



# WASTE IMAGE CLASSIFICATION

Python for Data Science | Final Project

Sanja Dragičević

---

1 RESEARCH PROBLEM

2 SOLUTION

3 METHODOLOGY

4 RESULTS

5 FUTURE IMPROVEMENTS

# RESEARCH PROBLEM

Problem Statement

---



Separating recyclable waste is a tedious task



Confusing recycling guidelines



Human error



Recycling contamination

# SOLUTION

Description

---



A computer vision-based waste management system

Scan, identify, and sort

# SOLUTION

## Objective

---



Train machine learning model using images of different types of recyclable waste to accurately classify an image into one of the waste categories

# SOLUTION

## Assumptions

---



1

Images show one or more items of the same waste category

2

Categories in compliance with recycling guidelines

3

Images in the training set are accurately classified

# METHODOLOGY

## Overview

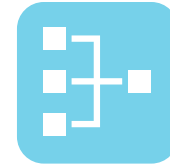
---

Data  
custom dataset



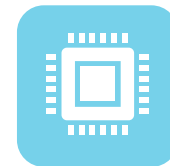
Model  
Convolutional Neural Network

Tool  
Jupyter Notebook



Model Architecture  
ResNet50

Python Package  
fastai



Processor  
CPU

# METHODOLOGY

## Process Overview

---

1

### Data collection

Carefully viewed and downloaded images

Stored data on an easily available online platform

2

### Dataset preparation

Imported and loaded images

Split data into training and validation sets

Augmented data

3

### Model training

Trained model using transfer learning

Retrained model with optimized hyperparameter

4

### Model evaluation

Summarized and visualized prediction results on validation set



# METHODOLOGY

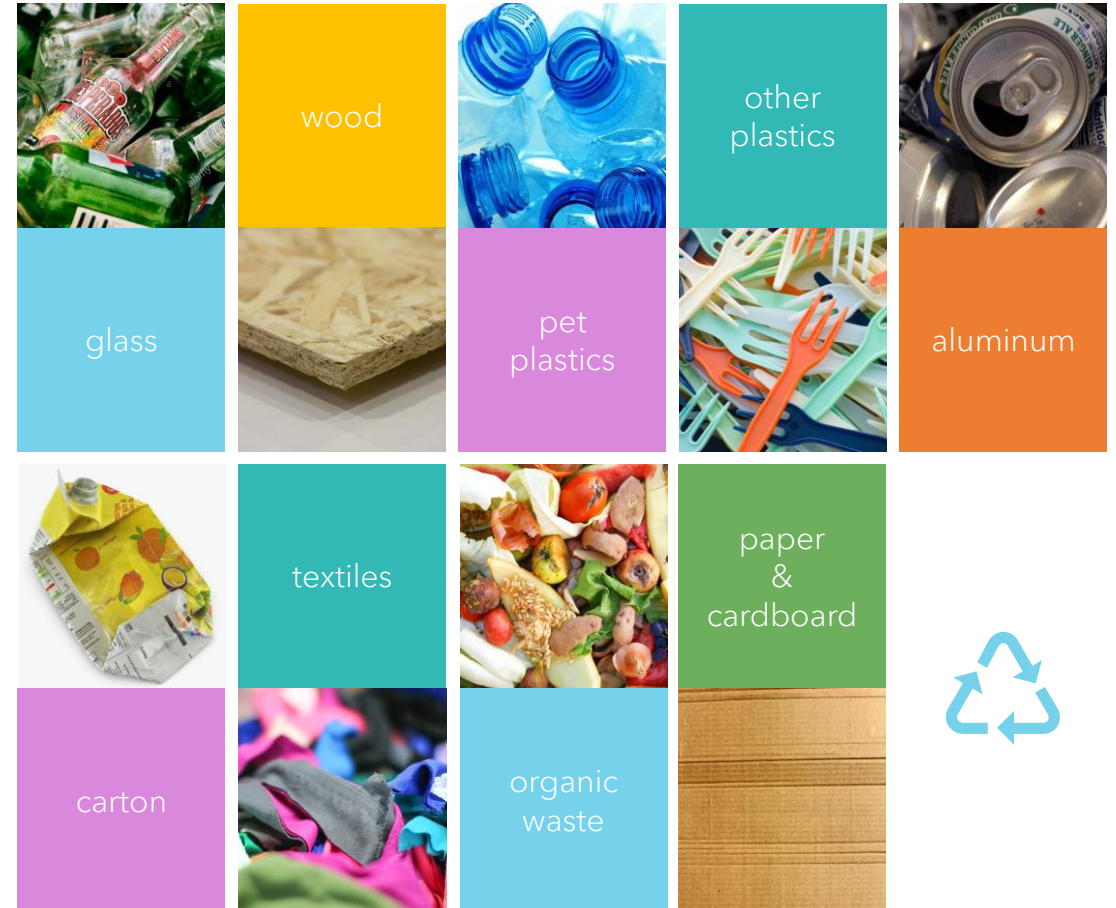
## Data Collection

9  
classes

appr. 350  
handpicked images per class

Google Images  
source

Kaggle  
storage



# METHODOLOGY

## Dataset Preparation

80%  
training set

20%  
validation set

Resize  
item transformations

Aug\_transforms; no flip  
batch transformations



glass



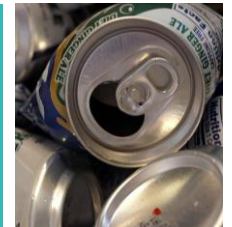
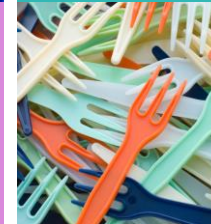
wood



