First Phrase

Get library

```
# Normal Lib
  import os
  import pandas as pd
  import numpy as np
  import pickle
  import math
  # keras
  from keras import Model
  import keras
  from keras.layers import Conv3D, Input, MaxPooling3D, BatchNormalization, Dense, Dropout, Flatten, AveragePooling
  import tensorflow as tf
  from keras.optimizers import Adam, RMSprop, SGD
  from keras.regularizers import L2
  # Metrics
  from scipy.stats import pearsonr # Pearson R best
  from keras.metrics import AUC, MeanAbsoluteError, Precision, Recall, Accuracy
  from sklearn.metrics import matthews corrcoef
  from keras.activations import linear
  # Import File
  from zipfile import ZipFile
  from google.colab import drive
  !pip install rdkit
  from rdkit import Chem
      Looking in indexes: <a href="https://pypi.org/simple">https://us-python.pkg.dev/colab-wheels/public/simple/</a>
      Collecting rdkit
        Downloading rdkit-2023.3.1-cp310-cp310-manylinux_2_17_x86_64.manylinux2014_x86_64.whl (29.7 MB)
                                                                            - 29.7/29.7 MB 43.7 MB/s eta 0:00:00
      Requirement already satisfied: numpy in /usr/local/lib/python3.10/dist-packages (from rdkit) (1.22.4)
      Requirement already satisfied: Pillow in /usr/local/lib/python3.10/dist-packages (from rdkit) (8.4.0)
      Installing collected packages: rdkit
      Successfully installed rdkit-2023.3.1
  drive.mount('/content/gdrive/')
  dataset_folder = '/content/gdrive/MyDrive/Final'
  files = os.listdir(dataset_folder)
  for file in files:
    if '.zip' in file:
      file_path = os.path.join(dataset_folder, file)
      with ZipFile(file_path, 'r') as f:
        f.extractall()
      Mounted at /content/gdrive/
Get data and labels zip
  protein folder = '/content/protein'
  protein_list = os.listdir(protein_folder)
```

totalSize = len(ligand list)

ligand_folder = '/content/ligand'
ligand_list = os.listdir(ligand_folder)

label_folder = '/content/label'
label_list = os.listdir(label_folder)

```
totalSize
      16686
 # permu = np.random.permutation(totalSize)
 permu = np.random.RandomState(seed=69).permutation(totalSize)
 train_num, validate_num, test_num = 0,0,0
 iDataset_num = totalSize
 ratio = (60, 20, 20)
 train_num = int(iDataset_num * (ratio[0]/ (ratio[0]+ratio[1]+ratio[2])))
 # val_num = int(iDataset_num * (ratio[1]/ (ratio[0]+ratio[1]+ratio[2])))
 # test_num = int(iDataset_num * (ratio[2]/ (ratio[0]+ratio[1]+ratio[2])))
 val num = 100
 test_num = 500
 last num = 2000
 train_list_IDs = permu[:train_num]
 val_list_IDs = permu[train_num:(train_num+val_num)]
 test_list_IDs = permu[(train_num+val_num):(train_num+val_num+test_num)]
 last_list_IDs = permu[(train_num+val_num+test_num):(train_num+val_num+test_num+last_num)]
 train_list_IDs
      array([ 2788, 12876, 5452, ..., 13517, 15820, 11375])
Get features
 def get_atom_features(atom, amino_acid, isprotein):
      ATOM\_CODES = \{\}
      metals = ([3, 4, 11, 12, 13] + list(range(19, 32))
                + list(range(37, 51)) + list(range(55, 84))
                + list(range(87, 104)))
      atom_classes = [(5, 'B'), (6, 'C'), (7, 'N'), (8, '0'), (15, 'P'), (16, 'S'), (34, 'Se'),
                      ([9, 17, 35, 53], 'halogen'), (metals, 'metal')]
      for code, (atomidx, name) in enumerate(atom_classes):
          if type(atomidx) is list:
              for a in atomidx:
                 ATOM\_CODES[a] = code
         else:
             ATOM_CODES[atomidx] = code
         classes = ATOM_CODES[atom.GetAtomicNum()]
      except:
         classes = 9
      possible_chirality_list = [
         Chem.rdchem.ChiralType.CHI_UNSPECIFIED,
         Chem.rdchem.ChiralType.CHI_TETRAHEDRAL_CW,
         Chem.rdchem.ChiralType.CHI_TETRAHEDRAL_CCW,
         Chem.rdchem.ChiralType.CHI OTHER
      chirality = possible chirality list.index(atom.GetChiralTag())
      possible formal_charge_list = [-5, -4, -3, -2, -1, 0, 1, 2, 3, 4, 5]
         charge = possible_formal_charge_list.index(atom.GetFormalCharge())
      except:
         charge = 11
      possible_hybridization_list = [
         Chem.rdchem.HybridizationType.S,
          Chem.rdchem.HybridizationType.SP,
          Chem.rdchem.HybridizationType.SP2,
```

```
Chem.rdchem.HybridizationType.SP3,
          Chem.rdchem.HybridizationType.SP3D,
          Chem.rdchem.HybridizationType.SP3D2,
          Chem.rdchem.HybridizationType.UNSPECIFIED
      try:
          hyb = possible_hybridization_list.index(atom.GetHybridization())
      except:
          hyb = 6
      possible_numH_list = [0, 1, 2, 3, 4, 5, 6, 7, 8]
          numH = possible_numH_list.index(atom.GetTotalNumHs())
      except:
          numH = 9
      possible_implicit_valence_list = [0, 1, 2, 3, 4, 5, 6, 7]
          valence = possible implicit valence list.index(atom.GetTotalValence())
      except:
          valence = 8
      possible_degree_list = [0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10]
          degree = possible_degree_list.index(atom.GetTotalDegree())
      except:
          degree = 11
      is_aromatic = [False, True]
      aromatic = is aromatic.index(atom.GetIsAromatic())
      mass = atom.GetMass() / 100
      # idx = atom.GetIdx()
      # with open(protein_path, 'r+') as f:
            readlines = f.readlines()
      #
            f.close()
      amino acids = [
          'ALA', 'ARG', 'ASN', 'ASN', 'ASP', 'CYS', 'GLU', 'GLN', 'GLY', 'HIS', 'ILE', 'LEU', 'LYS', 'MET', 'PHE',
      if amino acid in amino acids:
        amino acid = amino acids.index(amino acid)
        amino_acid = int(len(amino_acids) + 1)
      # amino_acid = amino_acids.index(amino_acid)
      # amino acid = 0
      # for lines in readlines:
            if 'HETATM' in lines or 'ATOM' in lines:
      #
                if idx == int(lines[6:11]):
      #
      #
                   amino_acid = lines[17:20]
                  # if amino_acid in amino_acids:
                       amino_acid = amino_acids.index(amino_acid)
                  # else:
                        amino_acid = int(len(amino_acids) + 1)
      return [classes, chirality, charge, hyb, numH, valence, degree, aromatic, mass, amino_acid, isprotein]
Get min coordinates
  def get_min(compound_positions):
      minx, miny, minz = 999,999,999
      for pos in compound_positions:
          x, y, z = pos
          if x < minx:
              minx = x
```

