# CS577-Assignment 4

#### Binary Class Classifier

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#### 1.Problem Statement:

Classification of Cats and Dogs. This is three class classification problem which we are going to solve by implementing Conv neural networks.

#### 2. Proposed Solution:

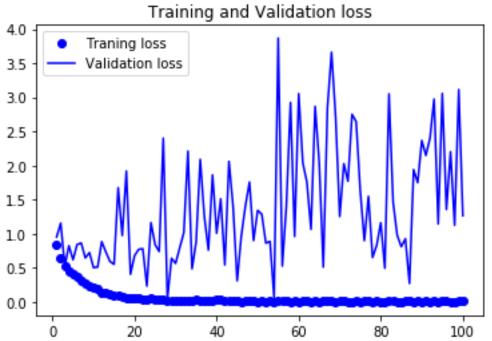
We will design a Conv neural network in Python with Keras and then train the network on train and validation data. Finally we will evaluate performance of the network on test data.

#### 3.Implementation details:

- We first load the data Cats and Dogs Data from the below Link.
- https://www.microsoft.com/en-us/download/details.aspx?id=54765
- Then we are going to One Hot Encode the labels of the dataset.
- We split the Iris data in Train, Test and validation Set using train\_test\_split() method in 8:2 ratio.
- Then we normalized the features.
- We designed neural network with 4 Convolution Network layers.
- Activation used in the hidden layers is Relu and Activation used in the output node is Sigmoid.
- We used various Loss Function and Optimizer to evaluate the network that are discussed in the results section.
- Now we train our network with train data and observed its performance. Results are discussed in below section.

#### 4. Results and discussion:





After Epochs =20 the validation results converge . hence we choose 20 as our epoch. Evaluation on Test data:

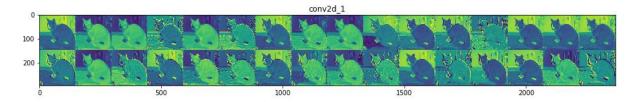
Loss: 1.8303858041763306 Accuracy: 0.737500011920929

Visualising Convolution layer 1 and layer 2:

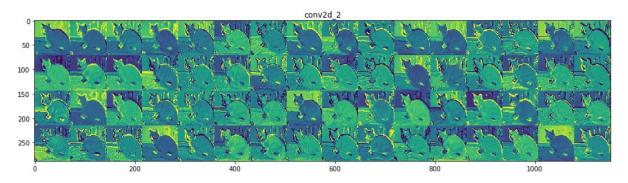


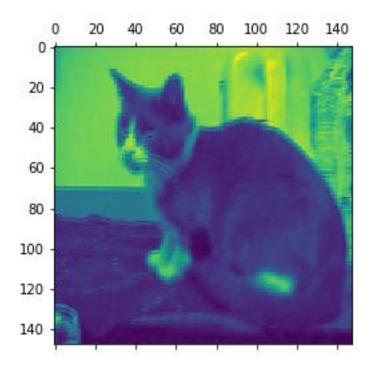
## **Original Image**

## **Convolution Layer 1:**

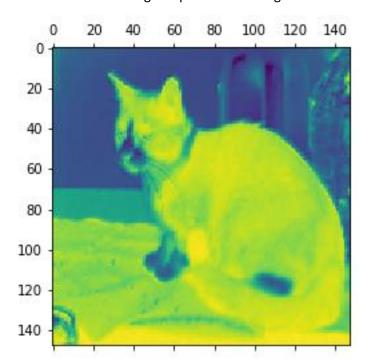


## **Convolution Layer 1:**

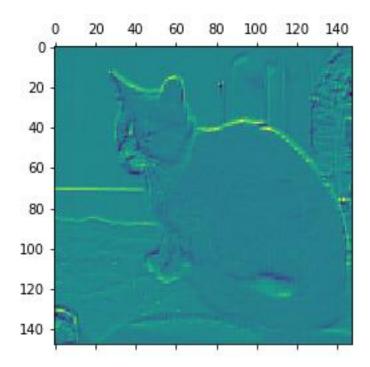




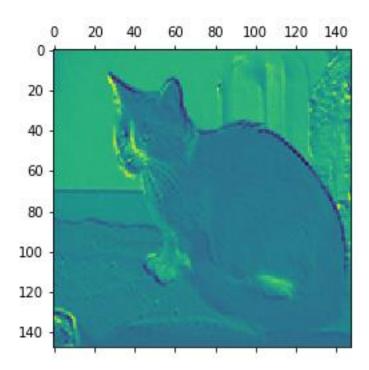
**Channel 5:** Detects brighter parts of the image



