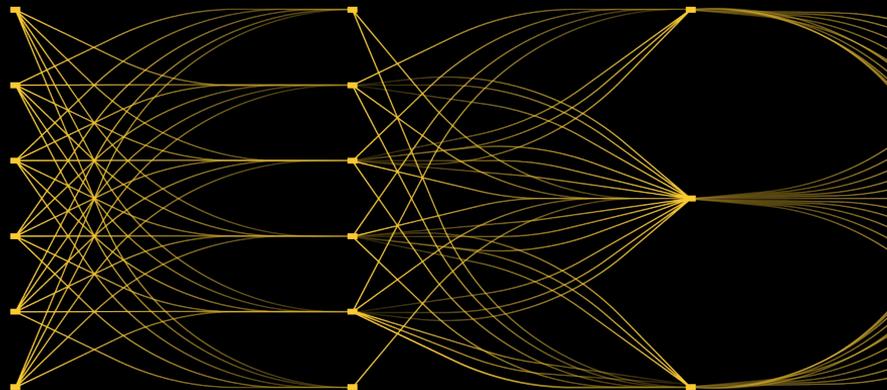


Iterative, Multiplayer Research



 Weights & Biases

Accounts Needed for Pt. 2, Competition

[kaggle.com](https://www.kaggle.com)

wandb.ai

colab.research.google.com

 Weights & Biases

The W&B Course

www.wandb.courses

The Goal

Table 3: Detection results on **PASCAL VOC 2007 test set**. The detector is Fast R-CNN and VGG-16. Training data: “07”: VOC 2007 trainval, “07+12”: union set of VOC 2007 trainval and VOC 2012 trainval. For RPN, the train-time proposals for Fast R-CNN are 2000. †: this number was reported in [2]; using the repository provided by this paper, this result is higher (68.1).

method	# proposals	data	mAP (%)
SS	2000	07	66.9 [†]
SS	2000	07+12	70.0
RPN+VGG, unshared	300	07	68.5
RPN+VGG, shared	300	07	69.9
RPN+VGG, shared	300	07+12	73.2
RPN+VGG, shared	300	COCO+07+12	78.8

Table 4: Detection results on **PASCAL VOC 2012 test set**. The detector is Fast R-CNN and VGG-16. Training data: “07”: VOC 2007 trainval, “07++12”: union set of VOC 2007 trainval+test and VOC 2012 trainval. For RPN, the train-time proposals for Fast R-CNN are 2000. †: <http://host.robots.ox.ac.uk:8080/anonymous/HZJTQA.html>. ‡: <http://host.robots.ox.ac.uk:8080/anonymous/YNPLXB.html>. §: <http://host.robots.ox.ac.uk:8080/anonymous/XEDH10.html>.

method	# proposals	data	mAP (%)
SS	2000	12	65.7
SS	2000	07++12	68.4
RPN+VGG, shared [†]	300	12	67.0
RPN+VGG, shared [‡]	300	07++12	70.4
RPN+VGG, shared [§]	300	COCO+07++12	75.9

Table 5: **Timing** (ms) on a K40 GPU, except SS proposal is evaluated in a CPU. “Region-wise” includes NMS, pooling, fully-connected, and softmax layers. See our released code for the profiling of running time.

model	system	conv	proposal	region-wise	total	rate
VGG	SS + Fast R-CNN	146	1510	174	1830	0.5 fps
VGG	RPN + Fast R-CNN	141	10	47	198	5 fps
ZF	RPN + Fast R-CNN	31	3	25	59	17 fps

	backbone	AP	AP ₅₀	AP ₇₅	AP _S	AP _M	AP _L
<i>Two-stage methods</i>							
Faster R-CNN+++ [5]	ResNet-101-C4	34.9	55.7	37.4	15.6	38.7	50.9
Faster R-CNN w FPN [8]	ResNet-101-FPN	36.2	59.1	39.0	18.2	39.0	48.2
Faster R-CNN by G-RMI [6]	Inception-ResNet-v2 [21]	34.7	55.5	36.7	13.5	38.1	52.0
Faster R-CNN w TDM [20]	Inception-ResNet-v2-TDM	36.8	57.7	39.2	16.2	39.8	52.1
<i>One-stage methods</i>							
YOLOv2 [15]	DarkNet-19 [15]	21.6	44.0	19.2	5.0	22.4	35.5
SSD513 [11, 3]	ResNet-101-SSD	31.2	50.4	33.3	10.2	34.5	49.8
DSSD513 [3]	ResNet-101-DSSD	33.2	53.3	35.2	13.0	35.4	51.1
RetinaNet [9]	ResNet-101-FPN	39.1	59.1	42.3	21.8	42.7	50.2
RetinaNet [9]	ResNeXt-101-FPN	40.8	61.1	44.1	24.1	44.2	51.2
YOLOv3 608 × 608	Darknet-53	33.0	57.9	34.4	18.3	35.4	41.9

```
0000 p1 DRZ 3.11 - not super eval
mag_threshold 0.21
2L 300N BLSTM (BasicLSTM)
20D
sigmoid
AdamOptimizer
100 frames
dropout 1.0
zero input and label
log(x+1.0)
103300 training, 2000 CV
model:
weights20170224-005946_v10.1419
(p1, loss .1419, epoch 40 [task0])
MEAN IBM SDR GAIN: 2.324 -
with 0.15 thresh during cluster
STD IBM SDR GAIN: 2.276
MEAN IBM SDR GAIN: 2.110 -
with 0.32 threshold during cluster
STD IBM SDR GAIN: 2.254
```

```
0001 p2 DRZ 3.23
mag_threshold 0.12
2L 300N BLSTM_clean (LSTM & many
reworks) - note, this was the
massive model rewrite
20D
sigmoid
AdamOptimizer
100 frames
dropout 1.0
zero input and label
log(x+1.0)
10330 training, 2000 CV
model:
weights20170224-032054_v10.1418
(p2, loss .1418, epoch 40 [task0])
MEAN IBM SDR GAIN: 2.056 -
with 0.15 thresh during cluster
STD IBM SDR GAIN: 2.214
MEAN IBM SDR GAIN: 2.068 -
with 0.32 threshold during cluster
STD IBM SDR GAIN: 2.205
MEAN IBM SDR GAIN: 2.108 - with
fancy best SDR of the two system
(eval_sdr2.py)
STD IBM SDR GAIN: 4.114
MEAN IBM SDR GAIN: 5.915 -
using EXACT script measuring both
voices gain (SUPER_EVAL)
STD IBM SDR GAIN: 4.349
```

```

0000 p1 DRZ 3.11 - not super eval
mag_threshold 0.21
2L 300N BLSTM (BasicLSTM)
20D
sigmoid
AdamOptimizer
100 frames
dropout 1.0
zero input and label
log(x+1.0)
103300 training, 2000 CV
model:

```

```

0001 p2 DRZ 3.23
mag_threshold 0.12
2L 300N BLSTM_clean (LSTM & many
reworks) - note, this was the
massive model rewrite
20D
sigmoid
AdamOptimizer
100 frames
dropout 1.0
zero input and label

```

```

weights20170224-005946_v10
(p1, loss .1419, epoch 40)
MEAN IBM SDR GAIN: 2.
with 0.15 thresh during cl
STD IBM SDR GAIN: 2.
MEAN IBM SDR GAIN: 2.
with 0.32 threshold during
STD IBM SDR GAIN: 2.

```

A	B	L	M	N	O	P
Experiment Name	Created	train_loss	valid_loss	acc	traffic_acc	road_acc
best car acc (50% data)	2021-04-14	0.5375041962	0.442730248	0.8823291659	0.8663836718	0.9399003386
best traffic acc (50% data)	2021-04-14	0.4919361174	0.4202951491	0.8879730701	0.8718349934	0.9439761043
best overall IOU (20% data)	2021-04-14	0.5095784068	0.4658596516	0.8725891709	0.8592621684	0.9359762073
major-sweep-196	2021-01-31	0.5705417991	0.4875227213	0.8698127866	0.8570468426	0.9454026222
swept-sweep-164	2021-01-31	0.5535062551	0.4849829972	0.8701210618	0.8567070365	0.9204238057
silver-sweep-139	2021-01-31	0.563354373	0.5251165628	0.871628046	0.846842885	0.9262287617
laced-sweep-115	2021-01-31	0.5277443528	0.5124291778	0.8705932498	0.8521561027	0.9389513731
eager-sweep-97	2021-01-31	0.5488699675	0.5005864501	0.8738754392	0.8612990975	0.913561523
rich-sweep-88	2021-01-31	0.5587444901	0.5211353302	0.8785927892	0.8512274623	0.9295567274
hopeful-sweep-33	2021-01-31	0.503461957	0.4650281966	0.8706912994	0.8560319543	0.9387732744
autumn-sweep-24	2021-01-31	0.5777919888	0.500880897	0.8755427003	0.8561192751	0.9181208611
decent-sweep-21	2021-01-31	0.5714729428	0.4979581237	0.8745227456	0.8490597606	0.9463140965
vague-sweep-5	2021-01-31	0.6230331063	0.473508656	0.8732874393	0.8601382971	0.9297611117
Second best acc	2021-01-31	0.4194990396	0.4509823024	0.8873019218	0.8705806732	0.9445936084



```

0000 p1 DRZ 3.11 - not super eval
mag_threshold 0.21
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massive model rewrite
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AdamOptimizer
100 frames
dropout 1.0
zero input and label

```

```

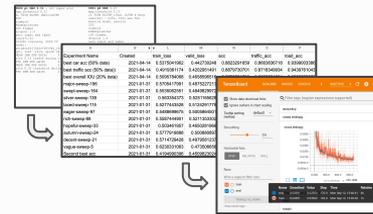
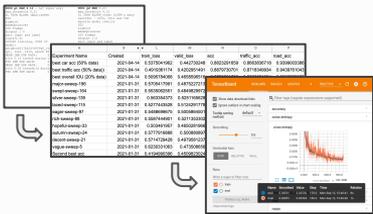
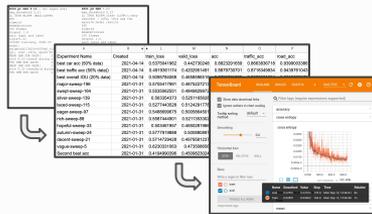
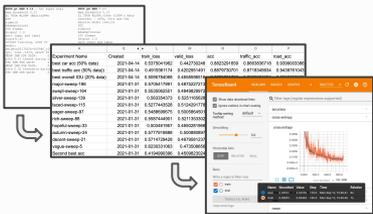
weights20170224-005946_v10
(p1, loss .1419, epoch 40)
MEAN IBM SDR GAIN: 2.
with 0.15 thresh during cl
STD IBM SDR GAIN: 2.
MEAN IBM SDR GAIN: 2.
with 0.32 threshold during
STD IBM SDR GAIN: 2.

```

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swept-sweep-164	2021-01-31	0.5535062551	0.4849829972			
silver-sweep-139	2021-01-31	0.563354373	0.5251165628			
laced-sweep-115	2021-01-31	0.5277443528	0.5124291778			
eager-sweep-97	2021-01-31	0.5488699675	0.5005864501			
rich-sweep-88	2021-01-31	0.5587444901	0.5211353302			
hopeful-sweep-33	2021-01-31	0.503461957	0.4650281966			
autumn-sweep-24	2021-01-31	0.5777919888	0.500880897			
decent-sweep-21	2021-01-31	0.5714729428	0.4979581237			
vague-sweep-5	2021-01-31	0.6230331063	0.473508656			
Second best acc	2021-01-31	0.4194990396	0.4509823024			

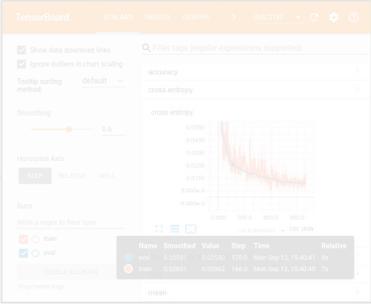
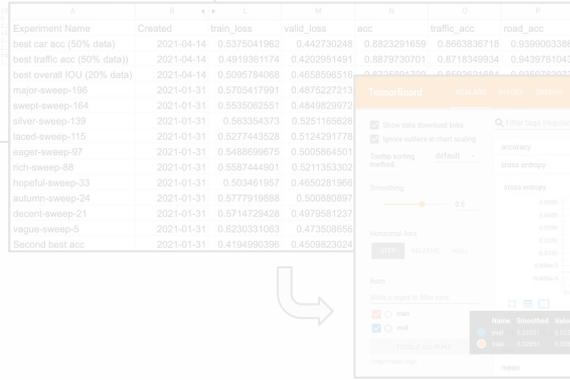
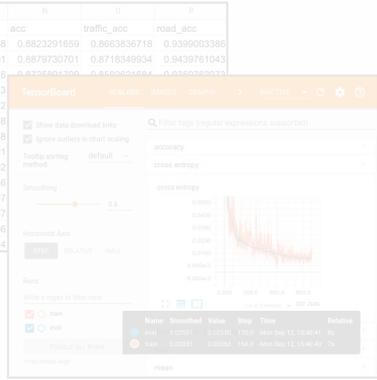
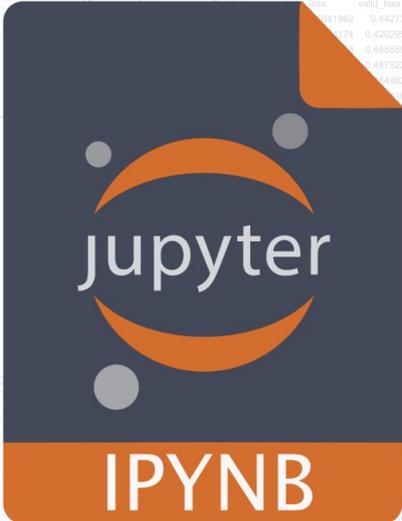
The screenshot shows the TensorBoard interface. At the top, there are tabs for SCALARS, IMAGES, and GRAPHS. The current view is SCALARS, showing a table of runs and a graph of cross entropy. The table has columns for Name, Smoothed Value, Step, Time, and Relative. The graph shows cross entropy decreasing over time, with a smoothed blue line and noisy orange data points. A tooltip is visible over the 'train' run, showing its smoothed value and step.

