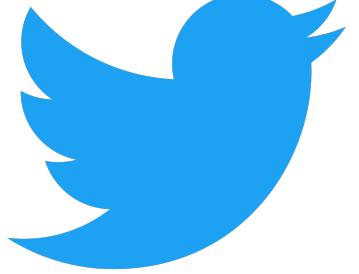

Visual Debugger for Jupyter Notebooks: Myth or Reality?

Elizaveta Shashkova
EuroPython 2019

About Me

- Software Developer at JetBrains, PyCharm IDE
- Debugger and Data Science tools
-  @lisa_shashkova



Visual Debugger

The screenshot shows a visual debugger interface with a code editor and a debugger tool window.

Code Editor:

```
375     before_set = set()  before_set: <type 'set'>: set([])
376     after_set = set()   after_set: <type 'set'>: set([])
377     pad = 4   pad: 4
378     for dx in xrange(-pad, pad + 1):  dx: -4
379         for dy in [0]: # xrange(-pad, pad + 1):  dy: 0
380             for dz in xrange(-pad, pad + 1):  dz: -4
381     ● if dx ** 2 + dy ** 2 + dz ** 2 > (pad + 1) ** 2:
382         continue
383     if before:
384         x, y, z = before
385         before_set.add((x + dx, y + dy, z + dz))
```

Debugger Tool Window:

- Debug:** main
- Frames:** MainThread (selected), change_sectors, main.py:381, update, main.py:568, call_scheduled_functions, clock.py:309
- Variables:**
 - after = {tuple} <type 'tuple'>: (0, 0, 0)
 - after_set = {set} <type 'set'>: set([])
 - before = {NoneType} None
 - before_set = {set} <type 'set'>: set([])

Jupyter Notebooks

- Popular scientific tool
- File is a sequence of cells



Jupyter Notebooks Debug

- Logging with print statements
- Command-line debugger ipdb

Jupyter Notebooks Debug

```
In [*]: 1 from IPython.core.debugger import set_trace  
2 set_trace()  
3 a = 1  
4 b = 2  
5 c = a + b  
6 print(c)
```

```
--Return--  
None  
> <ipython-input-12-d7e9a919d186>(2)<module>()  
    1 from IPython.core.debugger import set_trace  
----> 2 set_trace()  
    3 a = 1  
    4 b = 2  
    5 c = a + b
```

```
ipdb> n  
> /Users/Elizaveta/PycharmProjects/jupyter-demo37/venv/lib/python3.7/site-packages/IPython/core/interactiveshell.py(3  
294)run_code()  
    3292         finally:  
    3293             # Reset our crash handler in place  
-> 3294             sys.excepthook = old_excepthook  
    3295         except SystemExit as e:  
    3296             if result is not None:
```

```
ipdb>
```

Myth or Reality?

Myth or Reality?

BA DUM TSSS



Contents

- Python files debugging
- Jupyter breakpoints
- Debugger communication
- Jupyter visual debugger

Tracing Function

```
1 def tracefunc(frame, event, arg):  
2     print(frame.f_lineno, event)  
3     return tracefunc  
4  
5  
6 sys.settrace(tracefunc)
```

Tracing Function

```
1 def greet_neighbors():
2     planets = ["Mars", "Venus"]
3     for p in planets:
4         print(f"Hi {p}!")
5     return len(planets)
6
7
8 sys.settrace(tracefunc)
9 greet_neighbors()
```

Tracing Function

```
1 def greet_neighbors():
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```

1 call

Tracing Function

```
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8 sys.settrace(tracefunc)
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```

```
1 call
2 line
```

Tracing Function

```
1 def greet_neighbors():
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3     for p in planets:
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6
7
8 sys.settrace(tracefunc)
9 greet_neighbors()
```

```
1 call
2 line
3 line
4 line
Hi Mars!
```

Tracing Function

```
1 def greet_neighbors():
2     planets = ["Mars", "Venus"]
3     for p in planets:
4         print(f"Hi {p}!")
5     return len(planets)
6
7
8 sys.settrace(tracefunc)
9 greet_neighbors()
```

```
1 call
2 line
3 line
4 line
Hi Mars!
3 line
4 line
Hi Venus!
```

Tracing Function

```
1 def greet_neighbors():
2     planets = ["Mars", "Venus"]
3     for p in planets:
4         print(f"Hi {p}!")
5     return len(planets)
6
7
8 sys.settrace(tracefunc)
9 greet_neighbors()
```

```
1 call
2 line
3 line
4 line
Hi Mars!
3 line
4 line
Hi Venus!
5 line
5 return
```

Breakpoint

- **frame.f_lineno** - current line number
- **frame.f_code.co_filename** - current file name

Breakpoint

- **frame.f_lineno** - current line number
- **frame.f_code.co_filename** - current file name
- Equals to breakpoint's file and line -> suspend program!

