ML Experimental Design Discussion

Overview of Assignment 1

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ML Experimental Design Overview

Problem Definition and Experimental Design Setup

Data Collection

Model Design and Hyperparameter Tuning

Performance Evaluation



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Problem Definition – Assignment 1

The city of Calgary assigned your team to develop a garbage classification system that, given a cellphone picture of an object you want to throw away and a short sentence describing the object, the system tells you whether to throw it in the "green", "blue", "black" trash bin or somewhere else. You can see more information about the city of Calgary's garbage collection system here: https://www.calgary.ca/uep/wrs/what-goes-where/default.html.



Whenever we're starting with a new ML problem, a literature review of similar works can help provide a good starting point!



Experimental Design Considerations – Assignment 1

Data

Source, Diversity, Preprocessing



Assignment 1 – Data Source

 Write a quick description of the following piece of garbage which would help with sorting it?





Assignment 1 – Data Diversity

- How does garbage vary?
- How do images vary?
- How may these effects bias the model?











Assignment 1 – Data Preprocessing

- Object segmentation
- White background
- Pre-filtering
- Convert images to grayscale
- The object material alone does not determine the appropriate trash bin







Experimental Design Considerations – Assignment 1

Task Definition

Architecture, Output type, Metrics



Assignment 1 – Task Definition

Model Task complexity



Multi-object detection



Single object background segmentation

Pros vs. Cons?



Assignment 1 – Task Definition

Hardware limitations?





"Need a lighter high-performing model because of the computational limitations on cell phones when a new sample is detected."



Experimental Design Considerations – Assignment 1

Addressing
Anticipated Issues

Generalizability, Anticipated Model Uses



Assignment 1 – Potential Issues

Rare items that your model did not see during training?





"Another issue that can arise is the inability of the system to classify certain objects due to their rarity and the lack of data. A prime example would be Floppy Disks or VHS tapes that are generally not sold commercially anymore and are hard to find."



Assignment 1 – Potential Issues

Not green, nor black nor blue trash bin?







Assignment 1 – Potential Issues





"Another potential issue is the class overlap for certain items. For example, a clean pizza box can be disposed of in the blue bin, however if it is greasy/covered in food toppings, it should be disposed of in the green bin. Depending on how the photo is taken, it may be impossible to know for sure which class this item belongs to."



Assignment 1 – Good Suggestions

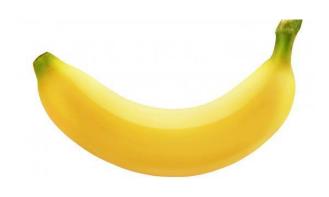
Crowdsourcing and future data collection

 "Once the photos will be taken from different cameras with different resolutions, we have planned to train and validate the model with some cell-phones and test them on the others to check our model's generalization."



Assignment 01 – Philosophical question...

Trash?







Thank you!