Name	Smoothed Value	Step	Time	Relative	
eval_top0.02591pp_p0.0255017170	0.0255017170	170	Mon Sep 12, 15:40:41	8s	
train_max	0.02851	0.03362	166.0	Mon Sep 12, 15:40:40	7s



```
0000_01_000_3_11 --root /opt/conda/envs/...
0001_01_000_3_11 --root /opt/conda/envs/...
0002_01_000_3_11 --root /opt/conda/envs/...
```

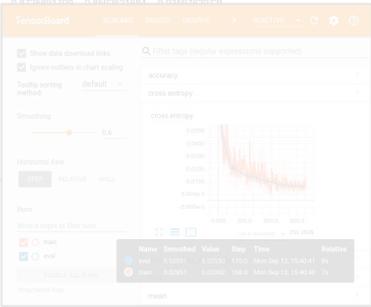
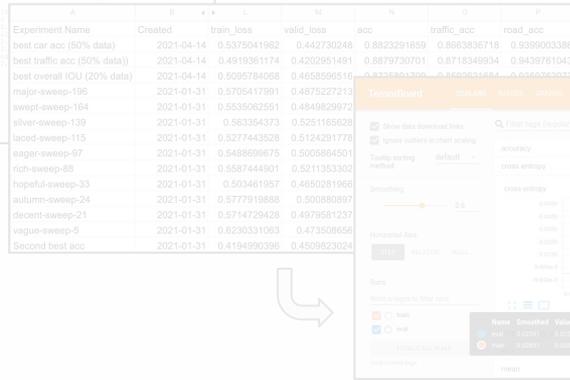
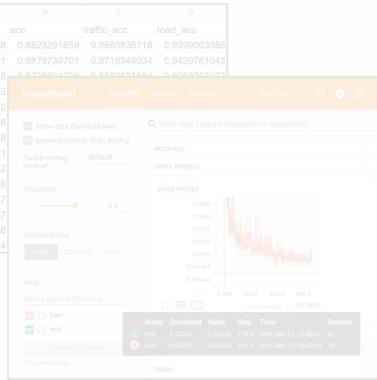
```
0003_01_000_3_11 --root /opt/conda/envs/...
0004_01_000_3_11 --root /opt/conda/envs/...
0005_01_000_3_11 --root /opt/conda/envs/...
```



```
0006_01_000_3_11 --root /opt/conda/envs/...
0007_01_000_3_11 --root /opt/conda/envs/...
0008_01_000_3_11 --root /opt/conda/envs/...
```

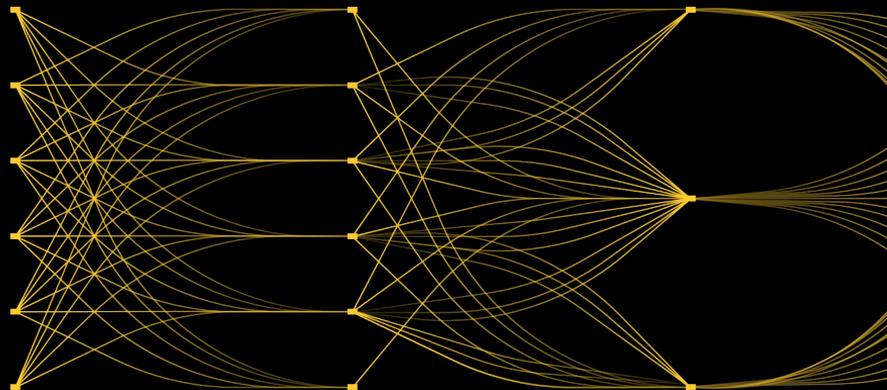
```
0009_01_000_3_11 --root /opt/conda/envs/...
0010_01_000_3_11 --root /opt/conda/envs/...
0011_01_000_3_11 --root /opt/conda/envs/...
```

Table with 5 columns: Experiment Name, Created, train_loss, valid_loss, acc. Rows include 'best overall IOU (20% data)', 'major-sweep-196', 'silver-sweep-164', 'lacad-sweep-115', 'eager-sweep-97', 'rich-sweep-88', 'hopeful-sweep-33', 'autumn-sweep-24', 'decent-sweep-21', 'vague-sweep-5', and 'Second best acc'.





Just Stop



Three principles of an ideal ML workflow



Rapidly iterate

to continuously refine and optimize models



Reproduce

to reduce key-person dependencies



Collaborate

to ensure knowledge transfer across the organization

Three principles of an ideal ML workflow



Rapidly iterate

to continuously refine and optimize models



Reproduce

to reduce key-person dependencies



Collaborate

to ensure knowledge transfer across the organization

A system of record for all ML workflows



A system of record for all ML workflows



Name (44 visualized)	train_data	test_data	test_acc	loss
Group: double_5K 2 3	5K	["half_full","large"]	0.8748	0.2345
Job Type: eval 2	5K	["half_full","large"]	0.8748	-
Job Type: train_model 5K	-	-	-	0.2345
Group: baseline_5K 2 3	5K	["half_full","large"]	0.8385	0.005867
Job Type: eval 2	5K	["half_full","large"]	0.8385	-
Job Type: train_model 5K	-	-	-	0.005867
Group: baseline_accessories	accessories	["half_full","large"]	0.3466	0.06003
Job Type: eval 4	accessories	["half_full","large"]	0.3466	-
Job Type: train_model accessories	-	-	-	0.06003
Group: baseline_clothes 2	clothes	["half_full","large"]	0.5365	0.2822
Job Type: eval 4	clothes	["half_full","large"]	0.5365	-
Job Type: train_model clothes	-	-	-	0.2822
Group: baseline 2 5	all	["half_full","large"]	0.826	0.1976
Job Type: eval 4	all	["half_full","large"]	0.826	-
Job Type: train_model all	-	-	-	0.1976
Group: double 2 5	accessories	["half_full","large"]	0.3396	0.01346
Job Type: eval 4	accessories	["half_full","large"]	0.3396	-
Job Type: train_model accessories	-	-	-	0.01346
Group: double_clothes 2 3	clothes	["half_full","large"]	0.5485	1.379
Job Type: eval 4	clothes	["half_full","large"]	0.5485	-
Job Type: train_model clothes	-	-	-	1.379
Group: double_all 2 5	all	["half_full","large"]	0.7535	0.004875

loss

group: baseline_accessories
group: baseline_clothes_1
group: baseline_jobType_1
group: double_clothes_job
group: double_all_jobType
group: baseline_5K_jobType
group: double_5K_jobType

Experiment configuration 1

diff only double_5K baseline_5K baseline_5K

CONFIG

batch_size	>4	>4	>4
conv_kernel	5	5	5
epochs	5	5	5
l1_size	64	32	32
l2_size	128	64	64
lr	0.002	0.001	0.001

test_data ["half_full","large"] ["half_full","large"] ["half_full","large"]

Tables 5

runs.summary["evaluation"]

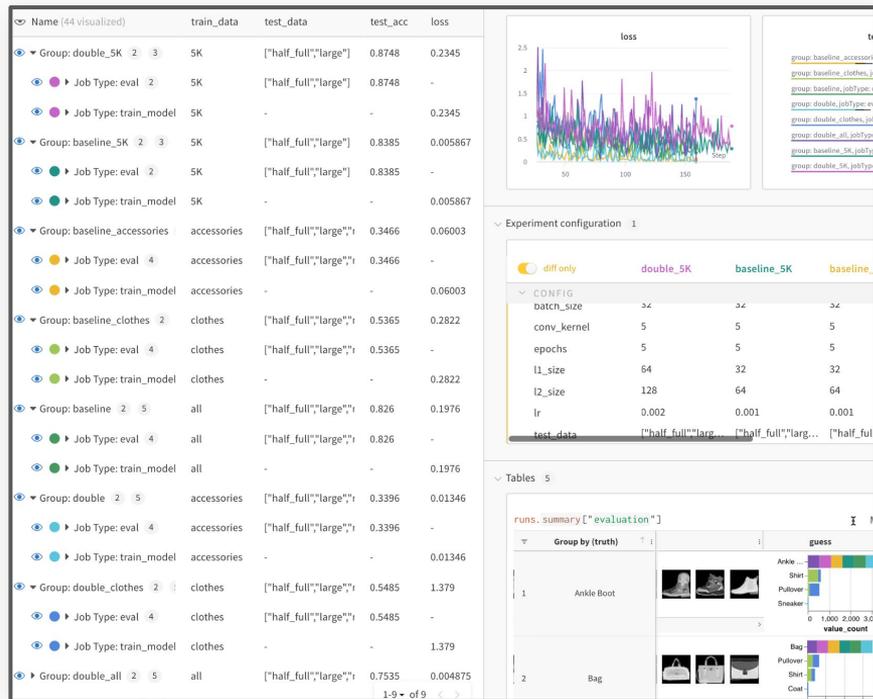
Group by (truth)	guess
Ankle Boot	Ankle Boot
Bag	Bag

A system of record for all ML workflows



Get started in 60 seconds

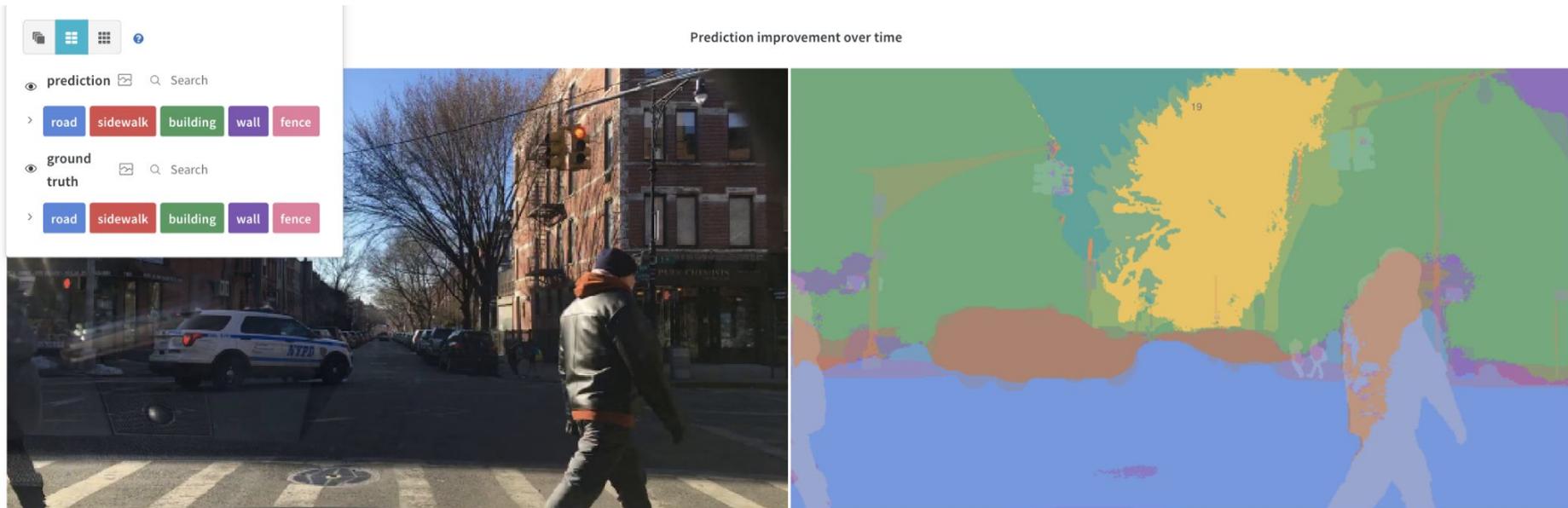
```
!pip install wandb # Install W&B
wandb.init() # Start experiment
wandb.log(metrics) # Log metrics + more!
```