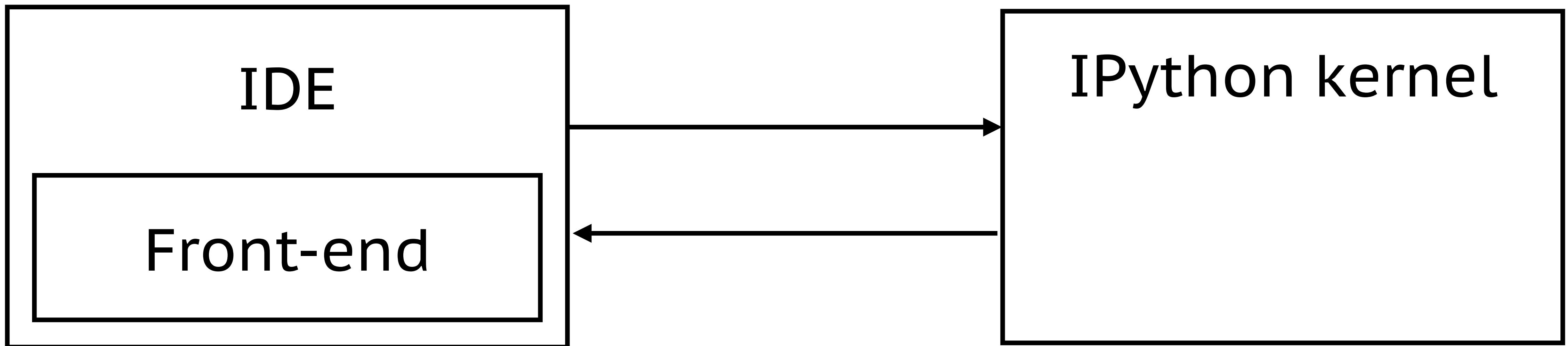
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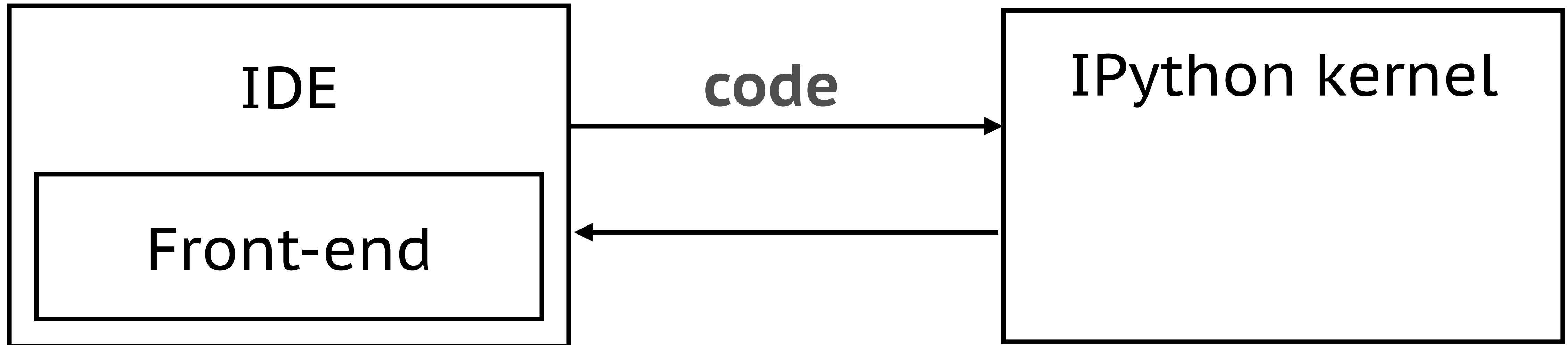
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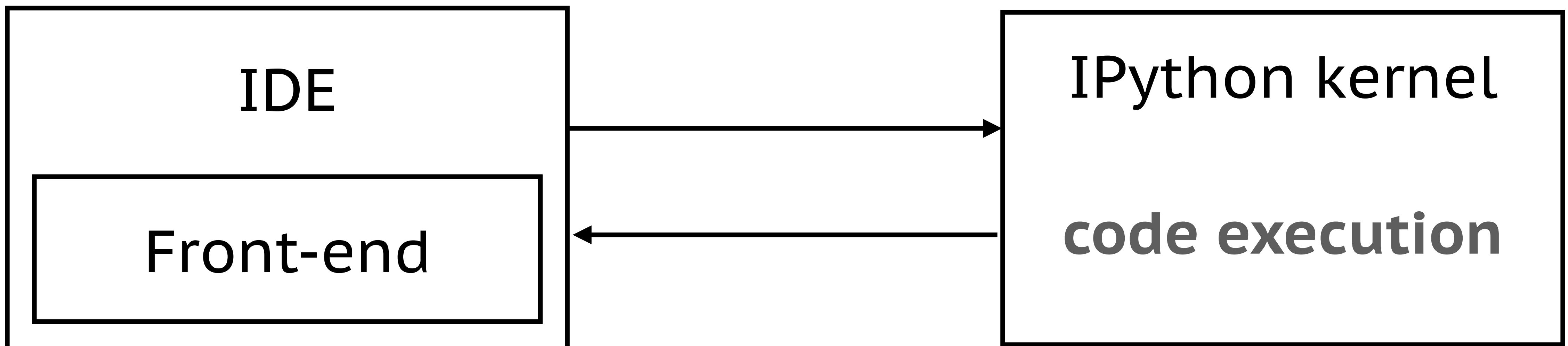
Cells Execution



