


# Jupyter Data Science Workflow, Remastered

Michał Wojczulis

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# Jupyter Workflow

In this session we will revisit the classic workflow by Jake Vanderplas **Reproducible Data Analysis in Jupyter**.



**Jake Vanderplas**  
jakevdp

[Overview](#) [Repositories 220](#) [Projects](#) [Packages](#) [Stars 48](#)

**Pinned**

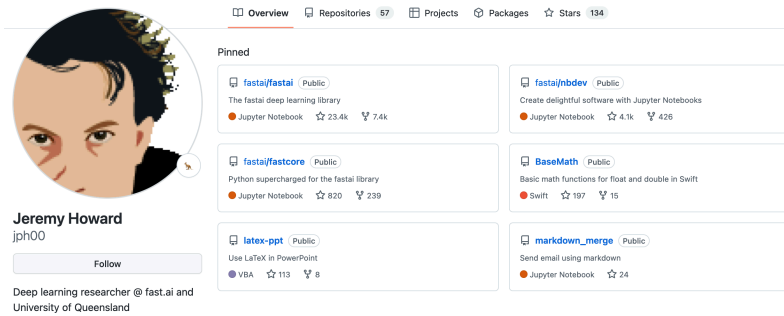
[PythonDataScienceHandbook](#) Public  
Python Data Science Handbook; full text in Jupyter Notebooks  
● Jupyter Notebook ☆ 37.5k 🗨 16.5k

[altair-viz/altair](#) Public  
Declarative statistical visualization library for Python  
● Python ☆ 8.1k 🗨 715

[WhirlwindTourOfPython](#) Public  
The Jupyter Notebooks behind my O'Reilly report, "A Whirlwind Tour of Python"  
● Jupyter Notebook ☆ 3.3k 🗨 1.5k

[sklearn\\_tutorial](#) Public  
Materials for my scikit-learn tutorial  
● Jupyter Notebook ☆ 1.7k 🗨 924

**Nbdev** is a notebook-driven development platform. With nbdev, you get documentation, tests, continuous integration, and packaging.



The screenshot shows the GitHub profile of Jeremy Howard (jph00). The profile includes a circular avatar with a crown of repository icons, the name "Jeremy Howard", the username "jph00", a "Follow" button, and a bio: "Deep learning researcher @ fast.ai and University of Queensland". The repository tabs show "Overview" selected, with "Repositories" at 57, "Projects", "Packages", and "Stars" at 134. The "Pinned" section displays six repositories:

Repository	Language	Stars	Forks
<a href="#">fastai/fastai</a> (Public)	Jupyter Notebook	23.4k	7.4k
<a href="#">fastai/nbdev</a> (Public)	Jupyter Notebook	4.1k	426
<a href="#">fastai/fastcore</a> (Public)	Jupyter Notebook	820	239
<a href="#">BaseMath</a> (Public)	Swift	197	15
<a href="#">latex-ppt</a> (Public)	VBA	113	8
<a href="#">markdown_merge</a> (Public)	Jupyter Notebook	24	-

# Agenda

- ▶ Hands-on Walkthrough

## Extras

- ▶ Notebook Best Practices
- ▶ Qmd Documents
- ▶ RenderScripts
- ▶ Git-Friendly Jupyter
- ▶ Blogging
- ▶ Pre-Commit Hooks
- ▶ Documentation Only Sites
- ▶ Modular nbdev
- ▶ Nbdev plugins

# Hands-on Walkthrough

Live coding.

What could possibly go wrong? :)

Code repo

# Notebook Best Practices

## Document parameters with docments

With **documents**, this function:

```
def draw_n(n:int, # Number of cards to draw
           replace:bool=True # Draw with replacement?
           )->list: # List of cards
    "Draw `n` cards."
```

...would include the following table as part of its documentation:

	Type	Default	Details
n	int		Number of cards to draw
replace	bool	True	Draw with replacement?
<b>Returns</b>	<b>list</b>		<b>List of cards</b>

# Notebook Best Practices

## Code examples as tests by adding assertions

`fastcore.test` provides a set of light wrappers around `assert` for better notebook tests (for example, they print both objects on error if they differ).