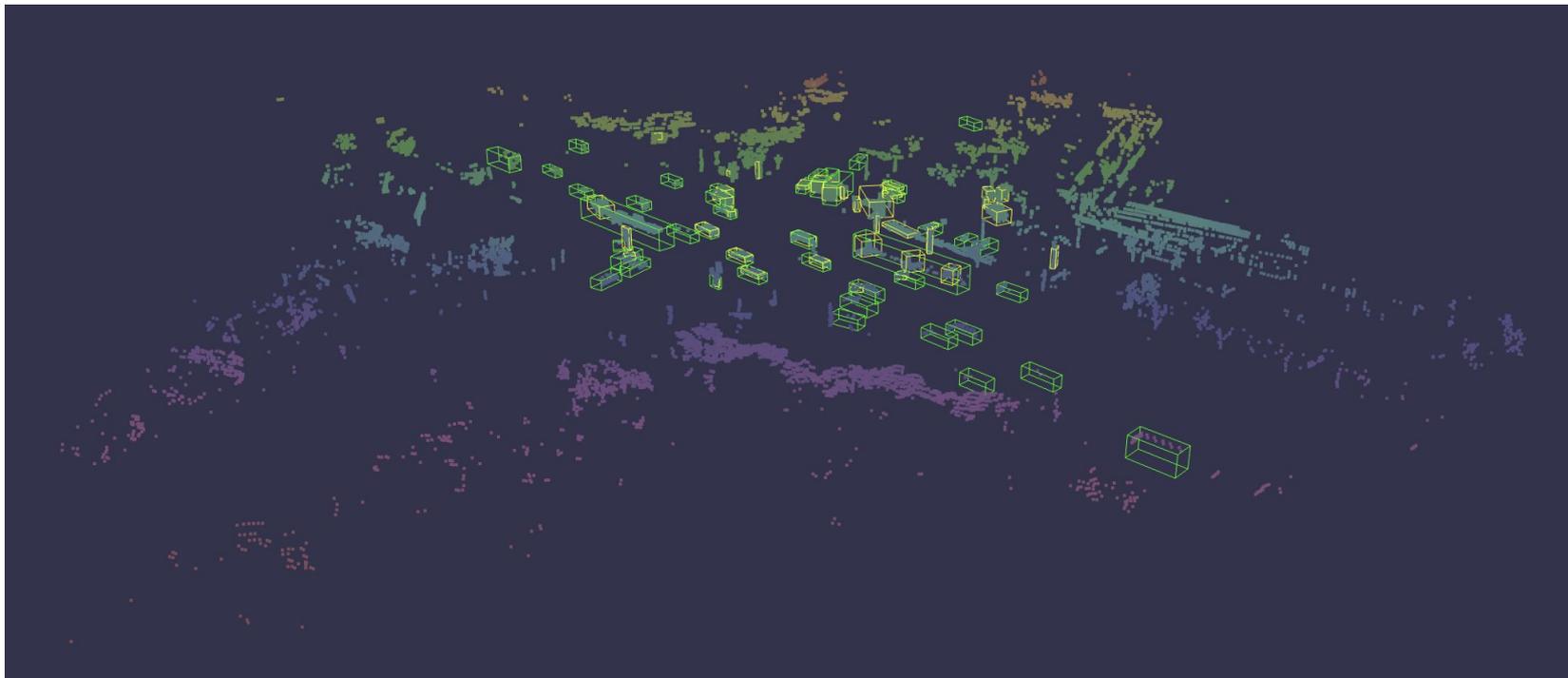


Yes, you really can get started in 60 seconds.

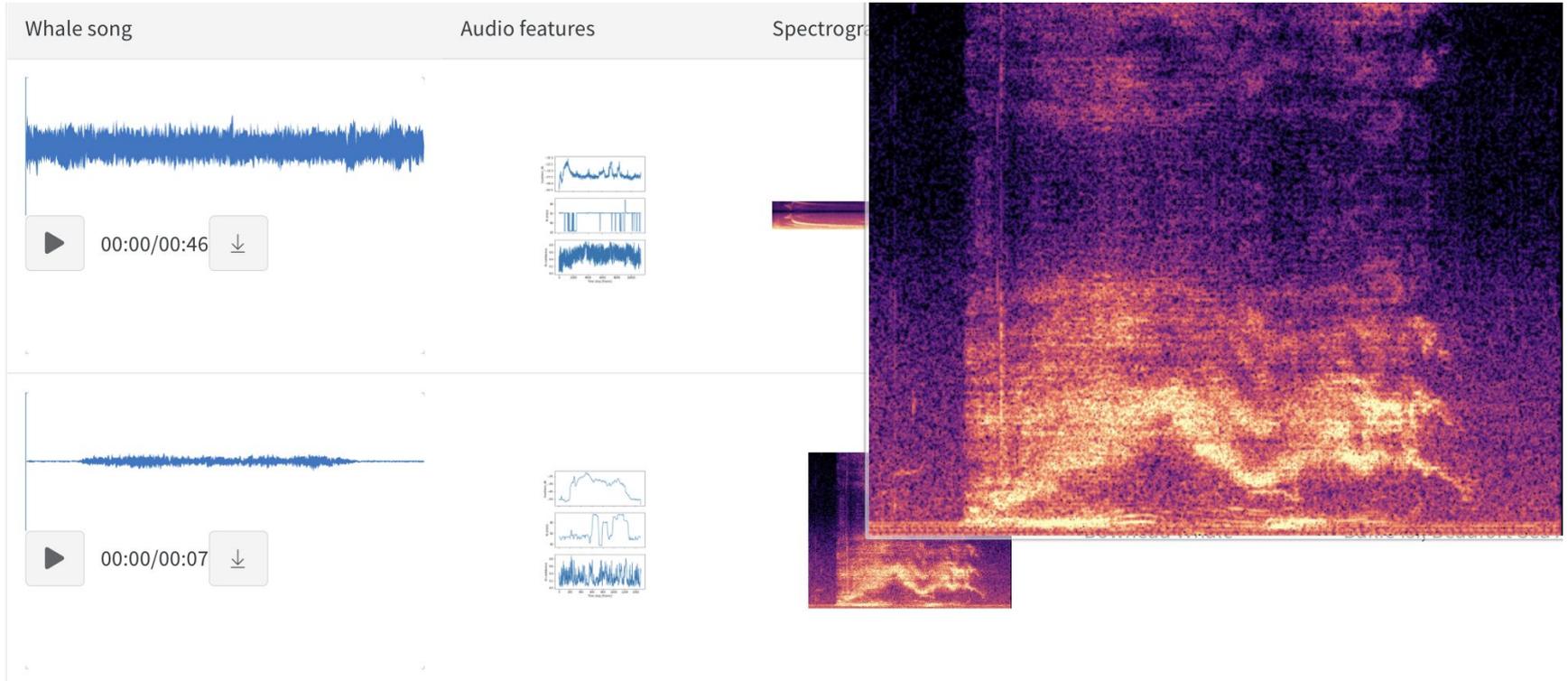
A system of record for wandb . Image



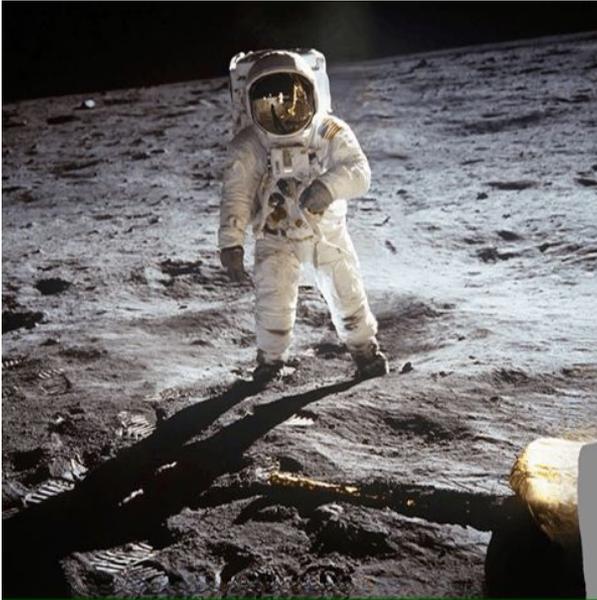
A system of record for wandb.Object3D



A system of record for wandb.Audio

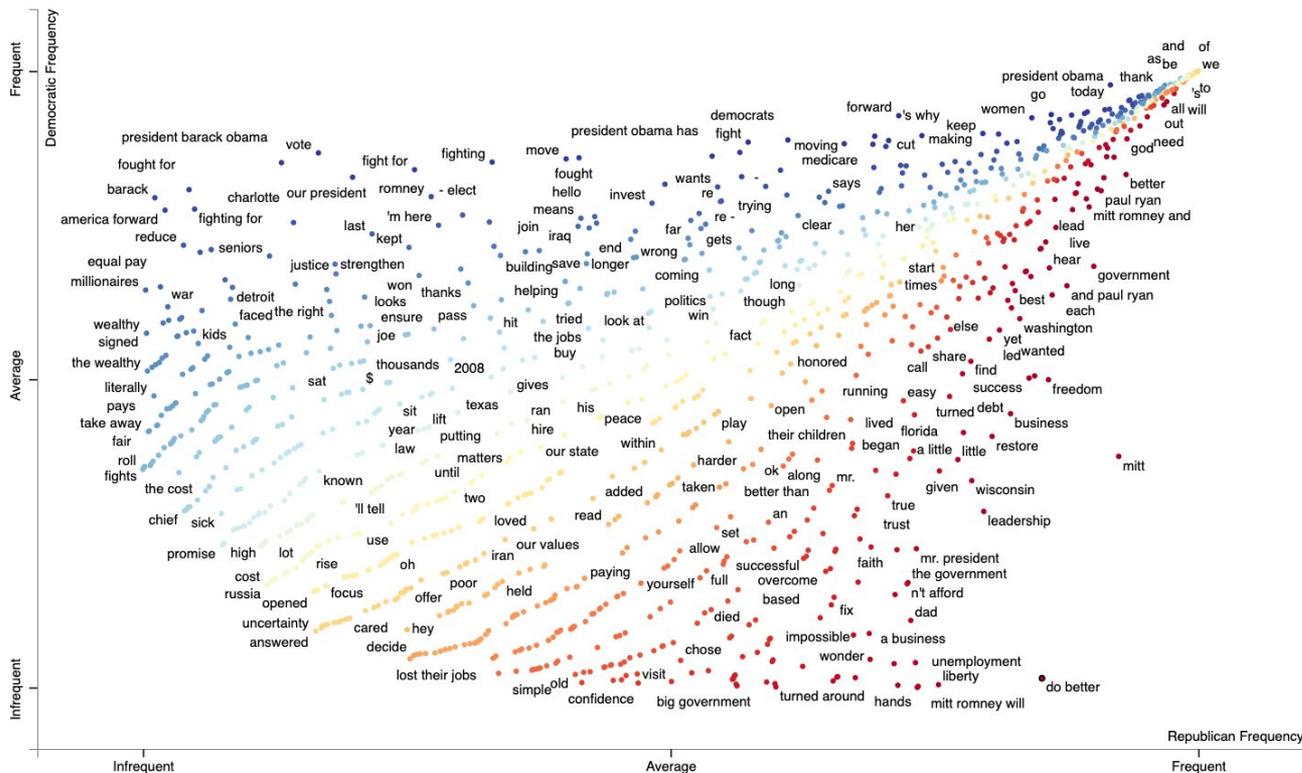


A system of record for wandb.Video





A system of record for wandb.html

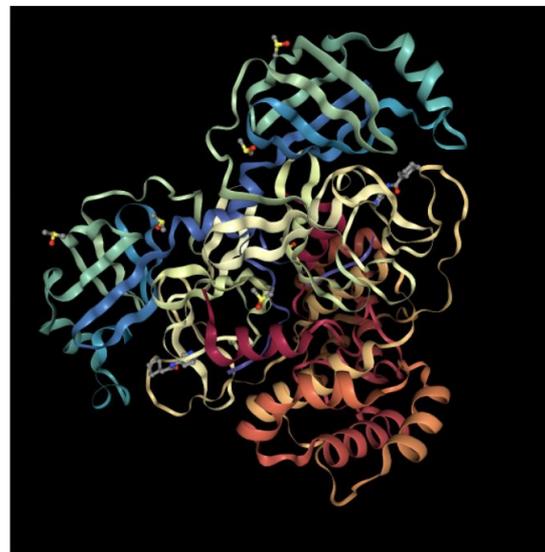


Top Democratic	Characteristic
forward	obamacare
president obama	mitt
women	barack
barack obama	obama
pay	romney
democrats	billionaires
cut	millionaires
fight	bless
vote	risked
together	gentlemen
's why	understands
go	wo
medicare	fought
	republicans
	elect
	bankrupt
	prosper
	tonight
	repeal
	democrats
	medicare
	proud
	honored
	thank
	struggled
	prosperity
	deserve
	believes
	nominate
	pledged

A system of record for all types of data!