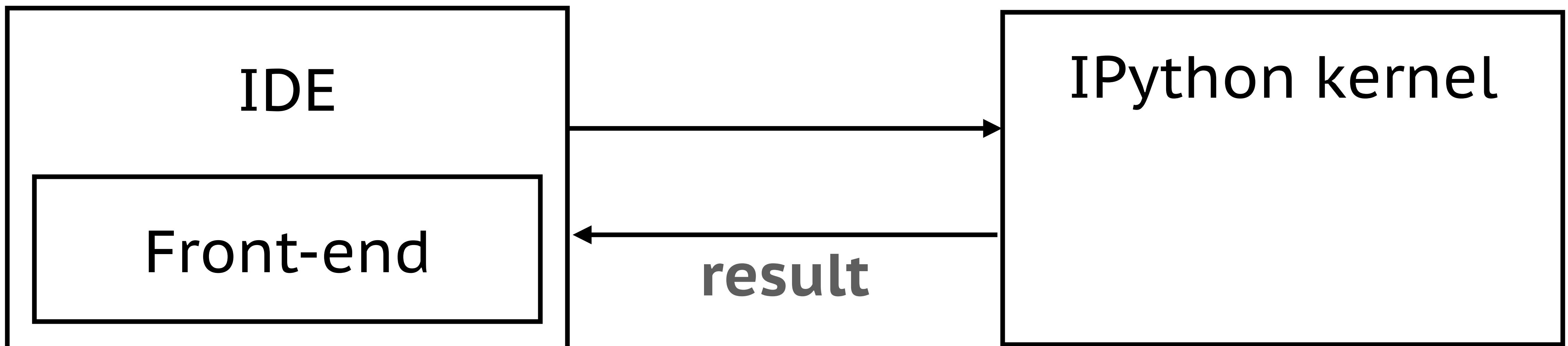
Cells Execution



Cells Execution



Cells Execution



Cells Execution

- Kernel generates a unique name for each cell
- <ipython-input-5-11faed10a894>
- File name of a generated code object

IPython kernel
code execution

Jupyter Breakpoints

- Python files: (filename, line number) -> unique location

Jupyter Breakpoints

- Python files: (filename, line number) -> unique location

- Jupyter Notebooks?

```
In [1]: 1 a = 1  
         2 b = a + 1
```

```
In [2]: 1 c = b  
         2 d = c + 1
```

```
In [3]: 1 print(b)  
         2 print(d)
```

2
3

Jupyter Breakpoints

- Python files: (filename, line number) -> unique location

- Jupyter Notebooks:

- generated cell name

- line inside code object

```
In [1]: 1 a = 1  
         2 b = a + 1
```

```
In [2]: 1 c = b  
         2 d = c + 1
```

```
In [3]: 1 print(b)  
         2 print(d)
```

2
3

Source Mapping

IDE

MyNotebook.ipynb

IPython kernel

cell
source code

generated
<code object>

Source Mapping

IDE

MyNotebook.ipynb

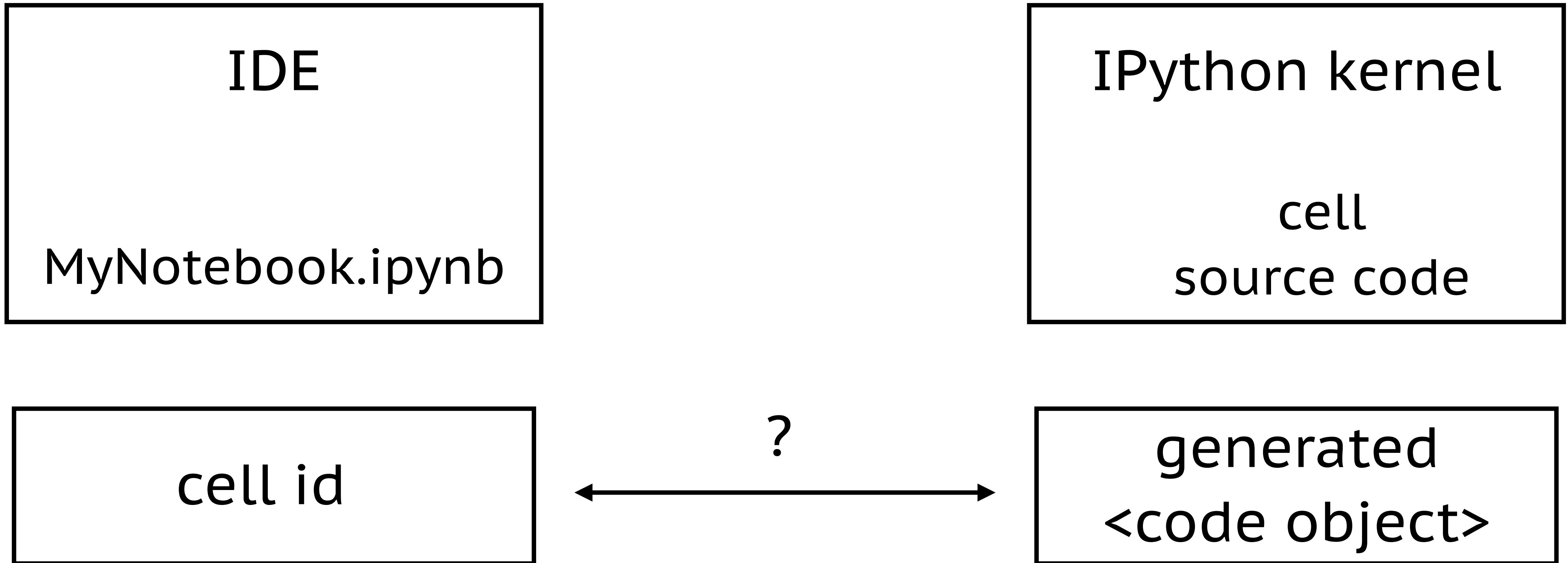
IPython kernel

cell
source code

cell id

generated
<code object>

Source Mapping



Source Mapping

- Tracking cells execution in the IDE

Source Mapping

- Tracking cells execution in the IDE
- Silent cell execution in IPython kernel

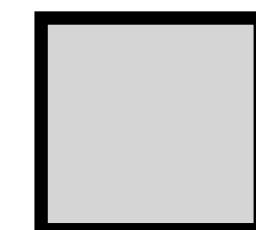
Debug Cell Execution

<cell source code>

Debug Cell Execution

patch name generation

<cell source code>



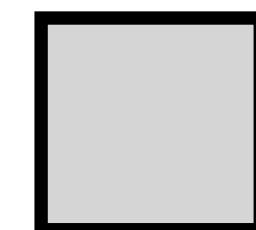
- silent mode

Debug Cell Execution

patch name generation

cell id

<cell source code>



- silent mode

Jupyter Tracing Function

- **frame.f_code.co_filename** - generated name

Jupyter Tracing Function

- **frame.f_code.co_filename** - generated name
- Map: generated name -> cell id

Jupyter Tracing Function

- **frame.f_code.co_filename** - generated name
- Map: generated name -> cell id
- Send message to the IDE

