Run the first 4 cells to import data and create training and testing set

```
In [3]: import numpy as np
        import h5py
        import tensorflow as tf
        import matplotlib.pyplot as plt
        from keras.models import Sequential
        from keras.layers import SimpleRNN, LSTM, Dense, Activation
        from keras.utils import to_categorical
        #from sklearn.preprocessing import OneHotEncoder
        from sklearn.preprocessing import StandardScaler
        from UtilNNDL import create window data
In [4]: # vals is a list whose elements are the data values to be plotted
        # labels is a list of labels for each respective data set
        def plot_hist(vals,labels='Null',title='Null',xlabel='epochs'):
            n = len(vals)
            for i in range(n): plt.plot(vals[i],label=labels[i])
            plt.title(title)
            plt.xlabel(xlabel)
            plt.legend()
            plt.show()
In [5]: A01T = h5py.File('datasets/A01T_slice.mat','r')
        data = np.copy(A01T['image'])
        data = np.transpose(data, (0,2,1))
        data = data[:,:,:22]
        labels = np.copy(A01T['type'])
        labels = labels[0,0:data.shape[0]:1]
        labels = np.asarray(labels, dtype=np.int32)
        a = data[:56]
        b = data[57:]
        data = np.vstack((a,b))
        a = labels[:56]
        b = labels[57:]
        labels = np.hstack((a,b))
        #enc = OneHotEncoder()
        #enc_labels = enc.fit_transform(labels.reshape(-1,1)).toarray()
        enc_labels = to_categorical(labels-769, num_classes=4)
        print(enc_labels)
        #scaler = StandardScaler()
        #data = scaler.fit_transform(data,enc_labels)
        [[ 0. 0.
                   0. 1.1
         [0. 0. 1. 0.]
         [ 0. 1. 0. 0.]
         [1. 0. 0. 0.]
         [0. 1. 0. 0.]
```

1 of 23 3/13/18, 3:25 PM

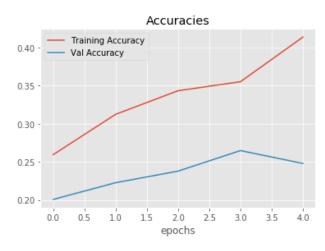
[1. 0. 0. 0.]

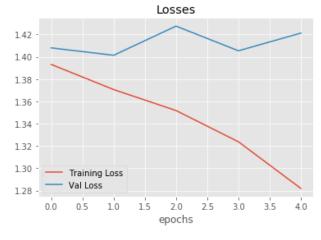
```
In [6]: bs, t, f = data.shape
        np.random.seed(42)
        shuffle = np.random.choice(bs,bs,replace=False)
        train_samples = 237
        train_data = data[shuffle[:train_samples],:,:]
        train_labels = enc_labels[shuffle[:train_samples]]
        test_data = data[shuffle[train_samples:],:,:]
        test_labels =enc_labels[shuffle[train_samples:]]
In [7]: | train_data = np.transpose(train_data,(0,2,1))
        test_data = np.transpose(test_data,(0,2,1))
        train_data,train_labels = create_window_data(train_data,train_labels)
        test_data,test_labels = create_window_data(test_data,test_labels)
        train_data = np.transpose(train_data,(0,2,1))
        test_data = np.transpose(test_data,(0,2,1))
        bs, t, f = train_data.shape
In [6]: train labels.shape
Out[6]: (2370, 4)
```

Everything from this point down is Testing

```
In [30]: model = Sequential([
             LSTM(100, input_shape=(t,f)),
             Dense(32),
             Activation('relu'),
             Dense(64),
             Activation('relu'),
             Dense(32),
             Activation('relu'),
             Dense(4),
             Activation('softmax'),
         ])
         model.compile(optimizer = 'adam',
                       loss = 'categorical_crossentropy',
                       metrics=['accuracy'])
         hist = model.fit(train_data,train_labels,epochs=5,validation_split=0.25,bat
         ch_size=32,verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=32)
         print(test_score)
         plot_hist([hist.history['acc'],hist.history['val_acc']],['Training Accuracy
          ','Val Accuracy'],title='Accuracies')
         plot_hist([hist.history['loss'],hist.history['val_loss']],['Training Loss',
          'Val Loss'],title='Losses')
```

```
Train on 1777 samples, validate on 593 samples
Epoch 1/5
acc: 0.2594 - val_loss: 1.4080 - val_acc: 0.2007
Epoch 2/5
acc: 0.3123 - val_loss: 1.4014 - val_acc: 0.2226
Epoch 3/5
acc: 0.3433 - val_loss: 1.4275 - val_acc: 0.2378
Epoch 4/5
acc: 0.3551 - val loss: 1.4054 - val acc: 0.2648
Epoch 5/5
acc: 0.4136 - val_loss: 1.4213 - val_acc: 0.2479
500/500 [========= ] - 3s 5ms/step
[1.4121294736862182, 0.28200000023841859]
```





