

THE BIN CONUNDRUM

Image-Based Waste Sorting



Data Knyts

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MOTIVATION

***Have you ever been
confused where to
throw trash?***



PROBLEM STATEMENT

The Garbage Problem

Waste sorting is critical for increasing the amount of waste that can be recycled.

However, it is often impractical to sort large quantities of waste by hand.



Canada's National Observer

Ontario's garbage problem is overwhelming

Residential waste — those blue boxes of juice containers, cardboard and other household items — has been recycled

3 weeks ago



Digital Journal

Automated Waste Collection System Market to Grow at a ...

However, the segregation of waste at a high scale is a tedious ... smart and intelligent garbage collection and sorting solutions.

2 days ago

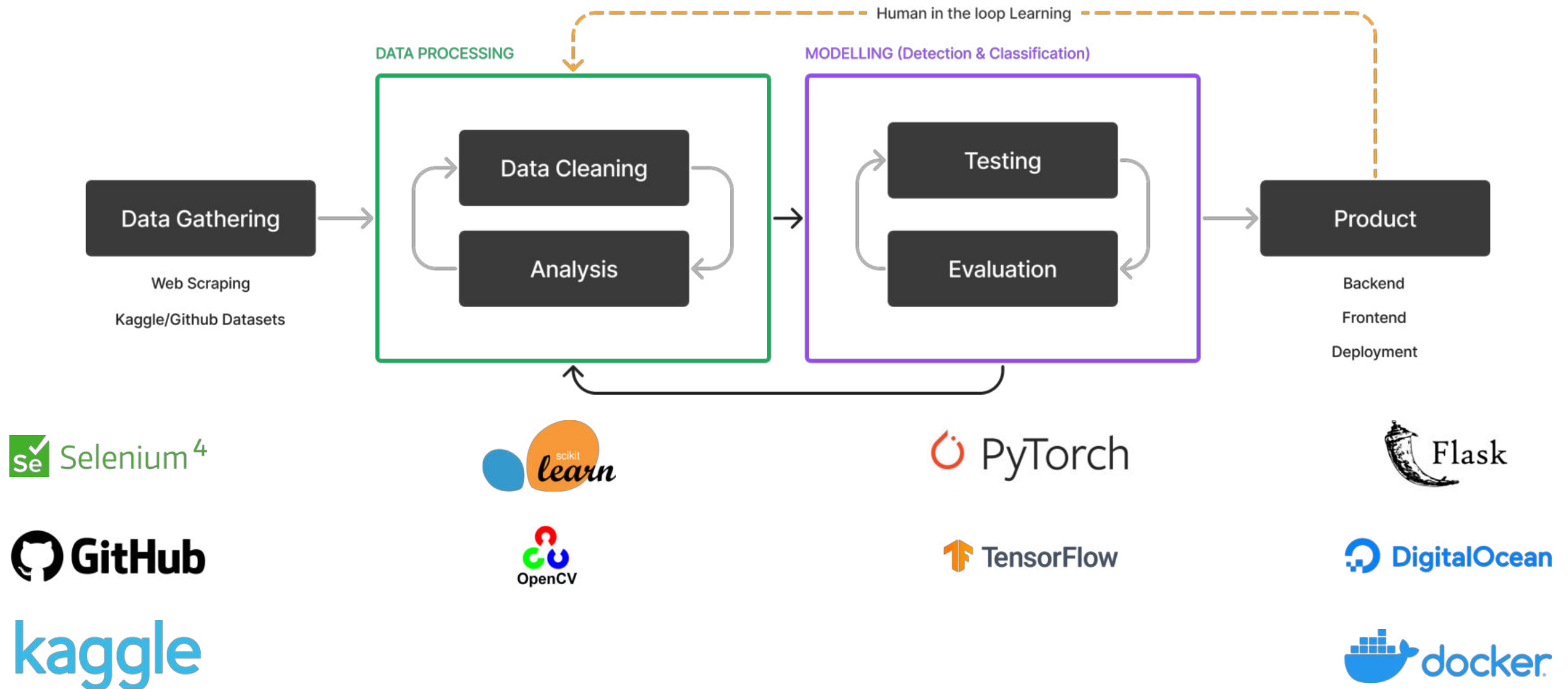
GOALS & AIM

Our Intention

- Can we improve waste sorting by using a neural network to identify which waste products are compostable and/or recyclable?
- Via comparative analysis, which neural network provides the best results for identifying waste? Are some better than others in certain scenarios?
- Can we improve this process by utilizing active learning procedures?