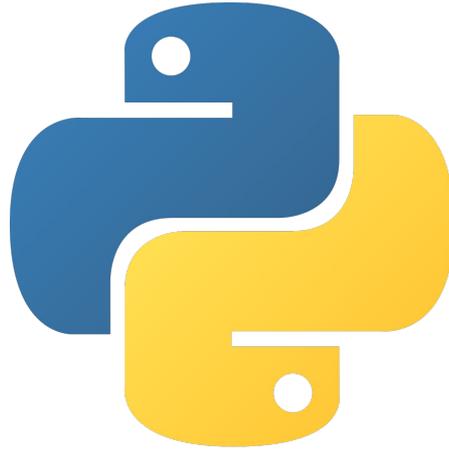
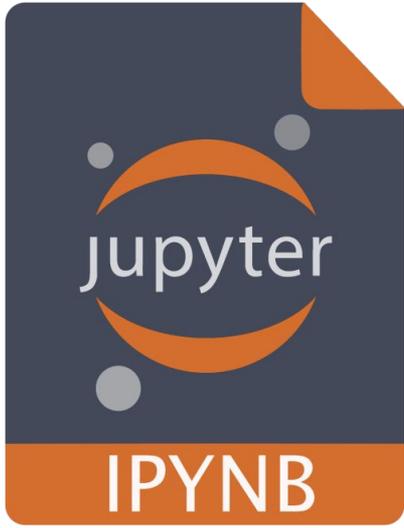
```
wandb.Image  
wandb.Object3D  
wandb.log( wandb.Molecule )  
wandb.Video  
wandb.Html
```

COVID-19 main protease in complex with Z31792168





Ask questions about your data and models

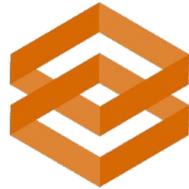


Flask

web development,
one drop at a time



Streamlit



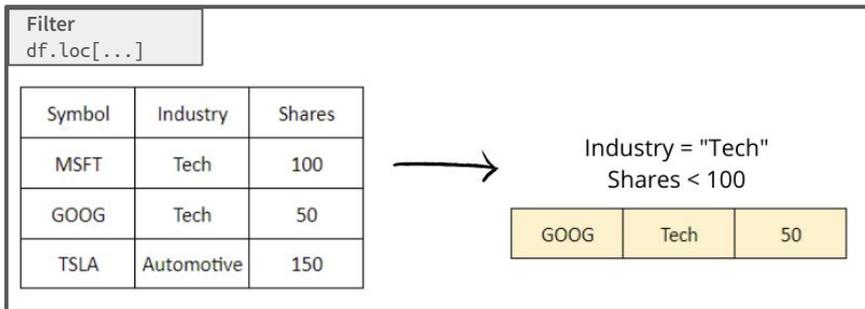
gradio



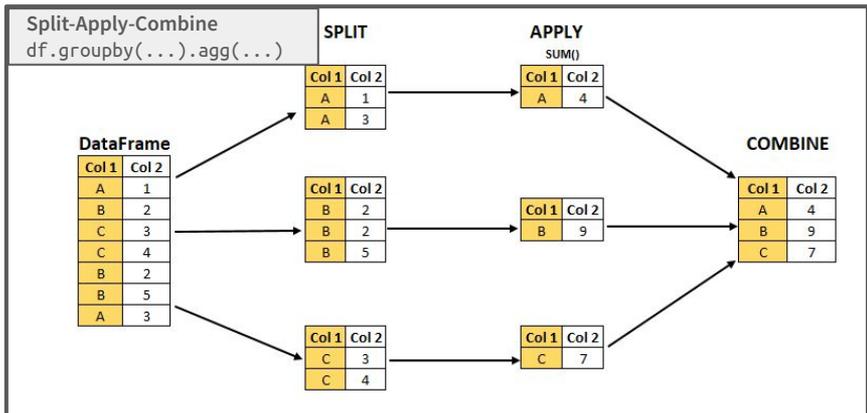
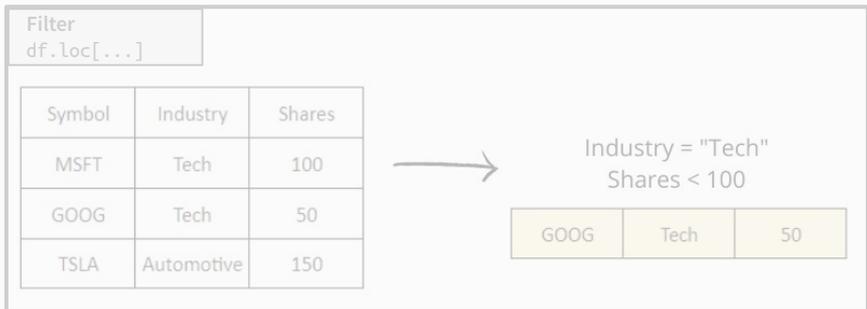
plotly | Dash



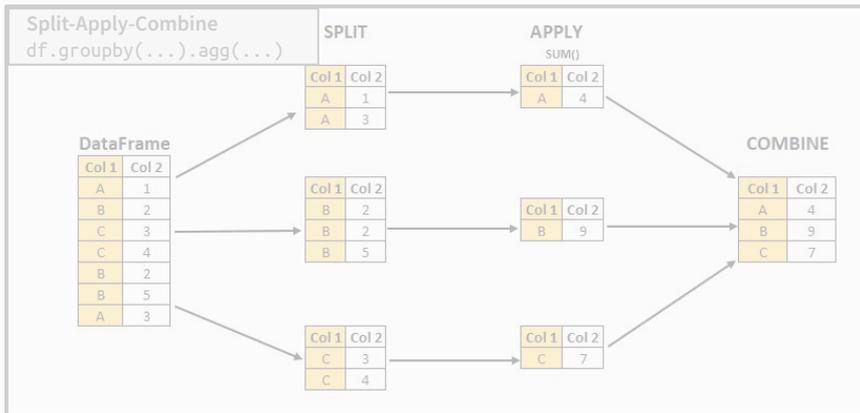
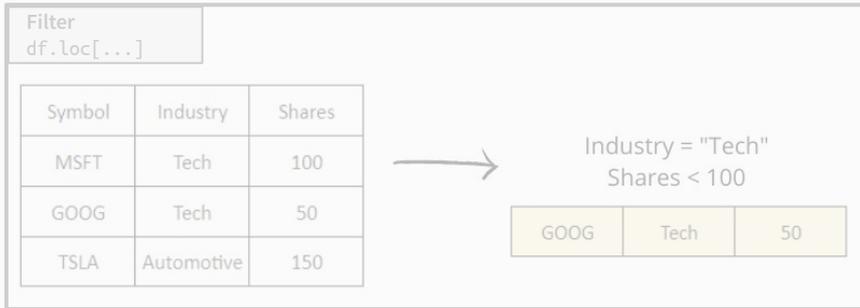
Ask questions about your data (and models)



Ask questions about your data (and models)



Ask questions about your data (and models)





How do I ask questions about **non-tabular** data?

Ask questions about your data (and models)

Classic DataFrames

<code>img</code>	<code>label</code>
<code>image mode=RGB size=500x333 at 0x7F56F6360ED0></code>	<code>samoyed</code>
<code>image mode=RGB size=443x435 at 0x7F56F6379BD0></code>	<code>shiba_inu</code>
<code>image mode=RGB size=600x437 at 0x7F56F6379E50></code>	<code>Egyptian_Mau</code>
<code>image mode=RGB size=375x500 at 0x7F56F6379F90></code>	<code>Birman</code>
<code>image mode=RGB size=500x375 at 0x7F56F637B350></code>	<code>great_pyrenees</code>
<code>...</code>	<code>...</code>
<code>image mode=RGB size=500x335 at 0x7F56F623BD50></code>	<code>Bengal</code>
<code>image mode=RGB size=403x500 at 0x7F56F623BF90></code>	<code>leonberger</code>
<code>image mode=RGB size=500x375 at 0x7F56F6241390></code>	<code>beagle</code>
<code>image mode=RGB size=192x288 at 0x7F56F62416D0></code>	<code>Abyssinian</code>
<code>image mode=RGB size=288x300 at 0x7F56F6241910></code>	<code>american_pit_bull_terrier</code>

Ask questions about your data (and models)

✗ Classic DataFrames

	img	label
image mode=RGB size=500x333 at 0x7F56F6360ED0>		samoyed
image mode=RGB size=443x435 at 0x7F56F6379BD0>		shiba_inu
image mode=RGB size=600x437 at 0x7F56F6379E50>		Egyptian_Mau
image mode=RGB size=375x500 at 0x7F56F6379F90>		Birman
image mode=RGB size=500x375 at 0x7F56F637B350>		great_pyrenees
...
image mode=RGB size=500x333 at 0x7F56F623BD50>		Bengal
image mode=RGB size=403x500 at 0x7F56F623BF90>		leonberger
image mode=RGB size=500x375 at 0x7F56F6241390>		beagle
image mode=RGB size=192x288 at 0x7F56F62416D0>		Abyssinian
image mode=RGB size=288x300 at 0x7F56F6241910>		american_pit_bull_terrier

✓ wandb.Table

	img	label
1		samoyed
2		shiba_inu
3		Egyptian_Mau
4		Birman

Ask questions about your data (and models)

✓ wandb.Table

	img	label
1		samoyed
2		shiba_inu
3		Egyptian_Mau
4		Birman

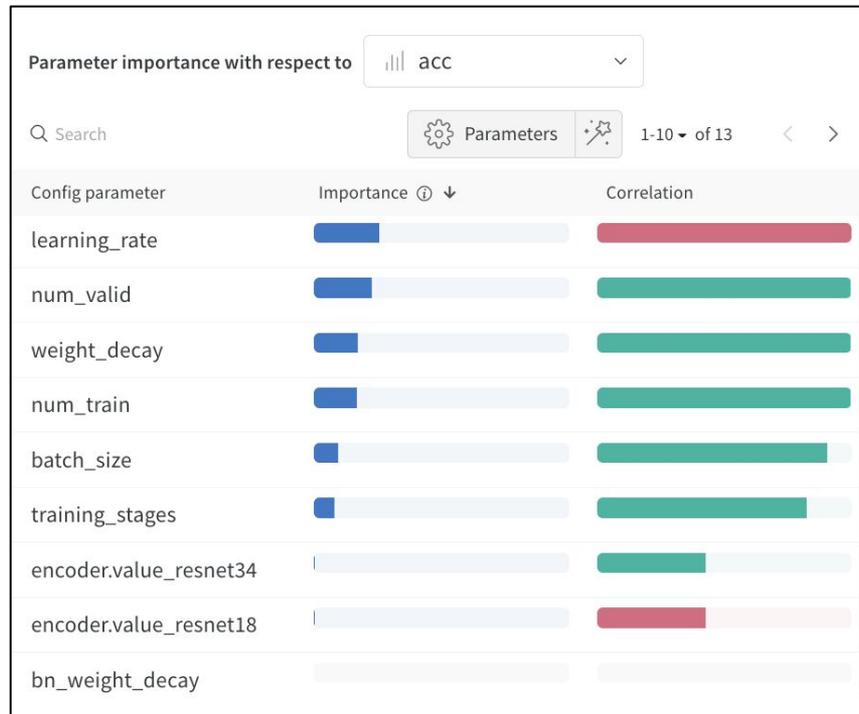
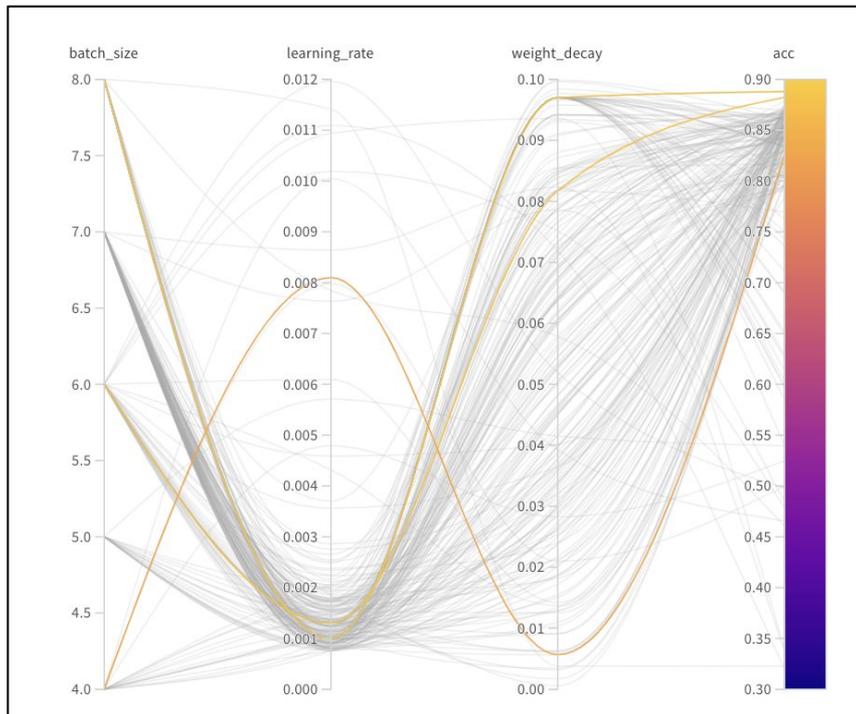
Table.groupby("label")

	Group by (label)	img
1	japanese_chin	 6-10 of 24
2	Ragdoll	 1-5 of 34
3	leonberger	 1-5 of 30
4	shiba_inu	 1-5 of 25



How do I ask questions about training?