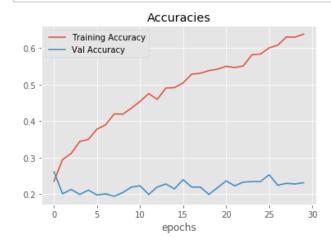
Modified VGG net to handle our input i.e. replace 2D with 1D, etc.(need to check dimensions and might need to transpose input to original shape)

Original VGGnet implementation can be found at hte address below

```
In [27]: # VGGnet
         # https://keras.io/getting-started/sequential-model-guide/#examples
         import numpy as np
         import keras
         from keras.models import Sequential
         from keras.layers import Dense, Dropout, Flatten
         from keras.layers import Conv1D, MaxPooling1D, BatchNormalization
         from keras.optimizers import SGD
         #del model
         model = Sequential()
         #model.add(LSTM(100, input_shape=(1000, 22)))
         model.add(Conv1D(32, 3, activation='relu',input shape=(t,f)))
                                                                                   #
         Originally 32 each
         model.add(BatchNormalization())
         model.add(Conv1D(32, 3, activation='relu'))
         model.add(MaxPooling1D())
         model.add(Dropout(0.25))
         model.add(Conv1D(64, 3, activation='relu'))
         #Originally 64 each
         model.add(BatchNormalization())
         model.add(Conv1D(64, 3, activation='relu'))
         model.add(MaxPooling1D())
         model.add(Dropout(0.25))
         model.add(Flatten())
         model.add(Dense(256, activation='relu'))
         model.add(Dropout(0.5))
         model.add(Dense(4, activation='softmax'))
         #sgd = SGD(lr=0.01, decay=1e-6, momentum=0.9, nesterov=True)
         #model.compile(loss='categorical_crossentropy', optimizer=sgd)
         model.compile(optimizer = 'adam',
                      loss = 'categorical_crossentropy',
                      metrics=['accuracy'])
         hist = model.fit(train data,train labels,epochs=20,validation split=0.25,ba
         tch_size=32,verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=32)
         print(test_score)
         plot_hist([hist.history['acc'],hist.history['val_acc']],['Training Accuracy
          ,'Val Accuracy'],title='Accuracies')
         plot_hist([hist.history['loss'],hist.history['val_loss']],['Training Loss',
         'Val Loss'], title='Losses')
         500/500 [======== ] - 1s 2ms/step
```

Simple RNN model

500/500 [=========] - 1s 2ms/step





CHRONONET PAPER

Here is the implementation of Figure 1b based on ChronoNet paper

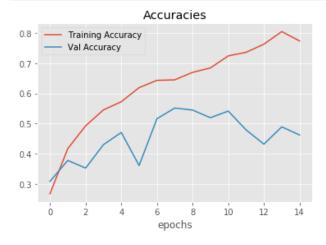
```
In [16]: import numpy as np
         import keras
         from keras.models import Sequential
         from keras.layers import Dense, Dropout, Flatten
         from keras.layers import Conv1D, MaxPooling1D, BatchNormalization,GRU
         from keras.optimizers import SGD
         model = Sequential()
         model.add(Conv1D(32, 4, strides=2,activation='relu',input_shape=(t,f)))
         model.add(Conv1D(32, 4, strides=2,activation='relu'))
         model.add(Conv1D(32, 4, strides=2,activation='relu'))
         #model.add(Flatten())
         model.add(GRU(32,activation='relu',return sequences=True))
         model.add(GRU(32,activation='relu',return sequences=True))
         model.add(GRU(32,activation='relu'))
         model.add(Dense(4, activation='softmax'))
         \#sqd = SGD(lr=0.01, decay=1e-6, momentum=0.9, nesterov=True)
         #model.compile(loss='categorical crossentropy', optimizer=sqd)
         #model.add()
         model.compile(optimizer = 'adam',
                       loss = 'categorical_crossentropy',
                       metrics=['accuracy'])
         hist = model.fit(train_data,train_labels,epochs=10,validation_split=0.25,ba
         tch size=32, verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=32)
         print(test_score)
         plot_hist([hist.history['acc'],hist.history['val_acc']],['Training Accuracy
         ','Val Accuracy'],title='Accuracies')
plot_hist([hist.history['loss'],hist.history['val_loss']],['Training Loss',
          'Val Loss'], title='Losses')
         500/500 [========= ] - 1s 2ms/step
```