Jupyter Tracing Function

- **frame.f_code.co_filename** - generated name
- Map: generated name -> cell id
- Send message to the IDE

```
13
14 > #%%
15 a = 1
16 b = a + 1 a: 1
17
18 > #%%
19 c = b b: 2
20 d = c + 1 c: 2
21
22 > #%%
23 print(b) b: 2
24 print(d)
25
```

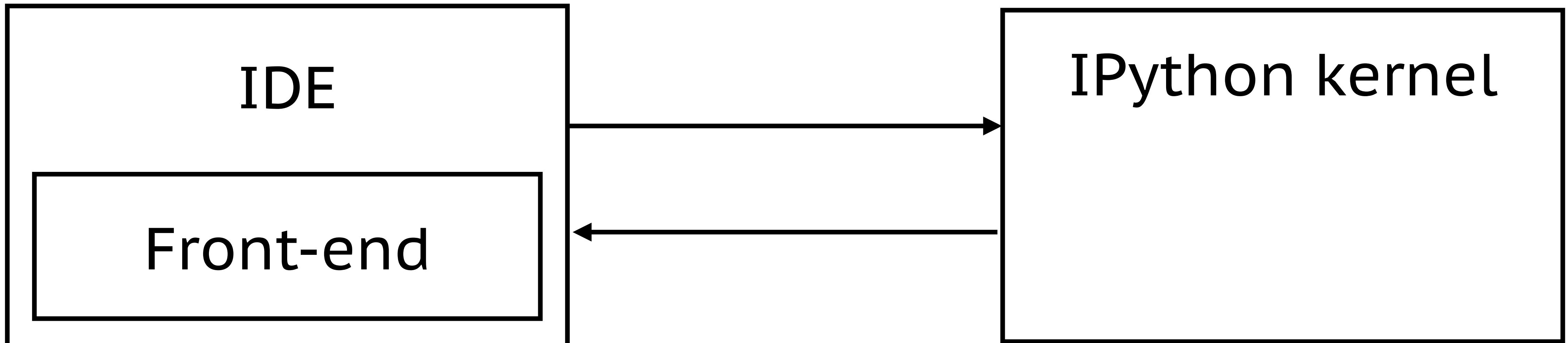
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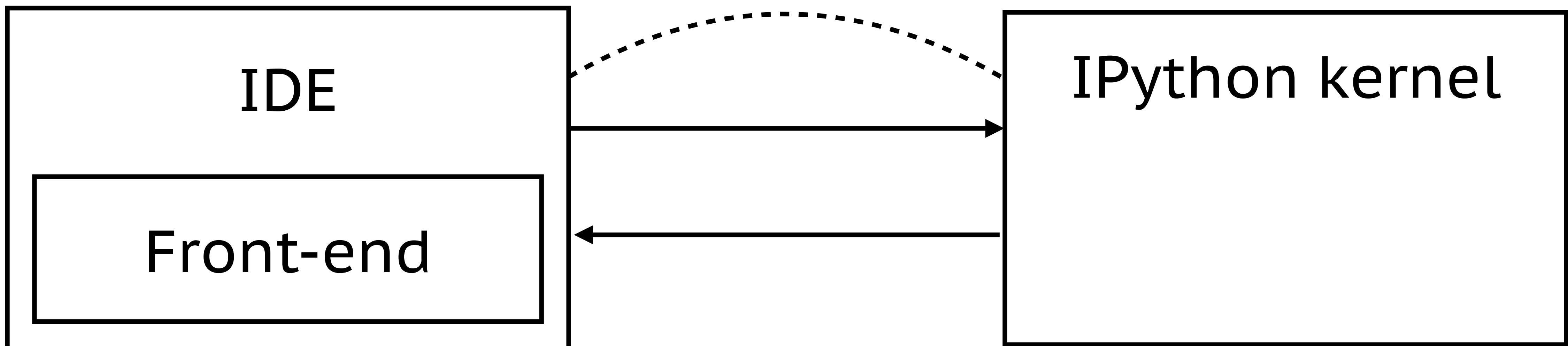
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Debug Communication



“Add breakpoint in a cell 3, line 2”

