

Compiler Construction: Practical Introduction

Lecture 13

Case Study: the Python Virtual Machine

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Innopolis University

A Case Study:

The Python Virtual Machine

Is Python an Interpreted Language?

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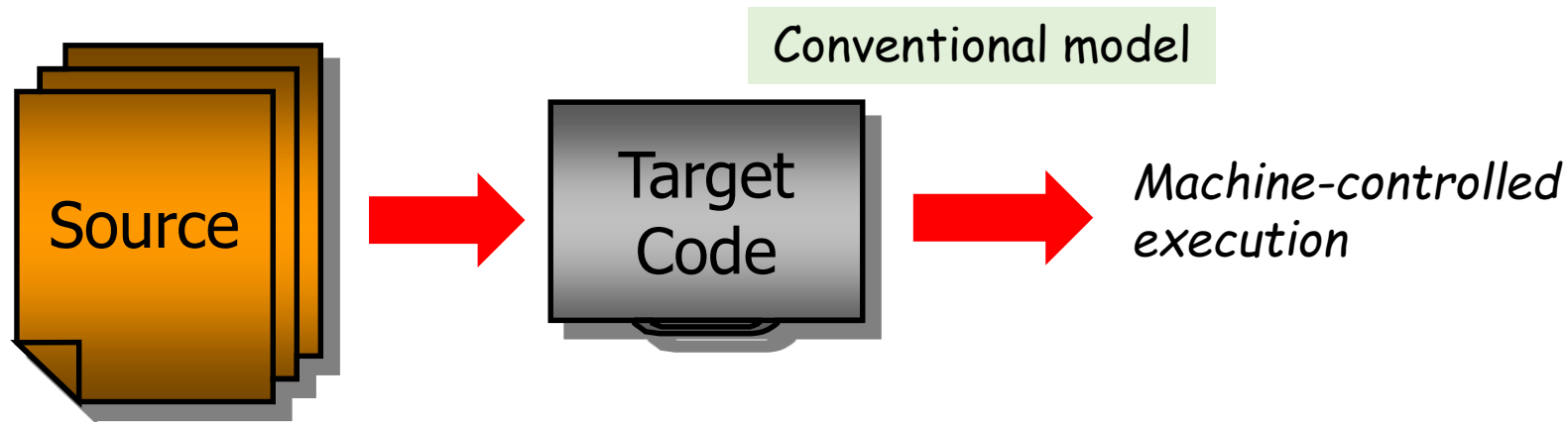