if y < miny:

miny = y

```
if z < minz:
             minz = z
      return (minx,miny,minz)
Get grid
  def adjust_grid(compound, compound_positions, protein_path, isprotein, grid, minx, miny, minz):
      atoms_aa = []
      with open(protein_path, 'r+') as f:
          readlines = f.readlines()
          f.close()
      for idx, lines in enumerate(readlines):
          if 'HETATM' in lines or 'ATOM' in lines:
              # print(idx)
              # if (idx+1) == int(lines[6:11]):
              atoms_aa.append(lines[17:20])
                  # if amino acid in amino acids:
                       amino acid = amino acids.index(amino acid)
                  # else:
                       amino acid = int(len(amino acids) + 1)
      for idx, pos in enumerate(compound_positions):
          x,y,z = pos
          amino_acid = atoms_aa[idx]
          atom = compound.GetAtomWithIdx(int(idx))
          features = get_atom_features(atom, amino_acid, isprotein)
          features.extend(pos)
          if grid[round(x - minx), round(y - miny), round(z - minz)][0] == 0:
              grid[round(x - minx), round(y - miny), round(z - minz)] = features
          elif grid[round(x - minx)+1, round(y - miny), round(z - minz)][0] == 0:
              grid[round(x - minx) + 1, round(y - miny), round(z - minz)] = features
          elif grid[round(x - minx), round(y - miny)+1, round(z - minz)][0] == 0:
              grid[round(x - minx), round(y - miny)+1, round(z - minz)] = features
          elif grid[round(x - minx), round(y - miny), round(z - minz)+1][0] == 0:
              grid[round(x - minx), round(y - miny), round(z - minz)+1] = features
          elif grid[round(x - minx)+1, round(y - miny)+1, round(z - minz)][0] == 0:
              grid[round(x - minx)+1, round(y - miny)+1, round(z - minz)] = features
          elif grid[round(x - minx), round(y - miny)+1, round(z - minz)+1][0] == 0:
              grid[round(x - minx), round(y - miny)+1, round(z - minz)+1] = features
          elif grid[round(x - minx)+1, round(y - miny), round(z - minz)+1][0] == 0:
              grid[round(x - minx)+1, round(y - miny), round(z - minz)+1] = features
          elif grid[round(x - minx)+1, round(y - miny)+1, round(z - minz)+1][0] == 0:
              grid[round(x - minx)+1, round(y - miny)+1, round(z - minz)+1] = features
      return grid
 def set_grid(protein_path, isprotein= 1):
      compound = Chem.MolFromPDBFile(protein_path, False, False, 1)
      compound_conf = compound.GetConformer()
      compound_positions = compound_conf.GetPositions()
      atom = compound.GetAtomWithIdx(int(1))
      features = get_atom_features(atom, '', isprotein)
      minx, miny, minz = get min(compound positions)
```

```
grid=np.zeros((52,52,52,len(features)+3))
      grid = adjust_grid(compound, compound_positions, protein_path, isprotein, grid, minx, miny, minz)
      return grid, minx, miny, minz
Add ligand
  def add_ligand(ligand_path, grid, minx, miny, minz, isprotein = 0):
      ligand = Chem.MolFromPDBFile(ligand_path, False, False, 1)
      ligand conf = ligand.GetConformer()
      ligand_positions = ligand_conf.GetPositions()
      grid = adjust_grid(ligand, ligand_positions, ligand_path, isprotein, grid, minx, miny, minz)
      return grid
Create Protein_Grid_list
 def create_grid_list(protein_folder):
      protein_list = os.listdir(protein_folder)
      grids = []
      for protein in protein_list:
          protein_name = protein.split('.')[0]
          protein_path = os.path.join(protein_folder, protein)
          grid, minx, miny, minz = set grid(protein path)
          grids.append((protein_name, grid, (minx, miny, minz)))
      return grids
Get grid list
 grids = create_grid_list(protein_folder)
 grid = grids[0][1]
 minx, miny, minz = grids[0][2]
 name = grids[0][0]
 new_grid = add_ligand('/content/ligand/5c1u-FIP_model79.pdb', grid, minx, miny, minz)
 # for grid in grids:
 count = 0
  for x in new_grid:
      for y in x:
        for features in y:
         if features[0] != 0:
            # print(features)
            count+=1
 print(count)

    Get batch data

 # /content/ligand/3qzq-10b_model1.pdb
 def get_data_batch(dataset_idx, protein_folder, ligand_folder, ligand_list, label_folder, label_list, batch_size,
    # dataset = get_dataset_ID(dataset_idx) # Wrong af
   baList = []
    statList = []
    gridList = []
    batch_list = [value for idx, value in enumerate(dataset_idx) if idx >= index * batch_size and idx < (index+1)*t
```

```
# print(batch_list)
   for i in batch_list:
     complexFile = ligand list[i]
     # Get Data and Labels
     from_protein = complexFile.split('-')[0]
     complex_name = complexFile.split('.')[0]
     protein_path = os.path.join(protein_folder, from_protein+'.pdb')
     complexFile_path = os.path.join(ligand_folder, complexFile)
     grid, minx, miny, minz = set_grid(protein_path)
     grid = add_ligand(complexFile_path, grid, minx, miny, minz)
     gridList.append(grid)
     grid = []
     protein = [value for value in label list if from protein in value][0]
     label_file_path = os.path.join(label_folder, protein)
     df = pd.read_csv(label_file_path)
     listidx = df.index[df['file.pdb'] == complex_name].tolist()[0]
     ba = df['BA'][listidx]
     stat = df['Hit/No_hit'][listidx]
     if stat == 'hit':
       stat = 1
     else:
       stat = 0
     baList.append(ba)
     statList.append(stat)
   gridList = np.array(gridList)
    baList = np.array(baList)
   statList = np.array(statList)
   return gridList, baList, statList

    Get metric

 def get_metrics(y_label, y_pred, ytype):
   if ytype == 0: # Regression
     PearsonR, _ = pearsonr(y_label, y_pred)
     print('Pearson Correlation Coefficient: ' + str(PearsonR))
     MSE = MeanAbsoluteError()
     MSE.update_state(y_label, y_pred)
     MSE = MSE.result().numpy()
     print('Mean Absolute Error: ' + str(MSE))
     # RMSE = math.sqrt(MSE)
     # print('Root Mean Absolute Error: ' + str(RMSE))
     return PearsonR, MSE
   if ytype == 1: # Classification
     auc = keras.metrics.AUC()
     tp = keras.metrics.TruePositives(thresholds= 0.9)
     tn = keras.metrics.TrueNegatives(thresholds= 0.9)
     fp = keras.metrics.FalsePositives(thresholds= 0.9)
     fn = keras.metrics.FalseNegatives(thresholds= 0.9)
     # auc.update_state(y_label, y_pred)
     tp.update_state(y_label, y_pred)
     tn.update_state(y_label, y_pred)
     fp.update_state(y_label, y_pred)
     fn.update_state(y_label, y_pred)
     # auc = auc.result().numpy()
```

```
tp = tp.result().numpy()
                      tn = tn.result().numpy()
                      fp = fp.result().numpy()
                      fn = fn.result().numpy()
                      precision = tp/ (tp+fp) # PPV
                      print('Precision: ' + str(precision))
                      # recall = Recall()
                      # recall.update_state(y_label, y_pred)
                      # recall = recall.result().numpy()
                      recall = tp/(tp+fn) # Recall - TPR
                      print('Recall: ' + str(recall))
                      specificity = tn/(tn+fp)
                      print('Specificity: ' + str(specificity))
                      NPV = tn/(tn+fn)
                      print('NPV: ' + str(NPV))
