



Moving from notebooks to py files for ML projects

Structuring Machine Learning Projects

ACM Student Chapter, Indian Institute of Technology Hyderabad (IITH)

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DON'T EVER LET SOMEBODY TELL YOU,
YOU CAN'T DO SOMETHING
NOT EVEN ME, ALRIGHT?
YOU GOT A DREAM, YOU GOTTA PROTECT IT
PEOPLE CAN'T DO SOMETHING THEMSELVES
THEY WANNA TELL YOU THAT YOU CAN'T DO IT
YOU WANT SOMETHING, GO GET IT. PERIOD.





Find the slides, here

Getting to know my audience better







Feel free to **stop/correct** me at any point during the session,

I am also still learning and would love feedbacks to improve.

Target Audience





Structuring Machine Learning Project

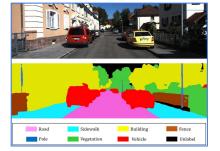
1. Pre-requisites:

- 1.1. Good Knowledge on Python Programming (as it is a dominant programming language for ML)
- **1.2.** Laptop [Python, cuda installed]
- 2. Beginners to Machine Learning Research/Deployment
- 3. Students with decent general idea of ML Lifecycle, starting with code
- 4. Ones thinking to pursue a career in ML/AI (industry standard ML Project setup)

Session Expectations



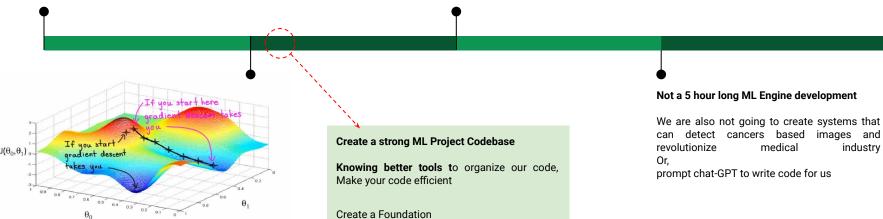






Not a theoretical class

We are not going to discuss concepts here





Pace might be a little fast, too much to cover

Learning Objectives





By the end of this session each student will be able to

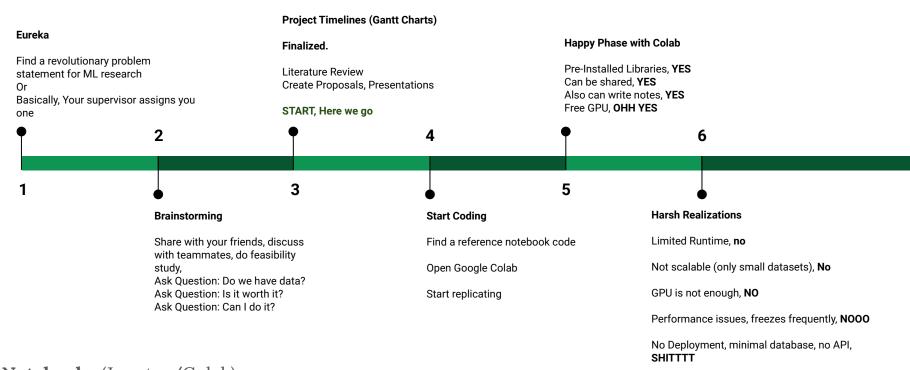
- 1. Know about the requirements, use cases and applications of some of the **industry's standard project**development

 tools
- 2. Properly structure their machine learning projects for:
 - 2.1. Structured and Modular Code
 - 2.2. **Reproducibility** (Replicate Results / Run Multiple Experiments at once)
 - 2.3. **Collaboration** (Get to know multiple peoples in a team collaborate on a project)
 - 2.4. **Incremental Updates** (Agile Methodology)
 - 2.5. **Maintenance** (Code Refactoring / Documentations)
 - 2.6. **Efficiency** (Code Organizations)
 - 2.7. **Shareability** (with proper logs and event files)
 - 2.8. Better Testing and Debugging
- 3. Puts you on a very good place with better coding habits/tools/styles/organization

What we generally do?







Notebooks (Jupyter/Colab)

What happens in real world application?