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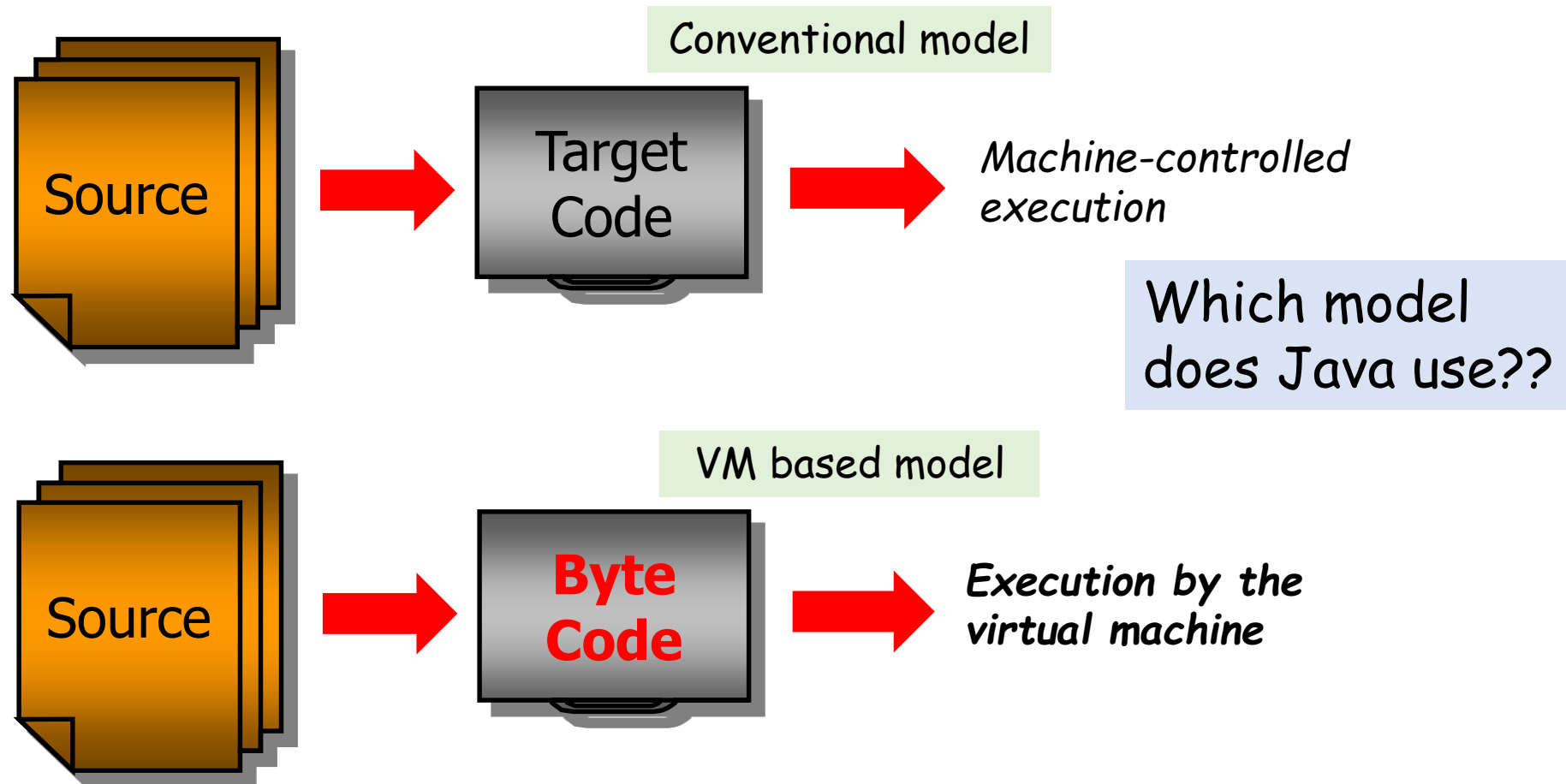
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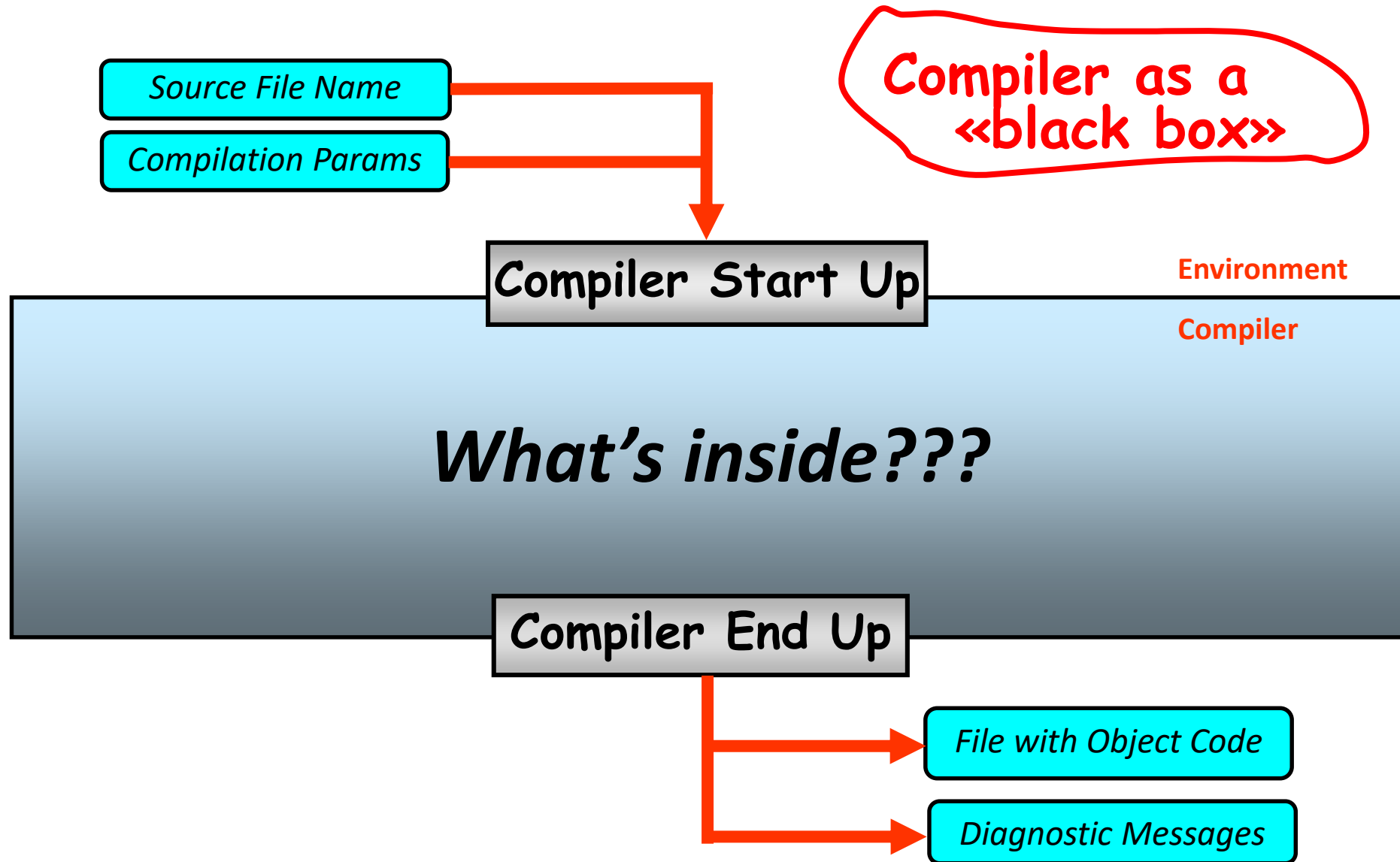
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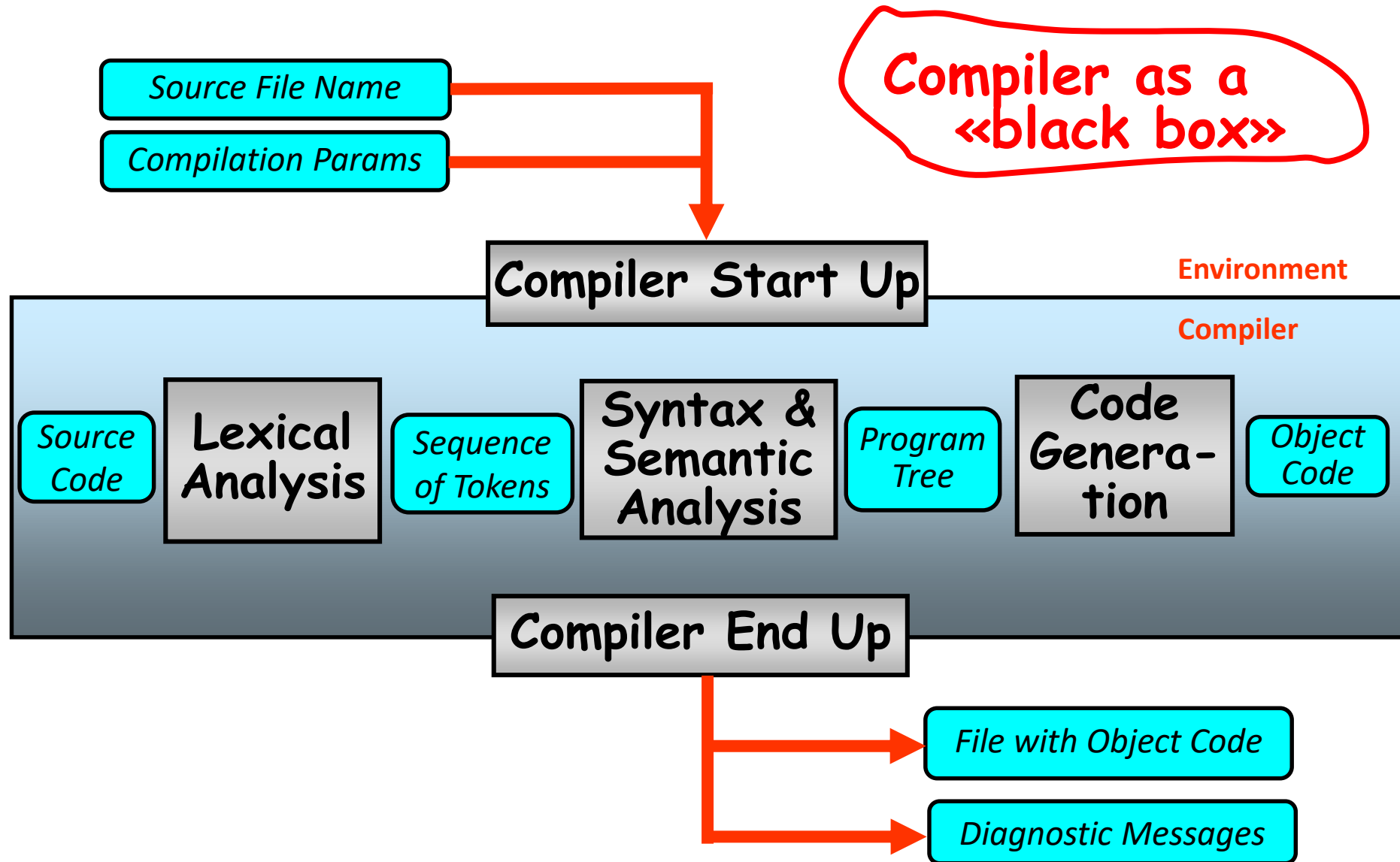
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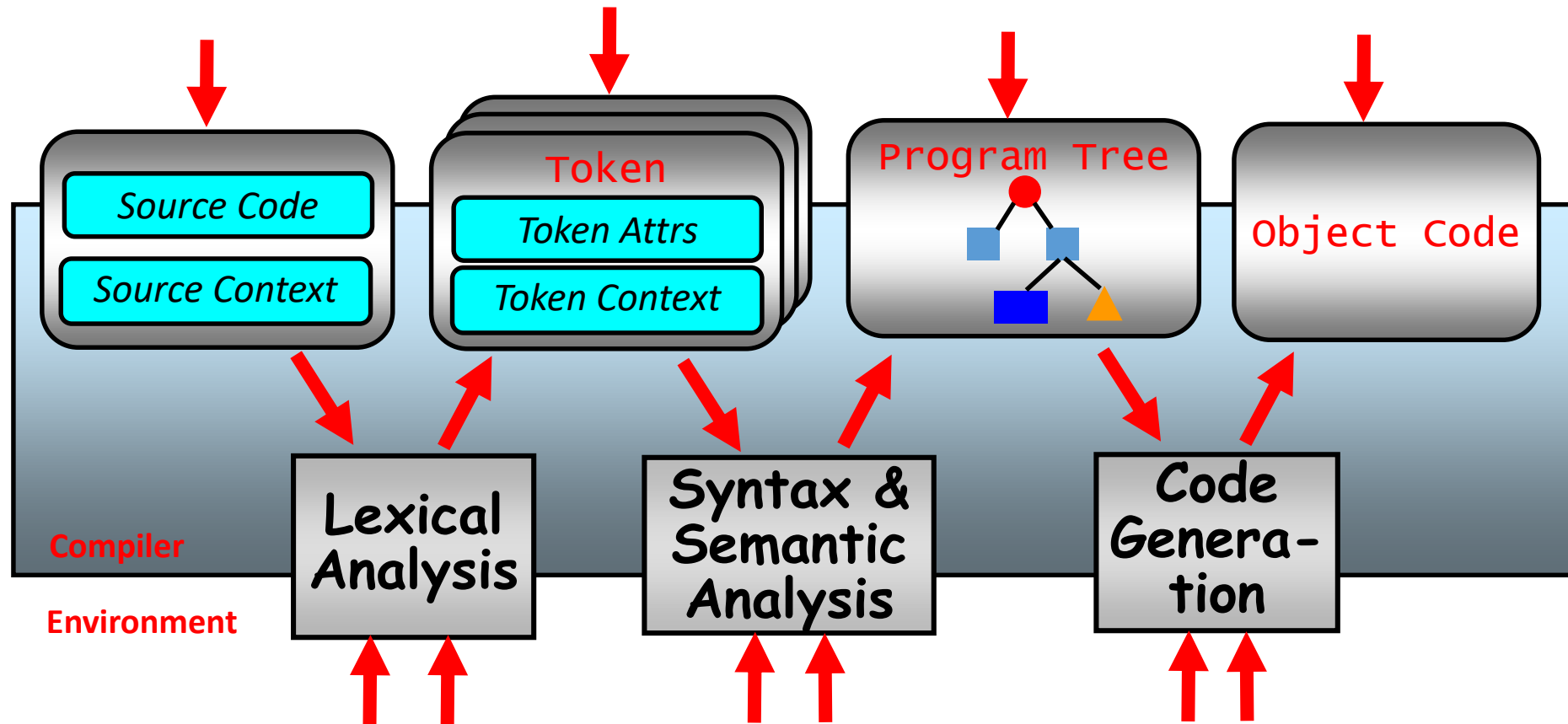
Compilation: Conventional Approach