Debug Communication

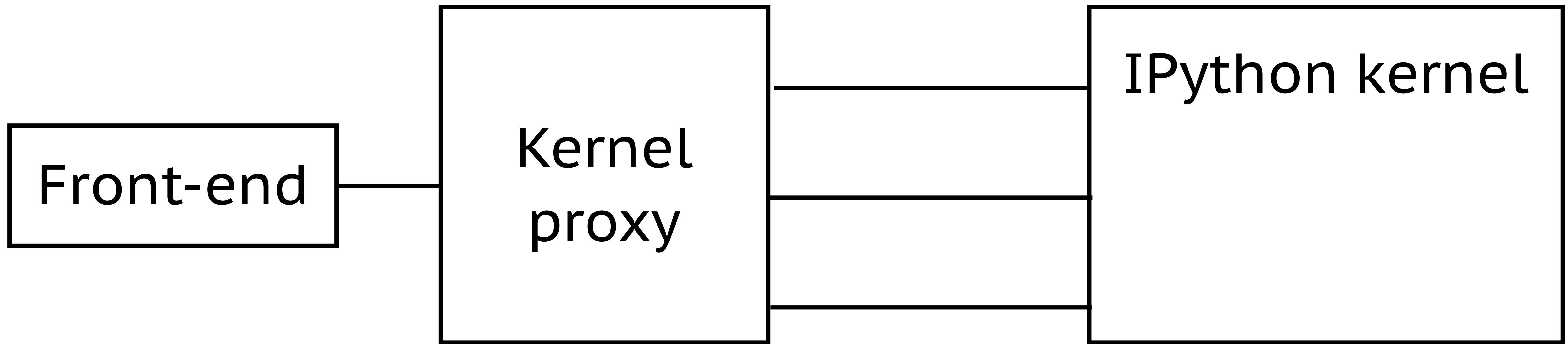


“Add breakpoint in a cell 3, line 2”