1. Large Scale Production Projects

[Real world problems, production envs, software components like database, data source, backend APIs, debuggers]

2. Version Controls (github/gitlab/bitbucket)

[JSON file-format, merge conflicts (git diff), dynamic outputs]

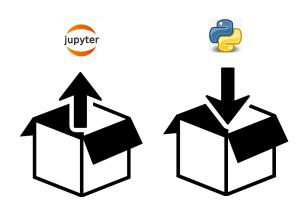
3. Automated Deployment Pipelines (Reproduce/Deploy/Monitor)

[not built for it, interactive elements, widgets, input cells, user inputs, no workflows, docker integration]

[Hidden state: Arbitrary code order execution - varied output]

4. Testing (Unit/Integrity)

[no test concepts]



Notebooks Vs Python Files

Examples



Mask R-CNN for Object Detection and Image Segmentation (IEEE, 2018)[URL]

Federated Semi-Supervised Medical image Classification with Interclient Relation Matching (MICCAI, 2021) [URL]

Transformers Library (**Hugging Face**) [<u>URL</u>]

TensorFlowGAN (TF-GAN), Generative Adversarial Networks (NIPS, 2014) [URL]

We will explore ..



























COOKIECUTTER https://github.com/cookiecutter/cookiecutter







has a

Structure

Don't know the structure

Not always defined

Not always consistent

Don't know the technical terms

Project structuring with cookiecutter A command-line utility that creates projects from boilerplate project templates

Cookiecutter Official Documentation

Cookiecutter Data Science, by drivendata

<u>Data Science Cookiecutter Template</u> by me

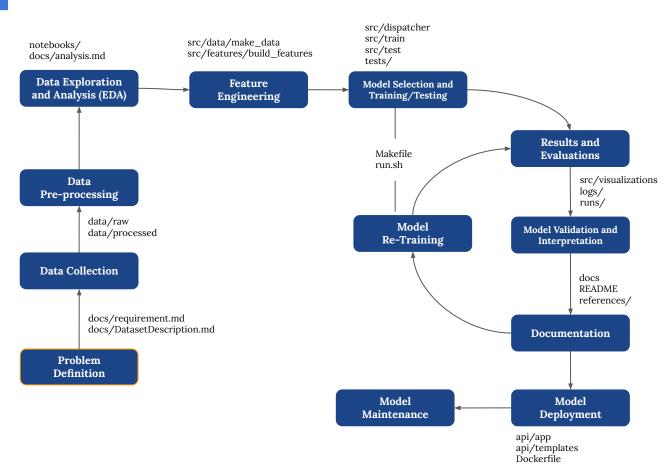
Installation

python3 -m pip install --user cookiecutter

Run

cookiecutter <github-link-to-boilerplate -template>

Life Cycle of a ML Project



```
api
    — app.py
    - config
    - resources
   L- templates
   data
   - processed
   L- raw
   {{cookiecutter.project_name}}
    — architectures
     config.py
      data
       - make_data.py
    - features
       - build features.py
    - logs
    - runs
    — test.py
   - train.py
   └─ utils
   docs
    - Analysis.md

    DatasetDescription.md

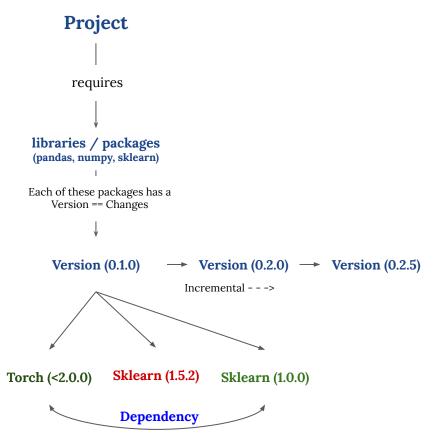
   L- Requirements.md
   notebooks
  - Dockerfile
   Makefile
 - run.sh
 - README.md

    references

LICENSE
└─ tests
    __init_.py
   L— test environment.py
```









What happens if you don't manage dependency?





1. Reproducibility Issues

[shared the same project with a friend but he is getting different results?]