Here's an example using `fastcore.test.test_eq`:

```
def inc(x): return x + 1
test_eq(inc(3), 4)
```



# Notebook Best Practices

## Document error-cases as tests

Nbdev recommends documenting errors with actual failing code using `fastcore.test.test_fail`. For example:

```
def divide(x, y): return x / y
test_fail(lambda: divide(1, 0), contains="division by zero")
```

## Qmd documents

Qmd documents are Markdown documents, but with extra functionality provided by **Quarto** and **Pandoc**.

For example images arranged into layouts.

```
::: {layout-ncol=3}
! [Jupyter] (jupyter.jpg) {width=50px fig-align="left"}

! [Vscode] (vscode.jpg) {width=50px fig-align="left"}

! [Git] (git.jpg) {width=50px fig-align="left"}
:::
```



Figure 1: Jupyter



Figure 2: Vscode



Figure 3: Git

# RenderScripts

RenderScripts are just like regular Python scripts. These scripts are run when your site is rendered.

For example to produce below table from a python list, the following script is used:

Name	Position
 Chris Lattner	Inventor of Swift and LLVM
 Fernando Pérez	Creator of Jupyter

```
testimonials = [  
    ('chris-lattner.png', 'Chris Lattner', 'Inventor of Swift and LLVM'),  
    ('fernando-pérez.jpeg', 'Fernando Pérez', 'Creator of Jupyter')  
]  
  
print(qmd.tbl_row(['', 'Name', 'Position']))  
print(qmd.tbl_sep([1, 3, 4]))  
for fname, name, position in testimonials:  
    print(qmd.tbl_row([im(fname, 60), name, position]))
```

# Git-Friendly Jupyter

Jupyter notebooks don't work with version control by default. Nbdev provides a set of hooks which enable git-friendly Jupyter notebooks in any git repo.

nbdev provides three hooks to ease Jupyter-git integration.

- ▶ `nbdev_merge` on merging notebooks with git, that automatically fixes conflicting outputs and metadata
- ▶ `nbdev_clean` on saving notebooks in Jupyter, to automatically clean unwanted metadata and outputs from your notebooks
- ▶ `nbdev_trust` after merging notebooks with git, to trust a repo once-off, and all notebooks and changes thereafter

# Bloggng

Nbdev uses Quarto for blogging via Jupyter Notebooks. Although nbdev is not required to blog with notebooks, it will add some functionality (testing, exporting, adding blog to nbdev project website)

# Pre-Commit Hooks

Nbdev provides hooks for the pre-commit framework to catch and fix uncleaned and unexported notebooks, locally, without having to wait for continuous integration pipelines to run:

1. pre-commit runs each hook on your staged changes
2. If a hook changes files pre-commit stops the commit, leaving those changes as unstaged
3. You can now stage those changes and make any edits required to get pre-commit to pass
4. Redo the git commit, and if it succeeds, your commit will be created.

# Documentation Only Sites

Nbdev can be used for the purposes of documenting existing code. For example, you can use the following features of nbdev without creating a python package:

- ▶ Custom nbdev directives such as `#|hide_line`.
- ▶ Testing with `nbdev_test`.
- ▶ Automated entity linking with `doclinks`.
- ▶ Rendering API documentation with `documents` and `show_doc`.

# Modular nbdev

You can use various nbdev tools separately:

- ▶ Document existing code with `show_doc`
- ▶ Testing notebooks with `nbdev_test`
- ▶ Export code to modules with `nb_export`
- ▶ Jupyter-git integration
- ▶ Python packaging, utilities for easy packaging on PyPI, conda, and GitHub



## Nbdev plugins

With nbdev, it's possible to customize and extend it further beyond the standard capabilities.