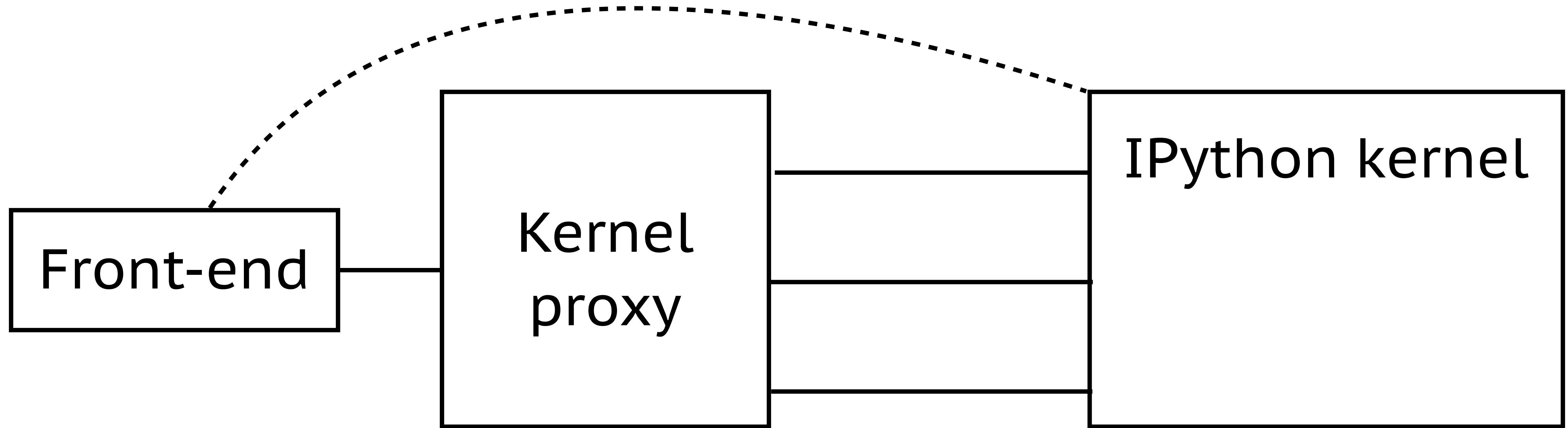
Debug Communication

- Additional connection
- Reuse Jupyter channels

Jupyter Messaging



Jupyter Messaging



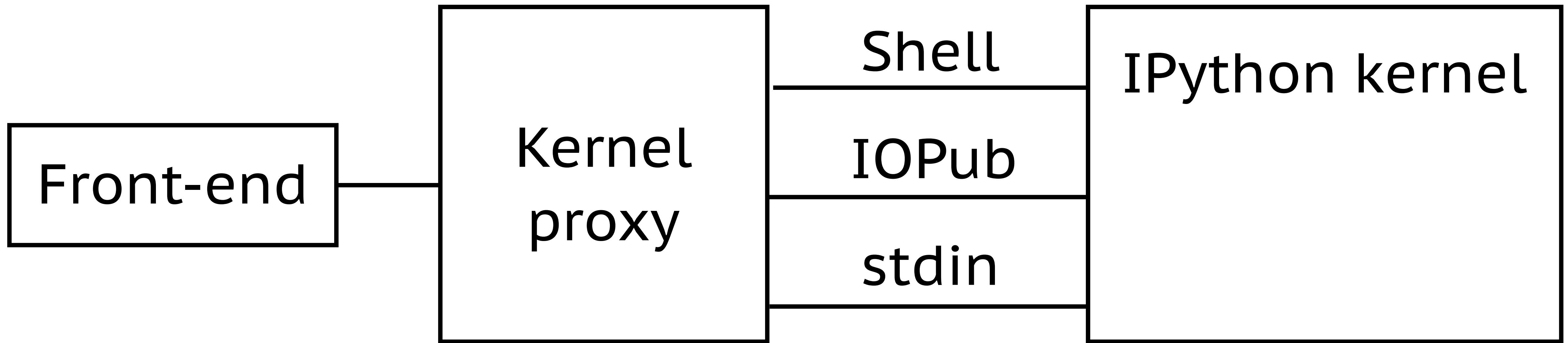
Debug Communication

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Debug Communication

- Additional connection
- Reuse Jupyter channels

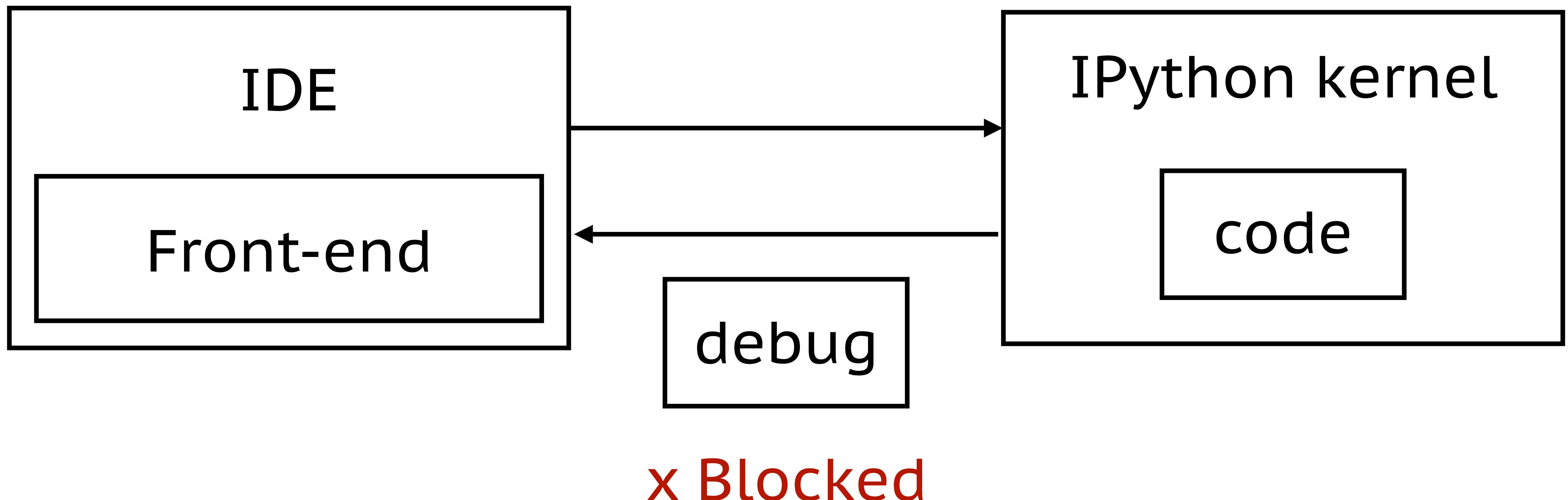
Jupyter Messaging



Jupyter Architecture

- Event loop in a main thread for execution events
- Event loop for output events

Jupyter Architecture



Debug Communication

- Additional connection
- Reuse Jupyter channels

Debug Communication

- Additional connection
- Reuse Jupyter channels

But **ipdb** works!