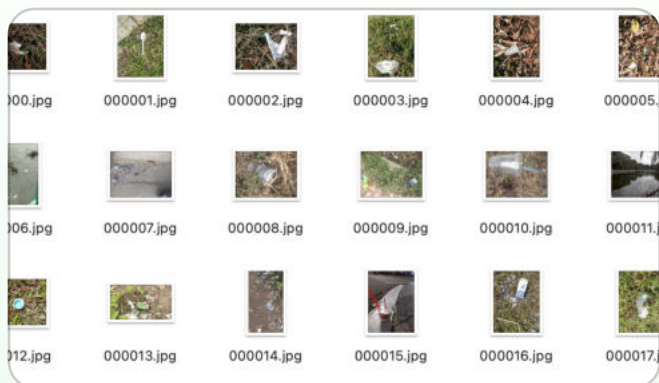


METHODOLOGY & TOOLS



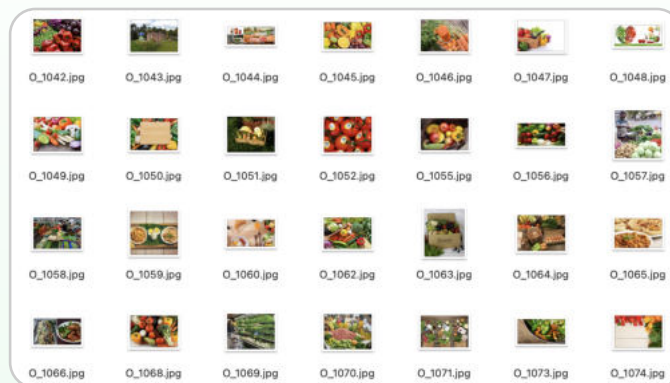
DATA

Annotated Data