Compilation: Conventional Approach



Compilation: Advanced Approach



Compiler as a collection of resources

Is it similar to that of Java/JVM?

Python Approach

So, as a conclusion:

- Python execution model assumes compilation ("AOT") to code ("bytecode") for a specialized **virtual machine**.
- Python implementation allows **direct access** (APIs) to all compilation phases and intermediate data structures.



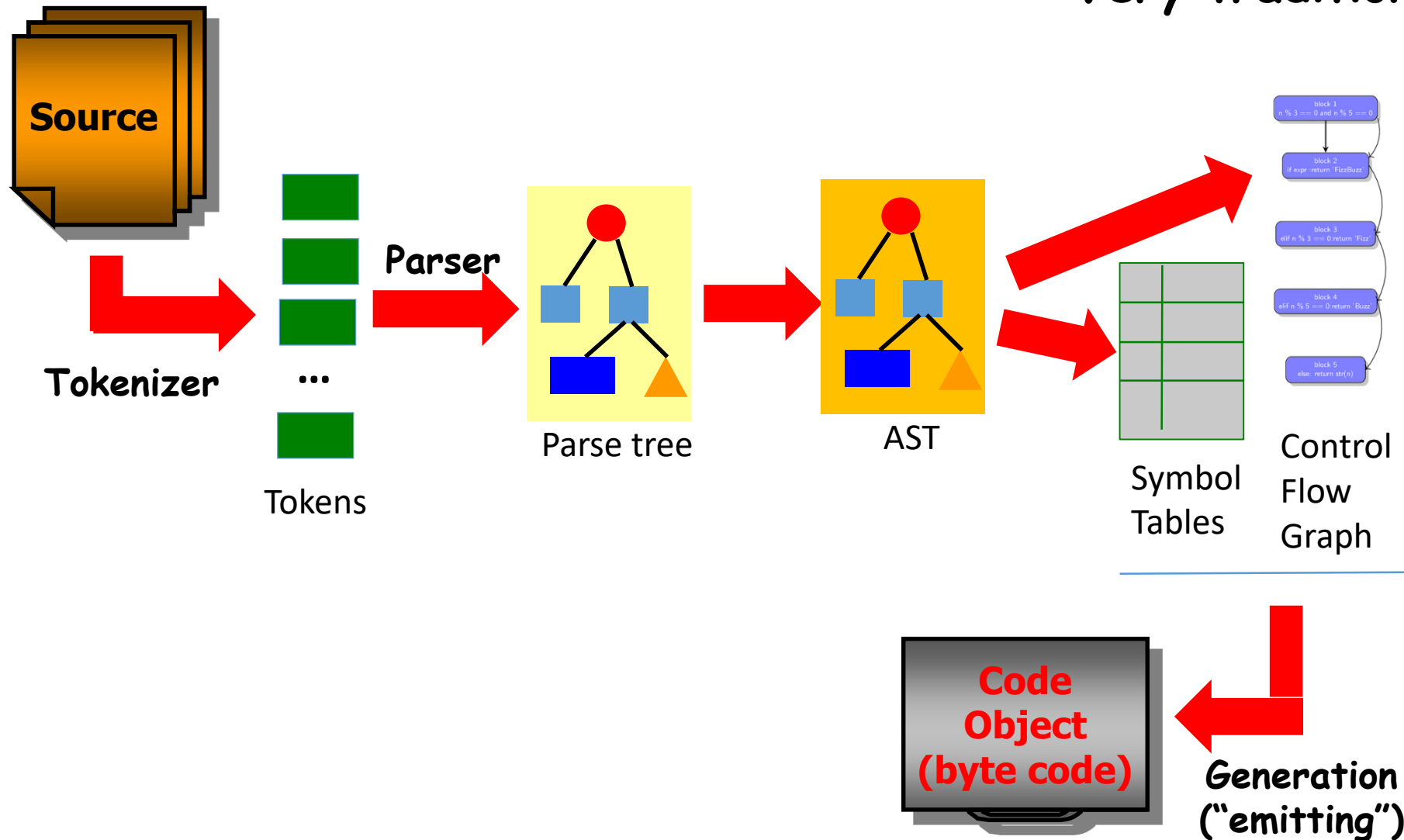
See the prev slide

Python Compilation/Execution Model

- Parsing the python source code into a parse tree.
 - Transforming the parse tree into an abstract syntax tree (AST).
 - Generation of the symbol table.
 - Generation of the code object from the AST
 - Transforming the AST into a flow control graph.
 - Emitting a code object from the control flow graph.
-
- Python code object gets executed under the control of the Python Virtual Machine.

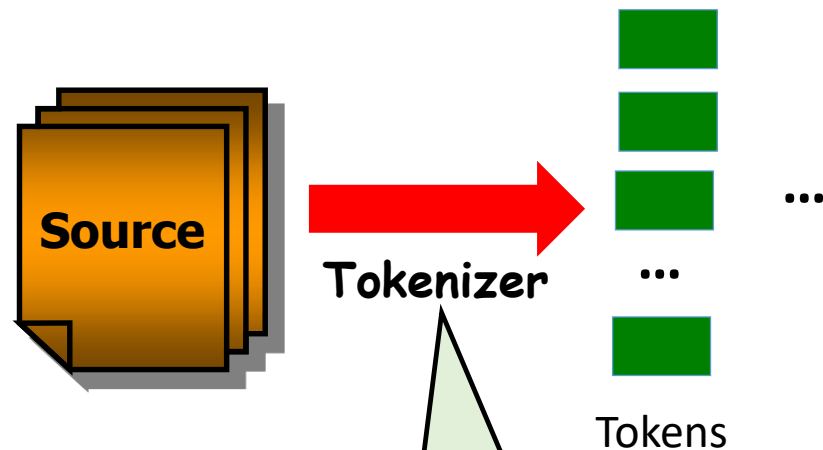
Python Compilation Process

Very traditional way!



1st Phase: Tokenization

The tokenization function breaks up the content of the module source into legal python tokens ("lexical grammar")



Controlled by the
Python lexical grammar

The tokens generated from the tokenizer are passed to the parser...

1st Phase: Tokenization

Python lexical grammar: informal view

identifiers :

Names that defined by a programmer: function & variable names, class names etc.
(The rules of identifiers are specified in the python documentation.)

operators

Special symbols: `+`, `*` that operate on data values and produce results.

delimiters:

Grouping expressions, provide punctuations and assignment: `(,), {, }, =, *=` etc.

literals:

Symbols that provide a constant value of some type.

String and byte literals: `"Fred"`, `b"Fred"`, numeric literals: integer literals: `2`, floating point literals: `1e100` and imaginary literals: `10j`.

comments:

String literals that start with the hash symbol and end at the end of the physical line.

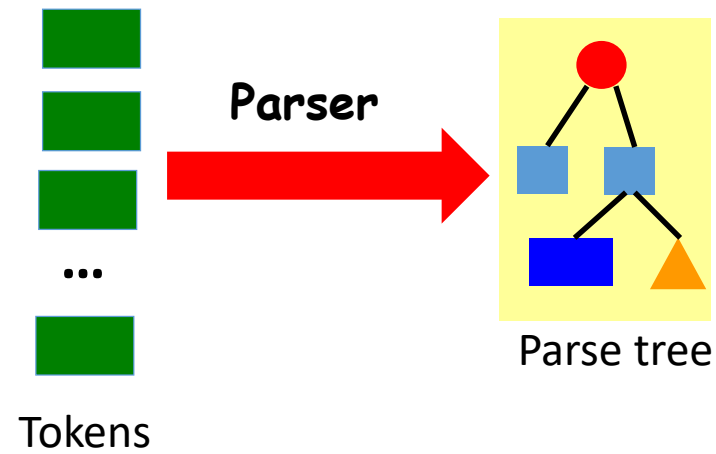
NEWLINE:

Special token that denotes the end of a logical line.

INDENT, DEDENT:

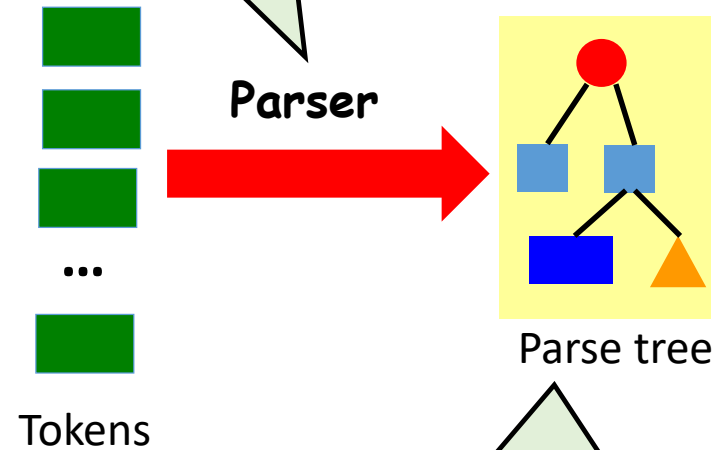
Tokens representing indentation levels which group compound statements.

2nd Phase: Building Program Tree(s)



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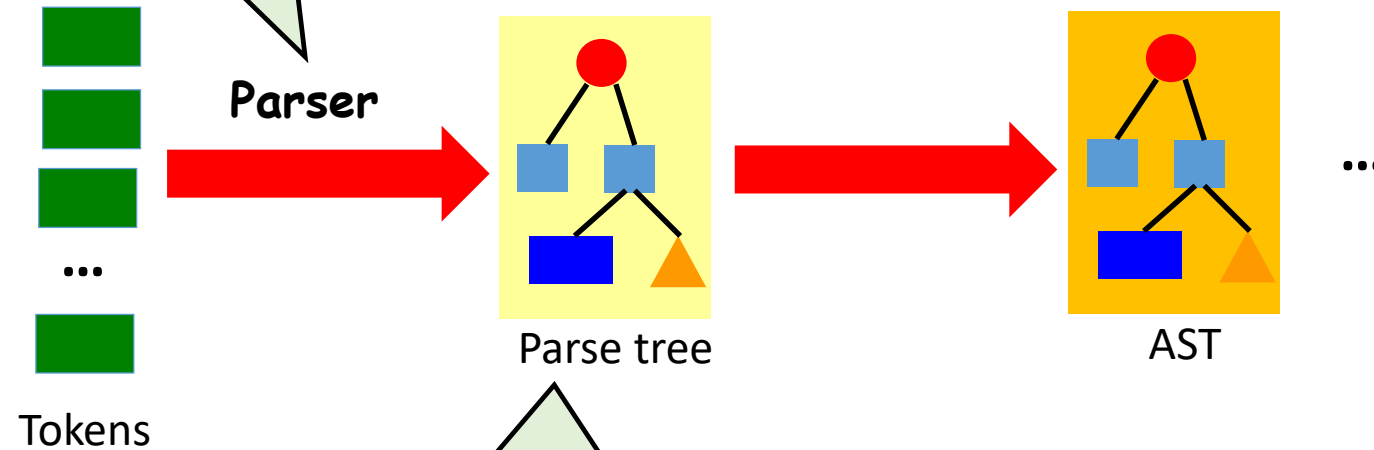
Recursive descent parser
controlled by the LL(1)
Python grammar



Represents the structure
of code **directly**:
with keywords, operator signs,
delimiters, indentations, newlines etc.