Easily and systematically search hyperparameters



Ask questions about your data (and models)

```
program: train.py
method: bayes
metric:
  name: valid_loss
  goal: minimize
parameters:
  batch_size:
    values: [32, 64]
  mixup_alpha:
    values: [0.2, 0.5, 0.8]
  optimizer:
    values: ["adam", "ranger"]
  encoder:
    values: ["resnet18", "resnet34", "resnet50", "resnet101"]
```

OUR MACHINE

central sweep server

YOUR MACHINES

agent 1

agent 2

agent 3

Three principles of an ideal ML workflow



Rapidly iterate

to continuously refine and optimize models



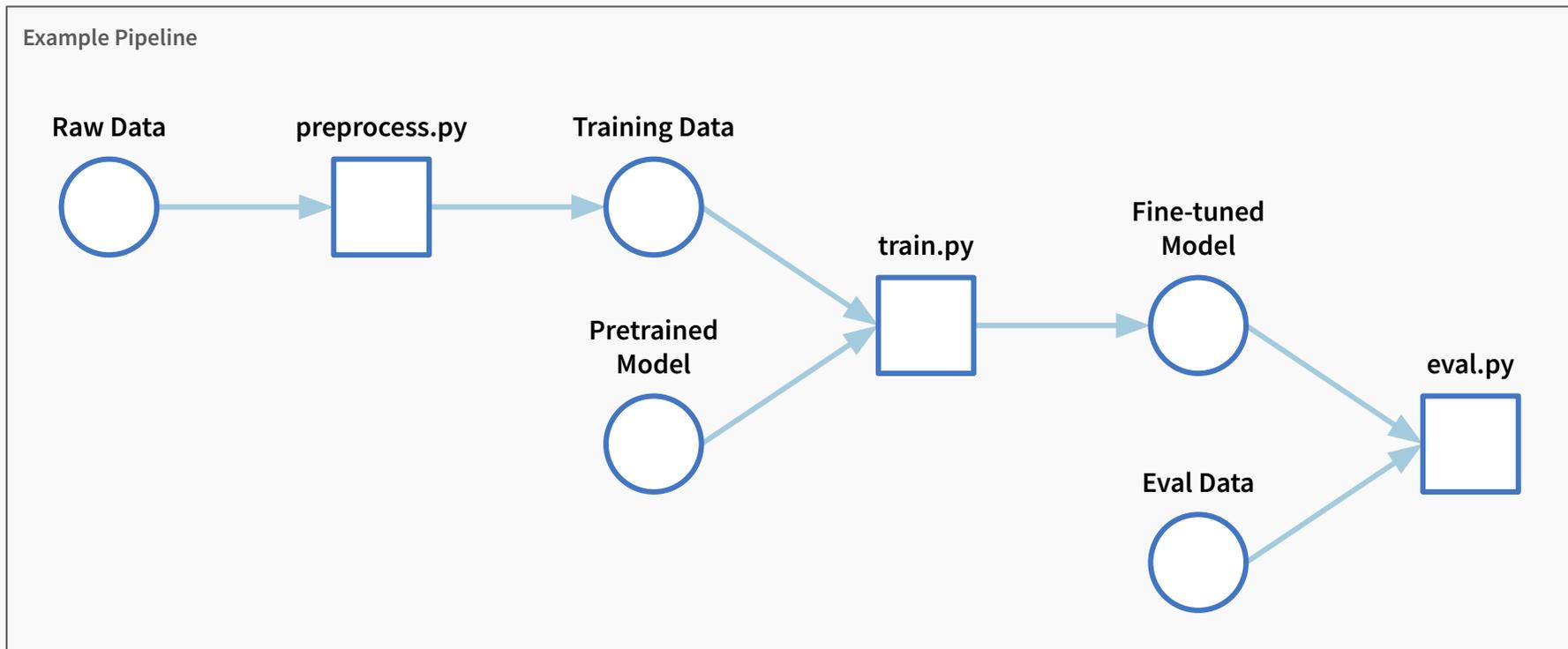
Reproduce

to reduce key-person dependencies

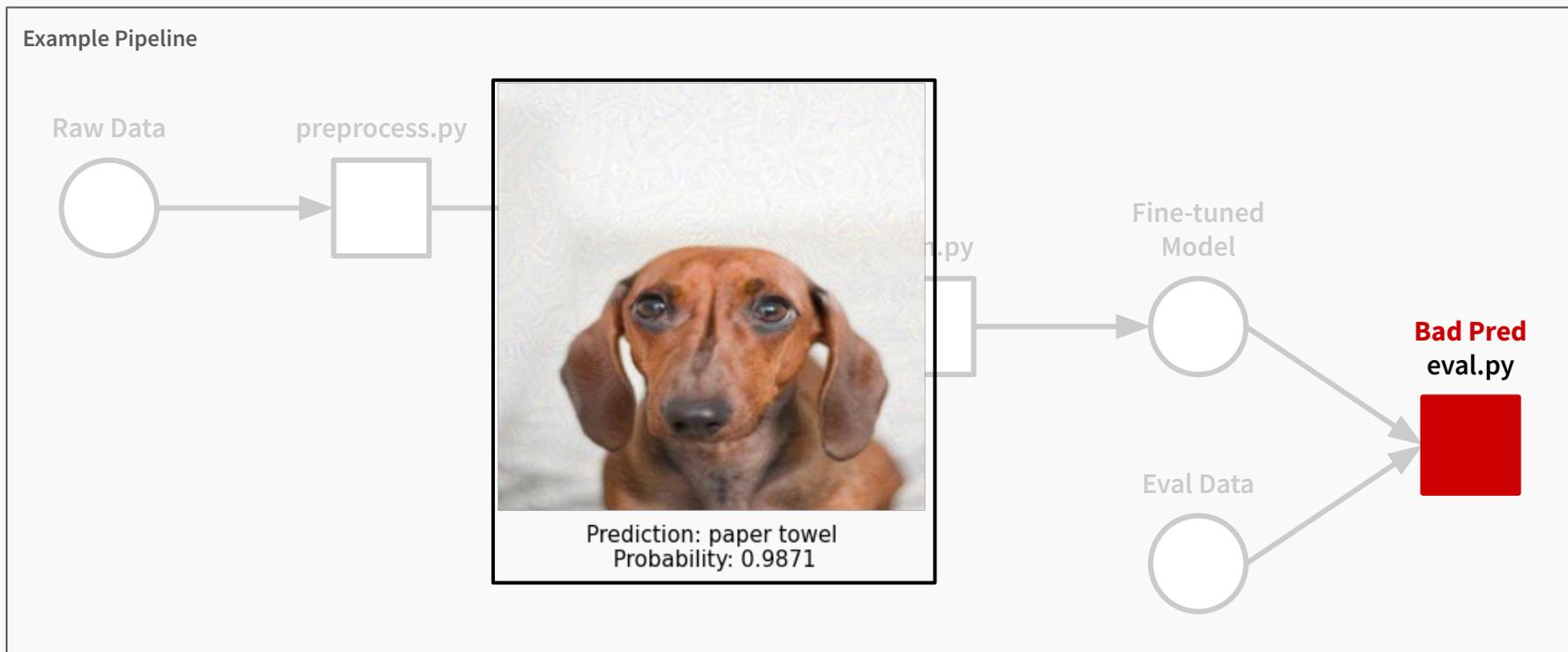


Collaborate

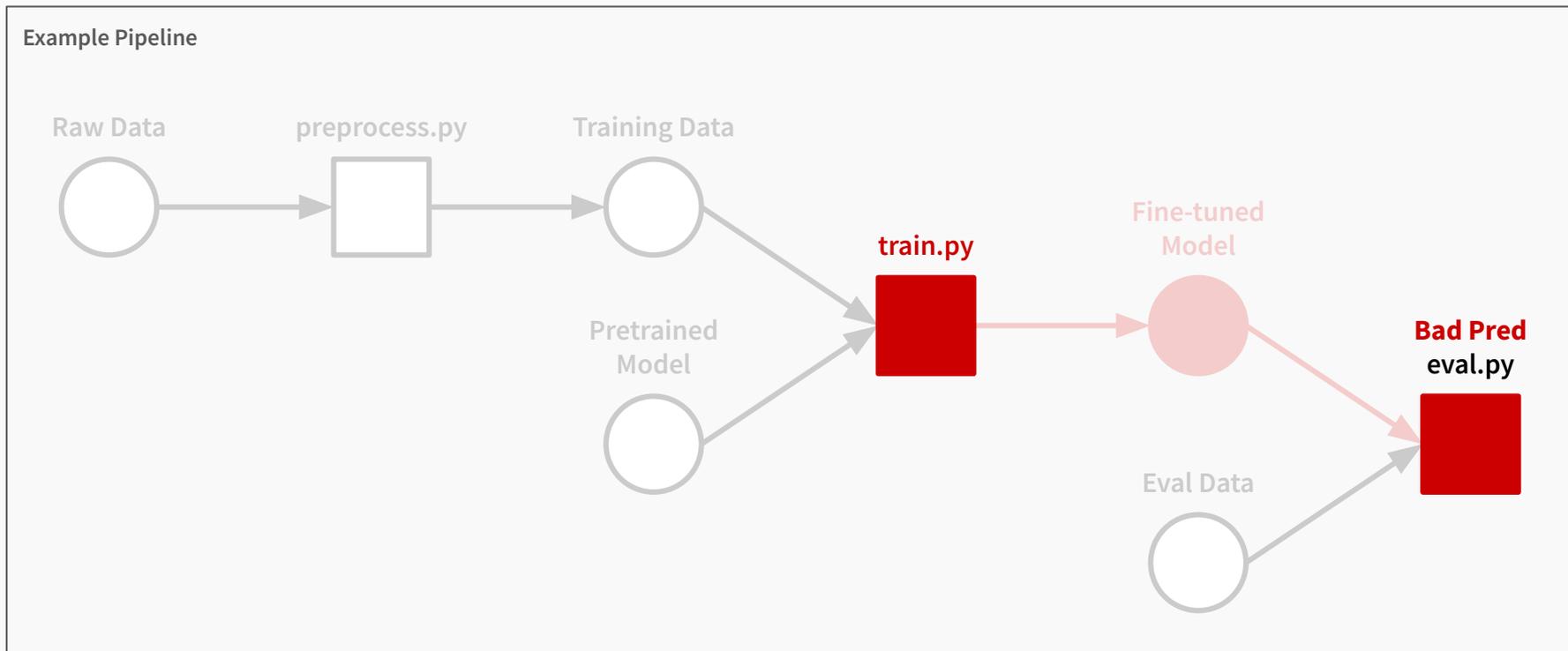
to ensure knowledge transfer across the organization



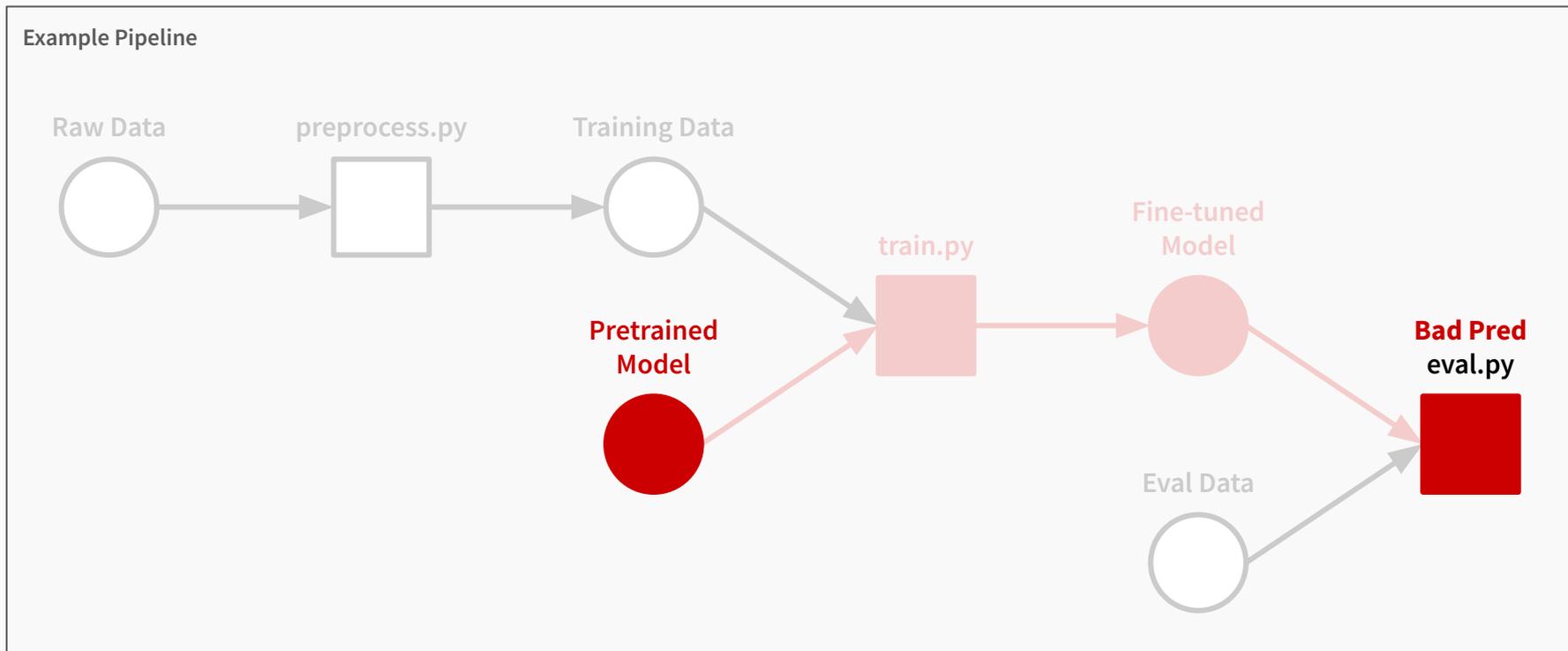
Bad predictions!