But ipdb Works!

```
In [*]: 1 from IPython.core.debugger import set_trace  
2 set_trace()  
3 a = 1  
4 b = 2  
5 c = a + b  
6 print(c)
```

```
--Return--  
None  
> <ipython-input-12-d7e9a919d186>(2)<module>()  
    1 from IPython.core.debugger import set_trace  
----> 2 set_trace()  
      3 a = 1  
      4 b = 2  
      5 c = a + b
```

```
ipdb> n  
> /Users/Elizaveta/PycharmProjects/jupyter-demo37/venv/lib/python3.7/site-packages/IPython/core/interactiveshell.py(3  
294)run_code()  
    3292         finally:  
    3293             # Reset our crash handler in place  
-> 3294             sys.excepthook = old_excepthook  
    3295         except SystemExit as e:  
    3296             if result is not None:
```

```
ipdb>
```

But ipdb Works!

- Based on `input()`
- Reuses user input channel

Debug Communication

- Additional connection
- Reuse Jupyter channels

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- Python files debugging
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- **Jupyter visual debugger**

Jupyter Visual Debugger

- Jupyter tracing function

Jupyter Visual Debugger

- Jupyter tracing function
- Mapping between editor and generated code

Jupyter Visual Debugger

- Jupyter tracing function
- Mapping between editor and generated code
- Debugger connection

Live Demo

The screenshot shows the PyCharm IDE interface with a Jupyter Notebook project open. The top navigation bar displays the project name "jupyter-demo" and the notebook file "EuroPython2019.ipynb". The main code editor window contains the following Python code:

```
#% md
## Hello EuroPython 2019!
## I'm a Jupyter Notebook
#%
print("Hi!")
my_name = "Earth"
earth_neighbors = ["Mars", "Venus"]
#%
def greet_neighbors(neighbors):
    for n in neighbors:
        print("Hi %s!" % n)
    return len(neighbors)
```

The line `my_name = "Earth"` is highlighted with a red dot, indicating it is selected or being debugged. To the right of the code editor, the notebook output area displays the results of the code execution:

Hello EuroPython 2019!

I'm a Jupyter Notebook

```
8
print("Hi!")
my_name = "Earth"
earth_neighbors = ["Mars", "Venus"]

Hi!
```

```
8
def greet_neighbors(neighbors):
    for n in neighbors:
        print("Hi %s!" % n)
    return len(neighbors)

num = greet_neighbors(earth_neighbors)
```

Below the code editor, the "Debug" tool window is open, showing the current thread as "MainThread" and the stack frames for the current cell. The "Variables" tab lists the following variables:

- Special Variables
- earth_neighbors = [list] <class 'list'>: ['Mars', 'Venus']
 - jupiter_len = {int} 2
- jupiter_neighbors = [list] <class 'list'>: ['Mars', 'Saturn']
 - my_name = {str} 'Earth'
 - num = {int} 2

At the bottom of the interface, status bars indicate the server is running at <http://localhost:8888> and the Python version is 3.7.

Live Demo

- PyCharm doesn't convert Jupyter Notebooks to Python files!
- On disk it's still the same JSON file with **.ipynb** extension

Jupyter Visual Debugger

- Jupyter tracing function
- Mapping between editor and generated code
- Debugger connection

Jupyter Visual Debugger

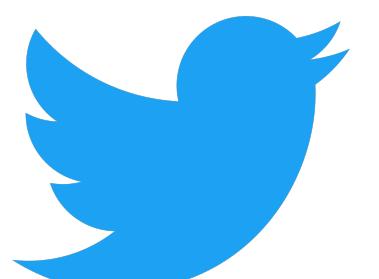
- Implement in your favourite IDE

Jupyter Visual Debugger

- Implement in your favourite IDE
- Try it in PyCharm Pro!

Jupyter Visual Debugger

- Implement in your favourite IDE
- Try it in PyCharm Pro!
- Questions?



@lisa_shashkova