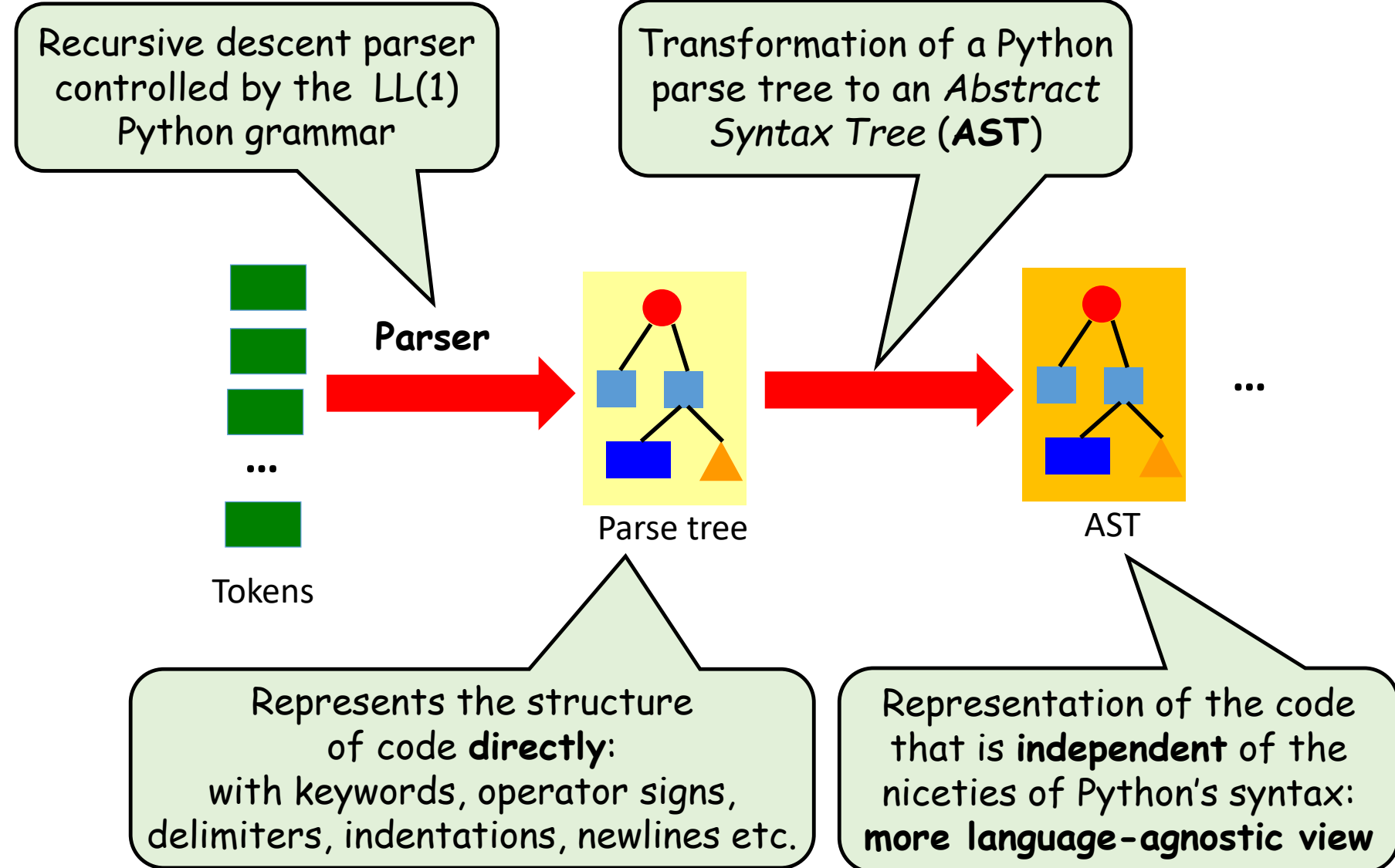
2nd Phase: Building Program Tree(s)

Recursive descent parser
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2nd Phase: Building Program Tree(s)



Python Grammar

```
stmt: simple_stmt | compound_stmt
simple_stmt: small_stmt (';' small_stmt)* [';'] NEWLINE
small_stmt: expr_stmt | del_stmt | pass_stmt | flow_stmt | import_stmt
           | global_stmt | nonlocal_stmt | assert_stmt
expr_stmt: testlist_star_expr ( augassign (yield_expr|testlist) |
                               ( '=' (yield_expr|testlist_star_expr))* )
testlist_star_expr: (test|star_expr) (',' (test|star_expr))* [',']
augassign: '+' '=' | '-' '=' | '*' '=' | '@=' | '/' '=' | '%' '=' | '&=' | '|' '=' | '^=' | '<=' | '>=' | '**=' | '//='
del_stmt: 'del' exprlist
pass_stmt: 'pass'
flow_stmt: break_stmt | continue_stmt | return_stmt | raise_stmt | yield_stmt
break_stmt: 'break'
continue_stmt: 'continue'
return_stmt: 'return' [testlist]
yield_stmt: yield_expr
raise_stmt: 'raise' [test ['from' test]]
import_stmt: import_name | import_from
import_name: 'import' dotted_as_names
import_from: ('from' (('.'|'...')* dotted_name | ('.'|'...')+
                  'import' ('*' | '(' import_as_names ')' | import_as_names))
import_as_name: NAME ['as' NAME]
dotted_as_name: dotted_name ['as' NAME]
import_as_names: import_as_name (',' import_as_name)* [',']
dotted_as_names: dotted_as_name (',' dotted_as_name)*
dotted_name: NAME ('.' NAME)*
global_stmt: 'global' NAME (',' NAME)*
nonlocal_stmt: 'nonlocal' NAME (',' NAME)*
assert_stmt: 'assert' test [',' test]
```

Extended Backus-Naur
Form (EBNF) grammar specification
for Python: Grammar/Grammar module

Python Syntax Tree

The `parser` Python module provides limited access to the **parse tree** of a block of Python code

```
import parser
from pprint import pprint
source = "def quad(a): return a*a\n"
st = parser.suite(source)
pprint(parser.st2list(st))
```

Python Syntax Tree

```
[268,
 [269,
  [295,
   [263,
    [1, 'def'],
    [1, 'quad'],
    [264, [7, '(', [265, [266, [1, 'a']]], [8, ')']],
    [11, ':'],
    [304,
     [270,
      [271,
       [278,
        [281,
         [1, 'return'],
         [331,
          [305,
           [309,
            [310,
             [311,
              [312,
               [315,
                [316,
                 [317,
                  [318,
                   [319,
                    [320,
                     [321, [322, [323, [324, [1, 'a']]]]],
                     [16, '*'],
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                    [4, '']] ]]]]]],
    [4, ''],
    [0, '']]
```

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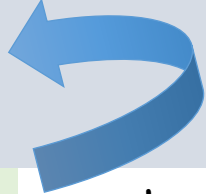
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Sic! Access to Python parse tree from within a Python program!