Taco Dataset

Non-Annotated Data



4+ Sets Kaggle/GitHub

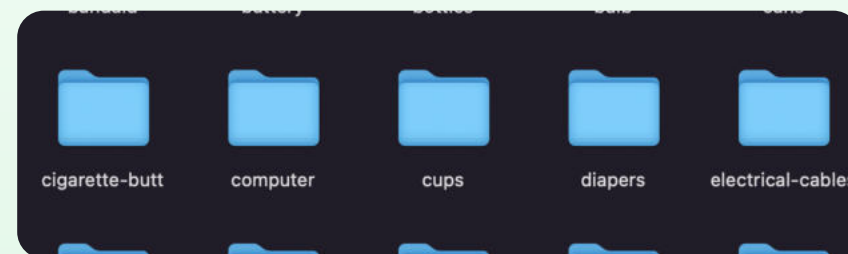
Scraped Data



20K+ images scraped

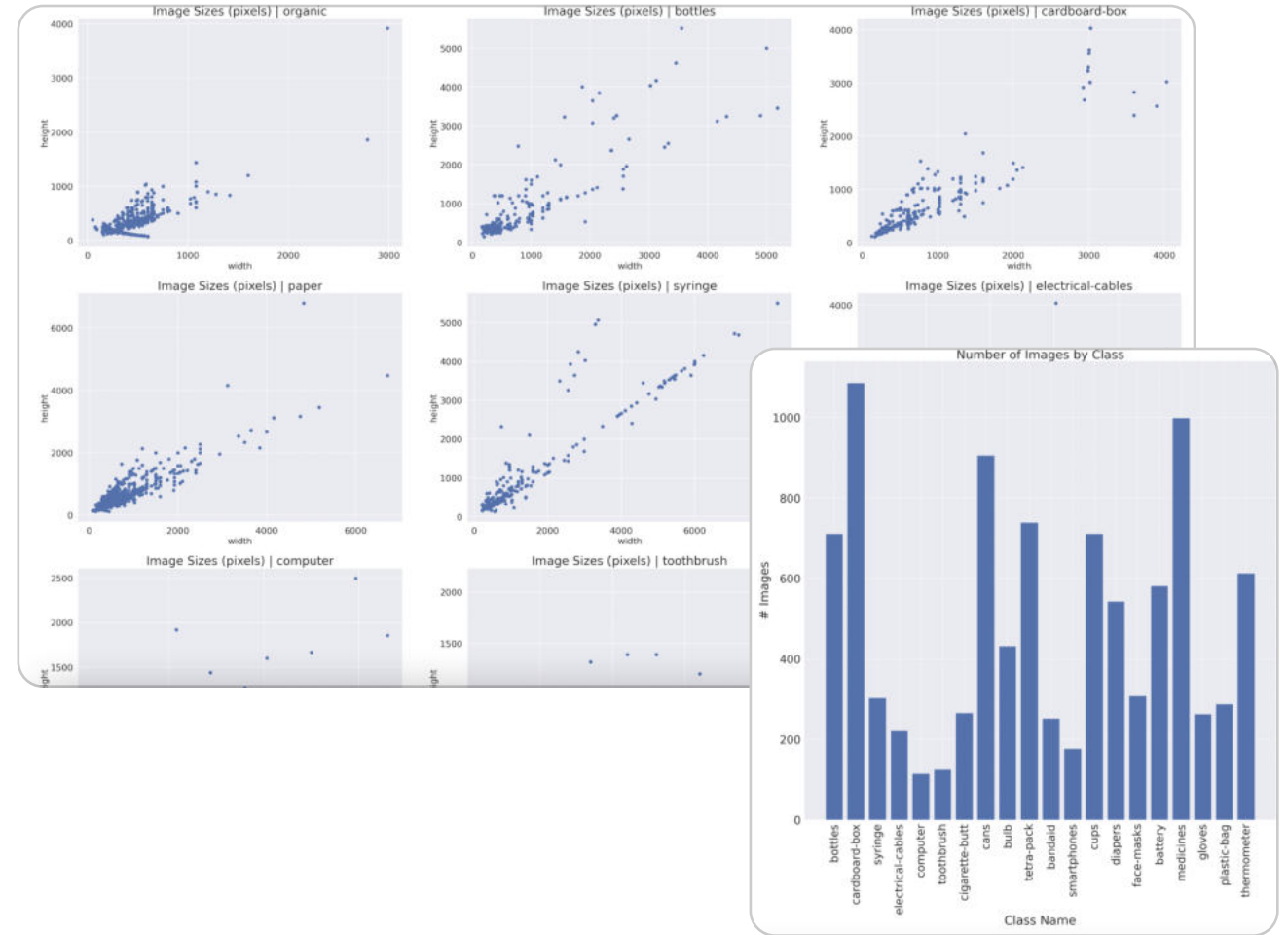
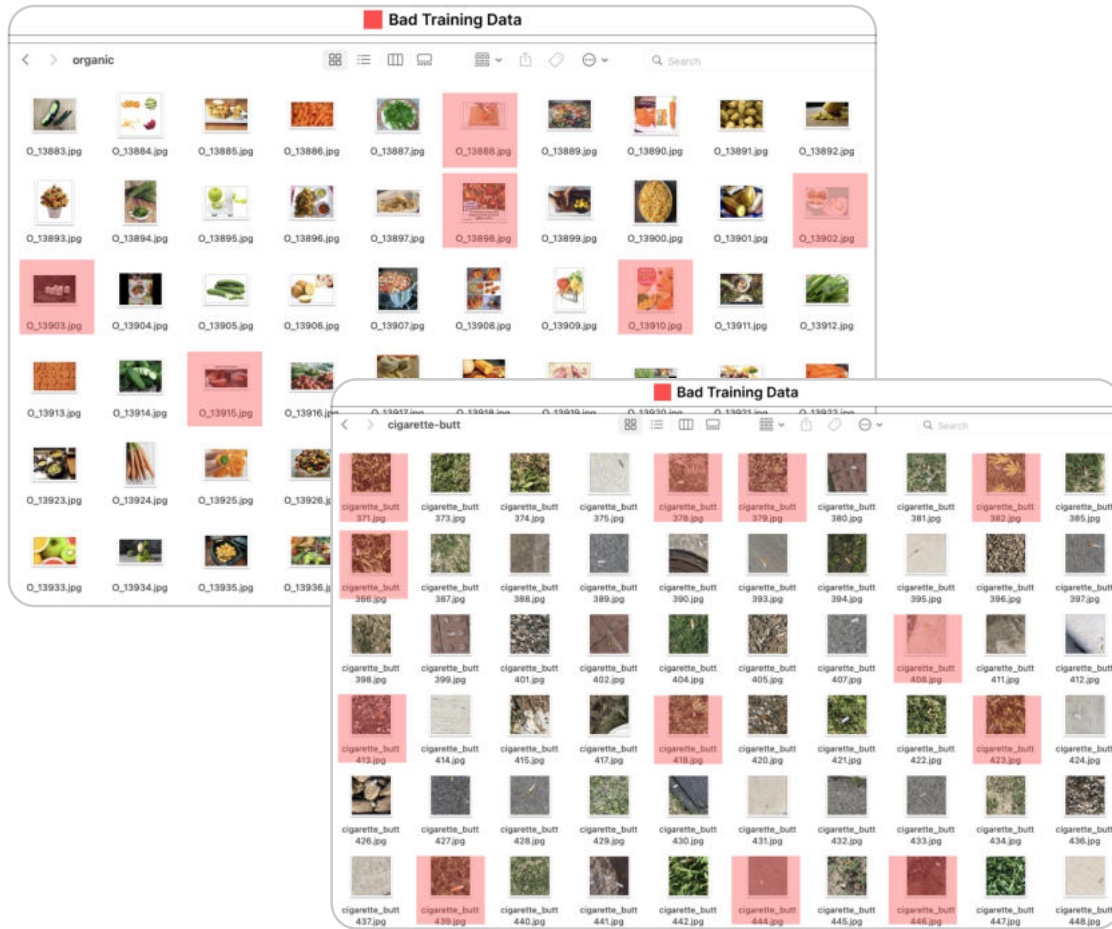
Dataset: 44,200 items
Size: 3.91 GB