2. Version Conflicts

[Have you ever tried running a famous old projects (like Mask R-CNN) from github and faced an error "version conflict error"]

3. Security Vulnerabilities

[unexpected errors and behaviours]

4. Reduced Productivity

[errors can be a time-consuming and frustrating process]

5. Deployment/Scalability Issues

[larger project,more packages, more dependencies to manage]



Dependency Management with Poetry [URL]



```
[tool.poetry.dependencies]
python = "^3.8"
notebook = "^6.5.3"
torch = "^1.13.1"
torchvision = "^0.14.1"
pandas = "^1.5.3"
pre-commit = "^3.1.1"
qdown = "^4.6.4"
tensorboard = "^2.12.0"
scikit-learn = "^1.2.2"
ipykernel = "^6.21.3"
Flask = "^2.2.3"
Flask-Cors = "^3.0.10"
opency-python = "^4.7.0"
watermark = "^2.3.1"
python-dotenv = "^1.0.0"
loguru = "^0.6.0"
[tool.poetry.dev-dependencies]
pytest = "^5.2"
```

Installation

python3 pip install poetry

Create a local virtual environment

poetry config virtualenvs.in-project true

poetry config -list

Initialization

poetry init

Install Dependencies

poetry install

Activate the virtual environment

poetry shell .venv

source .venv/bin/activate

which python >> "/home/kamal/Downloads/acm-session/.venv/bin/python"



Installing third-party packages/libraries



```
[tool.poetry.dependencies]
python = "^3.8"
notebook = "^6.5.3"
torch = "^1.13.1"
torchvision = "^0.14.1"
pandas = "^1.5.3"
pre-commit = "^3.1.1"
gdown = "^4.6.4"
tensorboard = "^2.12.0"
scikit-learn = "^1.2.2"
ipykernel = "^6.21.3"
Flask = "^2.2.3"
Flask-Cors = "^3.0.10"
opency-python = "^4.7.0"
watermark = "^2.3.1"
python-doteny = "^1.0.0"
loguru = "^0.6.0"
[tool.poetry.dev-dependencies]
pytest = "^5.2"
```

Installation with pip pip3 install numpy poetry -version Installation with poetry poetry add numpy cat pyproject.toml base: system Virtual Environment (venv/conda) <--> gans **Base Environment Project Environment** acm-session cnn



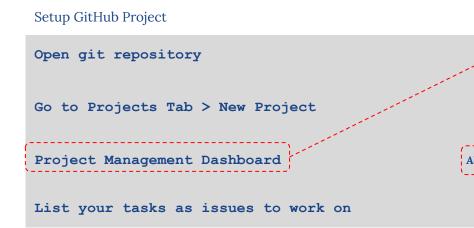




Setup Git







Agile Methodology of Project Development

Have you seen the Silicon Valley Scrum Board Scene?

Iterative, Incremental Approach to project development that emphasizes flexibility, collaboration and rapid output

Trello

Jira Software



Alternatives: JIRA, Trello







Do you use tabs or spaces for indentation?

Do you do 4 space indentation or 2 space indentation?

Your Choice = Your Style

Food for thoughts:

- 1. Each organization defines their own style [style of coding, commit messages, formatters, linters]
- 2. You are working on a team, remember you code are/should be read by a lot of people
- 3. Imagine coming to the same code after one years, would you be able to understand your code then?

PEP8 = Python Style Guide

Google Style Guide

Airbnb Style Guide (javascript)





```
from typing import List, Tuple
def find_duplicates(l):
    a = set()
    b = set()
    for i in l:
        if i in seen:
            b.add(i)
        else:
            a.add(i)
    return [(i, i) for i in b]
```

Unformatted

```
from typing import List, Tuple
def find_duplidates(lst: List[int]) -> List[Tuple[int, int]]:
   Given a list of integers, returns a list of tuples representing pairs of integers that are duplicates.
    Args:
       lst (List[int]): The list of integers.
    Returns:
       List[Tuple[int, int]]: A list of tuples representing pairs of integers that are duplicates.
    seen = set()
    duplicates = set()
    for num in 1st:
        if num in seen:
           duplicates.add(num)
            seen.add(num)
   return [(num, num) for num in duplicates]/
```

Well Formatted

(naming conventions, docstrings, indentations, line lengths, type hints)





```
# See https://pre-commit.com for more information
# See https://pre-commit.com/hooks.html for more hooks
repos:

- repo: https://github.com/pre-commit/pre-commit-hooks
rev: v3.2.0
hooks:

- id: trailing-whitespace
- id: end-of-file-fixer
- id: check-yaml
- id: check-yaml
- id: check-added-large-files
args: ["--maxkb=10000"]
- id: check-json

- repo: https://github.com/psf/black
rev: d9b8a6407e2f46304a8d36b18e4a73d8e0613519
hooks:
- id: black

- repo: https://github.com/PyCQA/isort
rev: 3a72e069635a865a92b8a0273aa829f630cbcd6f
hooks:
- id: isort
```