                      # accuracy = Accuracy()
                      # accuracy.update_state(y_label, y_pred)
                      # accuracy = accuracy.result().numpy()
                      # print('AUC: ' + str(auc))
                      # f1_score = 2 * (precision * recall) / (precision + recall)
                      # print('F1_Score: ' + str(f1_score))
                      MCC = (tp*tn - fp*fn) / math.sqrt( (tp+fp)*(tp+fn)*(tn+fp)*(tn+fn) ) # Phi coefficient
                      print("Phi coefficient:" + str(MCC))
                      return precision, recall, specificity, NPV, MCC
Get Validate
        import csv
       def model_val_dataset(val_dataset_idx, protein_folder, label_folder, label_list, batch_size, epochs, save_path, batch_size, epochs, e
              dataset_len = len(val_dataset_idx)
              runs = dataset_len // batch_size
              last_batch = dataset_len - batch_size*runs
              model = keras.models.load_model(save_path)
              # csv_path = 'resultCSV.csv'
              # csv_path = os.path.join(best_path, csv_path)
              # csvfile = open(csv_path, 'w')
              # fields = ['Model', 'Prediction C', 'Label C', 'Prediction R', 'Prediction R']
              # writer = csv.writer(f)
              # writer = csv.writer(csvfile)
              # writer.writerow(fields)
              # PearsonR_list, MCC_list, RSME_list = 0,0,0
              ba_Actual, stat_Actual, ba_Pred, stat_Pred = [], [], [], []
              print("----- Start ValDataset ------
              for i in range(int(runs+1)):
                      print("Get dataset on batch "+str(i+1))
                      if i != runs+1:
                             gridList, baList, statList = get_data_batch(val_dataset_idx, protein_folder, ligand_folder, ligand_list, laterial ligand_list, later
                      else:
                            gridList, baList, statList = get_data_batch(val_dataset_idx, protein_folder, ligand_folder, ligand_list, laterial ligand_list, later
                      print("-----")
                      result = model.predict(gridList, verbose=2)
                      gridList = []
                      pred_reg, pred_class = result
                      baList = [value for value in baList.tolist()]
                      statList = [value for value in statList.tolist()]
```

```
pred_reg = [value[0] for value in pred_reg.tolist()]
     pred_class = [value[0] for value in pred_class.tolist()]
     if ba_Actual == []:
       ba Actual = baList
       stat Actual = statList
       ba_Pred = pred_reg
       stat_Pred = pred_class
     else:
       ba_Actual.extend(baList)
       stat_Actual.extend(statList)
       ba_Pred.extend(pred_reg)
       stat_Pred.extend(pred_class)
     baList, statList = [], []
   PearsonR, MSE = get_metrics(ba_Actual, ba_Pred, 0)
   precision, recall, specificity, NPV, MCC = get_metrics(stat_Actual, stat_Pred, 1)
    # for idx, trueIndex in enumerate(val_dataset_idx):
   # row = [str(trueIndex), str(stat_Actual[idx]), str(stat_Pred[idx]), str(ba_Actual[idx]), str(ba_Pred[idx])]
   # print(row)
   # writer.writerow(row)
   # csvfile.close()
   return PearsonR, MSE, precision, recall, specificity, NPV, MCC, ba_Actual, ba_Pred, stat_Actual, stat_Pred
Get Train
 def model train_dataset(model, train_dataset idx, val dataset idx, protein_folder, label_folder, label_list, bato
   dataset len = len(train dataset idx)
   runs = dataset_len // batch_size
   cur = 1
   # PearsonR, MSE, RMSE, precision, recall, auc, f1 score, MCC = 0,0,0,0,0,0,0,0
   # checkPearsonR, checkMCC, checkRMSE = 0,0,999
   log_txt = "log.txt"
   log_path = os.path.join(save_path, log_txt)
   readline = ''
   if os.path.exists(log_path):
     log_file = open(log_path,"r+")
     readline = log file.readline()
     log file.close()
   else:
     with open(log path, 'w+') as f:
       f.write('0/'+str(runs))
       f.close()
   if readline == '' or int(readline.split('/')[0]) > runs or int(readline.split('/')[0]) == 0:
     cur = 1
     model.save(save_path)
   else:
     cur = int(readline.split('/')[0])
   check = 0
   print("-----")
    for i in range(int(cur-1),int(runs+1)):
     print("=======Batch "+ str(i+1)+"==========")
     model = keras.models.load model(save path)
     print("Get dataset")
     # get_data_batch(dataset_idx, protein_folder, ligand_folder, ligand_list, label_folder, label_list, batch_siz
     # get_data_batch(train_list_IDs, protein_folder, ligand_folder, ligand_list, label_folder, label_list, 32, 0)
     if i != runs+1:
       gridList, baList, statList = get_data_batch(val_dataset_idx, protein_folder, ligand_folder, ligand_list, la
     else:
       gridList, baList, statList = get_data_batch(val_dataset_idx, protein_folder, ligand_folder, ligand_list, la
     print("-----")
     model.fit(gridList, [baList, statList], epochs= epochs, verbose=0)
     gridList, baList, statList = [], [], []
      # PearsonR, MSE, RMSE, precision, recall, auc, f1 score, MCC = model val dataset(val dataset idx, protein fol
```

```
print("Save")
     model.save(save_path)
      log_file = open(log_path,"r+")
      readline = log_file.write(str(i)+'/'+str(runs))
      log file.close()
      # if PearsonR > checkPearsonR and MCC > checkMCC and RMSE < checkRMSE:
        model.save(best_path)
         checkPearsonR = PearsonR
         checkMCC = MCC
         checkRMSE = RMSE
      if check == 0 and batch_size*i >= 2000:
        check +=1
        model.save(best_path)
    return model

    Get Model

 def combine_embedding(drop_rate, input_shape= (52,52,52,11)):
   inp = Input(shape= input_shape, name='Input_Complexes')
    ## Check there are atoms
    x1 = Conv3D(filters= 8, kernel_size=(1,1,1), padding='same', bias_initializer='zeros', kernel_initializer='glor
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = Conv3D(8, kernel\_size=(3,3,3))(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
   x1 = Conv3D(32, kernel_size=(3,3,3), padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = MaxPooling3D(pool_size=2)(x1)
   x1 = Conv3D(64, kernel\_size=(1,1,1), padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = Conv3D(64, kernel\_size=(3,3,3), padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = MaxPooling3D(pool_size=2)(x1)
    x1 = Conv3D(128,kernel_size=(1,1,1),padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = Conv3D(128, kernel_size=(3,3,3), padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = MaxPooling3D(pool_size=2)(x1)
    x1 = Conv3D(256, kernel\_size=(1,1,1), padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = Conv3D(256,kernel_size=(3,3,3),padding='same')(x1)
    x1 = BatchNormalization()(x1)
    x1 = Activation('relu')(x1)
    x1 = MaxPooling3D(pool_size=2)(x1)
     # Global Pooling
    x2 = GlobalAveragePooling3D()(x1)
    x2 = Dense(256)(x2)
    x2 = BatchNormalization()(x2)
    x2 = Activation('relu')(x2)
    x2 = Dropout(0.5)(x2)
```

```
# Flattening
x1 = Flatten()(x1)

x1 = Dense(256)(x1)
x1 = BatchNormalization()(x1)
x1 = Activation('relu')(x1)
x1 = Dropout(0.5)(x1)

# Regression Output
d1 = Dense(1,kernel_regularizer=tf.keras.regularizers.l2(0.01))(x1)
# Classification Output
d2 = Dense(1, activation='sigmoid')(x2)

return Model(inputs=[inp], outputs=[d1,d2], name='Embedding')
```