Total Size



22 Classes

CLEANING & PROCESSING



MODELS

CLASSIFICATION

- Vgg16
- Resnet18
- Inception-v3
- SqueezeNet

DETECTION

- Mask R-CNN with Resnet50

```
model_vgg.classifier = nn.Sequential(*list(model_vgg.classifier.children())[:-1] + [nn.Linear(num_fts, len(all.clas
model_vgg = model_vgg.to(device)

criterion = nn.CrossEntropyLoss()

# Observe that only parameters of final layer are being optimized as
# opposed to before.
optimizer_vgg = optim.SGD(model_vgg.classifier.parameters(), lr=0.001, momentum=0.9)

# Decay LR by a factor of 0.1 every 7 epochs
exp_lr_scheduler = optim.lr_scheduler.StepLR(optimizer_vgg , step_size=7, gamma=0.1)

checkpoint_path = "./checkpoints/vgg16_all_simply/"

model_vgg = train_model(all_dataSets, all_dataLoader, model_vgg, criterion, optimizer_vgg,
                        exp_lr_scheduler, checkpoint_path, num_epochs=25, device=device)

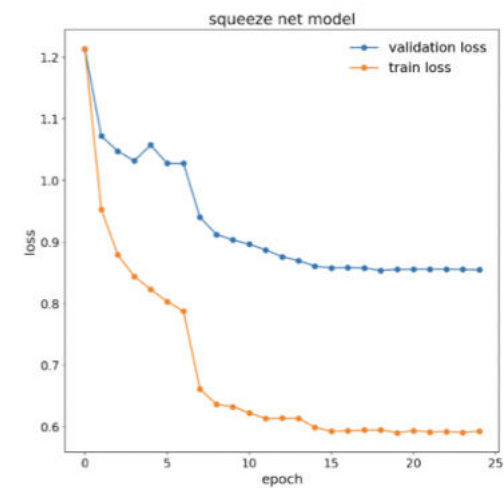
