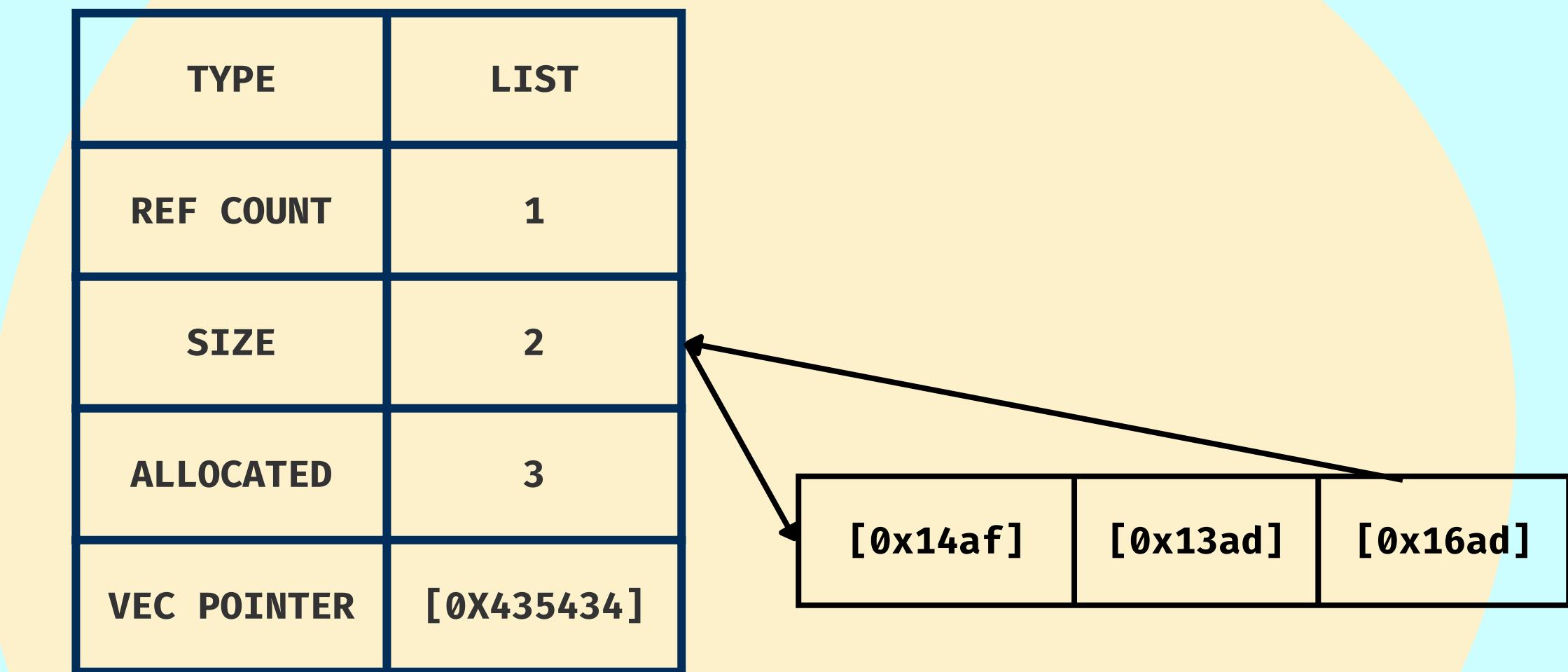
EXAMPLE

b = [1, 2]

b.append(b)

del b

circular references



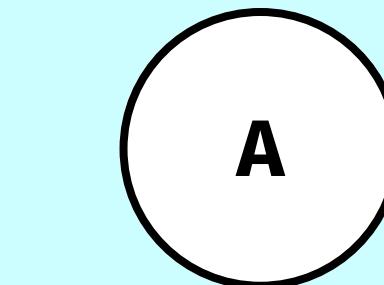
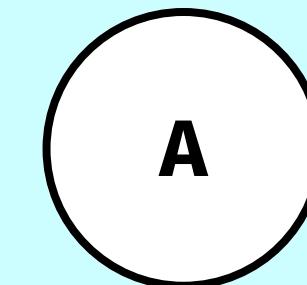
private heap

MEMORY STATE

TYPE	LIST
REF COUNT	1
SIZE	2
ALLOCATED	3
VEC POINTER	[0X435434]