Create model

```
fake_grid, x,y,z = set_grid('/content/protein/3qzq.pdb')

np.shape(fake_grid)
    (52, 52, 52, 14)

shape = np.shape(fake_grid)
shape
    (52, 52, 52, 14)

model = combine_embedding(0.5, shape)
model.summary()
```

Model: "Embedding"

Layer (type)	Output Shape	Param #	Connected to
Input_Complexes (InputLayer)	[(None, 52, 52, 52, 14)]	0	[]
conv3d (Conv3D)	(None, 52, 52, 52, 8)	120	['Input_Complexes[0][0]']
batch_normalization (BatchNormalization)	(None, 52, 52, 52, 8)	32	['conv3d[0][0]']
activation (Activation)	(None, 52, 52, 52, 8)	0	['batch_normalization[0][0]']
conv3d_1 (Conv3D)	(None, 50, 50, 50, 8)	1736	['activation[0][0]']
batch_normalization_1 (BatchNormalization)	(None, 50, 50, 50, 8)	32	['conv3d_1[0][0]']
activation_1 (Activation)	(None, 50, 50, 50, 8)	0	['batch_normalization_1[0][0]']
conv3d_2 (Conv3D)	(None, 50, 50, 50, 32)	6944	['activation_1[0][0]']
batch_normalization_2 (BatchNormalization)	(None, 50, 50, 50, 32)	128	['conv3d_2[0][0]']
activation_2 (Activation)	(None, 50, 50, 50, 32)	0	['batch_normalization_2[0][0]']
max_pooling3d (MaxPooling3D)	(None, 25, 25, 25, 32)	0	['activation_2[0][0]']
conv3d_3 (Conv3D)	(None, 25, 25, 25, 64)	2112	['max_pooling3d[0][0]']
batch_normalization_3 (BatchNormalization)	(None, 25, 25, 25, 64)	256	['conv3d_3[0][0]']
activation_3 (Activation)	(None, 25, 25, 25, 64)	0	['batch_normalization_3[0][0]']
conv3d_4 (Conv3D)	(None, 25, 25, 25,	110656	['activation_3[0][0]']