[1.0793222360610961, 0.54200000047683716]

Implementation of Figure 1b but adding regularization structures like that found in VGGnet

```
In [17]: import numpy as np
         import keras
         from keras.models import Sequential
         from keras.layers import Dense, Dropout, Flatten
         from keras.layers import Conv1D, MaxPooling1D, BatchNormalization,GRU
         from keras.optimizers import SGD
         #norm train = np.transpose((-np.mean(train data,axis=2)+np.transpose(train
         data,(2,0,1))/np.std(train data,axis=2),(1,2,0))
         model = Sequential()
         model.add(Conv1D(32, 4, strides=2,activation='relu',input shape=(t,f)))
         model.add(BatchNormalization())
                                                                     #From VGGnet
         model.add(Conv1D(32, 4, strides=2,activation='relu'))
         model.add(BatchNormalization())
                                                                     #From VGGnet
         model.add(Conv1D(32, 4, strides=2,activation='relu'))
         model.add(MaxPooling1D())
                                                                     #From VGGnet
                                                                     #From VGGnet
         model.add(Dropout(0.25))
         #model.add(Flatten())
         model.add(GRU(32,activation='tanh',return_sequences=True))
         model.add(GRU(32,activation='tanh',return_sequences=True))
         model.add(GRU(32,activation='tanh'))
         #model.add(Dense(256, activation='relu'))
                                                                      #From VGGnet, b
         ut makes model suck
         #model.add(Dropout(0.5))
                                                                      #From VGGnet, b
         ut makes model suck
         model.add(Dense(4, activation='softmax'))
         # From VGGnet, works well for some reason
         sgd = SGD(lr=0.01, decay=1e-6, momentum=0.9, nesterov=True)
         model.compile(loss='categorical_crossentropy', optimizer=sgd,metrics=['accu
         racy'])
         #model.add()
         #model.compile(optimizer = 'rmsprop',
         #
                       loss = 'categorical crossentropy',
         #
                       metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=15,validation_split=0.25,ba
         tch_size=32,verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=32)
         print(test_score)
         WARNING:tensorflow:Variable *= will be deprecated. Use variable.assign_mul
         if you want assignment to the variable value or x = x * y' if you want a n
         ew python Tensor object.
```

500/500 [=========] - 1s 1ms/step [1.0582130537033081, 0.6079999999999998]