VALUE	3
TYPE	INT
REF COUNT	0

VALUE	6
TYPE	INT
REF COUNT	1



STOP



**BUT WHAT ACTUALLY
HAPPENS TO THE OLD
OBJECT**



GARBAGE COLLECTOR

- Responsible for collection memory that no longer in used
- It can be trigger manually and by threshold
- Has module gc



GENERATION IN GC

Generation 0



Generation 1



Generation 2



GENERATION IN GC

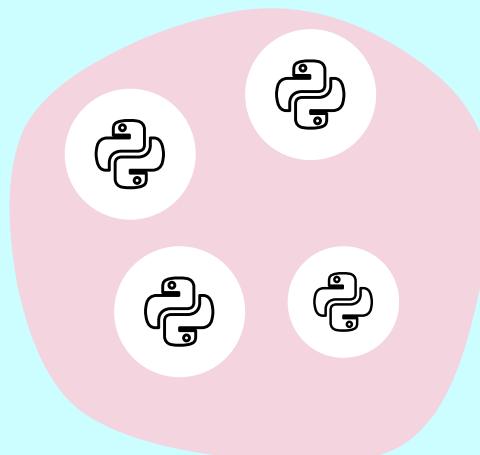
Generation 0



Generation 1



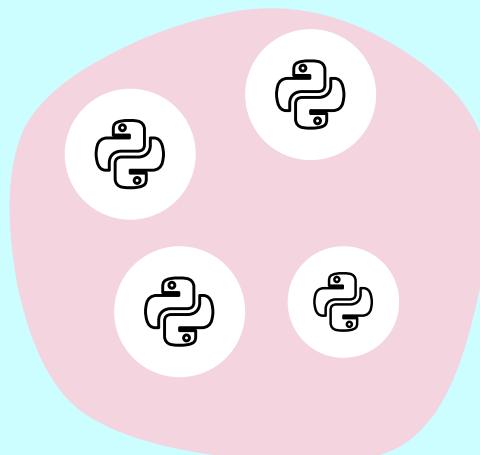
Generation 2



All newly
created objects

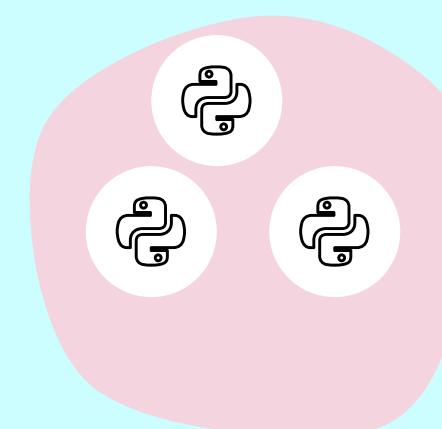
GENERATION IN GC

Generation 0



All newly
created objects

Generation 1



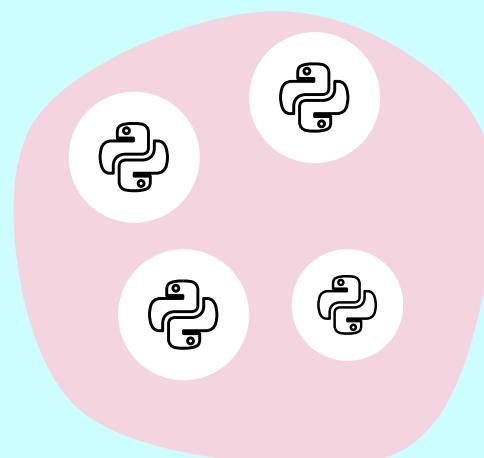
Object survived
generation 0