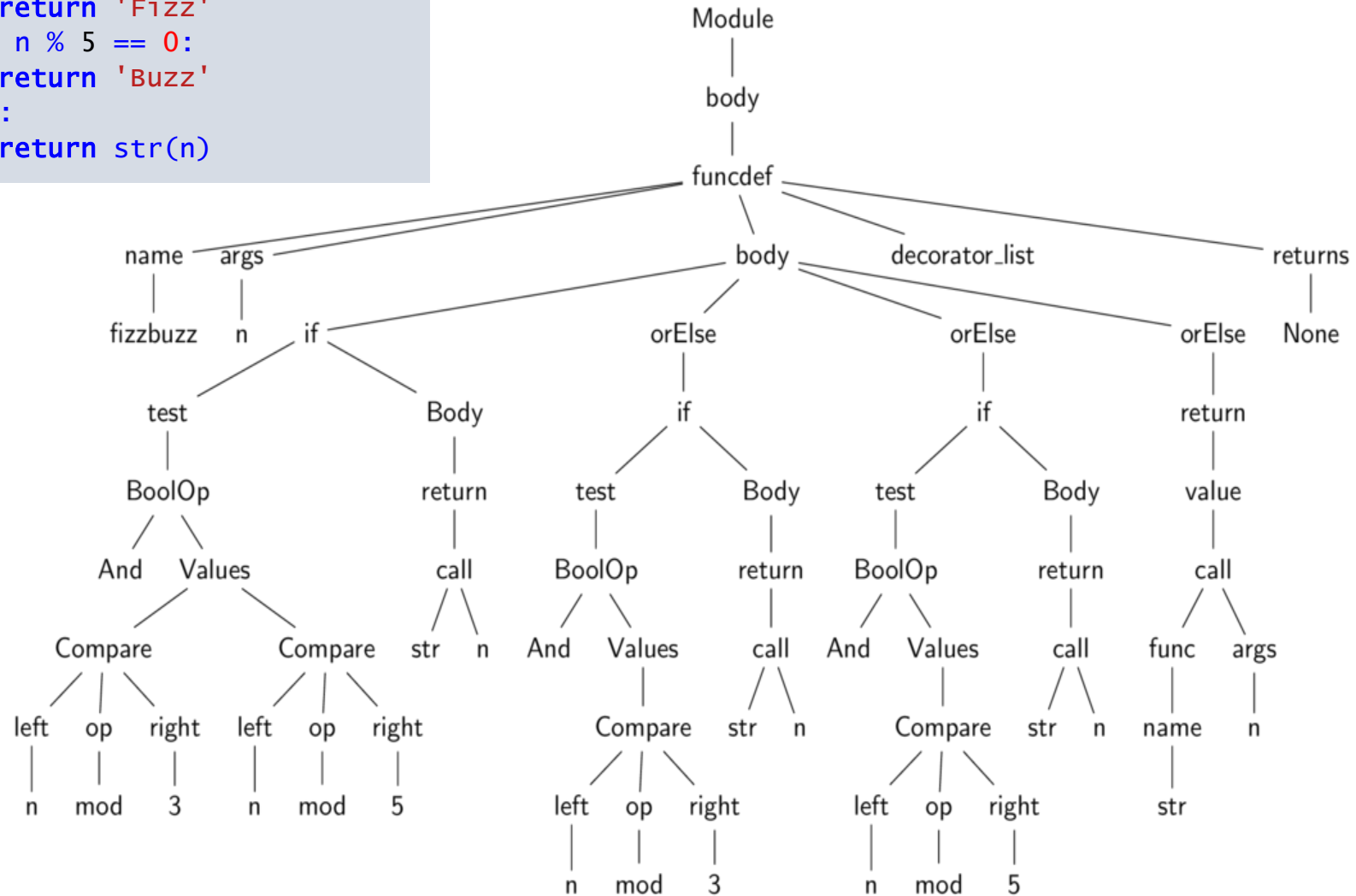
Python Syntax Tree

C implementation of the parse tree node

```
typedef struct _node
{
    short    n_type;           // node type
    char*    n_str;           // node name
    int      n_lineno;        // line number
    int      n_col_offset;    // offset within the line
    int      n_nchildren;     // number of children nodes
    struct _node* n_child;    // the list of children
} node;
```

Python AST

```
1 def fizzbuzz(n):
2     if n % 3 == 0 and n % 5 == 0:
3         return 'FizzBuzz'
4     elif n % 3 == 0:
5         return 'Fizz'
6     elif n % 5 == 0:
7         return 'Buzz'
8     else:
9         return str(n)
```



Python Abstract Syntax Tree

Example: the same source as before

```
import ast
source = "def quad(a): return a*a\n"
node = ast.parse(source, mode="exec")
ast.dump(node,
          annotate_fields=True,
          include_attributes=True)
```

Sic! Access to Python AST
from within a Python program!

The result of `dump`:

```
"Module(body=[FunctionDef(name='quad',
args=arguments(args=[arg(arg='a', annotation=None)],
vararg=None, kwonlyargs=[], kw_defaults=[], kwarg=None,
defaults=[]), body=[Return(value=BinOp(left=Name(id='a',
ctx=Load()), op=Mult(), right=Name(id='a', ctx=Load())))],
decorator_list=[], returns=None)])"
```

Python Abstract Syntax Tree

```
"Module (  
  body = [  
    FunctionDef (  
      name = 'quad',  
      args = arguments(  
        args = [  
          arg(arg='a',annotation=None,lineno=1, col_offset=9)  
        ],  
        vararg = None, kwonlyargs=[], kw_defaults=[], kwarg=None,  
        defaults = []  
      ),  
      body = [  
        Return(  
          value = BinOp(  
            left = Name(id='a',ctx=Load(),lineno=1,col_offset=20),  
            op = Mult(),  
            right = Name(id='a',ctx=Load(),lineno=1,col_offset=22),  
            lineno = 1, col_offset = 20  
          ),  
          lineno = 1, col_offset = 13  
        ),  
      ],  
      decorator_list=[], returns=None, lineno=1, col_offset=0  
    )  
  ]  
)"
```

From the prev. slide:
the formatted version

Python Abstract Syntax Tree

```
"Module (  
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    )  
  ]  
)"
```

From the prev. slide:
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Look carefully: does it
look familiar? 😊

Python Abstract Syntax Tree

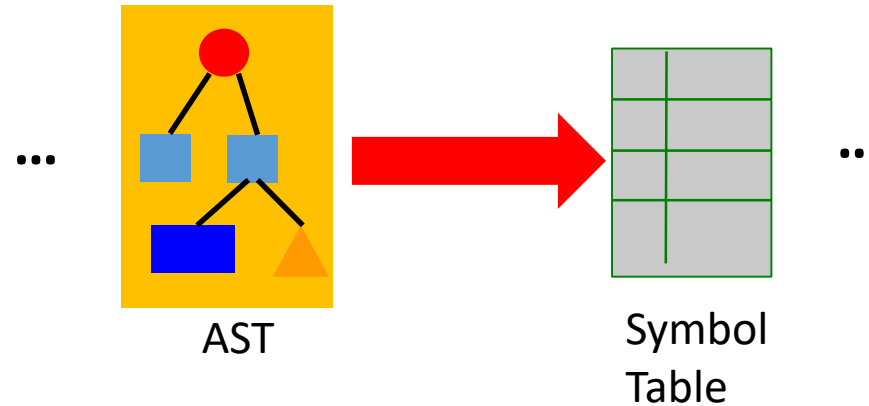
The C implementation
of the AST node
(example for statements)

```
struct _stmt {  
    enum _stmt_kind kind;  
    union {  
        struct {  
            identifier name;  
            arguments_ty args;  
            asdl_seq* body;  
            asdl_seq* decorator_list;  
            expr_ty returns;  
        } FunctionDef;  
        ...  
        struct {  
            identifier name;  
            asdl_seq* bases;  
            asdl_seq* keywords;  
            asdl_seq* body;  
            asdl_seq* decorator_list;  
        } ClassDef;  
        ...  
    } v;  
    int lineno;  
    int col_offset  
}
```

3rd Phase: Building Symbol Tables

Symbol Table:

A collection of the names within a code block and the context in which names are used



A **code block** is a piece of program code that is executed as a single unit.

Examples of code blocks: **modules**, **functions** and **classes**.

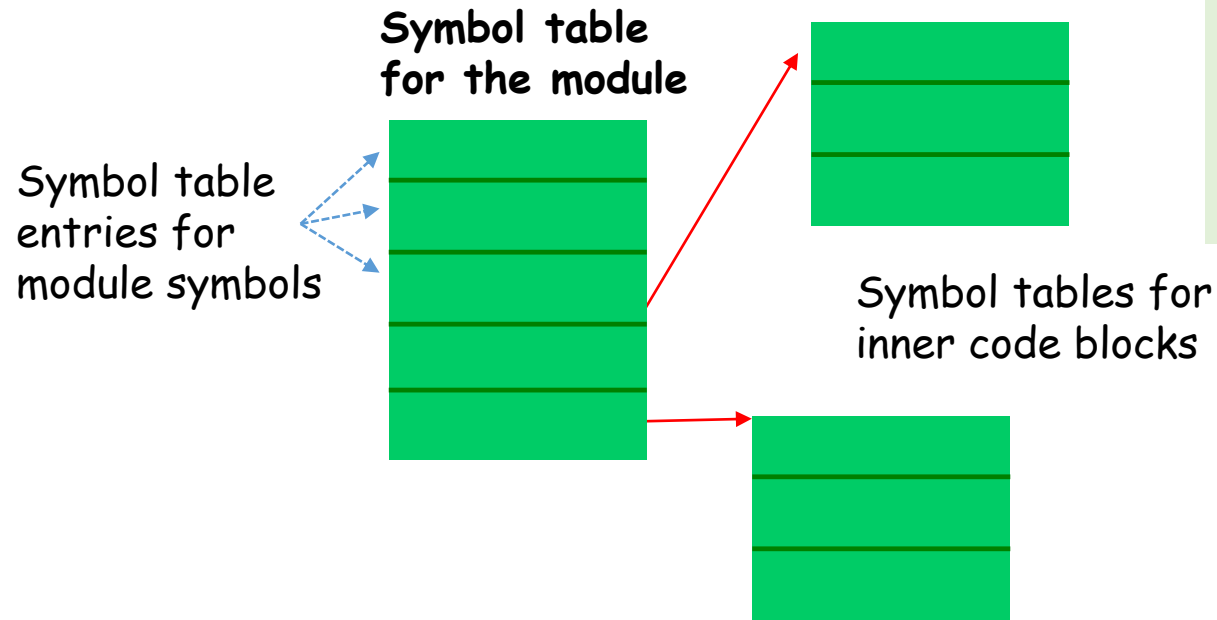
More examples: **commands** typed in interactively at the REPL

A code block has a number of **namespaces** associated with it.

Module code block: has access to the global namespace

Function code block: has access to the local as well as the global namespace.