Save paths

```
# save_path = '/content/gdrive/MyDrive/Final/Model'
# best_path = '/content/gdrive/MyDrive/Final/Best'

save_path = '/content/gdrive/MyDrive/SFCNN/Model1'
best_path = '/content/gdrive/MyDrive/SFCNN/Best1'
```

Set hyperparameters

```
batch_size = 32
epochs = 150
```

New test

```
model = keras.models.load_model('/content/gdrive/MyDrive/Final/Model')
model.summary()
```

Model: "Embedding"

Layer (type)	Output Shape	Param #	Connected to
Input_Complexes (InputLayer)			[]
conv3d (Conv3D)	(None, 52, 52, 52, 64)	24256	['Input_Complexes[0][0]']
<pre>batch_normalization (BatchNor alization)</pre>	m (None, 52, 52, 52, 64)	256	['conv3d[0][0]']
activation (Activation)	(None, 52, 52, 52, 64)	0	['batch_normalization[0][0]']
<pre>max_pooling3d (MaxPooling3D)</pre>	(None, 26, 26, 26, 64)	0	['activation[0][0]']
conv3d_1 (Conv3D)	(None, 26, 26, 26, 128)	221312	['max_pooling3d[0][0]']
batch_normalization_1 (BatchN rmalization)	lo (None, 26, 26, 26, 128)	512	['conv3d_1[0][0]']
activation_1 (Activation)	(None, 26, 26, 26, 128)	0	['batch_normalization_1[0][0]']
average_pooling3d (AveragePooling3D)	l (None, 13, 13, 13, 128)	0	['activation_1[0][0]']
conv3d_2 (Conv3D)	(None, 13, 13, 13, 256)	884992	['average_pooling3d[0][0]']
activation_2 (Activation)	(None, 13, 13, 13, 256)	0	['conv3d_2[0][0]']

```
batch_normalization_2 (BatchNo (None, 13, 13, 13, 1024
                                                      ['activation_2[0][0]']
    average_pooling3d_1 (AveragePo (None, 7, 7, 7, 256 0
                                                      ['batch_normalization_2[0][0]']
    oling3D)
    conv3d 3 (Conv3D)
                             (None, 7, 7, 7, 256 1769728
                                                      ['average pooling3d 1[0][0]']
    batch_normalization_3 (BatchNo (None, 7, 7, 7, 256 1024
                                                      ['conv3d_3[0][0]']
    activation_3 (Activation)
                            (None, 7, 7, 7, 256 0
                                                      ['batch_normalization_3[0][0]']
    average_pooling3d_2 (AveragePo (None, 4, 4, 4, 256 0
                                                      ['activation 3[0][0]']
    oling3D)
    flatten (Flatten)
                            (None, 16384)
                                           0
                                                      ['average_pooling3d_2[0][0]']
# PearsonR, MSE, precision, recall, specificity, NPV, MCC = model_val_dataset(test_list_IDs, protein_folder, labe
# !pip install mayavi
                                                                                                        # test1 list IDs = permu[12000:12100]
# len(test1 list IDs)
PearsonR, MSE, precision, recall, specificity, NPV, MCC, ba_Actual, ba_Pred, stat_Actual, stat_Pred = model_val_c
PearsonR, MSE, precision, recall, specificity, NPV, MCC, ba Actual, ba Pred, stat Actual, stat Pred = model val of
    ----- Start ValDataset
   Get dataset on batch 1
    ------Predict ValDataset ------
   1/1 - 0s - 360ms/epoch - 360ms/step
   Get dataset on batch 2
               ----- Predict ValDataset -----
   1/1 - 0s - 230ms/epoch - 230ms/step
   Get dataset on batch 3
     ------ Predict ValDataset -----
   1/1 - 0s - 228ms/epoch - 228ms/step
   Get dataset on batch 4
     ----- Predict ValDataset
   1/1 - 0s - 228ms/epoch - 228ms/step
   Get dataset on batch 5
     ------ Predict ValDataset
    1/1 - 0s - 231ms/epoch - 231ms/step
   Get dataset on batch 6
         ------ Predict ValDataset -----
   1/1 - 0s - 228ms/epoch - 228ms/step
   Get dataset on batch 7
    ----- Predict ValDataset -----
   1/1 - 0s - 249ms/epoch - 249ms/step
    Get dataset on batch 8
        ----- Predict ValDataset -----
   1/1 - 0s - 230ms/epoch - 230ms/step
   Get dataset on batch 9
               ----- Predict ValDataset -----
   1/1 - 0s - 230ms/epoch - 230ms/step
   Get dataset on batch 10
    ----- Predict ValDataset -----
   1/1 - 0s - 232ms/epoch - 232ms/step
   Get dataset on batch 11
    ------Predict ValDataset ------
   1/1 - 0s - 231ms/epoch - 231ms/step
    Get dataset on batch 12
            ----- Predict ValDataset -----
   1/1 - 0s - 231ms/epoch - 231ms/step
   Get dataset on batch 13
    ------Predict ValDataset -----
   1/1 - 0s - 227ms/epoch - 227ms/step
   Get dataset on batch 14
    ----- Predict ValDataset -----
   1/1 - 0s - 227ms/epoch - 227ms/step
   Get dataset on batch 15
            ------ Predict ValDataset -----
    1/1 - 0s - 229ms/epoch - 229ms/step
   Get dataset on batch 16
    ------Predict ValDataset ------
   1/1 - 1s - 1s/epoch - 1s/step
    Pearson Correlation Coefficient: 0.37141046168240693
```