Generation 2



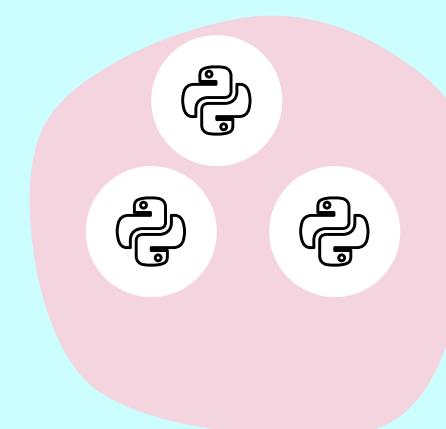
GENERATION IN GC

Generation 0



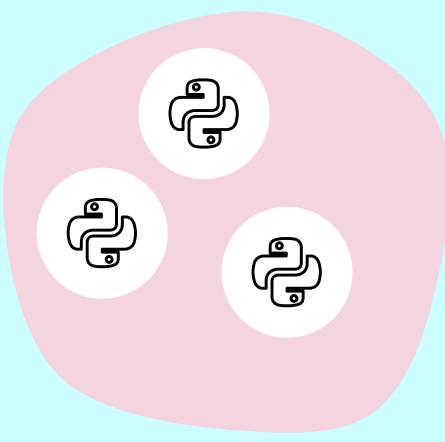
All newly
created objects

Generation 1



Object survived
generation 0

Generation 2



Object survived
generation 1

MEMORY STATE

TYPE	LIST
SIZE	3
VEC POINTER	[0x435 434]
ALLOCAT ED	3
REF COUNT	1

VALUE	3
TYPE	INT
REF COUNT	0

VALUE	6
TYPE	INT
REF COUNT	1

A

MEMORY STATE

TYPE	LIST
SIZE	3
VEC POINTER	[0x435 434]
ALLOCAT ED	3
REF COUNT	1

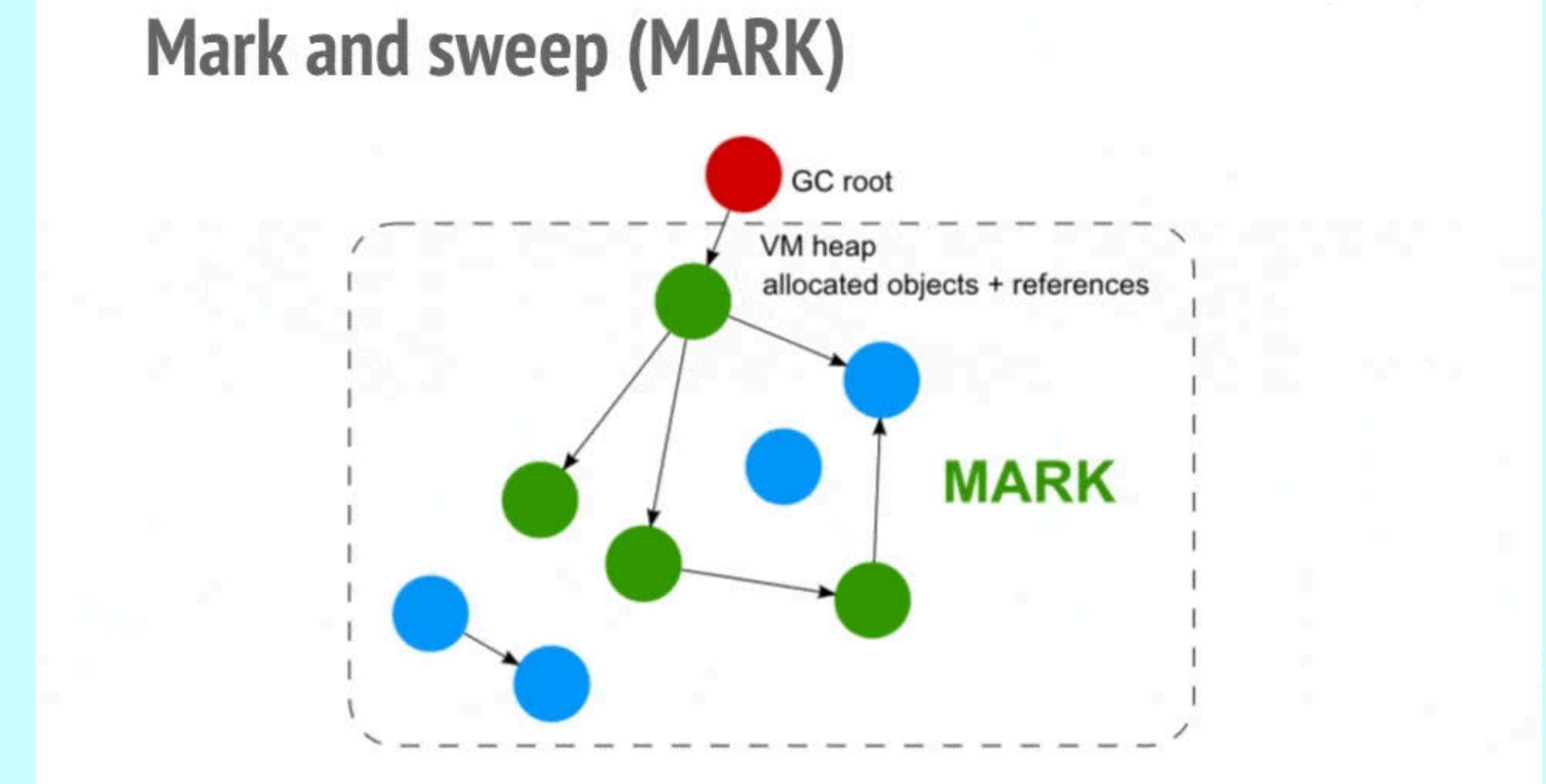
VALUE	6
TYPE	INT
REF COUNT	1

A

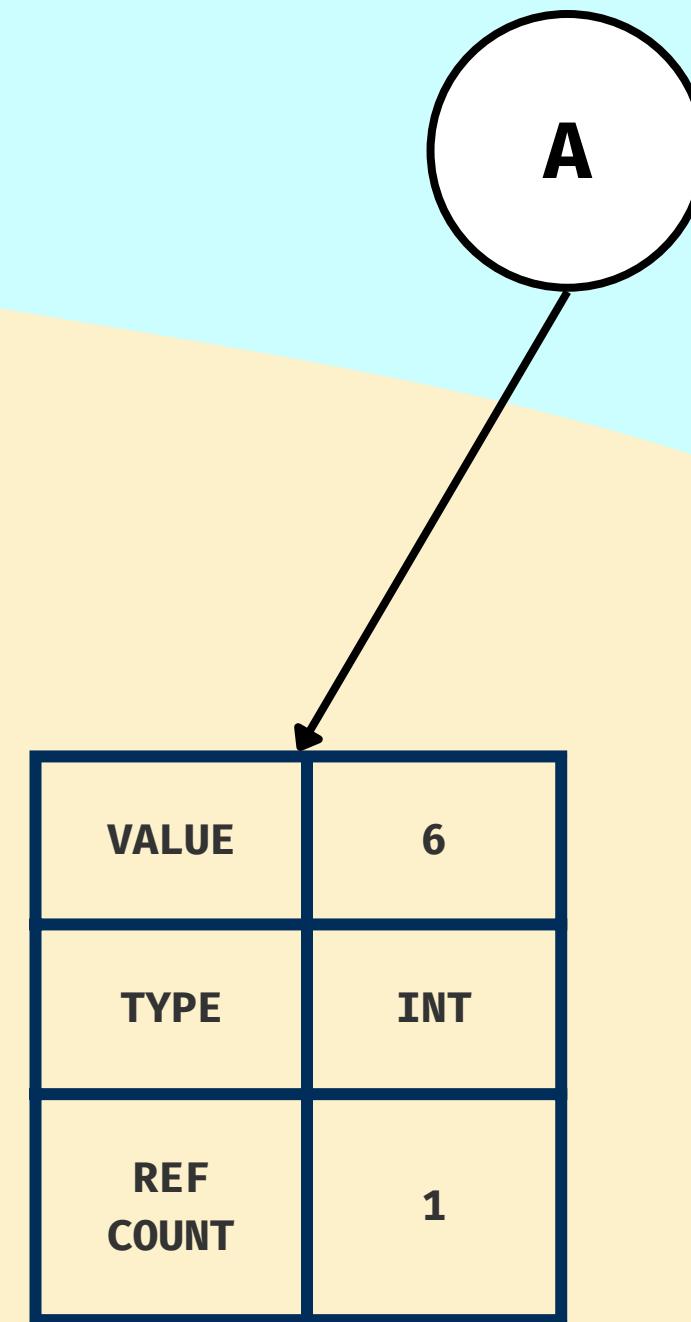


MARK AND SWEEP

1. take global variables and local variables as GC root
2. trace all objects that can be reached from GC root
3. sweep unreachable objects



MEMORY STATE



RECAP

- Think about your execution environment
- Everything is object inside Python
- Objects are stored in private heap space
- Memory manager is responsible for private heap space
- Memory manager relies on:
 - reference counting
 - garbage collection

REFERENCES

- Memory Management in Python
- CPython Internals: Your Guide to the Python 3
- High Performance Python
- Talks:
 - PEP 683: Immortal Objects - A new approach for memory managing - Vinícius Gubiani Ferreira
 - Pointers? In My Python? It's More Likely Than You Think! - Eli Holderness
- pythonspeed.com/articles/faster-python/ by Itamar Turner-Trauring