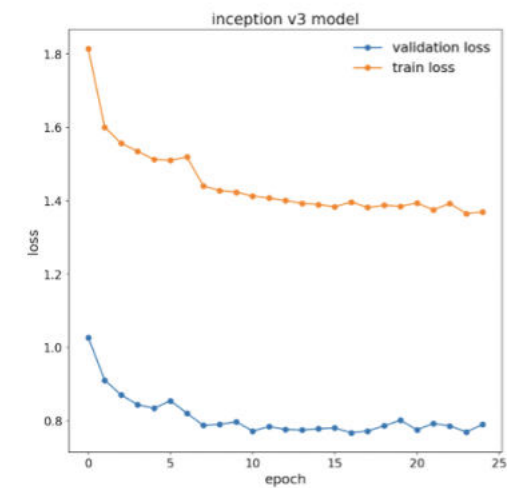
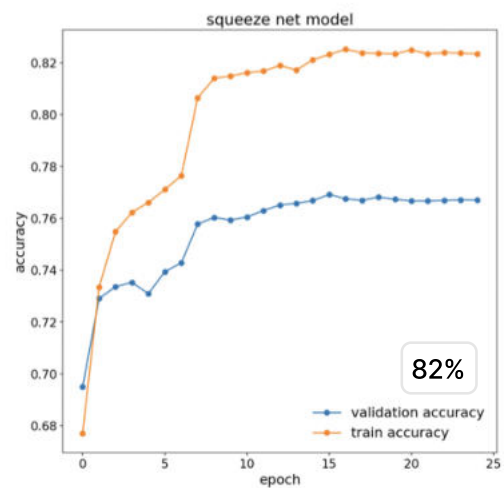
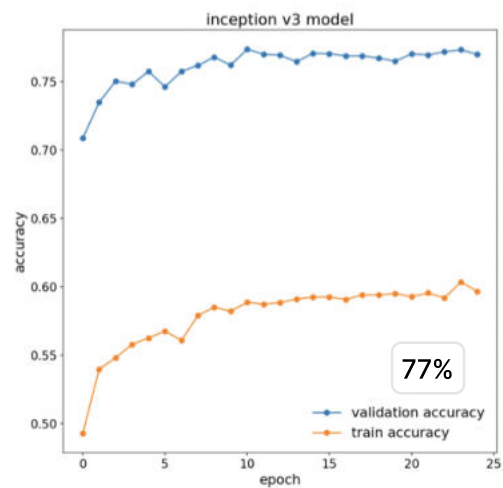
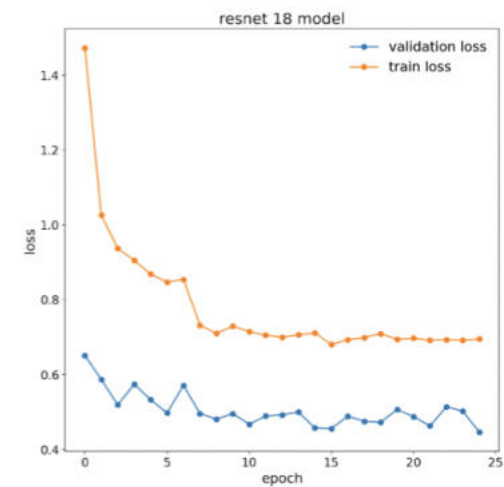
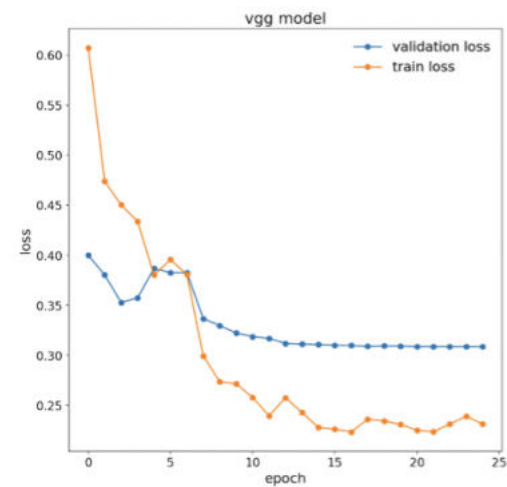
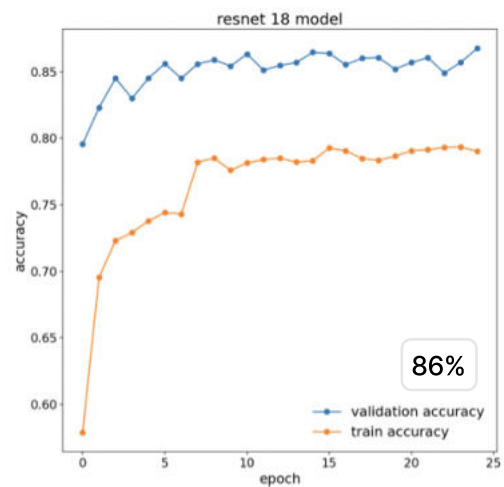
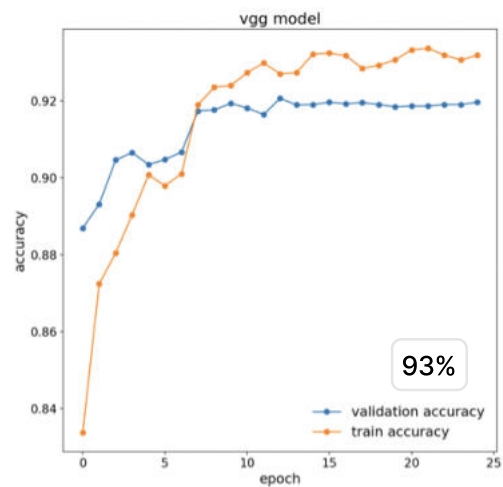
npy expressed in bytes should be converted to RGBA images
warnings.warn(
/home/tanmay/miniconda3/lib/python3.9/site-packages/PIL/Image.py:945: UserWarning: Palette images with Transpare
ncy expressed in bytes should be converted to RGBA images
warnings.warn(

train Loss: 0.2312 Acc: 0.9318

/home/tanmay/miniconda3/lib/python3.9/site-packages/PIL/Image.py:945: UserWarning: Palette images with Transpare
ncy expressed in bytes should be converted to RGBA images
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ncy expressed in bytes should be converted to RGBA images
warnings.warn(

val Loss: 0.3085 Acc: 0.9196
```