PearsonR, MSE, precision, recall, specificity, NPV, MCC, ba_Actual, ba_Pred, stat_Actual, stat_Pred = model_val_c

```
----- Start ValDataset
   Get dataset on batch 1
    -----Predict ValDataset -----
   1/1 - 0s - 480ms/epoch - 480ms/step
   Get dataset on batch 2
    -----Predict ValDataset -----
   1/1 - 0s - 228ms/epoch - 228ms/step
   Get dataset on batch 3
                  ---- Predict ValDataset -----
   1/1 - 0s - 229ms/epoch - 229ms/step
   Get dataset on batch 4
    ------Predict ValDataset -----
   1/1 - 0s - 235ms/epoch - 235ms/step
   Get dataset on batch 5
       ----- Predict ValDataset -----
   1/1 - 0s - 230ms/epoch - 230ms/step
   Get dataset on batch 6
       ------ Predict ValDataset -----
   1/1 - 0s - 232ms/epoch - 232ms/step
   Get dataset on batch 7
    ----- Predict ValDataset -----
   1/1 - 0s - 229ms/epoch - 229ms/step
   Get dataset on batch 8
     -----Predict ValDataset -----
   1/1 - 0s - 235ms/epoch - 235ms/step
   Get dataset on batch 9
           ----- Predict ValDataset -----
   1/1 - 0s - 231ms/epoch - 231ms/step
   Get dataset on batch 10
           ----- Predict ValDataset -----
   1/1 - 0s - 227ms/epoch - 227ms/step
   Get dataset on batch 11
             ----- Predict ValDataset -----
   1/1 - 0s - 227ms/epoch - 227ms/step
   Get dataset on batch 12
    -----Predict ValDataset -----
   1/1 - 0s - 229ms/epoch - 229ms/step
   Get dataset on batch 13
       ------Predict ValDataset ------
   1/1 - 0s - 226ms/epoch - 226ms/step
   Get dataset on batch 14
        ------ Predict ValDataset -----
   1/1 - 0s - 227ms/epoch - 227ms/step
   Get dataset on batch 15
    1/1 - 0s - 225ms/epoch - 225ms/step
   Get dataset on batch 16
    ------Predict ValDataset ------
   1/1 - 0s - 363ms/epoch - 363ms/step
   Pearson Correlation Coefficient: 0.37141046168240693
   Mean Absolute Error: 0.44962853
   Precision: 0.9872881
   Recall: 0.97899157
   Specificity: 0.9885496
   NPV: 0.9810606
# len(stat_Pred)
fields = ['Model', 'Hit_Label', 'Hit_Prediction', 'BindingAffinity_Label', 'BindingAffinity_Prediction']
rows = []
for idx, value in enumerate(val_list_IDs):
 row = []
 row.append(ligand_list[value])
 row.append(stat_Actual[idx])
 row.append(stat_Pred[idx])
 row.append(ba_Actual[idx])
 row.append(ba_Pred[idx])
 # row = (ligand_list[value], stat_Actual[idx], stat_Pred[idx], ba_Actual[idx], ba_Pred[idx])
```