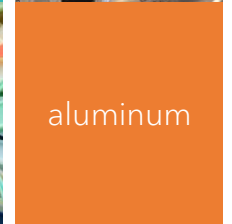
pet  
plastics



other  
plastics



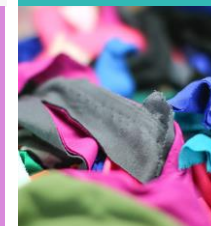
aluminum



carton



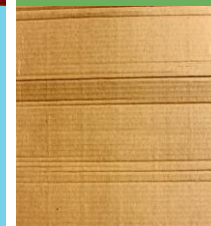
textiles



organic  
waste



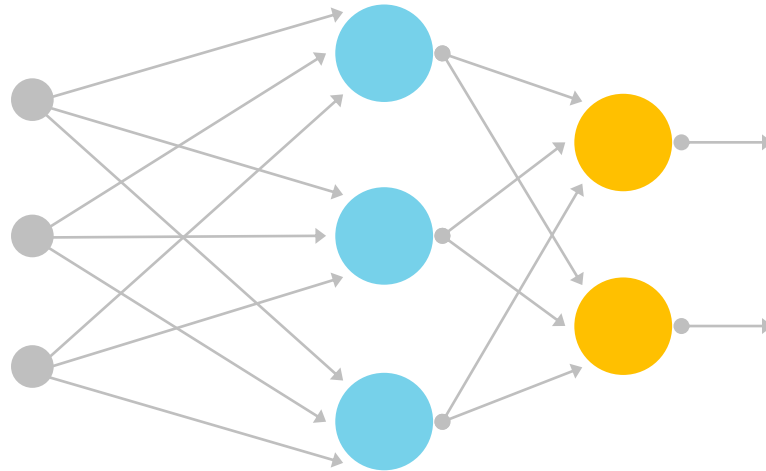
paper  
&  
cardboard



# METHODOLOGY

## Model Training

---



### Convolutional Neural Network

Deep learning algorithm used to analyze image objects

### ResNet50

Residual network variant with 50 layers (48 Convolution layers , 1 MaxPool, and 1 Average Pool layer) used for transfer learning

### Learning rate optimization

The most important neural network hyperparameter  
Optimizing the trade-off between the rate of convergence and overshooting

# METHODOLOGY

## Model Evaluation



Stage 1

89,9%

accuracy



Learning rate optimization



Stage 2

92,1%

accuracy

## RESULTS

## Testing

	Aluminium	Carton	Glass	Organic Waste	Other Plastics	PET Plastics	P & C	Textiles	Wood
Actual	Aluminium	54	1	1	0	1	0	0	0
Carton	3	72	0	0	0	0	2	0	0
Glass	6	0	65	0	0	2	0	0	0
Organic Waste	0	0	0	60	2	0	0	0	1
Other Plastics	4	2	0	0	66	0	1	0	0
PET Plastics	3	1	4	0	2	60	0	1	0
P & C	1	2	0	0	1	0	71	1	1
Textiles	1	0	0	0	2	1	0	78	0
Wood	0	0	0	0	0	0	3	0	60
	Aluminium	Carton	Glass	Organic Waste	Other Plastics	PET Plastics	P & C	Textiles	Wood
	Predicted								

## RESULTS

## Testing

	Aluminium	Carton	Glass	Organic Waste	Other Plastics	PET Plastics	P & C	Textiles	Wood
Actual	Aluminium	54	1	1	0	1	0	0	0
Carton	3	72	0	0	0	0	2	0	0
Glass	6	0	65	0	0	2	0	0	0
Organic Waste	0	0	0	60	2	0	0	0	1
Other Plastics	4	2	0	0	66	0	1	0	0
PET Plastics	3	1	4	0	2	60	0	1	0
P & C	1	2	0	0	1	0	71	1	1
Textiles	1	0	0	0	2	1	0	78	0
Wood	0	0	0	0	0	0	3	0	60
	Aluminium	Carton	Glass	Organic Waste	Other Plastics	PET Plastics	P & C	Textiles	Wood
	Predicted								

# RESULTS

## Testing



pet plastics



glass



Most confused  
PET Plastics and Glass

Problem  
Difficult to differentiate even by human eye

# FUTURE IMPROVEMENTS

## Methodology Improvements

---

**Data**  
custom dataset



**Tool**  
Jupyter Notebook



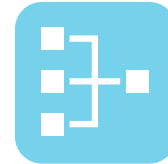
**Python Package**  
fastai



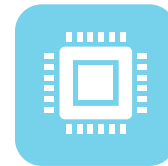
**Model**  
Convolutional Neural Network



**Model Architecture**  
ResNet50



**Processor**  
CPU





# FUTURE IMPROVEMENTS

## Methodology Improvements

---

**Data**  
bigger and better dataset



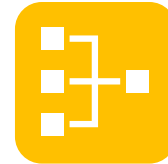
**Tool**  
Google Collab



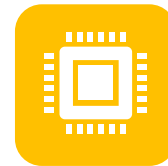
**Python Package**  
fastai



**Model**  
Convolutional Neural Network



**Model Architecture**  
ensemble modeling



**Processor**  
GPU

# FUTURE IMPROVEMENTS

## Methodology Improvements

---



### Assumptions

better waste  
classification criteria

more/less waste  
categories



### Data

increase number of  
images

more HD images

consistent  
background behind  
items



### Model

ensemble learning or  
other CNN  
architectures

multi-label  
classification

overfitting  
techniques:  
regularization,...

GitHub Code:  
[Waste\\_Image\\_Classification](#)

sanja.dragicevic@live.com