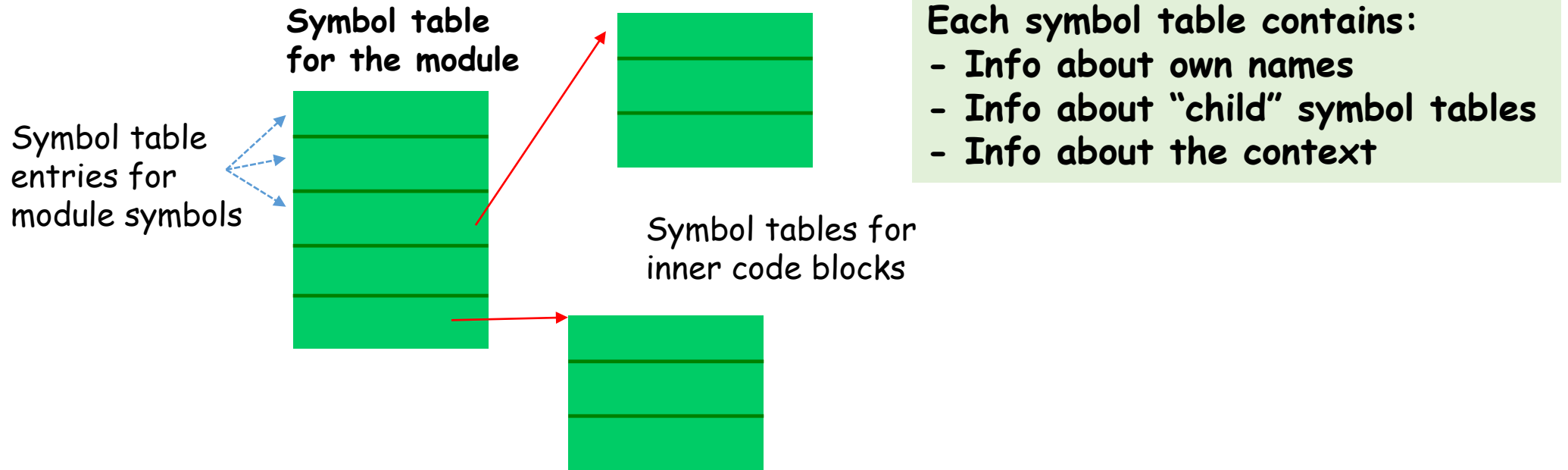
The Structure of Symbol Tables



Each symbol table contains:

- Info about own names
- Info about "child" symbol tables
- Info about the context

The Structure of Symbol Tables



The structure of a single symbol table

```
struct symtable {  
    PyObject* st_filename; // name of file being compiled  
    struct _symtable_entry* st_top;  
                                // symbols declared within the module  
    PyObject* st_blocks; // symbol tables for inner code blocks  
    ... // many other fields  
};
```

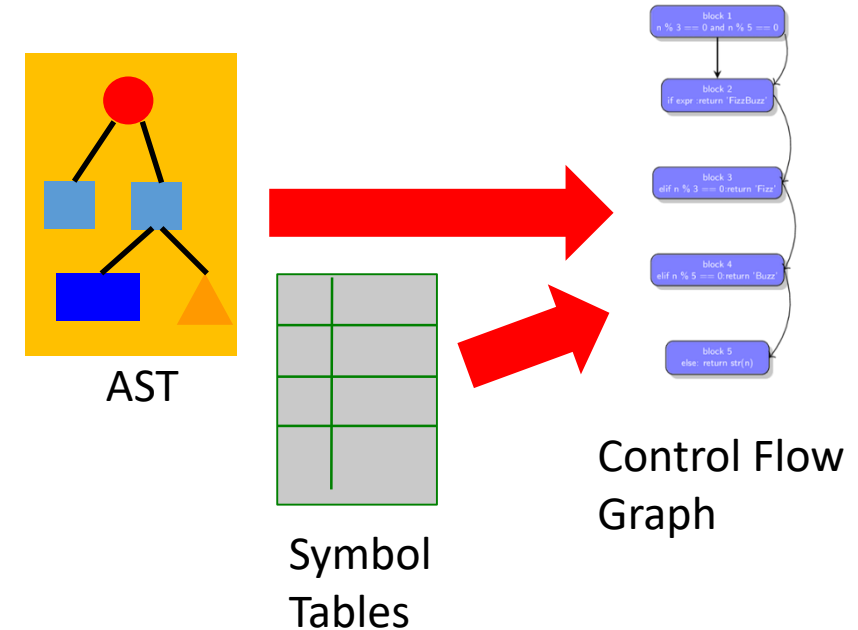
The Structure of Symbol Tables

The structure of a single symbol table entry

```
typedef struct _symtable_entry {  
    ...  
    PyObject* ste_name;           // string: name of current block  
    PyObject* ste_varnames;       // list of function parameters  
    PyObject* ste_children;       // list of child blocks  
    PyObject* ste_directives;     // locations of global and  
                                // nonlocal statements  
    _Py_block_ty ste_type;        // module, class, or function  
    int ste_nested;               // true if block is nested  
    ...  
} PySTEntryObject;
```

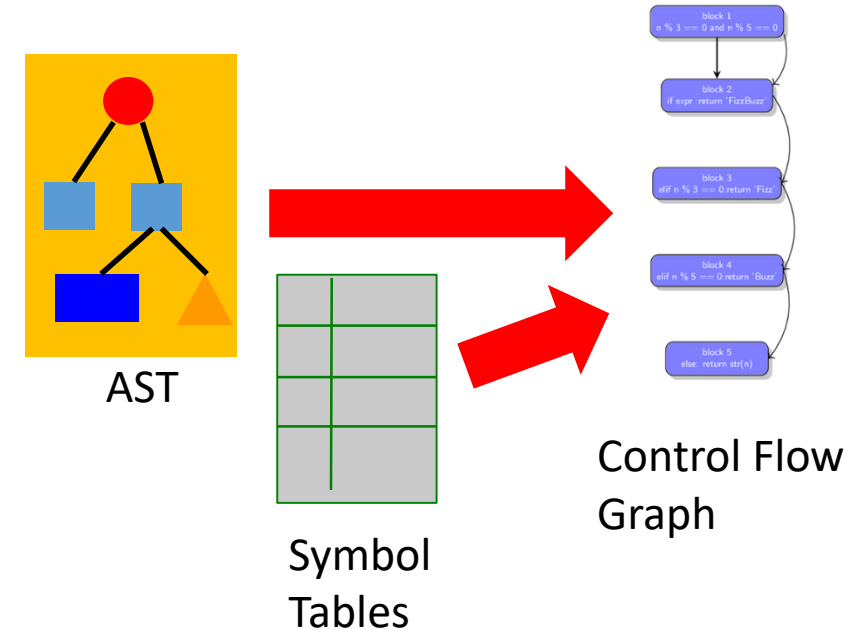

4th Phase: Building CFG & Bytecode

The next step for the compiler is to generate code objects from the AST incorporating information contained in the symbol table



4th Phase: Building CFG & Bytecode

The next step for the compiler is to generate code objects from the AST incorporating information contained in the symbol table



Step 1

The AST is converted into **basic blocks** of Python byte code instructions. The result is the Control Flow Graph (CFG).

Step2

The generated control flow graph is flattened using a post-order depth first search transversal.

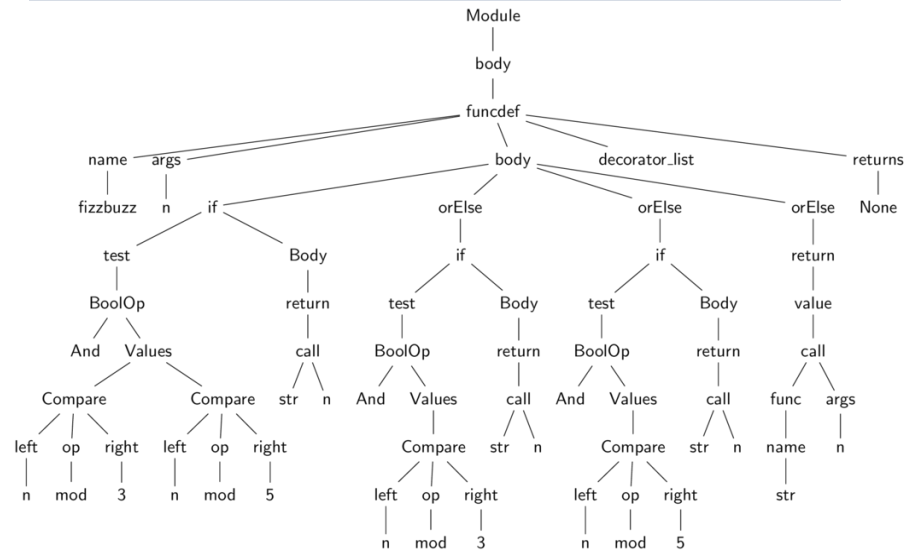
Control Flow Graph

- Maximal portion of language constructs that are to be executed sequentially is called **basic block**.
- The basic blocks have a single entry point but can have multiple exits.
- The basic blocks and paths between them implicitly represent a graph - the **control flow graph**.
- Therefore, the CFG is basically composed of basic blocks and connections between these basic blocks.

