

Below is the list of experiments done to Train a Neural network for **Gesture Recognition**.

There are **5 Gestures** which we want the Neural network to learn –

- Thumbs up: Increase the volume
- Thumbs down: Decrease the volume
- Left swipe: 'Jump' backwards 10 seconds
- Right swipe: 'Jump' forward 10 seconds
- Stop: Pause the movie

As part of this experiment, we have trained 2 different model types –

- Convolution 3D
- CNN(2D) + RNN

Below table shows all the experiments done on both the model types:

Experiment Number	Model	Result	Decision + Explanation
<b>Convolution 3D</b>			
1	Conv3D	Throws Generator error	Crop the images correctly, try to overfit on less amount of data
2	Conv3D	Model not trainable as a lot of parameters	Reduce the size of the image/Reduce the number of layers
3	Conv3D Images used = 18, 100x100 Batch size = <b>64</b> Layers = 3 conv3d layers, 2 Dense Activation = Relu Epoch = 30 Optimiser = <b>SGD</b>	OOM when allocating tensor with shape[64,64,18,100,100]	Throws Memory error with 64 batch size
4	Conv3D Images used = 15, 84x84 Batch size = <b>16</b> Layers = 3 conv3d layers, 2 Dense Activation = Relu Epoch = 30 Optimiser = <b>SGD</b>	Train Accuracy: 0.73 Validation Accuracy: 0.60	Not Overfitting but also not great accuracy. We can probably do better.
5	Conv3D Images used = 18, 100x100	InternalError: Could not synchronize CUDA stream: CUDA_ERROR_ILLEGAL_ADDRESS: an illegal memory access was encountered	
6	Conv3D Images used = 15, 84x84 Batch size = <b>32</b> Layers = 3 conv3d, 2 Dense Activation = Relu Epoch = 30 Optimiser = <b>RMSProp</b>	Train Accuracy: 0.8703 Validation Accuracy: 0.56  <b>Overfitting</b>	Lets try smaller batch size and images in next run. Also, lets try experimenting with activation function.
7	Conv3D Batch size: <b>8</b> Image used: 8, 42 x 42 Epochs:10 Activation: <b>elu</b>	Train accuracy :0.71 Val. Accuracy : 0.66	Reducing Batch size and image size and using ELU activation has controlled overfitting but accuracy is still not very good.

	Dropout:0.25 (throughout)		Lets try different activation function.
8	Conv3D Batch size:16 Image used: 12, 72 x 72 Epochs:15 Activation: <b>tanh</b> Dropout:0.25 (throughout)	Train accuracy :0.89 Val. Accuracy : 0.70  <b>Overfitting</b>	Using <b>tanh</b> has improved accuracy but still overfitting. Lets trying adding another layer and increasing the images and size.
9	Conv3D Batch size:10 Image used: 20, 120 x 120 Epochs:20 Layers: Added 1 more layer of Conv3D Hyperparameters: Used Batch normalisation in Dense layers as well this time. Activation: <b>RELU</b> Dropout:0.25 (only in Dense layer)	After 20 epochs: Train accuracy :0.9050 Val. Accuracy : 0.7900  <b>Best accuracy:</b> Epoch=13 Train accuracy : <b>0.8627</b> Val. Accuracy : <b>0.8300</b>	We have achieved good accuracy in this model. In 13 <sup>th</sup> epoch we can see that both train and validation accuracies are close to each other.  <b>This is an Optimal model and is submitted for evaluation</b>
<b>CNN + RNN</b>			
10	<b>Conv2D+GRU</b> Pre-trained model = <b>VGG16</b> Images used = 15 , 84x84 Batch size = 16 Layers = 5 (Timedist(Cnn2d),, GRU, GRU, Dense, Dense) Activation = Relu and softmax Epoch = 30	Train Accuracy: 0.1862 Validation Accuracy: 0.1700	Not a good model as accuracy is very less.
11	<b>Conv2D+GRU</b> Pre-trained model = <b>VGG16</b> Images used = 15 , 84x84 Trainable weights = False Batch size = 32 () Layers = 6 (Timedist(Cnn2d),, GRU, GRU, GRU, Dense, Dense) Activation = Relu and softmax Epoch = 30 Dropout layer = Removed	Train Accuracy: 0.2620 Validation Accuracy: 0.27  ( )	Adding additional GRU layer and removing Dropout has improved accuracy a little 16 batch size has offered lower generalization Dropout removed to check if these layers have generalized the model too much)
12	<b>Conv2D+GRU</b> <b>Using a different Pre-trained model to check if we can get better results:</b> Pre-trained model = <b>InceptionV3</b> Images used = 15 , 84x84 Trainable weights = False Batch size = 32 (16 batch size has offered lower generalization) Layers = 5 (Timedist(Cnn2d),, GRU, GRU, Dense, Dense) Activation = Relu and softmax (No change) Epoch = 30 Dropout layer = added a dropout layer  <b>Using a different Optimizer: RMSProp()</b>	Train Accuracy: 0.7134 Validation Accuracy: 0.4700  Best result: Epoch = 23 Train Accuracy: 0.7255 Validation Accuracy: 0.5300	using RMSProp and Inceptionv3 model has given better results in terms of accuracy than VGG16 but is overfitting
13	<b>Conv2D+GRU</b> Pre-trained model = <b>InceptionV3</b> Images used = 15 , 84x84 Trainable weights = False Batch size = 32 (16 batch size has offered lower generalization) Layers = 5 (Timedist(Cnn2d),, GRU, GRU, Dense, Dense)	Train Accuracy: 0.5400 Validation Accuracy: 0.2600	using SGD and removing the Dropout layer has reduced accuracy

	<p>Activation = Relu and softmax (No change)  Epoch = 30  Dropout layer = <b>removed</b> dropout layer</p> <p><b>Using a different Optimizer: SGD()</b></p>		
14	<p><b><u>Conv2D+GRU</u></b>  Pre-trained model = <b>InceptionV3</b>  Images used = 12, 75x75 (min for InceptionV3 module)  Trainable weights = False  Batch size = 16  Layers = 5 (Timedist(Cnn2d),, GRU, GRU, Dense, Dense)  Activation = Relu and softmax (No change)  Epoch = 30  Dropout layer = 0.25</p> <p><b>Using a different Optimizer: RMSProp()</b></p>	<p>Train Accuracy: 0.9201  Validation Accuracy: 0.4600</p>	<p>Model is Overfitting.   Lets try a different Pre-trained model.</p>
15	<p><b><u>Conv2D+LSTM</u></b>  Pre-trained model = <b>Mobilenet</b>  Images used = 20, 120x120  Trainable weights = <b>True</b>  Batch size = 10  Layers = 4 (Timedist(Cnn2d), LSTM, Dense, Dense)  Activation = Relu and softmax (No change)  Epoch = 20  Dropout layer = 0.25 (only on Dense layer)</p> <p><b>Using a different Optimizer: Adam()</b></p>	<p>Train Accuracy: 0.9864  Validation Accuracy: 0.8800</p>	<p>Model is Overfitting.  We have definitely improved the accuracy of Validation data set but the model is till overfitting.</p>