**Channel 4 :** Detecting Dark Colours



Channel 3: Detecting Edges

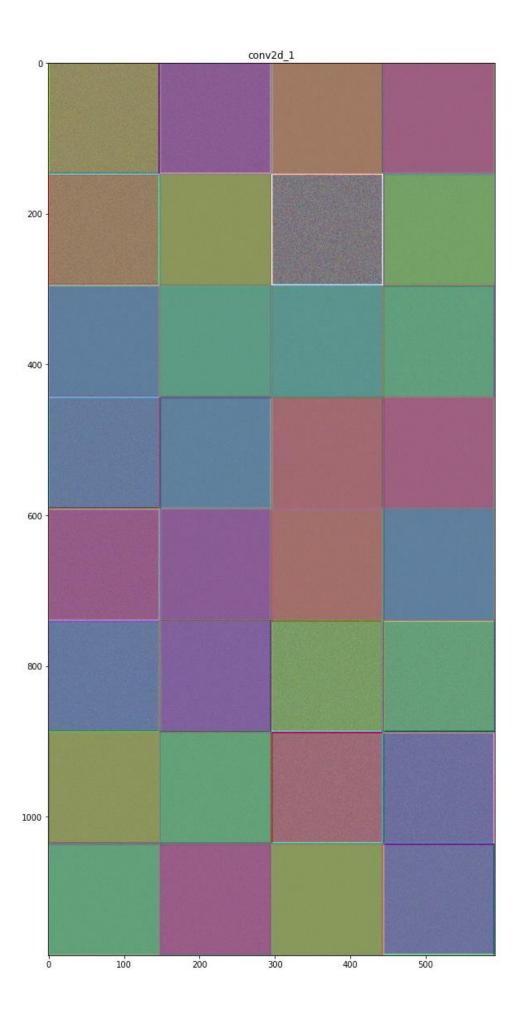


Channel 8 : Detects vertical edges of the image

From the above visualization of 2 layers we can see that different filters detects different features in the image.

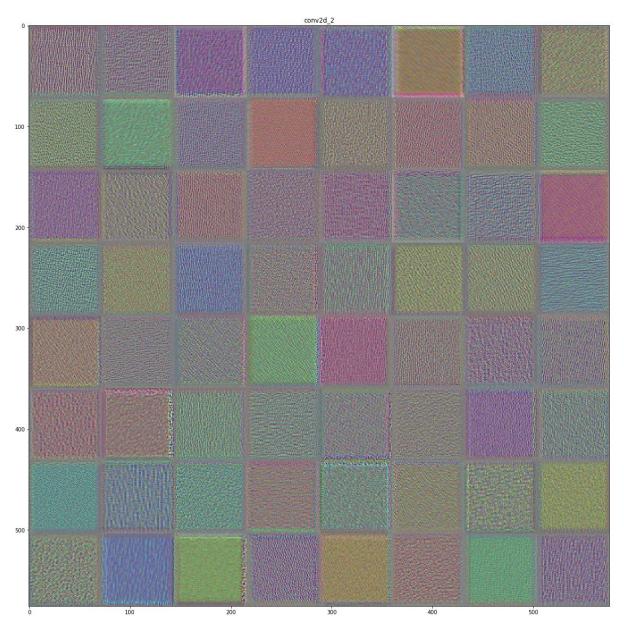
## **Visualization of Learned Filters:**