Control Flow Graph

Example

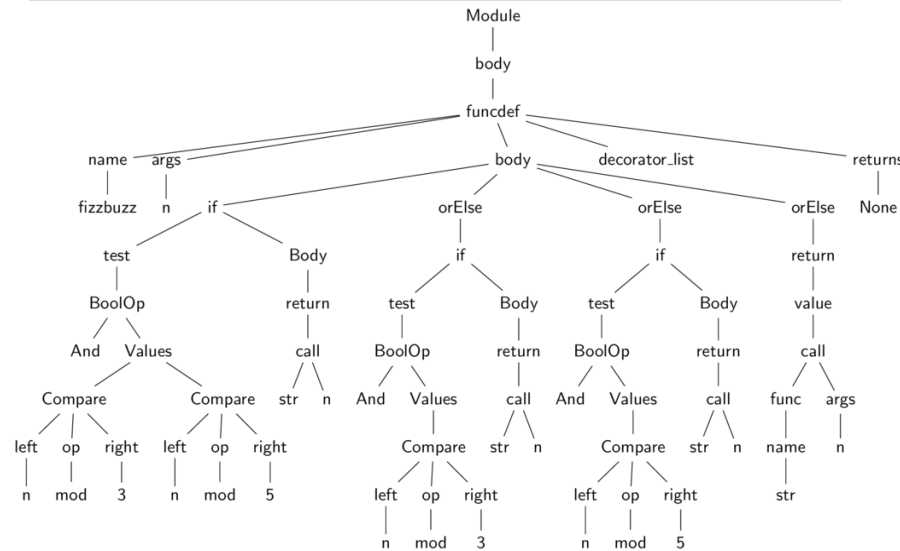
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def fizzbuzz(n):  
    if n % 3 == 0 and n % 5 == 0:  
        return 'FizzBuzz'  
    elif n % 3 == 0:  
        return 'Fizz'  
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    else:  
        return str(n)
```



Control Flow Graph

Example

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```



Block 1
n%3 == 0 and n%5 == 0

Block 2
return 'FizzBuzz'

Block 3
n % 3 == 0

Block 4
return 'Fizz'

Block 5
n % 5 == 0

Block 6
return 'Buzz'

Block 7
return str(n)

Code Object Structure

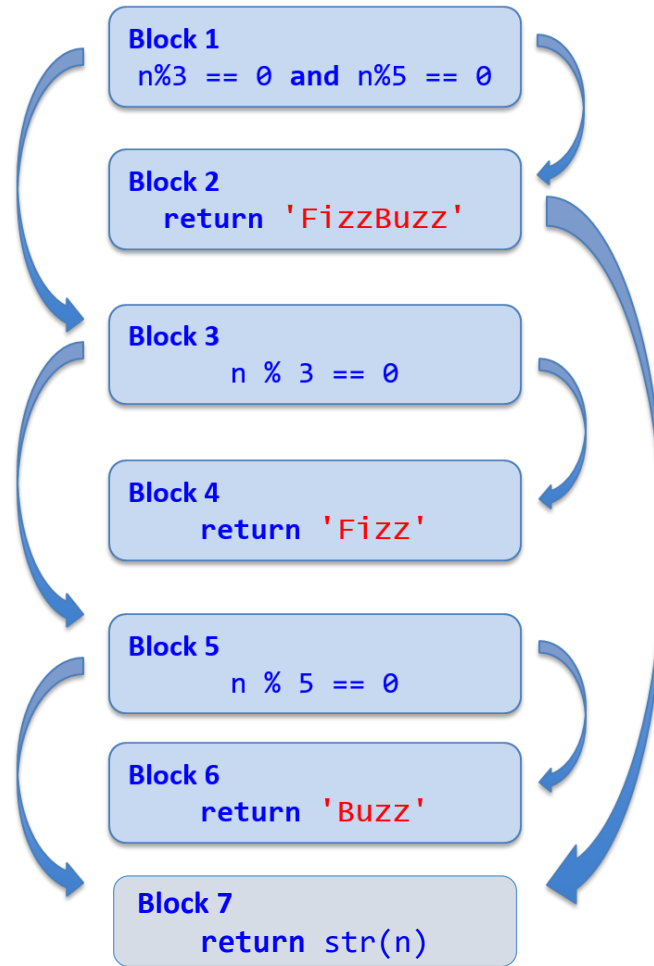
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Code Object Structure

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        return 'Buzz'  
    else:  
        return str(n)
```

```
co_argcount = 1 // number of arguments to a code block  
co_cellvars = ()  
co_code = <sequence of bytecode instructions>  
           // list of constants: string literals and numeric values  
co_consts = (None, 3, 0, 5, 'FizzBuzz', 'Fizz', 'Buzz')  
co_filename = <full path to the source file fizzbuzz.py>  
co_firstlineno = 6  
co_flags = 67  
co_freevars = ()  
co_kwonlyargcount = 0  
co_lnotab = <maps from opcodes to line numbers>  
co_name = fizzbuzz  
co_names = ('str',) // collection of non-local names  
co_nlocals = 1  
co_stacksize = 2  
co_varnames = ('n',) // names defined locally
```

From CFG to Code Object



From CFG to Code Object

Block 1

```
0 LOAD_FAST 0 (n)
2 LOAD_CONST 1 (3)
4 BINARY_MODULO
6 LOAD_CONST 2 (0)
8 COMPARE_OP 2 (==)
10 JUMP_IF_FALSE_OR_POP 28
12 LOAD_FAST 0 (n)
14 LOAD_CONST 3 (5)
16 BINARY_MODULO
18 LOAD_CONST 2 (0)
20 COMPARE_OP 2 (==)
22 JUMP_IF_FALSE_OR_POP 28
```

Block 2

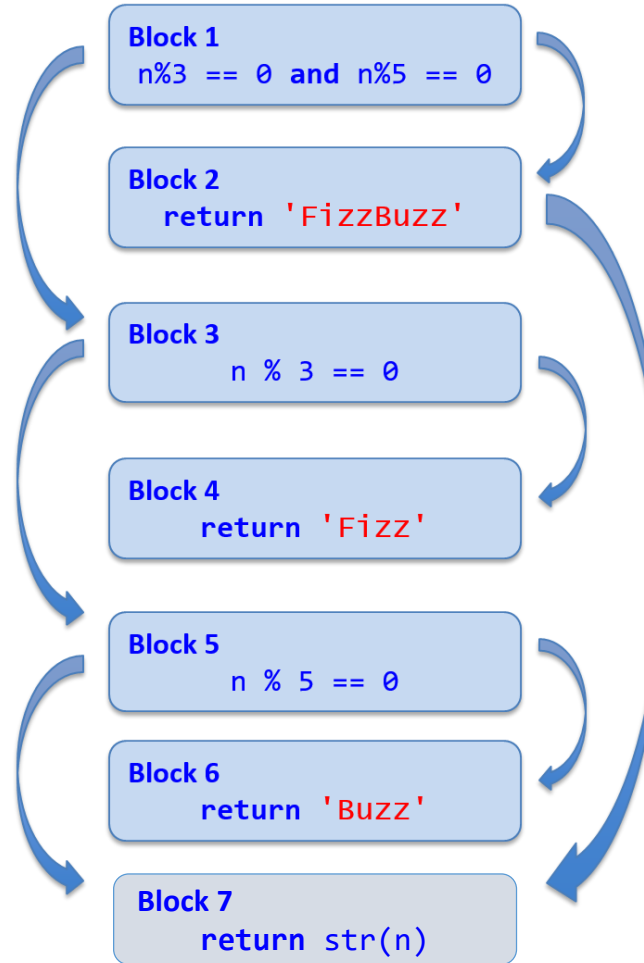
```
24 LOAD_CONST 4 ('FizzBuzz')
26 RETURN_VALUE
```

Block 3

```
28 LOAD_FAST 0 (n)
30 LOAD_CONST 1 (3)
32 BINARY_MODULO
34 LOAD_CONST 2 (0)
36 COMPARE_OP 2 (==)
38 POP_JUMP_IF_FALSE 44
```

Block 4

```
40 LOAD_CONST 5 ('Fizz')
42 RETURN_VALUE
```



Block 5

```
44 LOAD_FAST 0 (n)
46 LOAD_CONST 3 (5)
48 BINARY_MODULO
50 LOAD_CONST 2 (0)
52 COMPARE_OP 2 (==)
54 POP_JUMP_IF_FALSE 60
```

Block 6

```
56 LOAD_CONST 6 ('Buzz')
68 RETURN_VALUE
```

Block 7

```
60 LOAD_GLOBAL 0 (str)
62 LOAD_FAST 0 (n)
64 CALL_FUNCTION 1
66 RETURN_VALUE
68 LOAD_CONST 0 (None)
70 RETURN_VALUE
```

Instructions in More Details

```
...  
if n % 3 == 0 and n % 5 == 0:  
...
```

Instructions in More Details

```
...  
if n % 3 == 0 and n % 5 == 0:  
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```

0	LOAD_FAST	0 (n)
2	LOAD_CONST	1 (3)
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6	LOAD_CONST	2 (0)
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Instructions in More Details