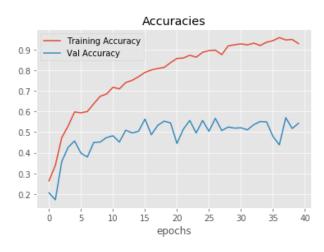


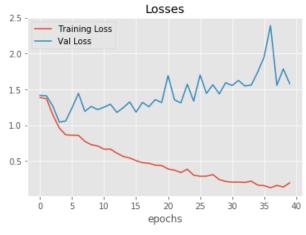
Replaced GRU with LSTM

```
In [19]: import numpy as np
         import keras
         from keras.models import Sequential
         from keras.layers import Dense, Dropout, Flatten
         from keras.layers import Conv1D, MaxPooling1D, BatchNormalization, GRU, LSTM
         from keras.optimizers import SGD
         #norm_train = np.transpose((-np.mean(train_data,axis=2)+np.transpose(train_
         data,(2,0,1))/np.std(train data,axis=2),(1,2,0))
         model = Sequential()
         model.add(Conv1D(32, 4, strides=2,activation='relu',input shape=(t,f)))
         model.add(BatchNormalization())
                                                                     #From VGGnet
         model.add(Conv1D(32, 4, strides=2,activation='relu'))
         model.add(BatchNormalization())
                                                                     #From VGGnet
         model.add(Conv1D(32, 4, strides=2,activation='relu'))
         model.add(MaxPooling1D())
                                                                     #From VGGnet
                                                                     #From VGGnet
         model.add(Dropout(0.25))
         #model.add(Flatten())
         model.add(LSTM(32,activation='tanh',return_sequences=True))
         model.add(LSTM(32,activation='tanh',return_sequences=True))
         model.add(LSTM(32,activation='tanh'))
         #model.add(Dense(256, activation='relu'))
                                                                      #From VGGnet, b
         ut makes model suck
         #model.add(Dropout(0.5))
                                                                      #From VGGnet, b
         ut makes model suck
         model.add(Dense(4, activation='softmax'))
         # From VGGnet, works well for some reason
         sgd = SGD(lr=0.01, decay=1e-6, momentum=0.9, nesterov=True)
         model.compile(loss='categorical_crossentropy', optimizer=sgd,metrics=['accu
         racy'])
         #model.add()
         #model.compile(optimizer = 'rmsprop',
         #
                       loss = 'categorical crossentropy',
         #
                       metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=40,validation_split=0.25,ba
         tch_size=32,verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=32)
         print(test_score)
```

500/500 [===========] - 1s lms/step [1.3234160480499269, 0.60800000011920929]

Test Results are [1.3234160480499269, 0.60800000011920929]

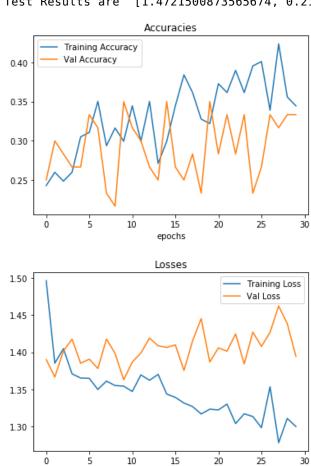




IC-RNN

```
In [42]: | from keras.layers import Input,Dense,concatenate,Flatten,GRU,Conv1D
         from keras.models import Model
         inputs= Input(shape=(1000,22))
         # First Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(inputs
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(inputs
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(inputs
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Second Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Third Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         x = concatenate([tower1,tower2,tower3],axis=2)
         x = GRU(32,activation='tanh',return_sequences=True)(x)
         x = GRU(32,activation='tanh',return_sequences=True)(x)
         x = GRU(32,activation='tanh')(x)
         predictions = Dense(4,activation='softmax')(x)
         model = Model(inputs=inputs, outputs=predictions)
         model.compile(optimizer = 'rmsprop',
                      loss = 'categorical crossentropy',
                      metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=30,validation_split=0.25,ba
         tch_size=64, verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=64)
         50/50 [======== ] - 0s 4ms/step
```

Test Results are [1.4721500873565674, 0.2199999988079071]

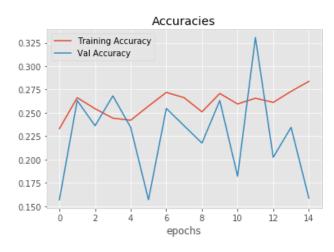


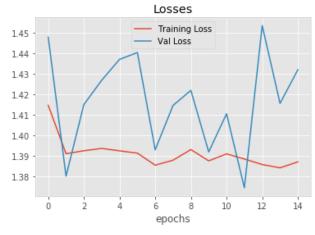
epochs

IC-RNN Testing

```
In [19]: | from keras.layers import Input, Dense, concatenate, Flatten, GRU, Conv1D
         from keras.models import Model
         inputs= Input(shape=(t,f))
         # First Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(inputs
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(inputs
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(inputs
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Second Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Third Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         x = concatenate([tower1,tower2,tower3],axis=2)
         x = GRU(32,activation='tanh',return_sequences=True)(x)
         x = GRU(32,activation='tanh',return_sequences=True)(x)
         x = GRU(32,activation='tanh')(x)
         predictions = Dense(4,activation='softmax')(x)
         model = Model(inputs=inputs, outputs=predictions)
         model.compile(optimizer = 'rmsprop',
                      loss = 'categorical crossentropy',
                      metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=15,validation_split=0.25,ba
         tch_size=64, verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=64)
         500/500 [========= ] - 2s 3ms/step
```

