

# Maritime Vessel Images Classification Using Deep Convolutional Neural Networks

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# Introduction

# Convolutional Neural Networks

## Dataset - Data collection

- ▶ *E2S2 – Vessel* dataset with images collected from ShipSpotting
  - ▶ From 16<sup>th</sup> July, 2015 – 19<sup>th</sup> July, 2015
  - ▶ 150,000 images of 51,500 vessels
- ▶ Division: 80% in training, 20% in validation set
- ▶ Dataset refinement
  - ▶ No image belongs to more than one class
  - ▶ Images of same vessel only belong either to training or validation set but not both

# Dataset - Class hierarchy

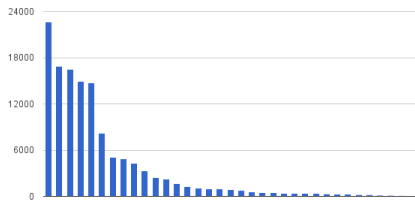
- ▶ ShipSpotting: 175 hierarchical classes
- ▶ E2S2-Vessel: aggregated to 35 classes

# Dataset - Class hierarchy

- ▶ ShipSpotting: 175 hierarchical classes
- ▶ E2S2-Vessel: aggregated to 35 classes
- ▶ Top dominants:
  - ▶ cargo vesel
  - ▶ tankers
  - ▶ bulkers
  - ▶ container vessel
  - ▶ passenger vessel
- ▶ Image distribution is not uniform



Figure 2: Sample images from E2S2-Vessel dataset. Images within the same column belong to same class. From left to right: (a) Cargo vessel; (b) Container vessel; (c) Fishing vessel; (d) Military vessels; (e) Tugs



# Dataset - Prepossessing

- ▶ After refinement: 130,000 images in E2S2-Vessel
  - ▶ Training set: 80% – 103,000 images
  - ▶ Validation set: 20% – 27,000 images
- ▶ Squashing all images to size  $256 \times 256$
- ▶ Converting all images to LMDB format
- ▶ Shuffling the order of images in both training and validation sets

- ▶ Commodity hardware specifications
  - ▶ CPU: Intel Core 2 Quad Q9550 @2.38GHz
  - ▶ RAM : 4GB DDR3
  - ▶ GPU : NVIDIA Geforce GTX 560 Ti with 2GB of memory





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# Results