**Convolution Layer 1** 



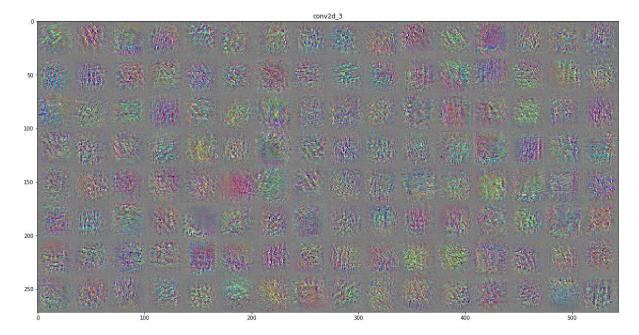
## **Detecting Colors**

## **Convolution Layer 2**



Detecting Patterns in the image

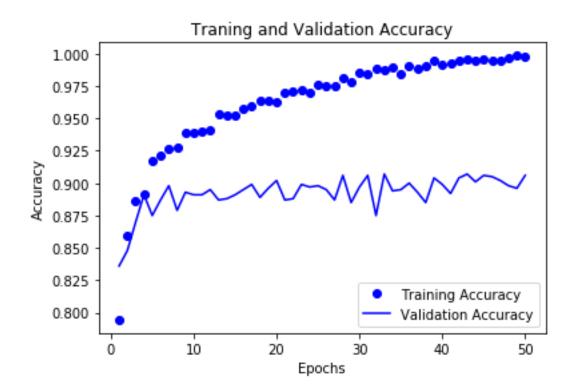
**Convolution Layer 3** 

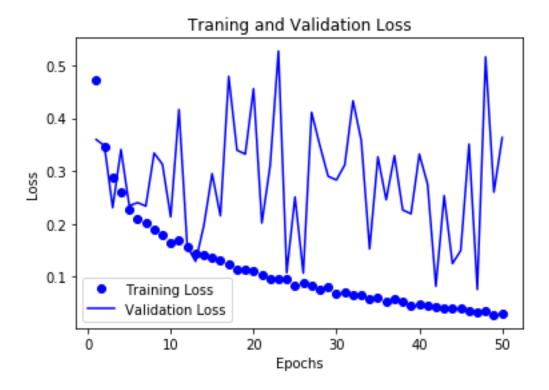


**Detecting Higher level patterns** 

 $From \ the \ above \ patterns \ we \ see \ various \ filters \ detect \ various \ patterns \ as \ template \ matching \ criteria$ 

Part G: Replace VGG16 with frozen base (Before Tuning)





Epochs =10

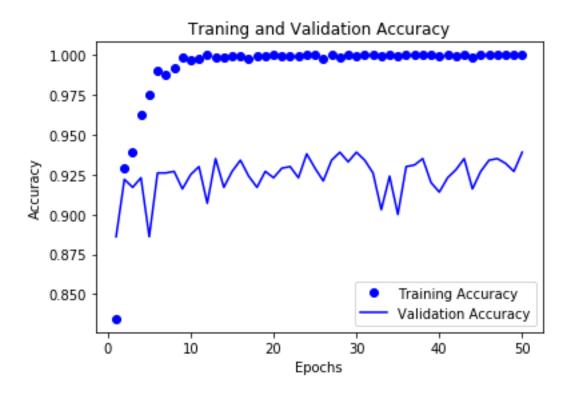
Test Results

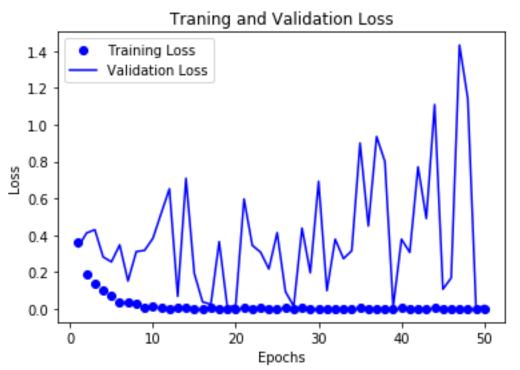
Loss: 0.5389158725738525

Accuracy: 0.887499988079071

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Part F: Replace VGG16 with unfrozen base (After Tuning)



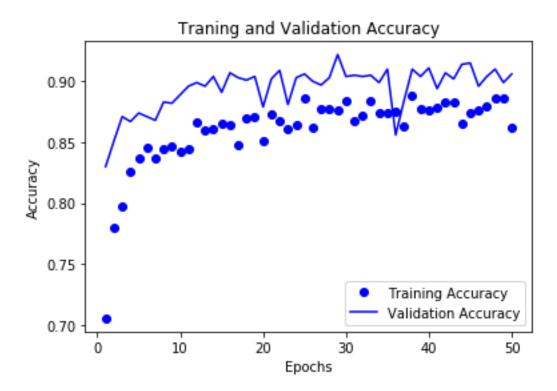


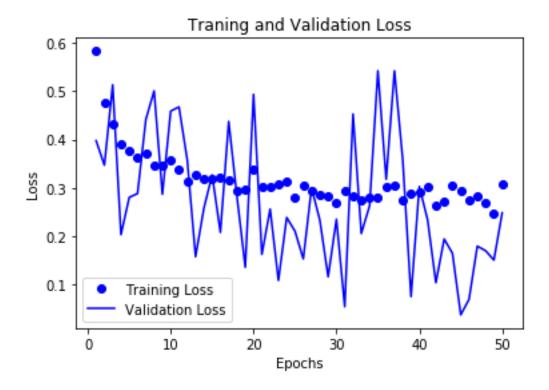
Epoch =10
Evaluation on Test Data:

Loss : 0.3597032129764557 Accuracy : 0.918749988079071 We can see that after unfreezing the base, we get higher accuracy which results due to fine tuning of the base of the pre-trained network with dense layers.

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## **Data Augmentation: After Training with Frozen Convolution Base**





From the above graph we can see that Validation results improved after data augmentation.

#### **Evaluation ON Test Data:**

Test Results

Loss: 0.34376198053359985

Accuracy: 0.893750011920929