Combating Human Trafficking from **Image Classification** of the **Hotel-ID dataset**

Computer Vision Project 2021/2022

Paper

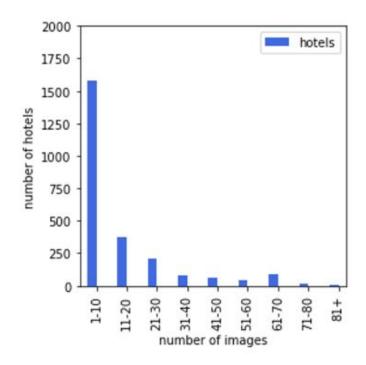
Problem



Hotel ID: **32248**

Dataset

- 97 527 images (~25GB)
- 7770 different classes (hotel ids)

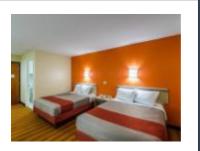


Problem characteristics

High Intra-class Variation

Low Inter-class Variation







Paper's Approach - Image Processing

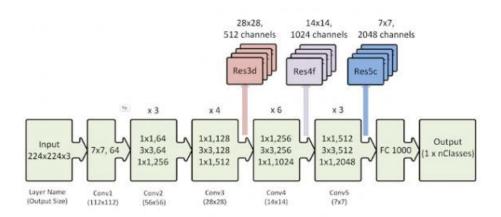




- Resize to 256x256
- Randomly Flip Horizontally
- Random Rotation (+/- 30°)
- Color Jittering

Paper's Approach - Model

ResNet50 pre-trained on ImageNet dataset



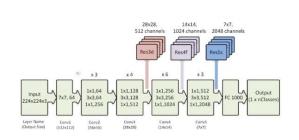
- Dropout of 50%
- Fully Connected Layer
- Label Smoothing
- SGD Optimizer

Paper's Approach - Classification & Results

Recall@1	Recall@10	Recall@100	Mean Average Precision@5
49.3%	68.8%	84.8%	55.1%

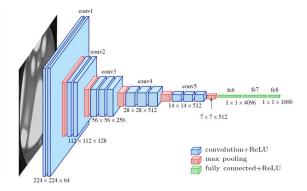
Ideal Scenario

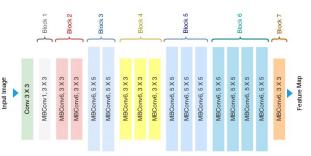
Various Models



ResNet Models

VGG Models

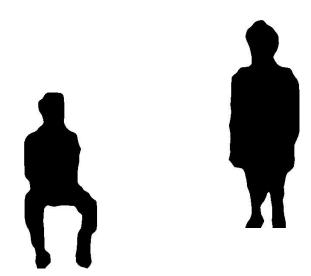




EfficientNet Models

Realistic Data

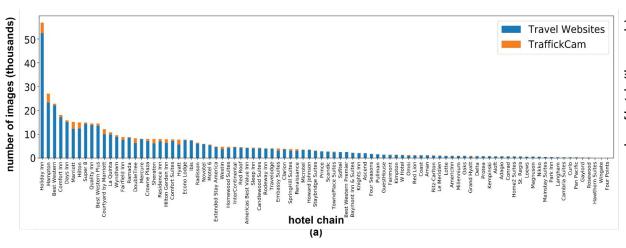
Human Posture Silhouettes

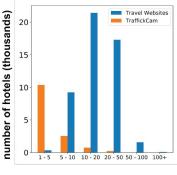


https://www.kaggle.com/deepshah16/silhouettes-of-human-posture

More Data

Hotels-50k Dataset





number of images (b)

https://paperswithcode.com/dataset/hotels-50k

Reality

Constraints

- Large Dataset (> 25GB)
- GPU intensive

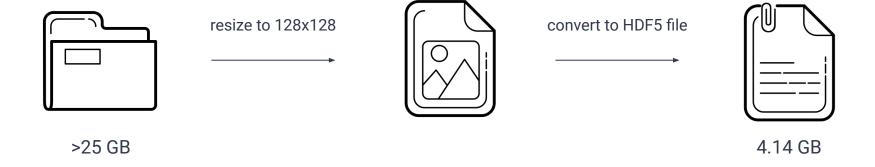








Dataset Optimization



Attempts

Optimizer Functions

- Adam optimizer
- Stochastic Gradient Descent

Model Backbone

- ResNet-50 V1
- ResNet-152 V1
- ResNet-50 V2
- ResNet-152 V2
- MobileNet V1
- MobileNet V2
- EfficientNet B1
- EfficientNet V2
- Inception V3

Additional Dense Layer

- None
- 64 nodes
- 128 nodes
- 256 nodes
- 512 nodes
- 1024 nodes

Intermediate Layers

- Dropouts
- Regulizers
- Pooling Layers
- Flatten Layer
- BatchNormalization Layer

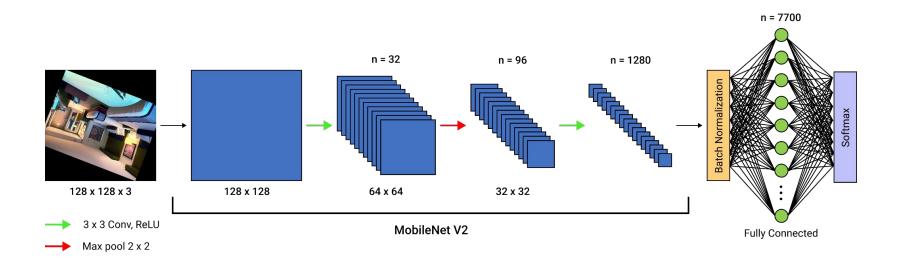
Final Model - Image Augmentation



- Random Horizontal Flip
- Random Vertical Flip
- Random Rotation between +/- 40°
- Random Contrast



Final Model - Model



- **Drop Out** of 0.5
- **L2 regularization** with value of 0.0001

Final Model - Results

	Accuracy	Top 5 Accuracy	Top 10 Accuracy
Project Model ¹	14.89%	24.42%	29.15%
Hotel-50k Model ²	8.1%	17.6%	34.8%
Control (random)	0.013%	0.64%	0.129%

¹ Trained for 40 Epochs (~6h)

² Stylianou, Abby, Hong Xuan, Maya Shende, Jonathan Brandt, Richard Souvenir, and Robert Pless. "Hotels-50k: A global hotel recognition dataset." In Proceedings of the AAAI Conference on Artificial Intelligence, vol. 33, no. 01, pp. 726-733, 2019.

Q&A