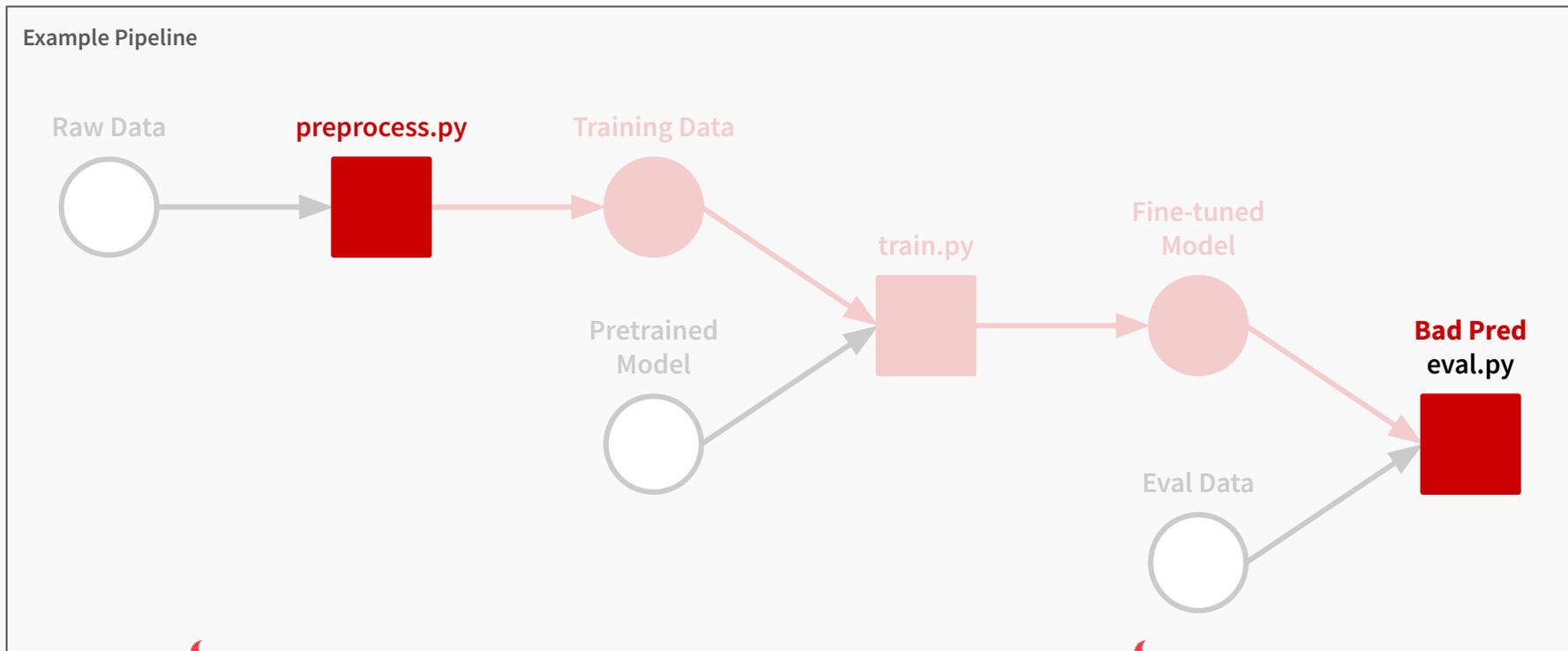
Bad predictions because of **training**?



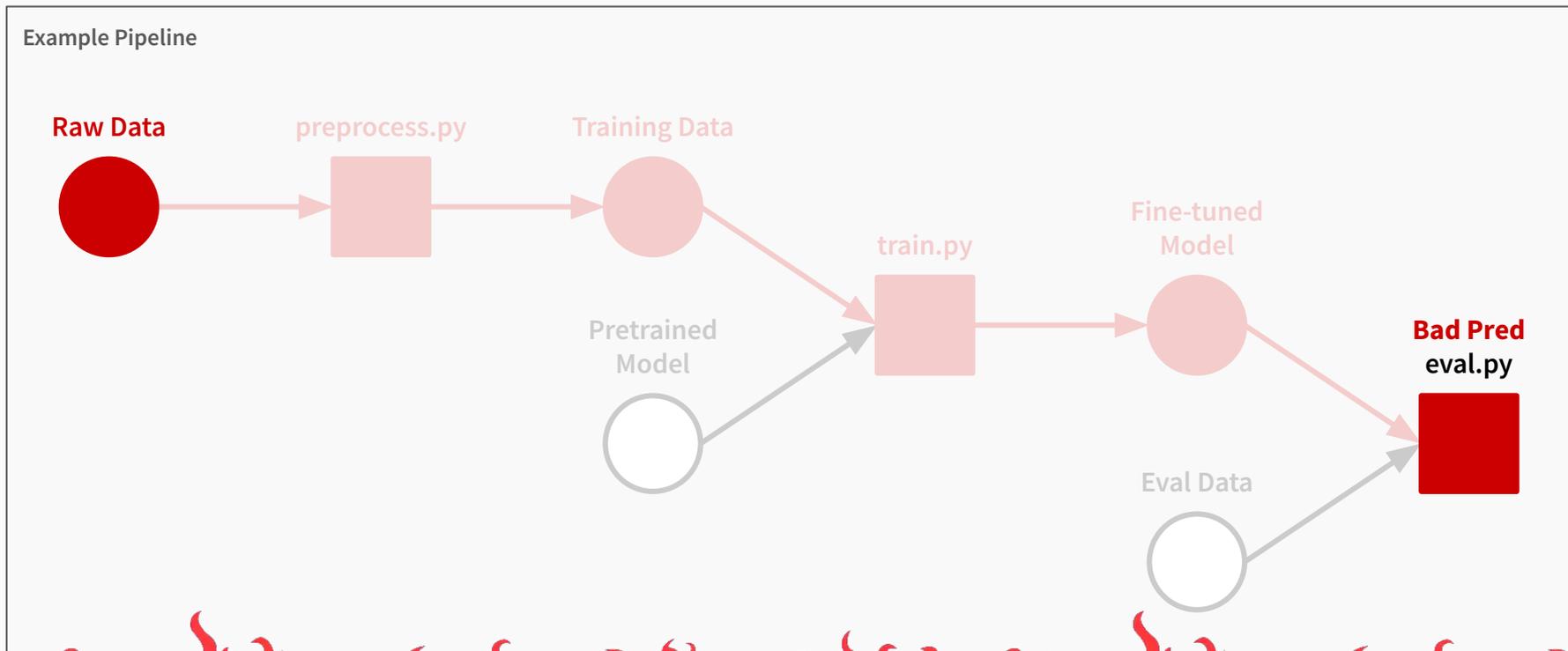
Bad predictions because of **pretrained models**?



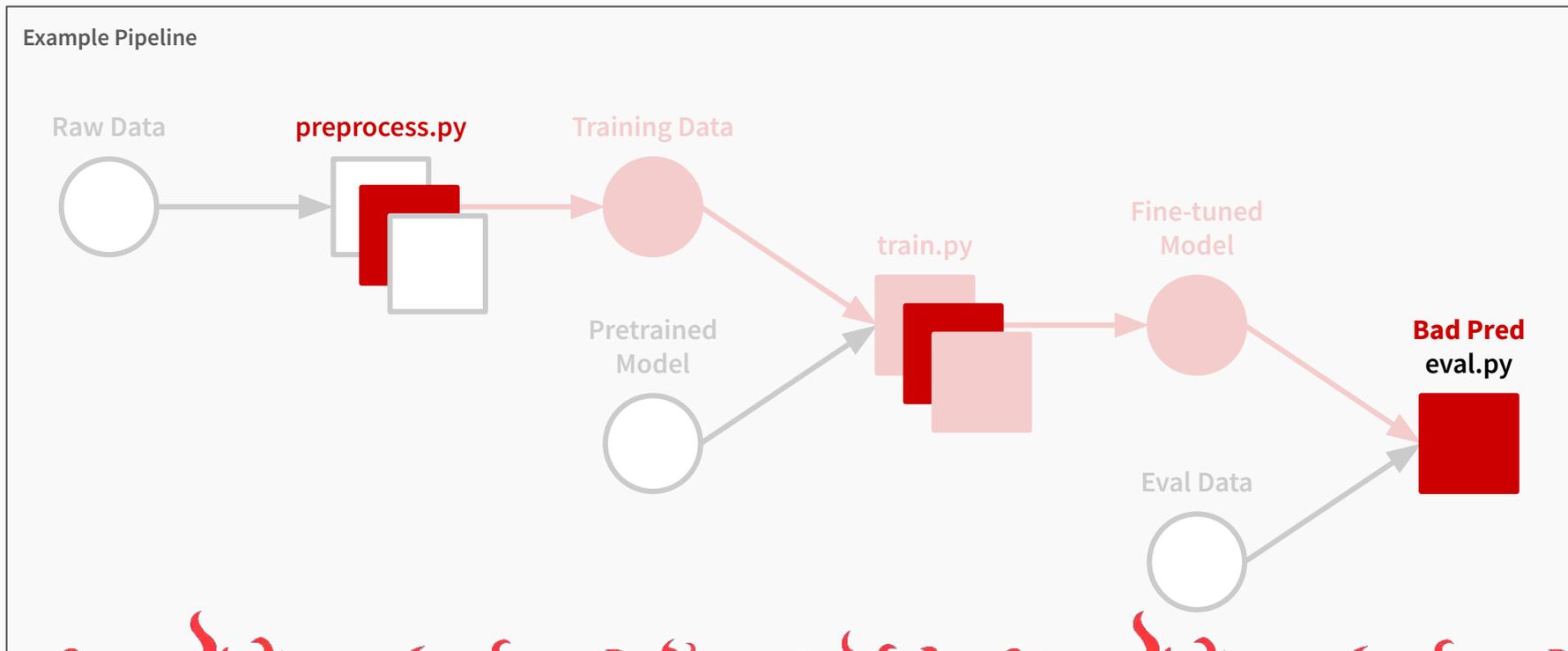
Bad predictions because of **preprocessing**?



Bad predictions because of **raw data**?



Bad predictions because of **multiprocessing**?



Bad predictions because of multiprocessing?

Example Pip

Raw Da



red
by

Bad predictions because of multiprocessing?

