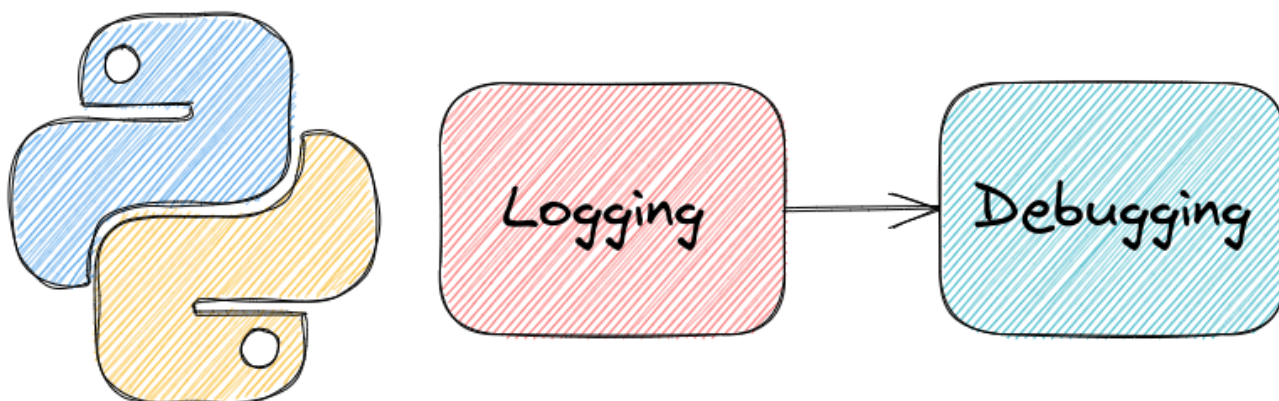


# Efficient Python Tricks and Tools for Data Scientists - By Khuyen Tran

## *Logging and Debugging*

 [GitHub](#) [View on GitHub](#) [Book](#) [View Book](#)

Collections of tools for logging and debugging Python code.



# *rich.inspect: Produce a Beautiful Report on any Python Object*

```
$ pip install rich
```

If you want to quickly see which attributes and methods of a Python object are available, use rich's `inspect` method.

rich's `inspect` method allows you to create a beautiful report for any Python object, including a string.

```
from rich import inspect

print(inspect('hello', methods=True))
```

```
<class 'str'
str(object='') -> str
str(bytes_or_buffer[, encoding[, errors]]) -> str
```

```
'hello'
```

```
capitalize = def capitalize(): Return a capitaliz
casefold = def casefold(): Return a version o
               comparisons.
center = def center(width, fillchar=' ', /
               width.
count = def count(...) S.count(sub[, star
encode = def encode(encoding='utf-8', erro
```

```

        codec registered for encoding.
    endswith = def endswith(...) S.endswith(suffix)
    expandtabs = def expandtabs(tabsize=8): Return
        expanded using spaces.
    find = def find(...) S.find(sub[, start[,
    format = def format(...) S.format(*args, *
    format_map = def format_map(...) S.format_map(
    index = def index(...) S.index(sub[, start
    isalnum = def isalnum(): Return True if the
        otherwise.
    isalpha = def isalpha(): Return True if the
        otherwise.
    isascii = def isascii(): Return True if all
        False otherwise.

    isdecimal = def isdecimal(): Return True if th
        otherwise.
    isdigit = def isdigit(): Return True if the
        otherwise.
    identifier = def identifier(): Return True if
        identifier, False otherwise.
    islower = def islower(): Return True if the
        otherwise.
    isnumeric = def isnumeric(): Return True if th
        otherwise.
    isprintable = def isprintable(): Return True if
        otherwise.
    isspace = def isspace(): Return True if the
        otherwise.
    istitle = def istitle(): Return True if the
        otherwise.
    isupper = def isupper(): Return True if the
        otherwise.
    join = def join(iterable, /): Concatenate
    ljust = def ljust(width, fillchar=' ', /)
        length width.
    lower = def lower(): Return a copy of the
    lstrip = def lstrip(chars=None, /): Return
        whitespace removed.
    maketrans = def maketrans(...) Return a trans
    partition = def partition(sep, /): Partition
        given separator.