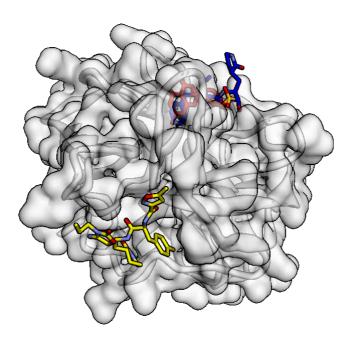
```
# print(type(row))
   rows.append(row)
   # if rows == []:
         rows = row
   # else:
         rows.append(row)
rows
       [['5c1u-Q model15.pdb', 1, 0.9993299245834351, -6.4, -6.485359191894531],
            3sjo-FOPMC_model46.pdb', 1, 0.9996739625930786, -7.4, -6.979996204376221],
         ['3qzr-FIOMC_model22.pdb',
          5.735444210586138e-05.
          -6.8.
          -6.977699279785156],
         ['3qzq-R_model41.pdb', 1, 0.9994035959243774, -7.5, -8.023859977722168]
          ['3sjo-NK18k_model4.pdb', 1, 0.9993780851364136, -7.1, -6.983725070953369],
          ['5gso-SG_model5.pdb', 1, 0.9997405409812927, -6.7, -7.3869123458862305],
['7dnc-10b_model81.pdb', 1, 0.9991466999053955, -7.1, -7.336747646331787],
         ['5gsw-D_model54.pdb', 1, 0.999691367149353, -6.5, -6.8474907875061035],
['5gsw-CIP_model58.pdb', 1, 0.999681367149353, -6.2, -6.279407501220703],
['3sjo-8v_model31.pdb', 0, 7.358544098678976e-05, -7.1, -7.324412822723389],
           '3qzq-F_model34.pdb', 0, 0.006644252687692642, -6.2, -6.533586502075195], '5c1u-NK19k_model23.pdb', 1, 0.9996753931045532, -7.2, -6.904038906097412],
          ['3qzq-R_model8.pdb', 1, 0.9988143444061279, -6.9, -7.713748931884766],
['3qzq-Q_model93.pdb', 0, 0.0064354585483670235, -6.2, -6.543240070343018],
['3sjo-CR_model82.pdb', 0, 0.000303973036352545, -6.6, -6.959396839141846],
['5c1u-10b_model59.pdb', 0, 0.001484525273554027, -6.9, -6.52389669418335],
           '3sjo-AG_model64.pdb', 0, 7.263942734425655e-06, -6.4, -7.164269924163818],
'5gso-CIP_model32.pdb', 0, 0.00025730679044499993, -6.7, -7.318888187408447],
           '7dnc-CIP_model93.pdb', 0, 8.597495252615772e-06, -6.4, -6.014207363128662], '5gsw-CIP_model24.pdb', 1, 0.9996488094329834, -6.6, -6.323408126831055],
           '5gsw-CIP_model59.pdb', 0, 0.06277648359537125, -6.2, -6.703273296356201],
           '5gsw-AG_model88.pdb', 1, 0.9998031258583069, -7.1, -6.934863567352295], 
'5gsw-8x_model11.pdb', 1, 0.9998950958251953, -7.2, -7.430840015411377], 
'5gso-FIOMC_model81.pdb', 1, 0.9996964931488037, -8.4, -7.312397003173828],
           '3sjk-NK18k_model70.pdb', 1, 0.9987233281135559, -6.9, -7.010770320892334],
           '5gsw-SG_model31.pdb', 1, 0.9995075464248657, -6.9, -7.274509906768799]
          '5gso-NK19k_model56.pdb', 1, 0.9996870756149292, -6.5, -7.398436069488525],
          '7dnc-10b_mode172.pdb', 1, 0.9993628859519958, -7.0, -7.303957462310791],
'7dnc-HF_mode187.pdb', 1, 0.9993100166320801, -6.7, -7.24800968170166],
         ['3qzq-NK18k_model14.pdb',
          0.00011404198448872194.
          -6.4,
           -6.627558708190918],
         ['3sjo-D_model96.pdb', 0, 9.499493899056688e-05, -6.5, -6.8696393966674805]
          ['3sjk-CR_model100.pdb', 0, 5.487958696903661e-05, -6.0, -6.875138282775879],
          '3sjk-D_model23.pdb', 0, 6.638530612690374e-05, -7.0, -6.836582183837891],
'5gso-D_model77.pdb', 1, 0.999344527721405, -6.3, -7.104061126708984],
           '5c1u-10b_model25.pdb', 1, 0.999481737613678, -7.2, -6.862899303436279], 
'5c1u-NK18k_model48.pdb', 1, 0.9977472424507141, -7.2, -6.761124134063721], 
'5gso-NK18k_model70.pdb', 1, 0.9995132684707642, -7.1, -7.090506076812744],
           '5gsw-FIP_model88.pdb', 0, 0.0736018493771553, -6.5, -6.601014137268066],
          ['5gso-CR_model85.pdb', 1, 0.9992552399635315, -6.4, -6.959052562713623],
           '5gsw-F_model2.pdb', 1, 0.9996814727783203, -6.8, -6.5274529457092285], 
'3qzr-8w_model49.pdb', 0, 0.0005750557756982744, -6.3, -6.898451328277588],
           '7dnc-FOPMC_model90.pdb', 1, 0.9997428059577942, -7.6, -7.509217739105225]
           '3qzq-SG_model51.pdb', 0, 0.00033046415774151683, -6.7, -6.713829040527344],
           '3qzq-9_model54.pdb', 0, 0.00037561042699962854, -6.6, -6.924108028411865], '5gso-L_model15.pdb', 1, 0.9993953704833984, -7.3, -7.098631858825684], '3sjo-L_model100.pdb', 1, 0.9979116320610046, -7.0, -6.91630634643555],
           '3sjk-NK18k_model86.pdb', 1, 0.9994366765022278, -7.4, -7.141674041748047],
           '3qzq-FOPMC_model5.pdb', 1, 0.998946487903595, -6.5, -7.30050802230835],
           '3qzq-10b_model38.pdb', 0, 0.0031556379981338978, -6.6, -6.517406463623047],
         ['5gso-FIP_model9.pdb', 0, 0.0017458174843341112, -6.4, -7.308454513549805],
len(rows)
```

https://colab.research.google.com/drive/1twTtkeCASLkgjflNXqiI_naTBj3dhA6P#scrollTo=Hs-FZVFcK8YZ&printMode=true

csv_path = '/content/gdrive/MyDrive/Final/CSV/resultSFCNN.csv'

```
with open(csv_path, 'w') as csvfile:
      # creating a csv writer object
      csvwriter = csv.writer(csvfile)
      # writing the fields
      csvwriter.writerow(fields)
      # writing the data rows
      csvwriter.writerows(rows)
 datatset_path = '/content/gdrive/MyDrive/Final/CSV/dataset.csv'
 fields = ['Model', 'Protein', 'Ligand']
 rows = []
  count = 0
Draw
  try:
   import py3Dmol
 except:
    !pip install py3Dmol
   import py3Dmol
      Looking in indexes: <a href="https://pypi.org/simple">https://us-python.pkg.dev/colab-wheels/public/simple/</a>
      Collecting pv3Dmol
       Downloading py3Dmol-2.0.3-py2.py3-none-any.whl (12 kB)
      Installing collected packages: py3Dmol Successfully installed py3Dmol-2.0.3
 14748
      14748
 ligand_14748 = ligand_list[14748]
 ligand 14748
      '3qzq-L_model16.pdb
 # ligand_14748_path = os.path.join(ligand_folder, ligand_14748)
 hitLead_Ligand = '/content/ligand/5c1u-CR_model22.pdb'
 hitLead_Protein = '/content/protein/5c1u.pdb'
 # ligand_14748_path = os.path.join(ligand_folder, ligand_14748)
 hit Ligand = '/content/ligand/5c1u-GC376 model97.pdb'
 hit_Protein = '/content/protein/3qzr.pdb'
 no Ligand = '/content/ligand/5c1u-FOPMC model71.pdb'
 no_Protein = '/content/protein/3qzr.pdb'
 view = py3Dmol.view()
 view.removeAllModels()
 view.setViewStyle({'style':'outline','color':'black','width':0.1})
 view.addModel(open(hitLead_Protein,'r').read(),format='pdb')
 Prot=view.getModel()
 Prot.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'white'}})
 view.addSurface(py3Dmol.VDW,{'opacity':0.8,'color':'white'})
```

```
view.addModel(open(hitLead_Ligand,'r').read(),format='mol2')
ref_m1 = view.getModel()
ref_m1.setStyle({},{'stick':{'colorscheme':'redCarbon','radius':0.2}})
view.addModel(open(hit_Ligand,'r').read(),format='mol2')
ref_m2 = view.getModel()
ref_m2.setStyle({},{'stick':{'colorscheme':'blueCarbon','radius':0.2}})
view.addModel(open(no_Ligand,'r').read(),format='mol2')
ref_m3 = view.getModel()
ref_m3.setStyle({},{'stick':{'colorscheme':'yellowCarbon','radius':0.2}})
# ref_m.setStyle({},{'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# ref_m.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# results=Chem.SDMolSupplier('1AZ8_lig_vina_out.sdf')
# p=Chem.MolToMolBlock(results[0],False)
# print('Reference: Magenta | Vina Pose: Cyan')
# print ('Pose: {} | Score: {}'.format(results[0].GetProp('Pose'),results[0].GetProp('Score')))
# view.addModel(p,'mol')
# x = view.getModel()
# x.setStyle({},{'stick':{'colorscheme':'cyanCarbon','radius':0.2}})
view.zoomTo()
view.show()
```



```
view = py3Dmol.view()
view.removeAllModels()
view.setViewStyle({'style':'outline','color':'black','width':0.1})

# view.addModel(open(hitLead_Protein,'r').read(),format='pdb')
# Prot=view.getModel()
# Prot.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'white'}})

# view.addSurface(py3Dmol.VDW,{'opacity':0.8,'color':'white'})

view.addModel(open(hitLead_Ligand,'r').read(),format='mol2')
ref_m = view.getModel()
ref_m.setStyle({},{'stick':{'colorscheme':'magentaCarbon','radius':0.2}})
# ref_m.setStyle({},{'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# ref_m.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# results=Chem.SDMolSupplier('1AZ8_lig_vina_out.sdf')
```

```
# p=Chem.MolToMolBlock(results[0],False)

# print('Reference: Magenta | Vina Pose: Cyan')

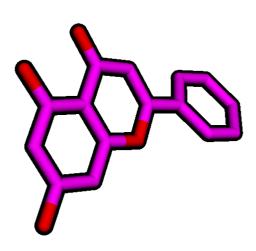
# print ('Pose: {} | Score: {}'.format(results[0].GetProp('Pose'),results[0].GetProp('Score')))

# view.addModel(p,'mol')

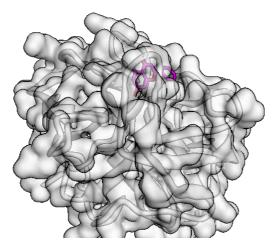
# x = view.getModel()

# x.setStyle({},{'stick':{'colorscheme':'cyanCarbon','radius':0.2}})

view.zoomTo()
view.show()
```