EVALUATION



Accuracy

Losses

RESULTS

What works well?

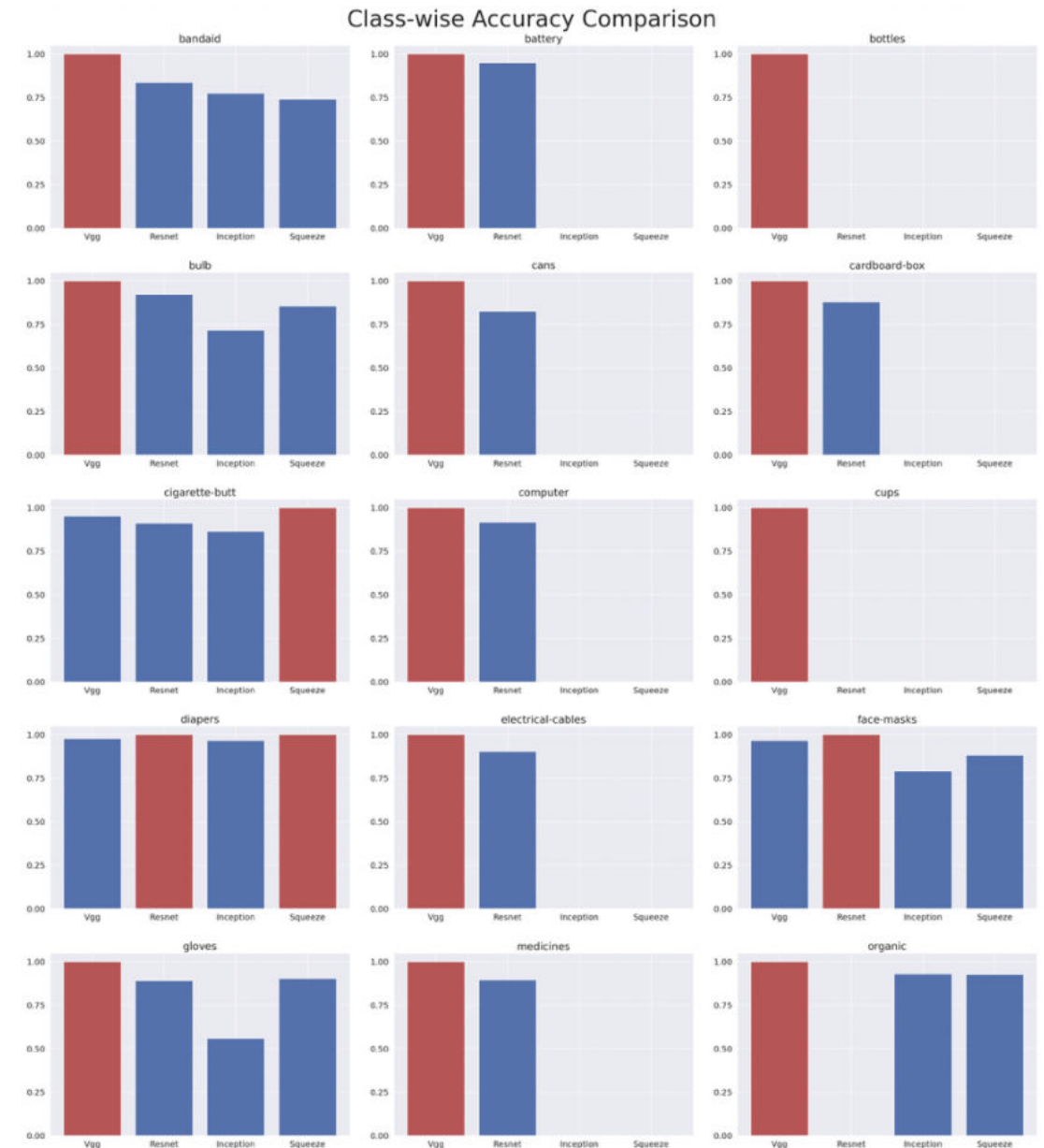
- Classification of items: bandaid, electronics, face masks, cups, organic, etc.
- Detection of items: cigarettes, bottles, cups.
- Detection on bounding boxes.

What doesn't?

- Limited training for detection: items detected but unable to classify.
- Bias for classification label - organic