Test Results are [1.387840368270874, 0.28400000023841859]



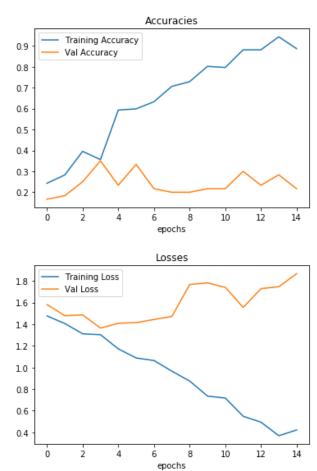


C-DRNN

```
In [8]: from keras.layers import Input, Dense, concatenate, Flatten, GRU, Conv1D
        from keras.models import Model
        inputs= Input(shape=(1000,22))
        x = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(inputs)
        x = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
        x = Conv1D(32, 4, strides=2, activation='relu', padding="causal")(x)
        res1 = GRU(32,activation='tanh',return_sequences=True)(x)
        res2 = GRU(32,activation='tanh',return_sequences=True)(res1)
        res1_2 = concatenate([res1,res2],axis=2)
        res3 = GRU(32,activation='tanh',return_sequences=True)(res1_2)
        x = concatenate([res1, res2, res3])
        x = GRU(32,activation='tanh')(x)
        predictions = Dense(4,activation='softmax')(x)
        model = Model(inputs=inputs, outputs=predictions)
        model.compile(optimizer = 'rmsprop',
                     loss = 'categorical_crossentropy',
                     metrics=['accuracy'])
        #hist.history is a dictionary with all accs and losses
        hist = model.fit(train_data,train_labels,epochs=15,validation_split=0.25,ba
        tch_size=32,verbose=0)
        test_score = model.evaluate(test_data, test_labels, batch_size=32)
```

50/50 [=======] - 0s 4ms/step

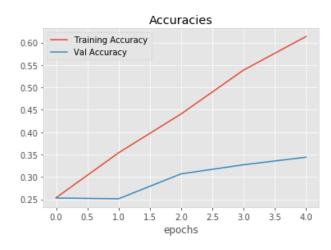
Test Results are [1.8914880275726318, 0.30000000238418578]

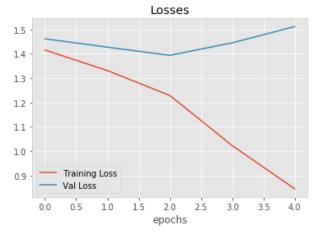


C-DRNN Testing

```
In [21]: from keras.layers import Input, Dense, concatenate, Flatten, GRU, Conv1D, BatchNo
         rmalization, Dropout
         from keras.models import Model
         inputs= Input(shape=(t,f))
         x = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(inputs)
         \#x = BatchNormalization()(x)
         x = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         \#x = BatchNormalization()(x)
         \#x = Conv1D(32, 4, strides=2, activation='relu', padding="causal")(x)
         \#x = Dropout(0.5)(x)
         res1 = GRU(32,activation='tanh',return sequences=True)(x)
         res2 = GRU(32,activation='tanh',return sequences=True)(res1)
         res1 2 = concatenate([res1,res2],axis=2)
         res3 = GRU(32,activation='tanh',return_sequences=True)(res2)
         x = concatenate([res1, res2, res3])
         x = GRU(32,activation='tanh')(x)
         predictions = Dense(4,activation='softmax')(x)
         model = Model(inputs=inputs, outputs=predictions)
         model.compile(optimizer = 'adam',
                      loss = 'categorical_crossentropy',
                      metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=5,validation_split=0.25,bat
         ch size=32, verbose=0)
         test score = model.evaluate(test data, test labels, batch size=32)
         500/500 [========= ] - 3s 7ms/step
```

Test Results are [1.3403036570549012, 0.40599999952316285]