Pre-commit are some checks (format, filesize, imports ...) that you run before pushing your code into Github

https://pre-commit.com/hooks.html

Sample:

https://gist.github.com/shresthakamal/34ff6 1afaf742828d83f58485f0cf76d

Installation

```
poetry add pre-commit --version
```

Install Pre-commit Hooks

```
pre-commit install
```

Create pre-commit-config file

```
gedit .pre-commit-config.yaml >> Paste sample hooks
```

Gets activated when committing code

```
git add .
git commit -m "modify readme"
<---pre-commit gets activated now--->
git push origin master
```







~/Downloads/acm-session master +2 !2) git add <u>.</u>	acm-session 12:21:36
~/Downloads/acm-session master +2 > git commit -m "function change" Trim Trailing Whitespace	◆ acm-session 12:21:37
~/Downloads/acm-session master >	• acm-session 12:21:40



Jupyter Notebooks (SURPRISE, SURPRISE, The King is Back) https://jupyter.org/





Exploratory Data Analysis (EDA) flourishes with jupyter notebook

- Cleaning Data
- 2. Visualizing Data
- 3. Extracting meaningful insights

Interactivity (widgets, user inputs, grades)

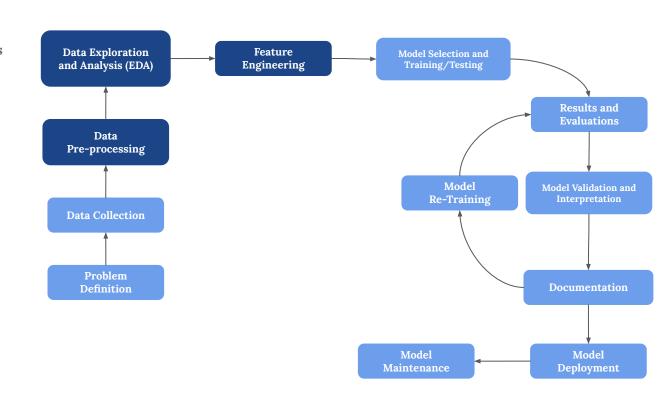
Documentation (markdown with code)

Easy Data Manipulation

Quick Prototyping

Online Courses (Automatic Code graders)

[nbgrader]





Jupyter Notebooks (SURPRISE, SURPRISE, The King is Back) https://jupyter.org/





Installation

poetry add notebook

notebook --version

Activate Jupyter Notebook

jupyter notebook

localhost:8888/tree







Pandas

NumPy

matplotlib



seaborn



nbgrader

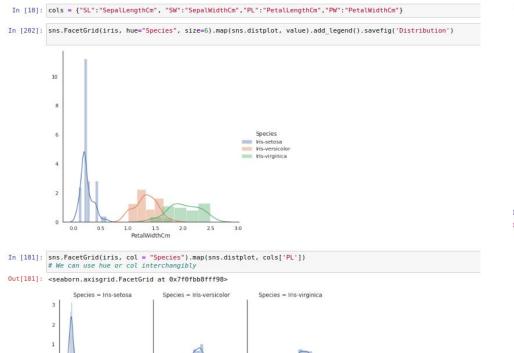


PetalLengthCm

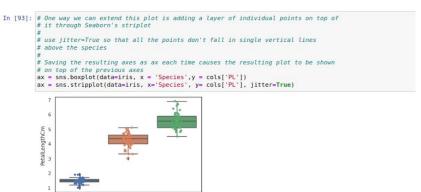
Jupyter Notebooks https://jupyter.org/

PetalLengthCm



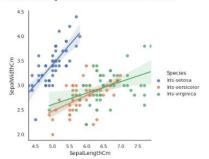


PetalLengthCm



In [100]: sns.FacetGrid(iris, hue= "Species", size =5).map(sns.regplot, cols['SL'], cols["SW"]).add_legend()
Out[100]: <seaborn.axisgrid.FacetGrid at 0x7f0fd2b905f8>