```

```

replace = def replace(old, new, count=-1, /)
           substring old replaced by new.
rfind = def rfind(...) S.rfind(sub[, start[, end]])
           Return the highest index in sub where a substring is found.
rindex = def rindex(...) S.rindex(sub[, start[, end]])
           Return the highest index in sub where a substring is found.
rjust = def rjust(width, fillchar=' ', /)
           Return a string of length width.
rpartition = def rpartition(sep, /): Partition
              given separator.
rsplit = def rsplit(sep=None, maxsplit=-1)
           string, using sep as the delimiter.
rstrip = def rstrip(chars=None, /): Return
           whitespace removed.
split = def split(sep=None, maxsplit=-1)
          string, using sep as the delimiter.

splitlines = def splitlines(keepends=False): Return
              breaking at line boundaries.
startswith = def startswith(...) S.startswith(prefix[, start[, end]])
              Return True if the string starts with the given prefix.
strip = def strip(chars=None, /): Return
           trailing whitespace removed.
swapcase = def swapcase()
           Convert uppercase characters to lowercase and vice versa.
title = def title()
           Return a version of the string where each word is titlecased.
translate = def translate(table, /)
           Replace each character in the string with the character it maps to in the given translation table.
upper = def upper()
           Return a copy of the string with all characters converted to uppercase.
zfill = def zfill(width, /)
           Pad a numeric string with zeros at the left to fill a field of the given width.

```

# *Rich's Console: Debug your Python Function in One Line of Code*

```
$ pip install rich
```

Sometimes, you might want to know which elements in the function created a certain output. Instead of printing every variable in the function, you can simply use Rich's Console object to print both the output and all the variables in the function.

```
from rich import console
from rich.console import Console
import pandas as pd

console = Console()
data = pd.DataFrame({'a': [1, 2, 3], 'b': [4, 5, 6]})

def edit_data(data):
    var_1 = 45
    var_2 = 30
    var_3 = var_1 + var_2
    data['a'] = [var_1, var_2, var_3]
    console.log(data, log_locals=True)
edit_data(data)
```

[08:12:24]

	a	b
0	45	4
1	30	5
2	75	6

*locals*

<i>data</i> =	a	b
	0	45 4
	1	30 5
	2	75 6
<i>var_1</i> =	45	
<i>var_2</i> =	30	
<i>var_3</i> =	75	

[Link to my article about rich.](#)

[Link to rich.](#)

# *loguru: Print Readable Traceback in Python*

```
$ pip install loguru
```

Sometimes, it is difficult to understand the traceback and to know which inputs cause the error. Is there a way that you can print a more readable traceback?

That is when loguru comes in handy. By adding decorator `logger.catch` to a function, loguru logger will print a more readable trackback and save the traceback to a separate file like below

```
from sklearn.metrics import mean_squared_error
import numpy as np
from loguru import logger

logger.add("file_{time}.log", format="{time}
{level} {message}")

@logger.catch
def evaluate_result(y_true: np.array, y_pred:
np.array):
    mean_square_err =
mean_squared_error(y_true, y_pred)
    root_mean_square_err = mean_square_err **
0.5
    y_true = np.array([1, 2, 3])

y_pred = np.array([1.5, 2.2])
evaluate_result(y_true, y_pred)
```



```
> File "/tmp/ipykernel_174022/1865479429.py",
line 14, in <module>
    evaluate_result(y_true, y_pred)
    |               |               L array([1.5,
2.2])
    |               L array([1, 2, 3])
    L <function evaluate_result at
0x7f279588f430>
```

```
File "/tmp/ipykernel_174022/1865479429.py",
line 9, in evaluate_result
    mean_square_err =
mean_squared_error(y_true, y_pred)
                        |               |
    L array([1.5, 2.2])
                        |               L
array([1, 2, 3])
                        L <function
mean_squared_error at 0x7f27958bfca0>
```

