

# OBJECT DETECTION

# PROJECT GOAL

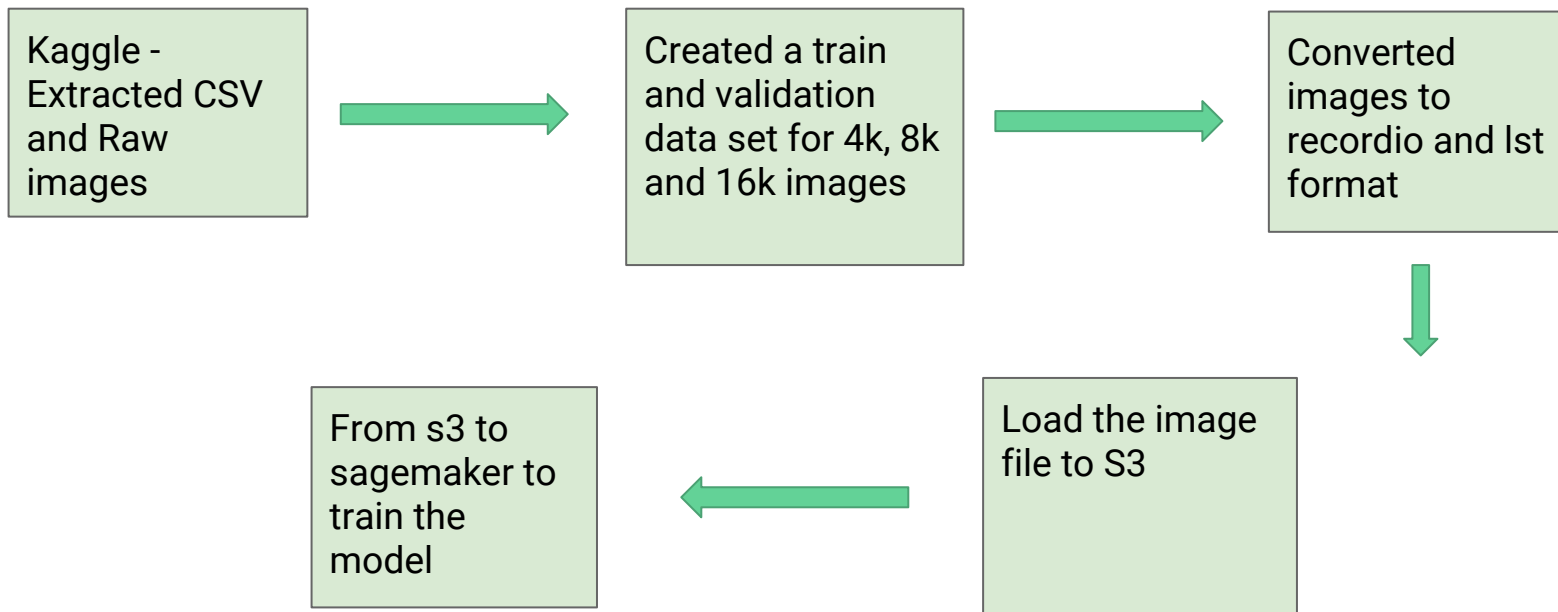
## **GOAL**

Identifying ships from the satellite images with high precision.

## **USE CASES**

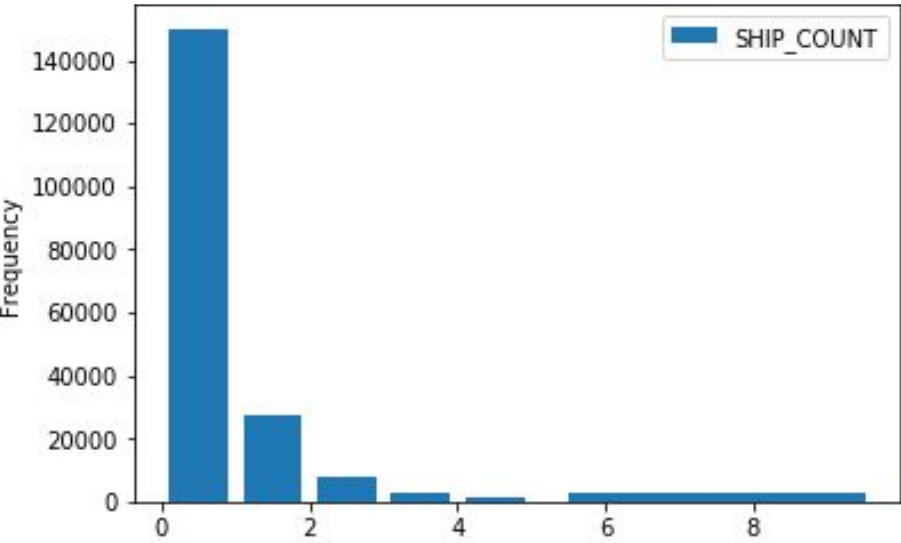
This solution will help in improving our response to environmental disasters, piracy, illegal cargo movement, etc...

# ETL STRATEGY



# DESCRIPTIVE ANALYTICS

Total number of rows in raw file - 231,723  
Number of rows with image - 192,556  
Number of images contain one or more ships - 42,556 (22%)  
Number of images with no ship - 150,000 (78%)



## Raw Data from Train Data Set

	▲ ImageId ▼	▲ EncodedPixels ▼
	192556 unique values	[null] 65% 43801 1 44567 4 ... 0% Other (81721) 35%
1	00003e153.jpg	
2	0001124c7.jpg	
3	000155de5.jpg	264661 17 265429 33 266197 33 266965 33 267733 33 268501 33 269269 33 270037 33 270805 33 271573 33 272341 33 273109 33 273877 33 274645 33 275413 33 276181 33 276949 33 277716 34 278484 34 279252 33 ...
4	000194a2d.jpg	360486 1 361252 4 362019 5 362785 8 363552 10 364321 10 365090 9 365858 10 366627 10 367396 9 368165 9 368933 10 369702 10 370471 9 371240 9 372009 9 372777 10 373546 9 374315 9 375084 7 375852 6 3766...

# MODELING STRATEGY

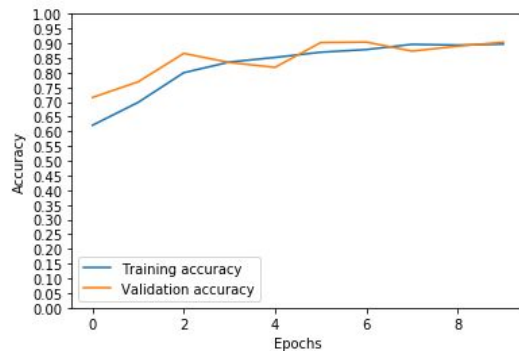
- **Image classification problem**
  - We used Sagemaker's image classification built-in algorithm to solve this problem.
  - Transfer learning using pre-trained ResNet-18 architecture
  - Two-class softmax classification: **SHIP or NO SHIP**
- Hyperparameters:
  - **Training set size: 4K, 8K, 16K**
  - Number of layers: 18
  - Mini-batch size: 10
  - Learning rate: 1e-2
- Interpreted accuracy with epochs and confusion matrix

# EPOCHS and ACCURACY

## Data Set : 4000 Images

Maximum validation accuracy: 0.904000

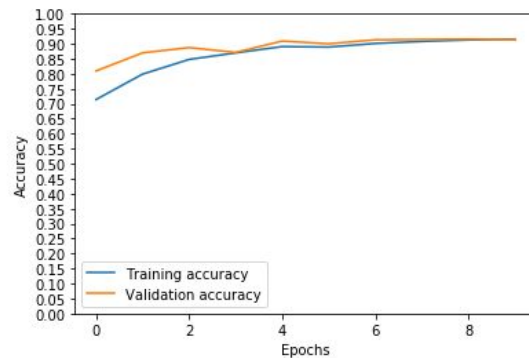
<Figure size 432x288 with 0 Axes>



## Data Set : 8000 Images

Maximum validation accuracy: 0.915750

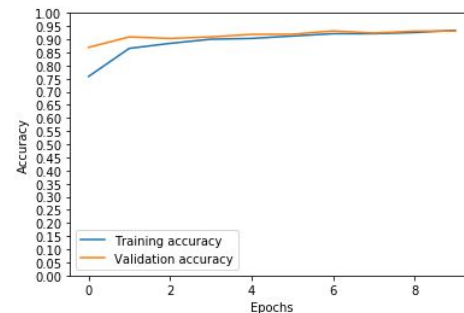
<Figure size 432x288 with 0 Axes>



## Data Set : 16000 Images

Maximum validation accuracy: 0.931750

<Figure size 432x288 with 0 Axes>



# CONFUSION MATRIX

True Positive <b>898</b>	False Positive <b>57</b>
False Negative <b>102</b>	True Negative <b>943</b>

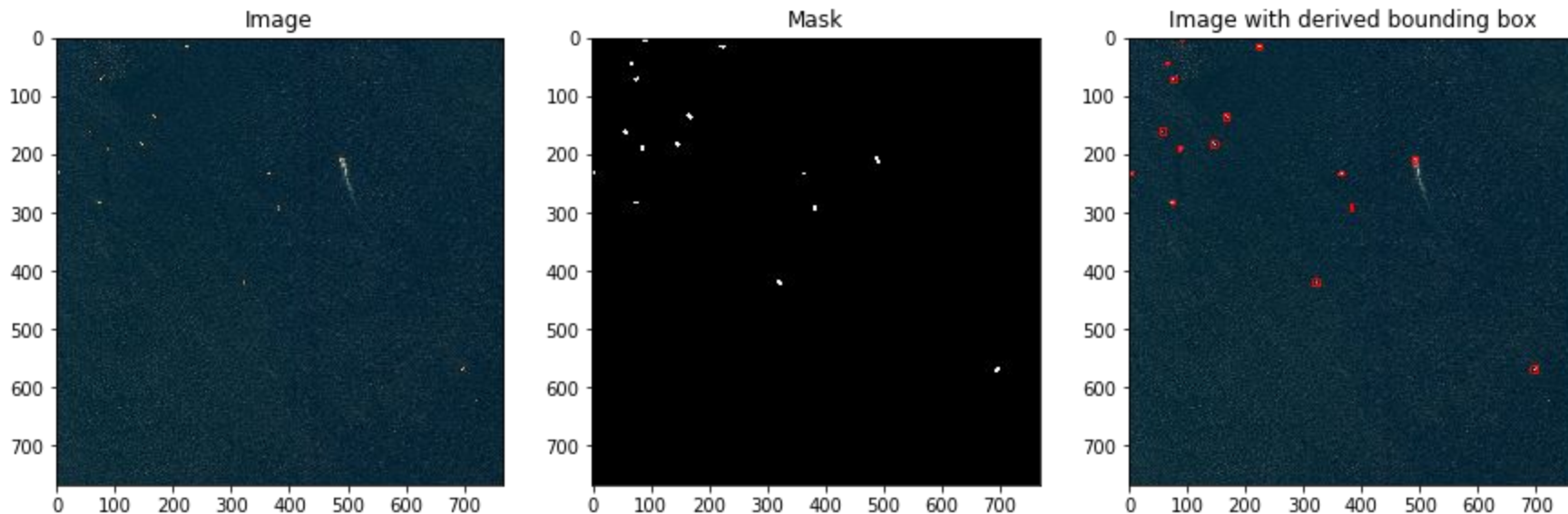
**False Negative** : Ship was not identified.  
For example, Drug trafficking and piracy would potentially result in loss of life.

**False Positive** : Ship identified falsely. Increase in cost and lost in time.  
For example, false leads will be provided to search and rescue teams resulting in lost time and efforts.

**Recall:** 94.3%

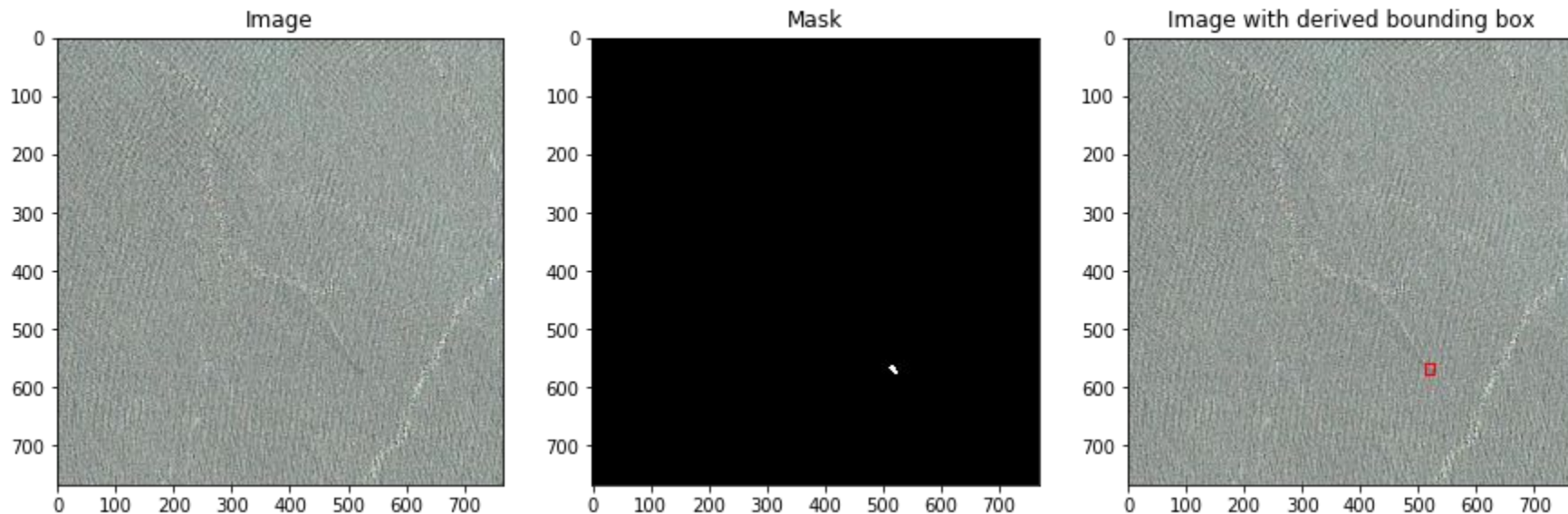
**Precision:** 90.2%

# ERROR MODES : Missed Ships (FNs)

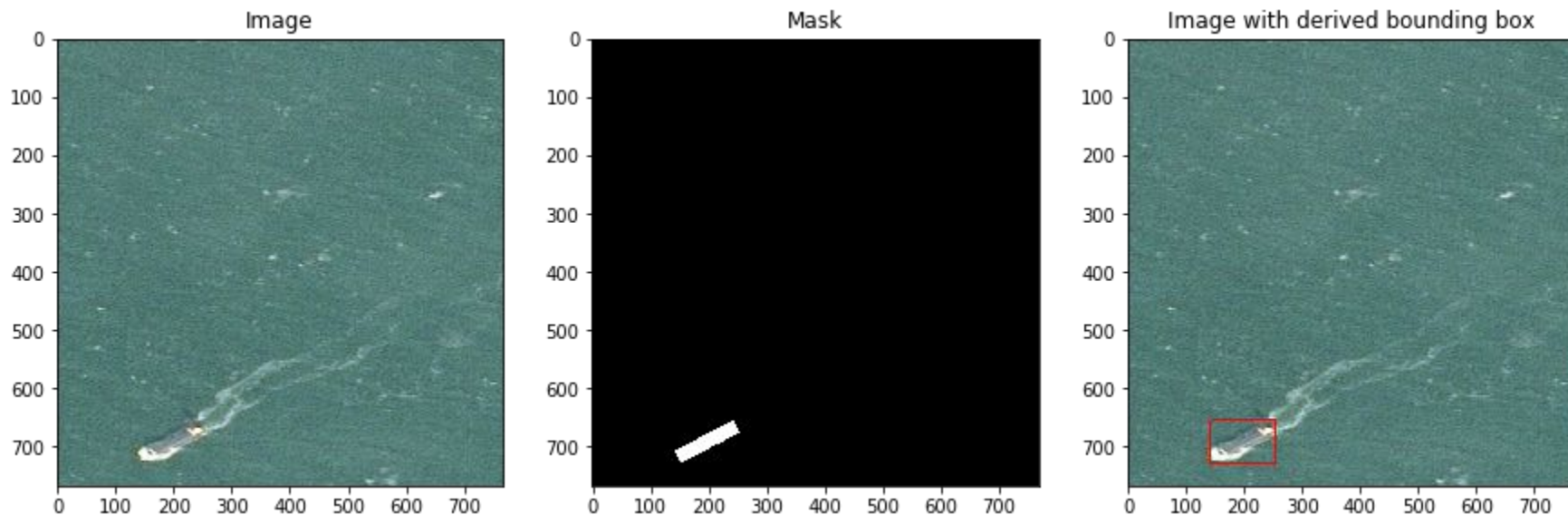




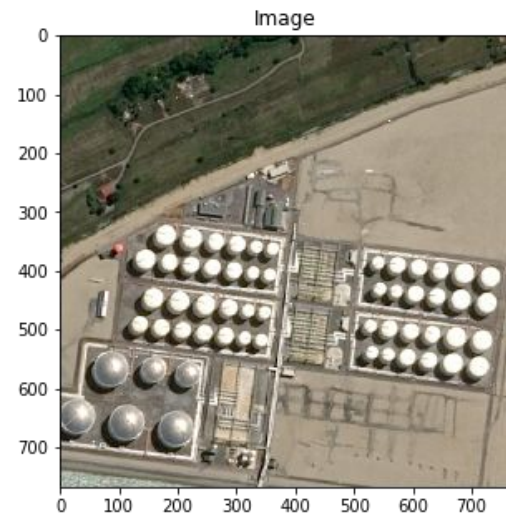
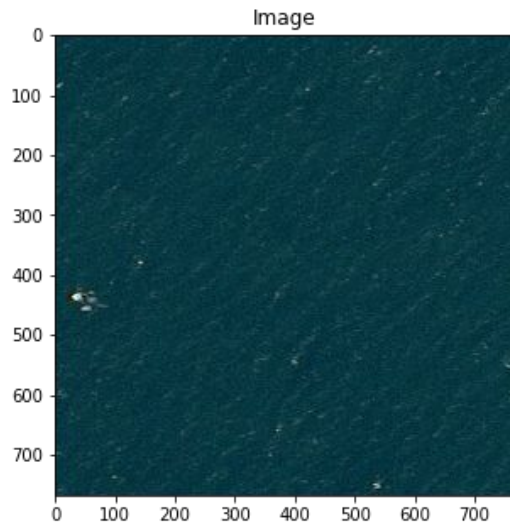
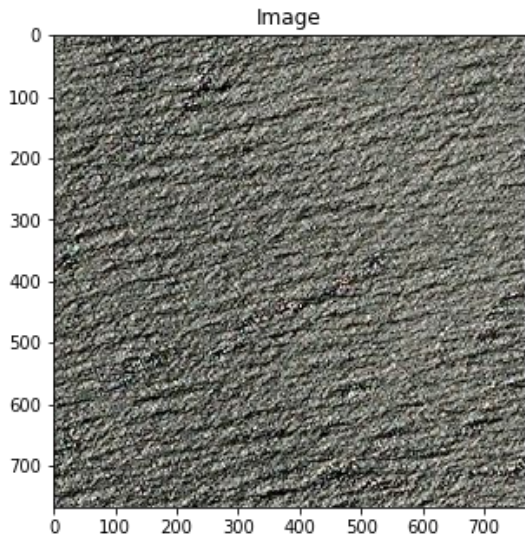
# ERROR MODES : Missed Ships (FNs)



# ERROR MODES : Missed Ships (FNs)



# ERROR MODES : Imagined Ships (FPs)



# NEXT STEPS

Assuming continued **free** access to **amazing** AWS/SageMaker:

- Scale the training set (and validation)
- Increase capacity of the network (e.g., larger/more FC layers)
- Tune additional hyperparameters (learning rate, batch size, epochs, etc.)
- Extend error analysis to identify edge cases
- Move to object localization (bounding boxes or pixel-level segmentation)