Iris-virginica



Iris-versicolor

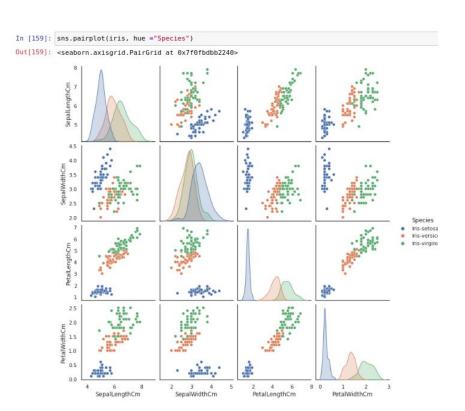
Species

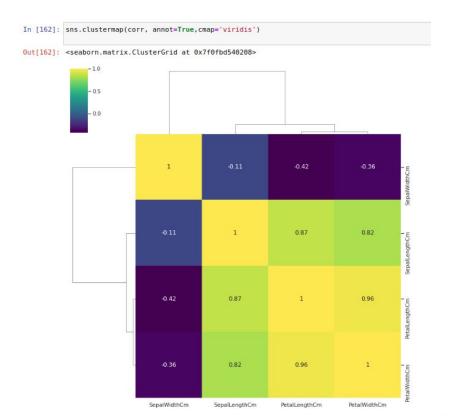
Iris-setosa



Jupyter Notebooks https://jupyter.org/









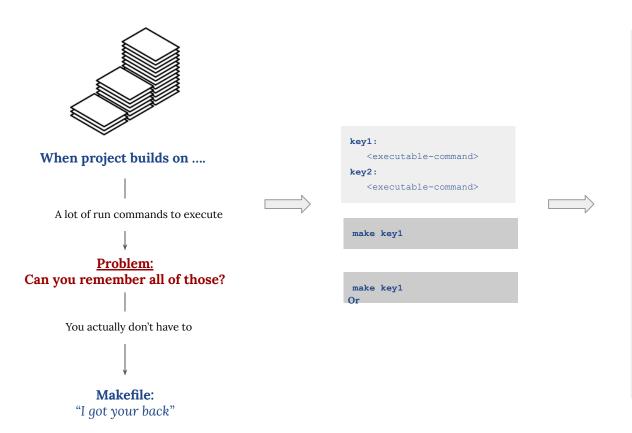


Any questions?









```
requirements:
  poetry export -f requirements.txt
install:
   pip3 install -r requirements.txt
tensorboard:
   tensorboard --logdir=lglutide/runs
app:
   python3 -m api.app
ngrok:
  ngrok http 5000
train:
  python3 -m acm_session.train --experiment 8
test:
  python3 -m acm session.test --gpu 7
clean:
   rm -rf __pycache__ .pytest_cache
```







Initialization

- Create a filename called "Makefile"
- 2. Add keywords:commands pair







WHY LOGGING?

- Logging multiple experiment Hyperparameters Did you ever run multiple experiments for an hour but forgot what parameters are used and had to re-run all the experiment?
- Unexpected Stoppage [What happens while you are training your code, but suddenly power cuts off or the server gets disconnected?, What

vou

currently

doing

now?]

- 3. Debugging and troubleshooting [Helps you track down errors, from files, line numbers, on each steps
- Compliance