```
...  
if n % 3 == 0 and n % 5 == 0:  
...
```

Offset of the given
instruction from the start
of the bytecode sequence

Human readable
instruction opcode

the index into the
`co_varnames` array

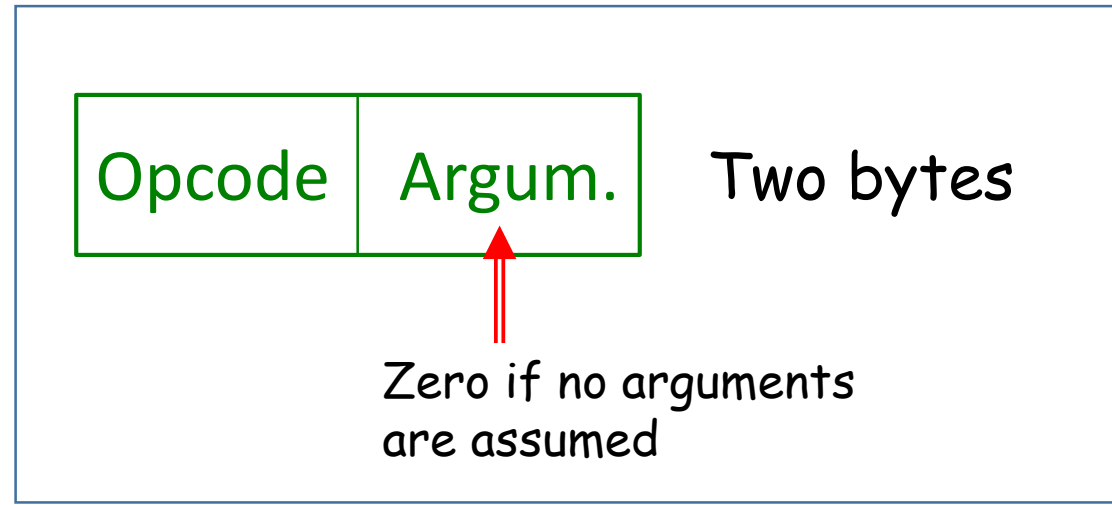
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the index into the
`co_const` array

The argument
to the instruction

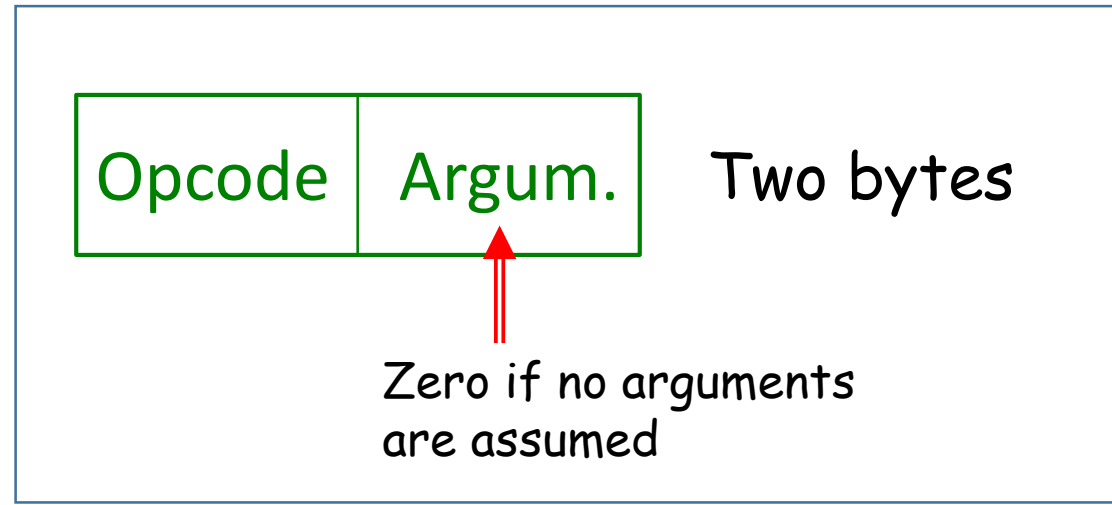
The Single Instruction Format

...is quite simple 😊



The Single Instruction Format

...is quite simple ☺



How to obtain the bytecode:

```
def cube(a):  
    return a*a*a
```

```
from dis import dis  
dis(cube)
```

```
2      0 LOAD_FAST      0 (a)  
      2 LOAD_FAST      0 (a)  
      4 BINARY_MULTIPLY  
      6 LOAD_FAST      0 (a)  
      8 BINARY_MULTIPLY  
     10 RETURN_VALUE
```

Extra Slides

Representation of Python Objects

Python Objects

C#

```
class C { ... }
```

```
var c = new C()
```

What's the type of `c`?

Python Objects

C#

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class C { ... }
```

```
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`c` is the **object** of the reference type. The type of `c` is **class C**

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class C:  
    ...  
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```

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Python

```
class C:  
    ...  
c = C()
```

What's the type of `c`?

`c` is the **name** (reference) to an object. `c` doesn't have a type. It just refers to an object. The object has a type.

Python: Names & Binding

From the book *Inside the Python Virtual Machine*

In Python, objects are referenced by *names*. Names are analogous to variables in C++ and Java (*but not exactly*).

```
>>> x = 5
```

Here, `x` is a name that references the object, `5`. The process of *assigning* a reference to `5` to `x` is called *binding*. A binding causes a name to be associated with an object in the innermost scope of the currently executing program. Bindings may occur during a number of instances such as during variable assignment or function or method call when the supplied parameter is bound to the argument.

It is important to note that names are just symbols and they have no *type* associated with them; **names are just references to objects that actually have types.**

How Objects Are Implemented?

```
typedef struct _object
{
    _PyObject_HEAD_EXTRA
    Py_ssize_t ob_refcnt;
    struct _typeobject* ob_type;
} PyObject;
```

How Objects Are Implemented?

Support for memory management

The number of references to the object

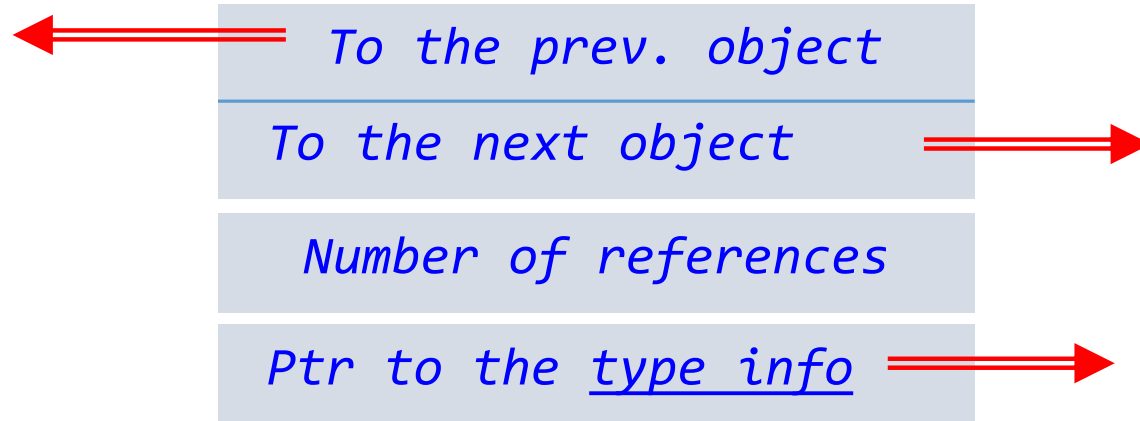
```
typedef struct _object
{
    _PyObject_HEAD_EXTRA
    Py_ssize_t ob_refcnt;
    struct _typeobject* ob_type;
} PyObject;
```

The reference to the information about the object type (!)

How Objects Are Implemented?

`aName = Expression`
An object

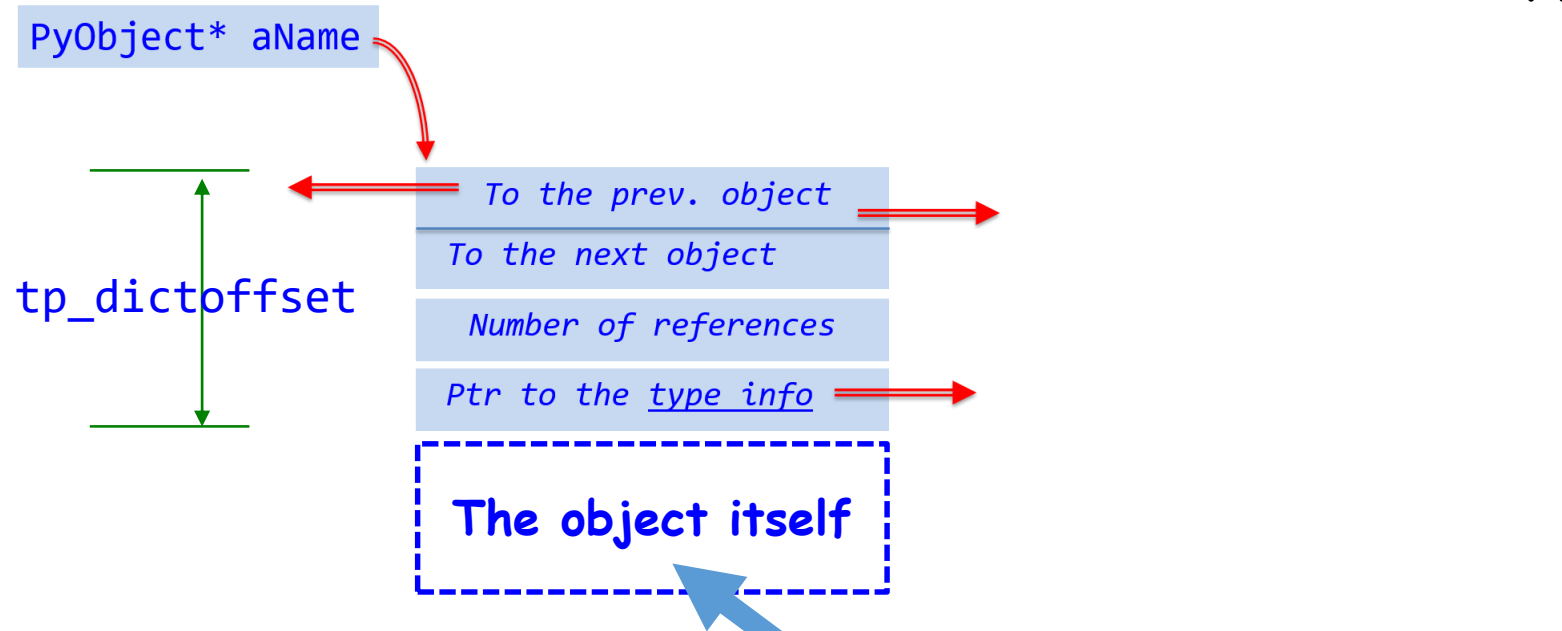
`PyObject* aName`



But where is the value??

How Objects Are Implemented?

For instances of user-defined types:



Example: tuple type

```
typedef struct {  
    PyObject_VAR_HEAD  
    PyObject* ob_item[1];  
} PyTupleObject;
```

```
tuple =  
    (PyTupleObject*)(aName+tp_dictoffset)
```


How Objects Are Implemented?

For instances of class types:

