

## How To Make ML-Ops Work For You. Achieve Productive Orchestration AND Provenance For ML

ClearML @ MLLifecycleConf, Jan , 2021

Ariel Biller (@LSTMeow) Evangelist

### Outline

- What does MLOps solve for "routine" R&D
- Getting started with ClearML
- The UI
- Integration
- Remote launching an experiment
  - o a.k.a. "So that is what execution was for"
- Demo Hyperparameter Optimization with two notebooks
- Sharing and Collaboration using clear.ml



# **FEEDBACK PLS**

#### https://twitter.com/LSTMeow

https://www.linkedin.com/in/LSTMeow/

https://www.reddit.com/user/LSTMeow

https://www.facebook.com/ariel.biller.LSTMeow



### Notice:

If you are DevOps - contact me to get an optimized edition of this content ;)

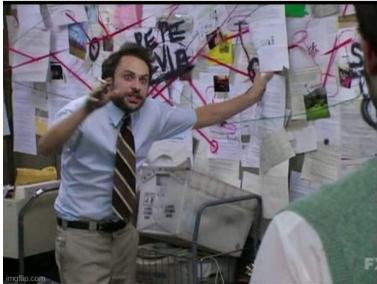


### This is ML/DL R&D

- "80% is data cleaning"
- fast paced, multi env.
- "best model" approach
- beyond traditional CI/CD
- Too Many Experiments
- "someone needs to deploy this"

#### ML/DL Research is inherently messy

boss: so how did you
manage to increase accuracy?
me:



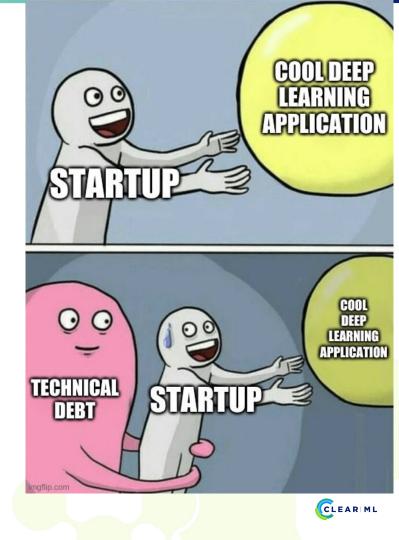


### What is missing? MLOps

- Automation
- Orchestration
- Reproducibility
- Integrates with workflow

#### **Production: "Everything is MLOPs"**

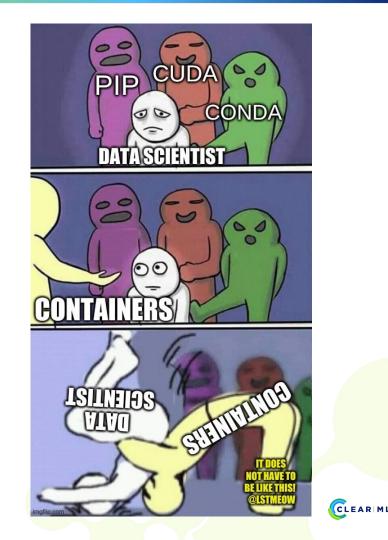
- Model serving
- Data Preprocessing
- Etc... (hardware!?)



### Partial solutions

- "My box" / on-prem / cloud
- Git commit for each experiment
- Shared/managed conda
- Build your own containers
- Central data/model store
- Configuration overload

#### Reproducibility Overhead Means No reproducibility



### **Choose your MLOps story:**

- Build from scratch (x2)
- Use experiment tracking
  - Only part of the story
- Assemble stack from OSS
  - Rewrite code
  - Add YAMLs
  - Orchestration still difficult
- Use ClearML for free



## ClearML: Made With 💙 From Allegro Al

#### • Single solution towards "lean-stack" MLOps

- Experiment management
- Workload orchestration
- Data management
- More coming...
- "Bottom-Up" design
  - Easy integration with ML/DL code
  - Log and keep, compare everything
  - One-click orchestration
  - Workflow versioning (pipelines!)
  - Dataset and model management
  - Remote session work/debug



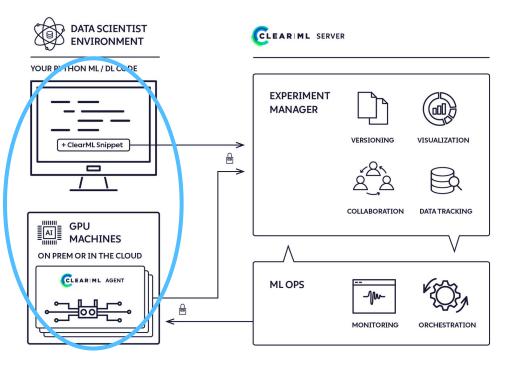
#### Open source & trusted by leading brands



Al teams in over 1,000 organizations rely upon ClearML for their development and deployment

CLEARIML

### ClearML: Open Source MLOPs solution



- Experiment Management
- Dataset Management & Lineage
- Model Management & Lineage
- Orchestration + Scheduling
- Remote Development
   Support
- Hyperparameter Optimization
- Pipelines



#### A word about servers

- **DS ENV:** For R&D (laptop, on-prem, cloud)
- **Agent:** Heavy Duty (cloud, on-prem, laptop)
- ClearML server:
  - Does not provide compute.
  - Spin your own... OR
  - Use clear.ml community server!
  - Notice: <u>live demo server</u>



#### <u>A good time to sign-up (FREE!)</u>

Free, supports teamwork, easy sharing of experiments, 100GB storage

If you want to check out any shared example,

sign up (takes less than a minute) at <u>clear.ml</u>

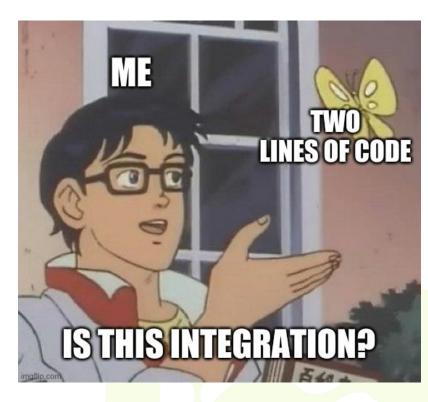


## Getting started



#### FULL INSTRUCTIONS - STEP BY STEP (PART I)

- 1. Signup at <u>clear.ml</u> **or** spin your own <u>clearml-server</u>
- 2. Go to "<u>getting started</u>" on our docs
  - a. `pip install clearml` (python package)
  - b. Generate credentials on UI, press "copy" button
  - c. Run <u>clearml-init</u> and paste credentials
- 3. 2 / 0 lines of code: integrate code snippet / <u>clearml-task</u>









## Integration



## MLOps time: Automations+Agent



#### Setup <u>clearml-agent</u> with same/different credentials

- 1. Docs: Installing and Configuring Your ClearML Agent
  - a. **`pip install clearml-agent`** (python package)
  - b. Generate credentials on UI, press "copy" button
  - c. Run `clearml-agent init` and paste credentials
- Repeat for any remote resource (or use k8s etc. - another webinar)



commit update YAML build container launch \*config bug\* repeat

#### clearml-agent



#### **START THE AGENT!**

1. "venv" (auto requirements!) - my box

clearml-agent daemon --queue default

2. "docker mode" (auto build!) - usually remote box

clearml-agent daemon --queue default --docker

- 3. Out of scope k8s
- 4. Out of scope "services mode"
- 5. Out of scope Yet more!



## Remote Launch an experiment







## Community server: Share & Collaborate



## My Favorite Feature: Compare



#### **Finally:** Join the ClearML Community:

- For feature requests or bug reports, see <u>ClearML GitHub Issues</u>.
- If you have *any* questions, post on the clearml <u>Slack Channel</u>.
- Or, tag your questions on <u>stackoverflow</u> with the clearml tag.
- You can always find me at <u>ariel@clear.ml</u>





### About Allegro Al

- Founded 2016
  - Founding team from Google, IDF elite tech units, and deep learning and CV PhDs
- 47 patents & 23 publications in AI and Computer Vision
- Allegro Trains open source MLOps platform
  - >1,000 organizations using for MLOps, >50 countries
- Jan 2021: Rebranded as ClearML
- Partners: NVIDIA, Intel, IBM, NetApp, Arrow, HPe





## **Thank You!**

ariel@clear.ml

@LSTMeow