File

`"/home/khuyen/book/venv/lib/python3.8/site-packages/sklearn/utils/validation.py", line`

`63, in inner_f`

`return f(*args, **kwargs)`

`| | L {}`

`| L (array([1, 2, 3]), array([1.5,`

`2.2]))`

`L <function mean_squared_error at`

`0x7f27958bfb80>`

File

`"/home/khuyen/book/venv/lib/python3.8/site-packages/sklearn/metrics/_regression.py", line`

`335, in mean_squared_error`

`y_type, y_true, y_pred, multioutput =`

`_check_reg_targets(`

`| | L`

`<function _check_reg_targets at`

`0x7f27958b7af0>`

`| L array([1.5, 2.2])`

`L array([1, 2, 3])`

```
File
"/home/khuyen/book/venv/lib/python3.8/site-
packages/sklearn/metrics/_regression.py", line
88, in _check_reg_targets
    check_consistent_length(y_true, y_pred)
    |                        |           L
array([1.5, 2.2])
    |                        L array([1, 2, 3])
    L <function check_consistent_length at
0x7f279676e040>
```

```
File
"/home/khuyen/book/venv/lib/python3.8/site-
packages/sklearn/utils/validation.py", line
319, in check_consistent_length
    raise ValueError("Found input variables
with inconsistent numbers of"
```

```
ValueError: Found input variables with
inconsistent numbers of samples: [3, 2]
```

[Link to loguru.](#)

## *Icrecream: Never use print() to debug again*

```
$ pip install iccream
```

If you use print or log to debug your code, you might be confused about which line of code creates the output, especially when there are many outputs.

You might insert text to make it less confusing, but it is time-consuming.

```
from iccream import ic

def plus_one(num):
    return num + 1

print('output of plus_on with num = 1:',
      plus_one(1))
print('output of plus_on with num = 2:',
      plus_one(2))
```

```
output of plus_on with num = 1: 2
output of plus_on with num = 2: 3
```

Try icecream instead. Icecream inspects itself and prints both its own arguments and the values of those arguments like below.

```
ic(plus_one(1))  
ic(plus_one(2))
```

```
ic| plus_one(1): 2  
ic| plus_one(2): 3  
  
3
```

Output:

```
ic| plus_one(1): 2  
ic| plus_one(2): 3
```

[Link to icecream](#)

[Link to my article about icecream](#)

# *heartrate — Visualize the Execution of a Python Program in Real-Time*

```
$ pip install heartrate
```

If you want to visualize which lines are executed and how many times they are executed, try heartrate.

You only need to add two lines of code to use heartrate.