Example 11



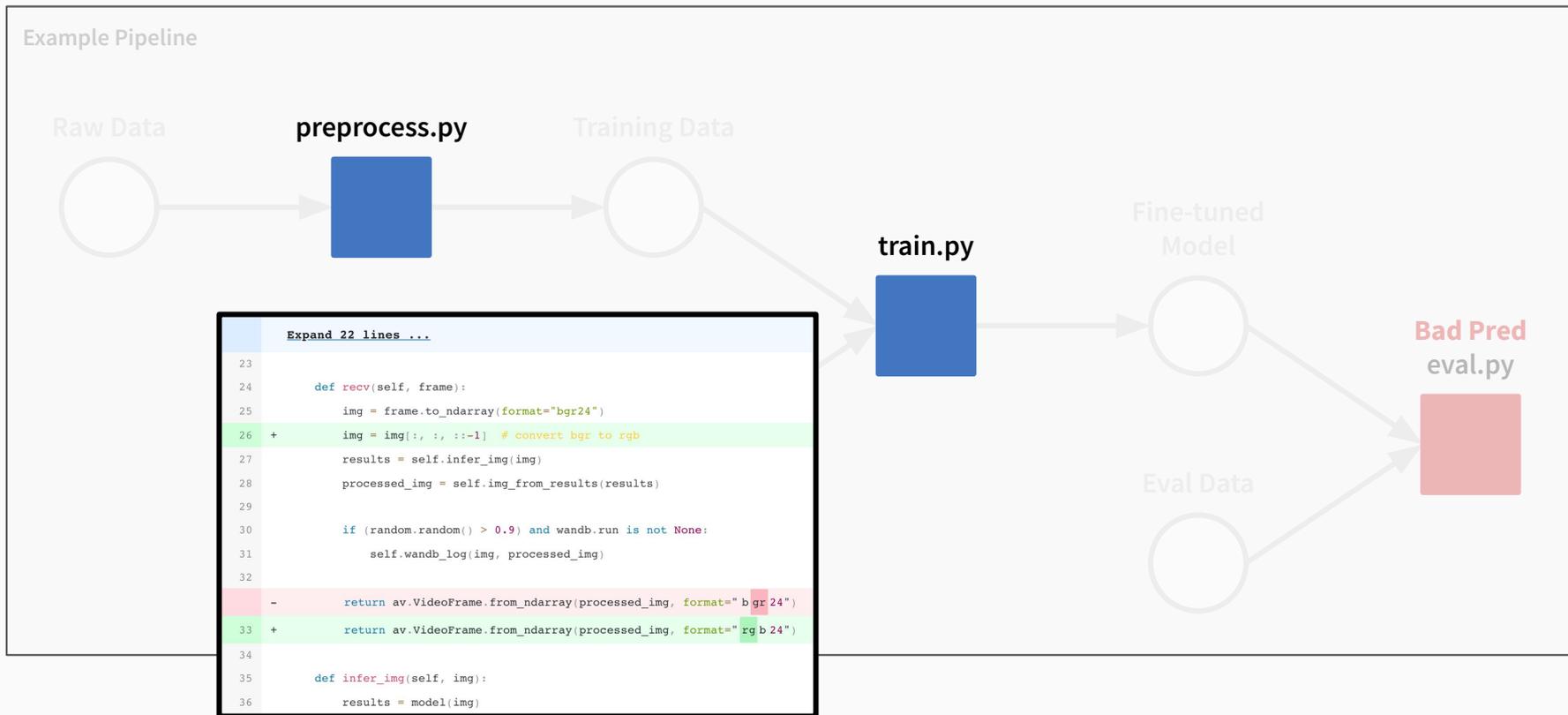
How do you debug a model pipeline?



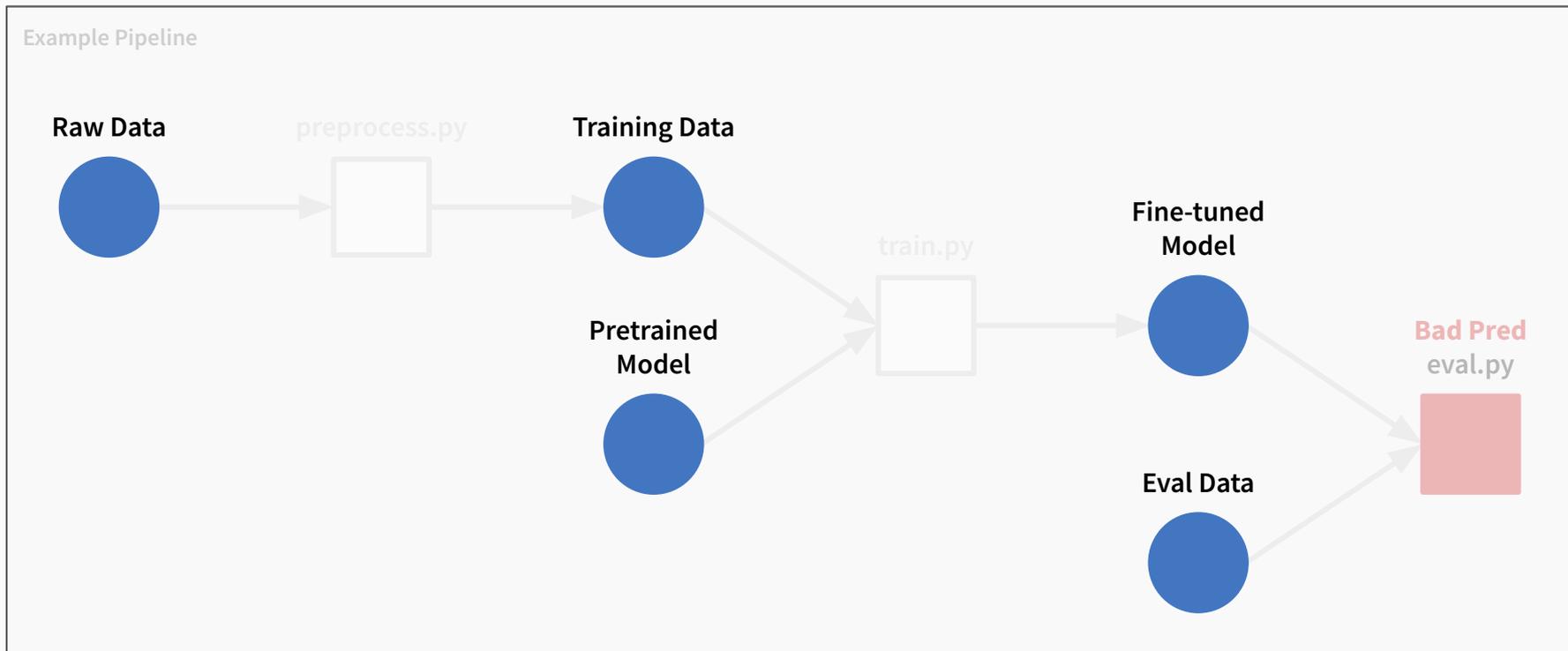


Check the Code

Problem with code? More than **git diff**



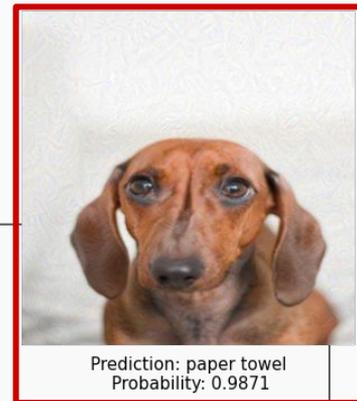
What about the input/output artifacts?





Check the inputs

Bad predictions because of **Raw Data**



Example Pipeline

Raw Data

preprocess.py

Training Data

train.py

Fine-tuned Model

eval.py

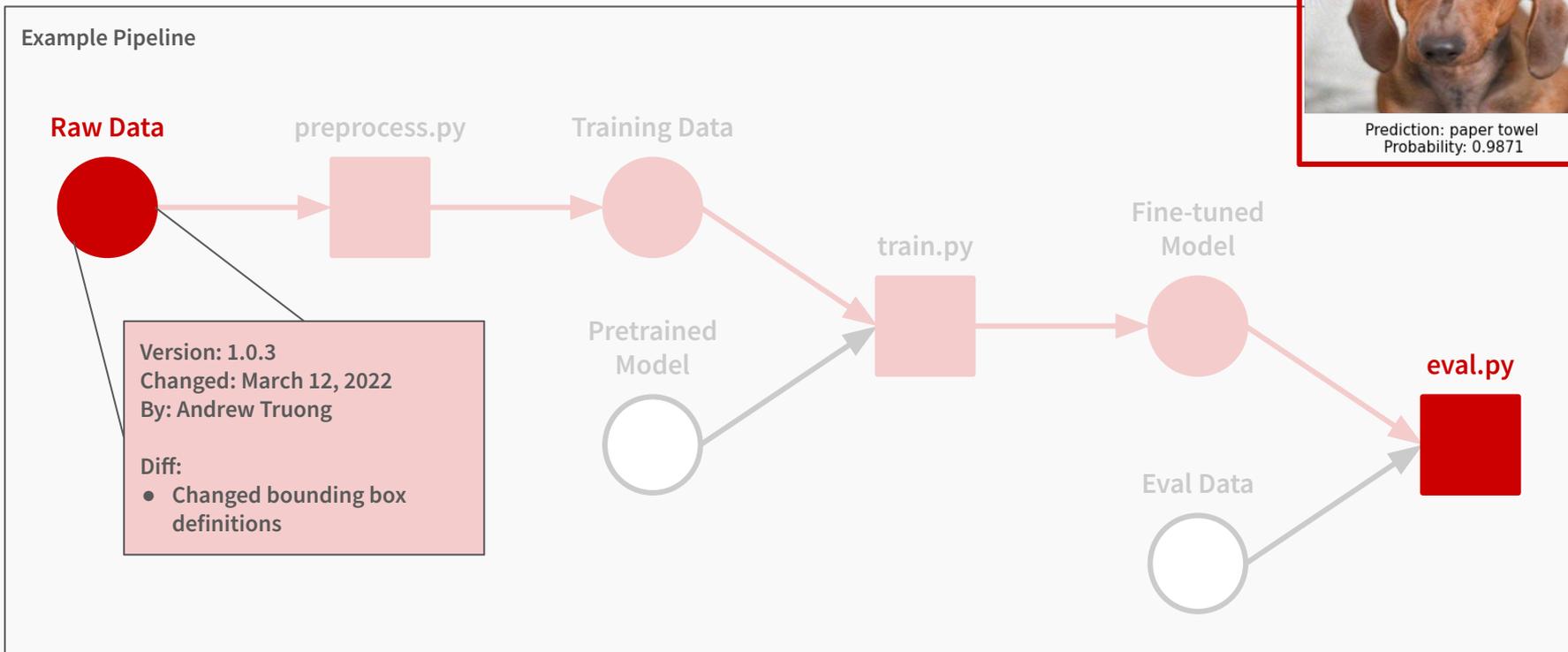
Version: 1.0.3
Changed: March 12, 2022
By: Andrew Truong

Diff:

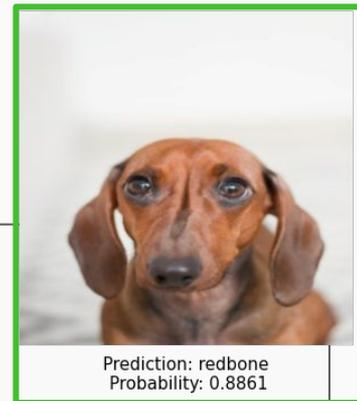
- Changed bounding box definitions

Pretrained Model

Eval Data



Good predictions after reverting Raw Data



Prediction: redbone
Probability: 0.8861

Example Pipeline

Raw Data

preprocess.py

Training Data

train.py

Fine-tuned Model

eval.py

Version: 1.0.2
Changed: March 11, 2022
By: Ben Sherman

Diff:

- Added 1713 new images
- Updated annotations.json

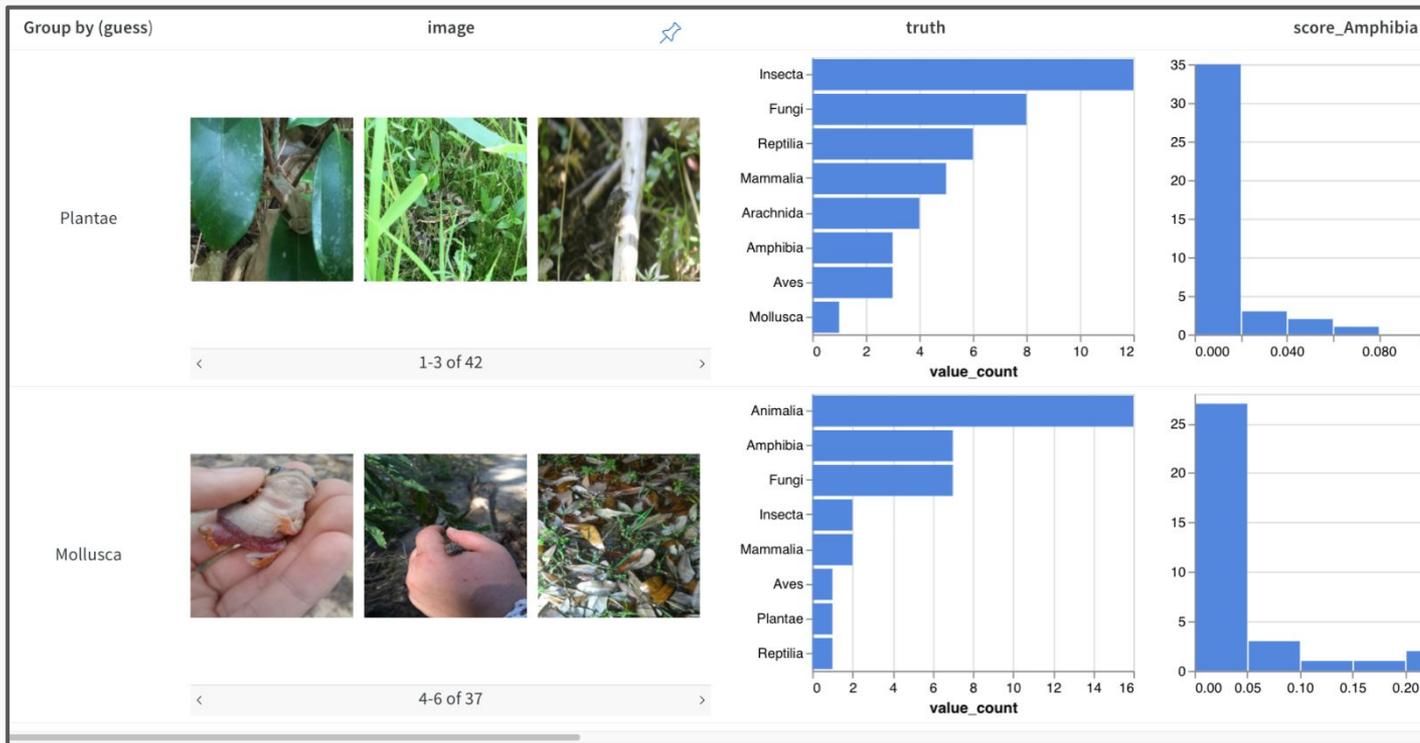
Pretrained Model

Eval Data



Check the outputs

Tables – DataFrames with rich media support



eval.py



Three principles of an ideal ML workflow



Rapidly iterate

to continuously refine and optimize models



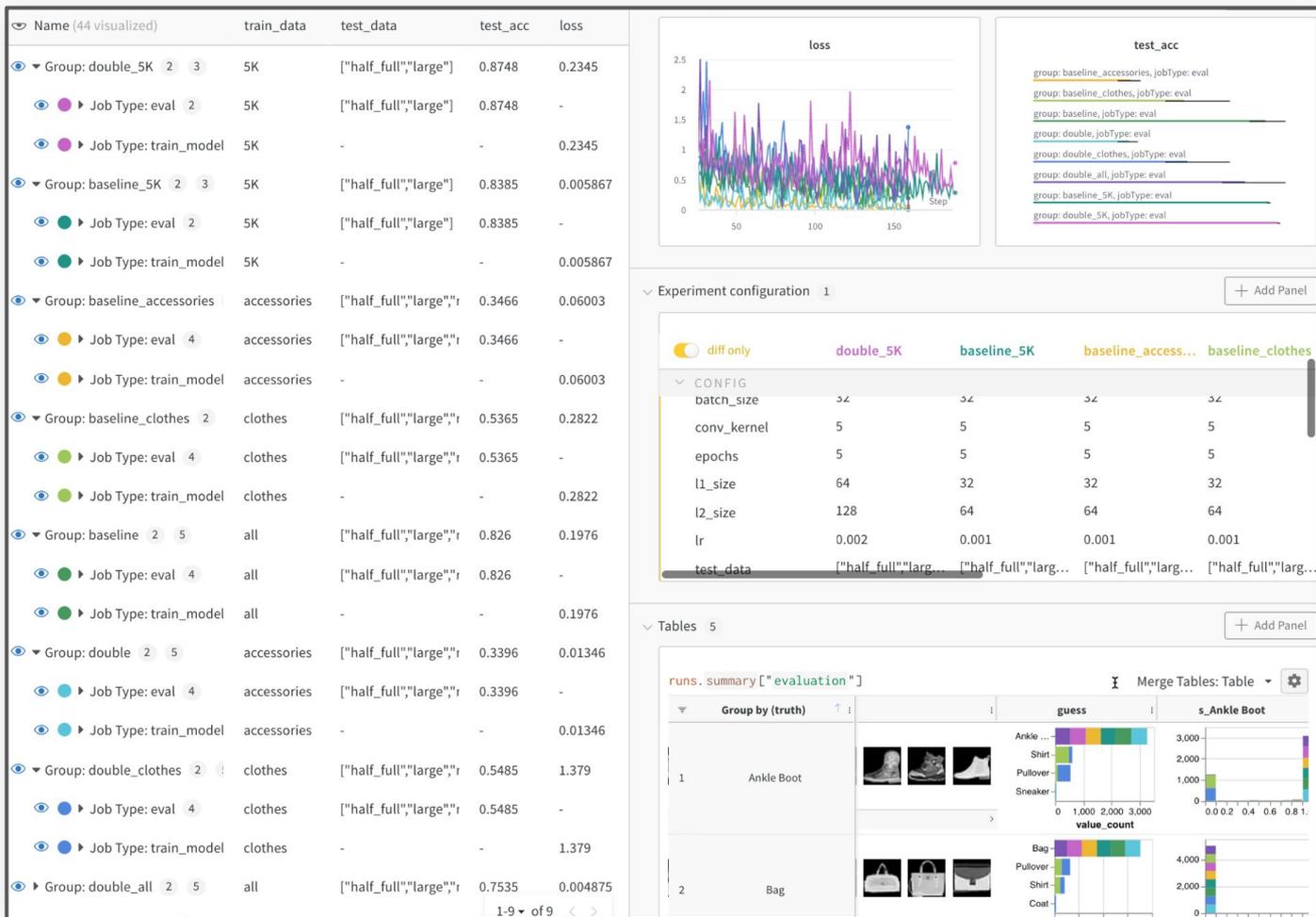
Reproduce

to reduce key-person dependencies



Collaborate

to ensure knowledge transfer across the organization



Check any metrics



Gourab 6:26 PM

Cool report, what about policy loss and CPU utilization?



Andrew Truong 🌊 6:27 PM

I didn't think it was important — let me get back to you later...



Gourab 6:28 PM

It seems you don't think anything I suggest as important.

Check any metrics



Gourab 6:26 PM

Cool report, what about policy loss and CPU utilization?



Andrew Truong 6:27 PM

I didn't think it was important — I

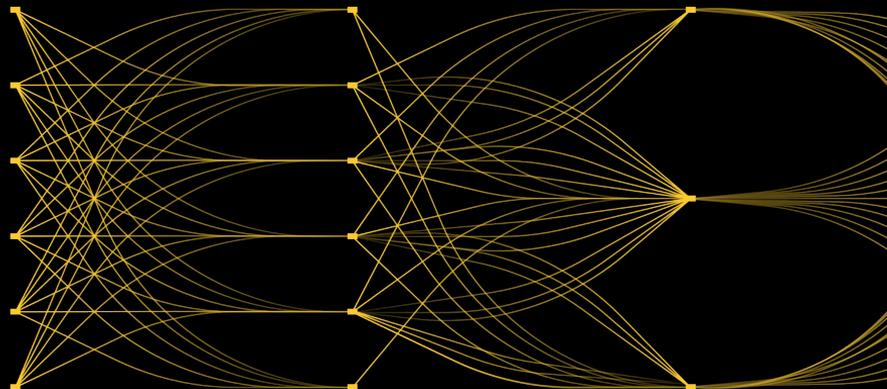
The screenshot shows a search interface with two panels. The left panel, titled "Search projects", lists several project names: brain-tumor-test-viz, g2net-cqt, trace, hf-flax-alberti-poetry, hf-flax-gpt2-tamil, hf-flax-transcoder, hf-flax-roberta-marathi, custom_yolov5, cleanRL, and niterch-mjiet-cagemaker. The right panel, titled "Search panels", lists various chart paths: charts, charts/episode_reward, charts/episode_reward/AttackRe..., charts/episode_reward/Produce..., charts/episode_reward/Produce..., charts/episode_reward/ProduceWorkerRev, charts/episode_reward/Resourc..., charts/episode_reward/WinLoss..., charts/learning_rate, and charts/sps. At the bottom of the interface are two buttons: "Import panel" and "Add panel".



Unified Reporting and Dashboarding

Weights & Biases

Open Source
Research





The world's leading ML teams trust us



COATUE INSIGHT BOND





The top open source research orgs use us



EleutherAI



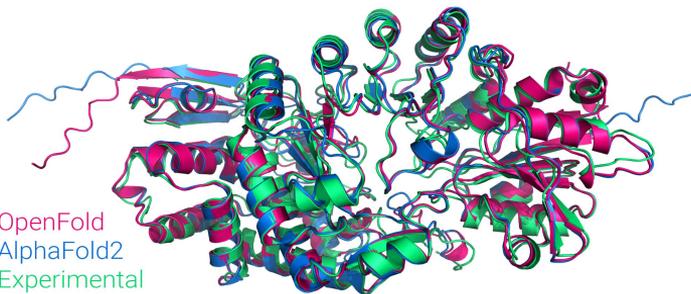
LAION



CarperAI



Harmonai



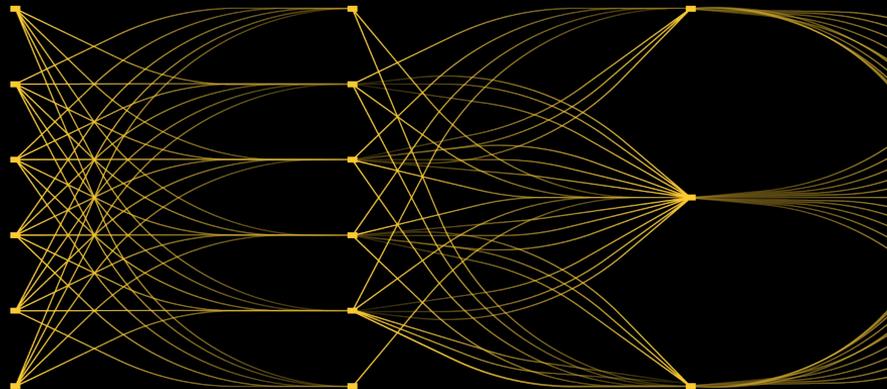
OpenFold



Craiyon

⋮⋮⋮ Weights & Biases

Integrations



Fits into your workflow

Integrated into every popular ML framework

 PyTorch

 PyTorch Lightning


TensorFlow

 Keras



dmlc
XGBoost

spaCy

Instrumented into over 6,000 popular ML repos



 Detectron2



Catalyst

Runs on every cloud or in your own infra



Google Cloud



Competition Time!

wandb.me/xx

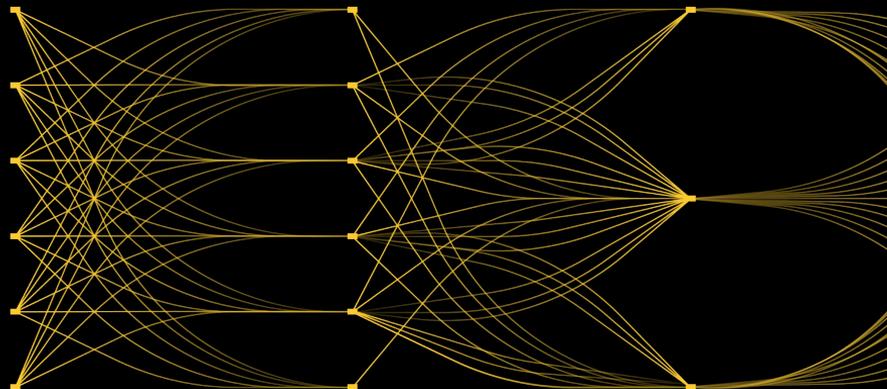
 Weights & Biases

The W&B Course

www.wandb.courses

⋮⋮⋮ Weights & Biases

Thank You!

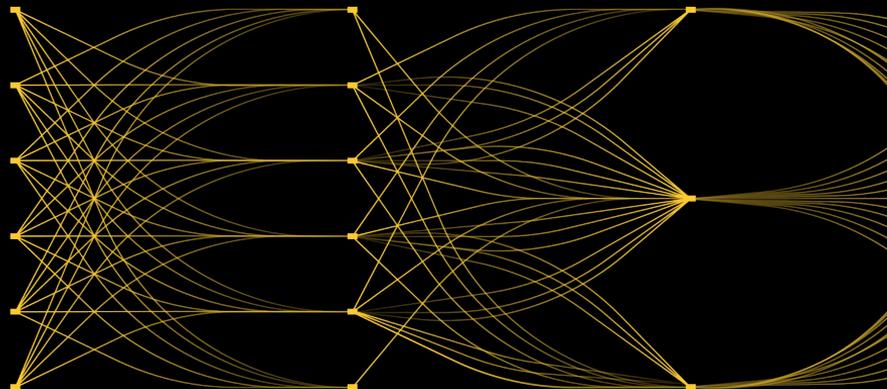


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- YouTube – wandb.me/youtube
- Twitter – wandb.me/twitter

Appendix





Andrew's Presentation

<https://www.youtube.com/watch?v=Se1HvbAM004&t=12s>