BEST MODEL

VGG16 with 93% Overall accuracy



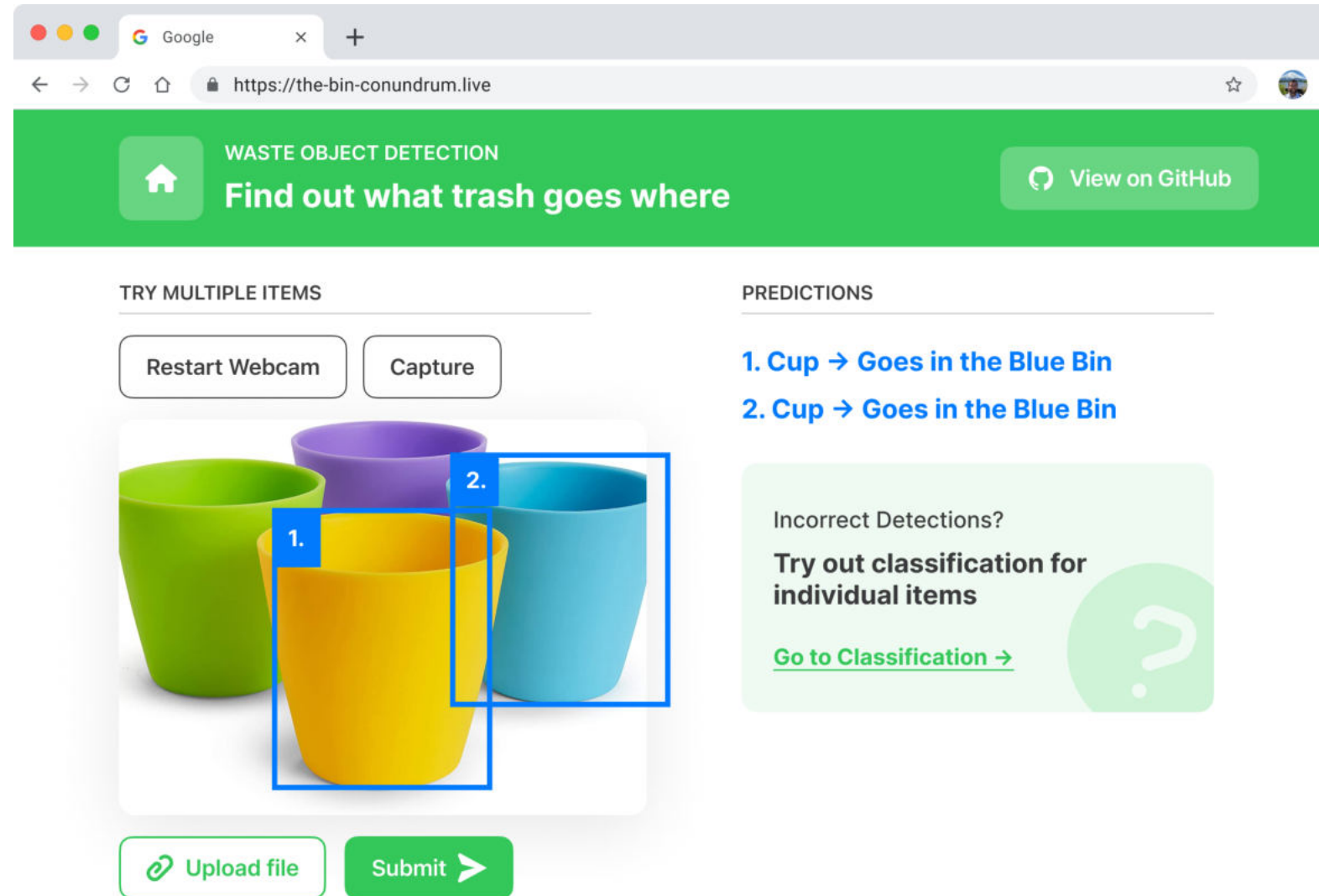
Class-wise accuracy

DATA PRODUCT

Our data product is a web app that integrates the classification and detection models into a single comprehensive system.

TRY IT OUT! 🎉

<https://the-bin-conundrum.live>



LEARNINGS

- Data Cleaning is not for the faint hearted. Even when working with pre-existing datasets, outliers and faulty data can still be present.
- Reinforce faith on: *Garbage In → Garbage Out*
- Checkpointing is of critical value when models have long training times.
- Model pros and cons in real-life usage: size, load Times, Accuracy trade-offs.
- ML Deployment with Containerization.



FUTURE WORK

What we have incorporated:

Dataset Creation

- Keeping a track of every image sent on the web-app and storing those predictions.
- Make Data lake through S3

What we plan to:

Active Learning

- Apply active (human-in-the-loop) learning for the dataset created and retrain our models.

Thank you



Tanmay Jain

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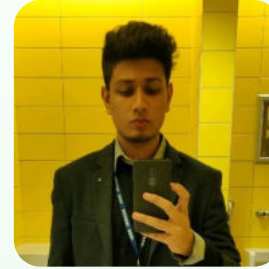
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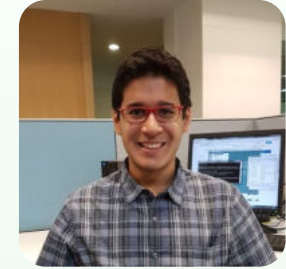
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