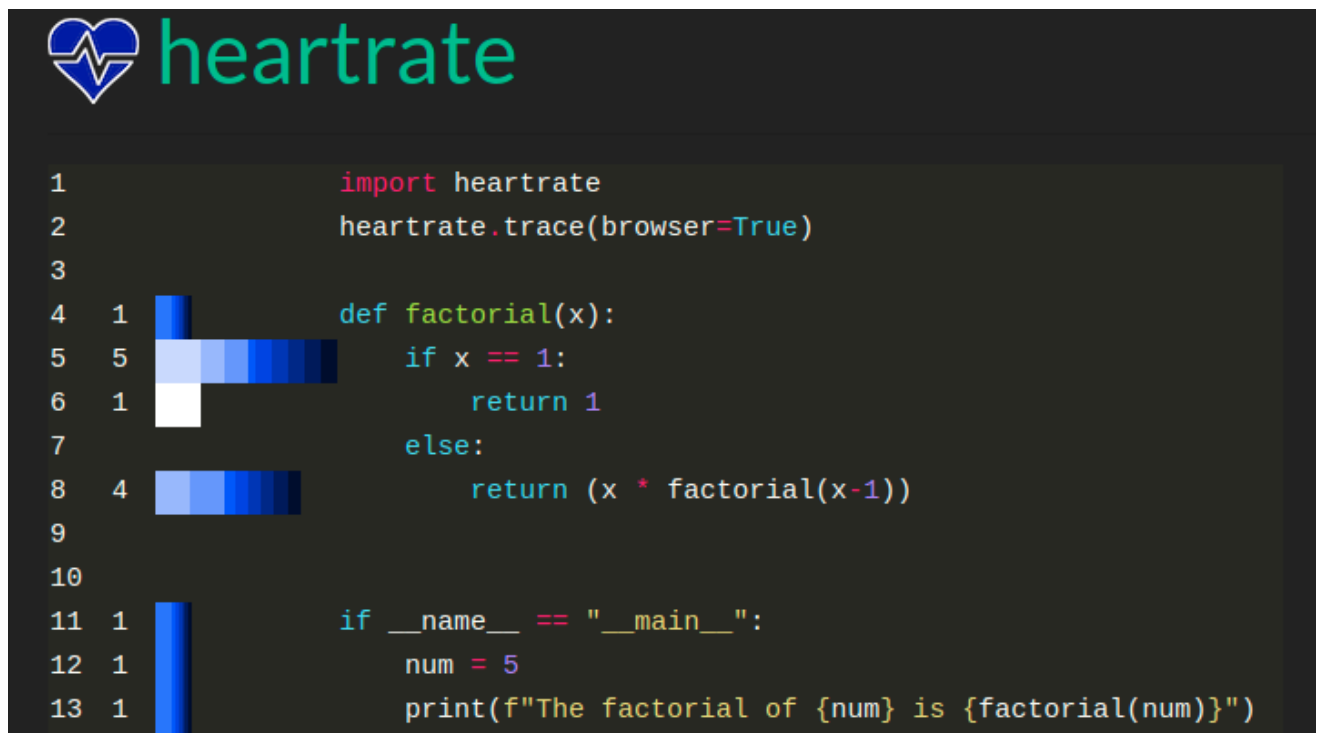
```
import heartrate
heartrate.trace(browser=True)

def factorial(x):
    if x == 1:
        return 1
    else:
        return (x * factorial(x-1))

if __name__ == "__main__":
    num = 5
    print(f"The factorial of {num} is {factorial(num)}")
```

```
* Serving Flask app 'heartrate.core' (lazy
loading)
* Environment: production
The factorial of 5 is 120
Opening in existing browser session.
```

You should see something similar to the below when opening the browser:



The screenshot shows the 'heartrate' application interface. At the top left is a logo consisting of a blue heart with a white ECG line. To its right is the word 'heartrate' in a green, sans-serif font. Below the logo is a dark-themed code editor. On the left side of the editor is a call stack with line numbers 1 through 13. The code in the editor is as follows:

```
1      import heartrate
2      heartrate.trace(browser=True)
3
4  1  def factorial(x):
5  5      if x == 1:
6  1          return 1
7          else:
8  4              return (x * factorial(x-1))
9
10
11 1  if __name__ == "__main__":
12 1      num = 5
13 1      print(f"The factorial of {num} is {factorial(num)}")
```

[Link to heartrate.](#)

# *snoop : Smart Print to Debug your Python Function*

```
$ pip install snoop
```

If you want to figure out what is happening in your code without adding many print statements, try snoop.