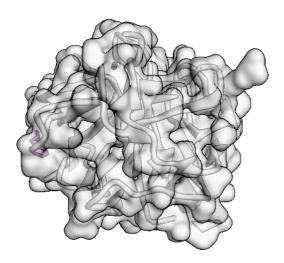


```
view = py3Dmol.view()
view.removeAllModels()
view.setViewStyle({'style':'outline','color':'black','width':0.1})
view.addModel(open(hitLead_Protein,'r').read(),format='pdb')
Prot=view.getModel()
Prot.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'white'}})
view.addSurface(py3Dmol.VDW,{'opacity':0.8,'color':'white'})
view.addModel(open(hitLead_Ligand,'r').read(),format='mol2')
ref_m = view.getModel()
ref_m.setStyle({},{'stick':{'colorscheme':'magentaCarbon','radius':0.2}})
# ref_m.setStyle({},{'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# ref_m.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# results=Chem.SDMolSupplier('1AZ8_lig_vina_out.sdf')
# p=Chem.MolToMolBlock(results[0],False)
# print('Reference: Magenta | Vina Pose: Cyan')
# print ('Pose: {} | Score: {}'.format(results[0].GetProp('Pose'),results[0].GetProp('Score')))
# view.addModel(p,'mol')
# x = view.getModel()
# x.setStyle({},{'stick':{'colorscheme':'cyanCarbon','radius':0.2}})
view.zoomTo()
view.show()
```



```
view = py3Dmol.view()
view.removeAllModels()
view.setViewStyle({'style':'outline','color':'black','width':0.1})
view.addModel(open(hit_Protein,'r').read(),format='pdb')
Prot=view.getModel()
Prot.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'white'}})
view.addSurface(py3Dmol.VDW,{'opacity':0.8,'color':'white'})
view.addModel(open(hit_Ligand,'r').read(),format='mol2')
ref_m = view.getModel()
ref_m.setStyle({},{'stick':{'colorscheme':'magentaCarbon','radius':0.2}})
# ref_m.setStyle({},{'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# ref_m.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# results=Chem.SDMolSupplier('1AZ8_lig_vina_out.sdf')
# p=Chem.MolToMolBlock(results[0],False)
# print('Reference: Magenta | Vina Pose: Cyan')
# print ('Pose: {} | Score: {}'.format(results[0].GetProp('Pose'),results[0].GetProp('Score')))
# view.addModel(p,'mol')
# x = view.getModel()
# x.setStyle({},{'stick':{'colorscheme':'cyanCarbon','radius':0.2}})
view.zoomTo()
view.show()
```

```
view = py3Dmol.view()
view.removeAllModels()
view.setViewStyle({'style':'outline','color':'black','width':0.1})
view.addModel(open(no Protein, 'r').read(), format='pdb')
Prot=view.getModel()
Prot.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'white'}})
view.addSurface(py3Dmol.VDW,{'opacity':0.8,'color':'white'})
view.addModel(open(no_Ligand,'r').read(),format='mol2')
ref_m = view.getModel()
ref_m.setStyle({},{'stick':{'colorscheme':'magentaCarbon','radius':0.2}})
# ref_m.setStyle({},{'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# ref_m.setStyle({'cartoon':{'arrows':True, 'tubes':True, 'style':'oval', 'color':'red'}})
# results=Chem.SDMolSupplier('1AZ8_lig_vina_out.sdf')
# p=Chem.MolToMolBlock(results[0],False)
# print('Reference: Magenta | Vina Pose: Cyan')
# print ('Pose: {} | Score: {}'.format(results[0].GetProp('Pose'),results[0].GetProp('Score')))
# view.addModel(p,'mol')
# x = view.getModel()
# x.setStyle({},{'stick':{'colorscheme':'cyanCarbon','radius':0.2}})
view.zoomTo()
view.show()
```



Các sản phẩm có tính phí của Colab - Huỷ hợp đồng tại đây