are

[Logging can also be required for compliance reasons, such as to meet regulatory or legal requirements]

```
logs > 

≡ 2023-03-29_16-12-45_628472.log
     2023-03-29 16:12:45 | INFO | main :train:28) - Using: cuda
     2023-03-29 16:12:46 | INFO | main :train:52) - Model:
      nnGAN (
       (generator): Sequential(
         (0): Linear(in features=75, out features=128, bias=True)
         (1): LeakyReLU(negative slope=0.01, inplace=True)
         (2): Dropout(p=0.5, inplace=False)
         (3): Linear(in features=128, out features=784, bias=True)
         (4): Tanh()
        (discriminator): Sequential(
         (0): Linear(in features=784, out features=128, bias=True)
         (1): LeakyReLU(negative slope=0.01, inplace=True)
         (2): Dropout(p=0.5, inplace=False)
         (3): Linear(in features=128, out features=1, bias=True)
         (4): Sigmoid()
      2023-03-29 16:12:47 | INFO |
                                    main :train:111) - Epoch: 001/010 | Batch 000/469
      2023-03-29 16:12:48 |
                           INFO
                                     main :train:111) - Epoch: 001/010 |
                                                                         Batch 100/469
      2023-03-29 16:12:50 |
                           INFO
                                    main :train:111) - Epoch: 001/010
                                                                         Batch 200/469
     2023-03-29 16:12:52
                           INFO
                                     main :train:111) - Epoch: 001/010
                                                                         Batch 300/469
     2023-03-29 16:12:53 |
                           INFO
                                    main :train:111) - Epoch: 001/010 |
                                                                         Batch 400/469
     2023-03-29 16:12:55 1
                           INFO
                                    main :train:123) - Time elapsed: 0.16 min
                           INFO
      2023-03-29 16:12:55
                                     main :train:111) - Epoch: 002/010 |
                                                                         Batch 000/469
                           INFO
      2023-03-29 16:12:56
                                    main :train:111) - Epoch: 002/010 |
                                                                         Batch 100/469
      2023-03-29 16:12:58
                           INFO I
                                     main :train:111) - Epoch: 002/010 |
                                                                         Batch 200/469
     2023-03-29 16:13:00 1
                           INFO I
                                     main :train:111) - Epoch: 002/010 |
                                                                         Batch 300/469
      2023-03-29 16:13:01 |
                           INFO
                                     main :train:111) - Epoch: 002/010 | Batch 400/469
                                    main :train:123) - Time elapsed: 0.29 min
      2023-03-29 16:13:03 | INFO
      2023-03-29 16:13:03
                           INFO
                                     main :train:111) - Epoch: 003/010 | Batch 000/469
      2023-03-29 16:13:04 |
                           INFO
                                    main :train:111) - Epoch: 003/010 |
                                                                         Batch 100/469
      2023-03-29 16:13:06
                           INFO
                                    main :train:111) - Epoch: 003/010
                                                                         Batch 200/469
     2023-03-29 16:13:08
                           INFO
                                     main :train:111) - Epoch: 003/010
                                                                         Batch 300/469
                                    main :train:111) - Epoch: 003/010 | Batch 400/469
      2023-03-29 16:13:10
                           INFO
      2023-03-29 16:13:11
                           INFO
                                     main :train:123) - Time elapsed: 0.43 min
     2023-03-29 16:13:11 |
                           INFO
                                     main :train:111) - Epoch: 004/010 | Batch 000/469
     2023-03-29 16:13:13 |
                           INFO
                                     main :train:111) - Epoch: 004/010 | Batch 100/469
     2023-03-29 16:13:15 |
                           INFO
                                    main :train:111) - Epoch: 004/010 | Batch 200/469
     2023-03-29 16:13:17
                                    main :train:111) - Epoch: 004/010 | Batch 300/469
```







Installation

```
poetry add loguru --version
```

Initialization

```
from logger import logger

log_format = <define_your_log_format>

# print logs in terminal logger.add("logs.log", format = log_format)

# print logs in a file logger.add("sys.stderr", format=log_format)
```

Usage: simply remove print with logger.info()

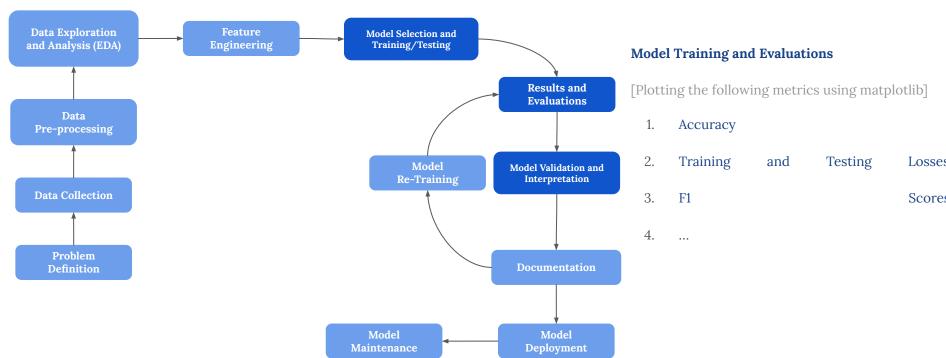
```
# Before
print("Time elapsed: %.2f min" % ((time.time() - start) / 60))
# After
logger.info("Time elapsed: %.2f min" % ((time.time() - start) / 60))
```







Web based real-time visualization tool for tracking, plotting, visualizing scalars, graphs, models and more..