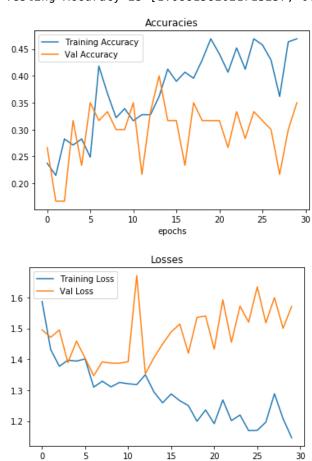




ChronoNet

```
In [49]: | from keras.layers import Input, Dense, concatenate, Flatten, GRU, Conv1D
         from keras.models import Model
         inputs= Input(shape=(t,f))
         # First Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(inputs
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(inputs
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(inputs
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Second Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Third Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         x = concatenate([tower1,tower2,tower3],axis=2)
         res1 = GRU(32,activation='tanh',return_sequences=True)(x)
         res2 = GRU(32,activation='tanh',return sequences=True)(res1)
         res1 2 = concatenate([res1,res2],axis=2)
         res3 = GRU(32,activation='tanh',return_sequences=True)(res2)
         x = concatenate([res1, res2, res3])
         x = GRU(32,activation='tanh')(x)
         predictions = Dense(4,activation='softmax')(x)
         model = Model(inputs=inputs, outputs=predictions)
         model.compile(optimizer = 'rmsprop',
                      loss = 'categorical_crossentropy',
                      metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=30,validation_split=0.25,ba
         tch size=32, verbose=0)
         test score = model.evaluate(test data, test labels, batch size=32)
         50/50 [======= ] - 0s 7ms/step
```

Testing Accuracy is [1.6881582021713257, 0.2600000047683716]



epochs

ChronoNet Model Testing

```
In [28]: from keras.layers import Input, Dense, concatenate, Flatten, GRU, Conv1D
         from keras.models import Model
         inputs= Input(shape=(t,f))
         # First Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(inputs
         tower1 = BatchNormalization()(tower1)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(inputs
         tower2 = BatchNormalization()(tower2)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(inputs
         tower3 = BatchNormalization()(tower3)
         x = concatenate([tower1,tower2,tower3],axis=2)
         # Second Inception
         #tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         #tower1 = BatchNormalization()(tower1)
         #tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         #tower2 = BatchNormalization()(tower2)
         \#tower3 = Conv1D(32, 8, strides=2, activation='relu', padding="causal")(x)
         #tower3 = BatchNormalization()(tower3)
         #x = concatenate([tower1, tower2, tower3], axis=2)
         # Third Inception
         tower1 = Conv1D(32, 2, strides=2,activation='relu',padding="causal")(x)
         tower1 = BatchNormalization()(tower1)
         tower2 = Conv1D(32, 4, strides=2,activation='relu',padding="causal")(x)
         tower2 = BatchNormalization()(tower2)
         tower3 = Conv1D(32, 8, strides=2,activation='relu',padding="causal")(x)
         tower3 = BatchNormalization()(tower3)
         x = concatenate([tower1,tower2,tower3],axis=2)
         res1 = GRU(32,activation='tanh',return_sequences=True)(x)
         res2 = GRU(32,activation='tanh',return_sequences=True)(res1)
         res1 2 = concatenate([res1,res2],axis=2)
         res3 = GRU(32,activation='tanh',return_sequences=True)(res2)
         x = concatenate([res1, res2, res3])
         x = GRU(32,activation='tanh')(x)
         predictions = Dense(4,activation='softmax')(x)
         model = Model(inputs=inputs, outputs=predictions)
         model.compile(optimizer = 'adam',
                      loss = 'categorical_crossentropy',
                       metrics=['accuracy'])
         #hist.history is a dictionary with all accs and losses
         hist = model.fit(train_data,train_labels,epochs=10,validation_split=0.25,ba
         tch size=32, verbose=0)
         test_score = model.evaluate(test_data, test_labels, batch_size=32)
         print "Testing Accuracy is", test score
         plot hist([hist.history['acc'],hist.history['val acc']],['Training Accuracy
          ,'Val Accuracy'],title='Accuracies')
         plot_hist([hist.history['loss'],hist.history['val_loss']],['Training Loss',
          'Val loss'l title='losses')
```