To use snoop, simply add the @snoop decorator to a function you want to understand.

```
import snoop

@snoop
def factorial(x):
    if x == 1:
        return 1
    else:
        return (x * factorial(x-1))

if __name__ == "__main__":
    num = 5
    print(f"The factorial of {num} is {factorial(num)}")
```



```
10:19:00.73 >>> Call to factorial in File "<ipython-input-2-57aff36d5f6d>", line 4
```

```
10:19:00.73 ..... x = 5
```

```
10:19:00.73      4 | def factorial(x):
```

```
10:19:00.73      5 |         if x == 1:
```

```
10:19:00.73      8 |             return (x *  
factorial(x-1))
```

```
10:19:00.74 >>> Call to factorial in File  
"<ipython-input-2-57aff36d5f6d>", line 4
```

```
10:19:00.74 ..... x = 4
```

```
10:19:00.74      4 | def factorial(x):
```

```
10:19:00.74      5 |         if x == 1:
```

```
10:19:00.74      8 |             return (x *  
factorial(x-1))
```

```
10:19:00.74 >>> Call to factorial in  
File "<ipython-input-2-57aff36d5f6d>", line 4
```

```
10:19:00.74 ..... x = 3
```

```
10:19:00.74      4 | def factorial(x):
```

```
10:19:00.74      5 |         if x == 1:
```

```
10:19:00.75      8 |             return (x *  
factorial(x-1))
```

```
10:19:00.75 >>> Call to factorial  
in File "<ipython-input-2-57aff36d5f6d>", line  
4
```

```
10:19:00.75 ..... x = 2
```

```
10:19:00.75      4 | def  
factorial(x):
```

```
10:19:00.75      5 |         if x == 1:
```

```
10:19:00.75      8 |             return  
(x * factorial(x-1))
```

```

10:19:00.75 >>> Call to
factorial in File "<ipython-input-2-
57aff36d5f6d>", line 4
10:19:00.75 ..... x = 1
10:19:00.75      4 | def
factorial(x):
10:19:00.76      5 |      if x ==
1:
10:19:00.76      6 |
return 1
10:19:00.76 <<< Return value
from factorial: 1
10:19:00.76      8 |      return
(x * factorial(x-1))
10:19:00.77 <<< Return value from
factorial: 2
10:19:00.77      8 |      return (x *
factorial(x-1))
10:19:00.77 <<< Return value from
factorial: 6
10:19:00.77      8 |      return (x *
factorial(x-1))
10:19:00.77 <<< Return value from
factorial: 24
10:19:00.78      8 |      return (x *
factorial(x-1))
10:19:00.78 <<< Return value from factorial:
120

```

The factorial of 5 is 120

# *Logging in Pandas Pipelines*

```
$ pip install scikit-lego
```

When using pandas pipe, you might want to check whether each pipeline transforms your pandas DataFrame correctly. To automatically log the information of a pandas DataFrame after each pipeline, use the decorator `sklego.pandas_utils.log_step`.

```
import pandas as pd
from sklego.pandas_utils import log_step
import logging
```

```
df = pd.DataFrame({"col1": [1, 2, 3], "col2":
["a", "b", "c"]})
```

To use `log_step`, simply use it as a decorator for functions being applied to your DataFrame.

```
@log_step(print_fn=logging.info)
def make_copy(df: pd.DataFrame):
    return df.copy()
```

```
@log_step(print_fn=logging.info)
def drop_column(df: pd.DataFrame):
    return df[["col2"]]

@log_step(print_fn=logging.info)
def encode_cat_variables(df: pd.DataFrame):
    df["col2"] = df["col2"].map({"a": 1, "b":
2, "c": 3})
    return df
```

```
df =
df.pipe(make_copy).pipe(drop_column).pipe(encode_cat_variables)
```

```
INFO:root:[make_copy(df)] time=0:00:00.000239
n_obs=3, n_col=2
INFO:root:[drop_column(df)]
time=0:00:00.002117 n_obs=3, n_col=1
INFO:root:[encode_cat_variables(df)]
time=0:00:00.003217 n_obs=3, n_col=1
```

Find more ways to customize your logging [here](#).

# *Add Progress Bar to Your List Comprehension*

```
$ pip install tqdm
```

If your for loop or list comprehension takes a long time to run, you might want to know which element is being processed. You can add clarity to your for-loop by using tqdm. Using tqdm with an iterable will show a progress bar.

```
from tqdm.notebook import tqdm
from time import sleep

def lower(word):
    sleep(1)
    print(f"Processing {word}")
    return word.lower()

words = tqdm(["Duck", "dog", "Flower", "fan"])

[lower(word) for word in words]
```

```
0%|          | 0/4 [00:00<?, ?it/s]
```

```
Processing Duck  
Processing dog  
Processing Flower  
Processing fan
```

```
['duck', 'dog', 'flower', 'fan']
```

[Link to tqdm.](#)