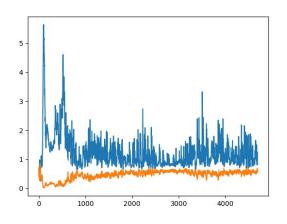


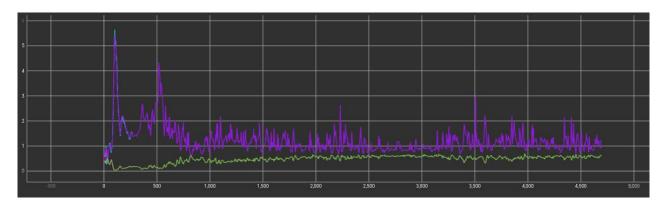






Web based real-time visualization tool for tracking, plotting, visualizing scalars, graphs, models and more..





matplotlib

tensorboard







Installation

```
poetry add tensorboard

Initialization

from torch.utils.tensorboard import SummaryWriter

# Before
losses = []
losses.append(loss)

# After
writer = SummaryWriter("runs/")
writer.add_scalar(y=loss, x=epochs)
```

Launch tensorboard

```
tensorboard -logdir=runs/
```

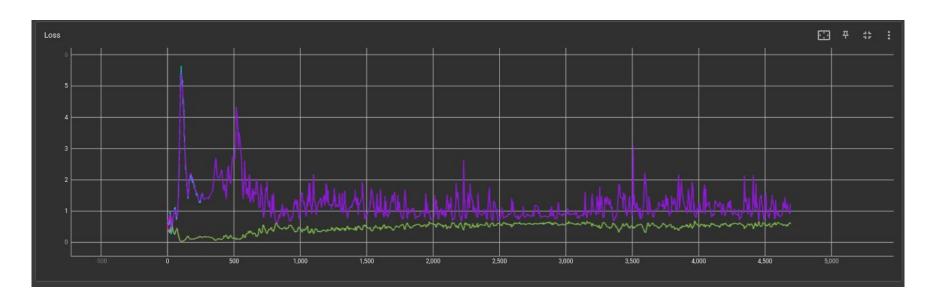






Demo

Plotting GAN MNIST loss curves





https://github.com/tmux/tmux/wiki





tmux is a terminal multiplexer.

It lets you switch easily between several programs in one terminal, detach them (they keep running in the background) and reattach them to a different terminal.

Problem:

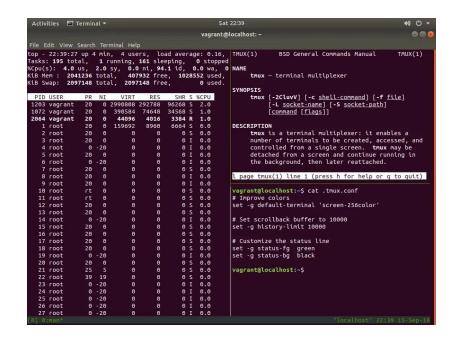
Have you ever waited hours for a model training to complete so that you can get the results?

Have you waited for one experiment to complete so that you can run the next one?

Solution:

What if I say, you can leave training your model on the server, close wards? laptop and back later vour come

tmux with SSH









Installation

sudo apt-get install tmux

Listing all sessions

tmux 1s

Creating a session

tmux new -s <session_name>

Attaching a session

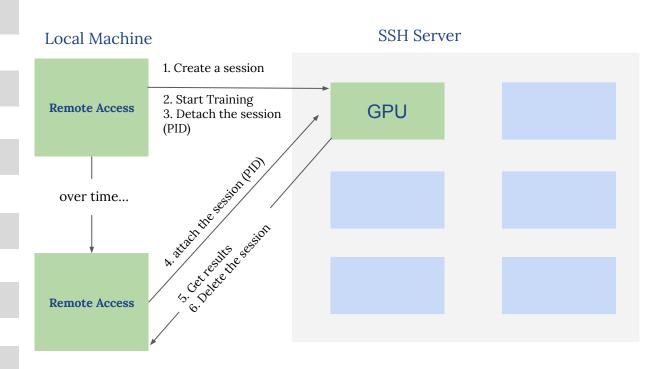
tmux attach -t <session_name>

Detaching a session

Ctrl+b d

Killing a session

Tmux kill-session -t <session_name>



What we explored ...

























What we didn't explore ...































Shoutouts





ACM IITH Student Chapter TEAM

acm.chapter@cse.iith.ac.in







Thanks!

Any questions?

You can find me at:

Kamal Shrestha

cs21mtech16001@iith.ac.in

shresthakamal.com.np/home



Feedbacks