Model2C19-Appendix

February 25, 2015

0.0.1 Train/Test split already done

In [2]:
```
#from sklearn.cross_validation import train_test_split

        # create 80%-20% train-test split
        #X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=5555)
```

In [3]:
```
twoC19_test = pd.read_csv("data/test2c19.csv", index_col='SID')
twoC19_train = pd.read_csv("data/training2c19.csv", index_col='SID')
```

In [6]:
```
# Isolate response variable
ActivityScore = twoC19_train['ActivityScore']
y_train = np.where(ActivityScore >= 40,1,0)

ActivityScore2 = twoC19_test['ActivityScore']
y_test = np.where(ActivityScore2 >= 40,1,0)
```

In [7]:
```
# looks right sized
y_train.shape, y_test.shape
```

Out[7]:
```
((9462,), (2366,))
```

In [8]:
```
y_test
```

Out[8]:
```
array([1, 1, 0, ..., 1, 0, 0])
```

In [9]:
```
# We don't need this column anymore
to_drop = ['ActivityScore']
inhib_feat_space = twoC19_train.drop(to_drop,axis=1)
inhib_feat_space_test = twoC19_test.drop(to_drop,axis=1)
```

In [10]:
```
# Pull out features for future use
 features = inhib_feat_space.columns
 features_test = inhib_feat_space_test.columns
```

In [11]:
```
X_train = inhib_feat_space.as_matrix().astype(np.float)
 X_test = inhib_feat_space_test.as_matrix().astype(np.float)
```

In [12]:
```
X_train.shape, X_test.shape
```

Out[12]:
```
((9462, 186), (2366, 186))
```

In [13]:
```
n_pos1 = y_test.sum()
 n_pos1
```

Out[13]:
```
1193
```

In [14]:
```
n_pos2 = y_train.sum()
n_pos2
```

Out[14]: 4721

In [15]:
```
print('Feature space holds '+repr(X_train.shape[0])+' observations and '+repr(X_test.shape[1])+
print('Unique target labels: '+repr(np.unique(y_train)))

print('Feature space holds '+repr(X_test.shape[0])+' observations and '+repr(X_test.shape[1])+
print('Unique target labels: '+repr(np.unique(y_test)))
```

```
Feature space holds 9462 observations and 186 features
Unique target labels: array([0, 1])
Feature space holds 2366 observations and 186 features
Unique target labels: array([0, 1])
```

In [16]:
```
X_test.shape[1]
```

Out[16]: 186

0.1 Scale the features before training model

In [17]:
```
from sklearn.preprocessing import StandardScaler
scaler = StandardScaler()
X_train = scaler.fit_transform(X_train)
X_test = scaler.fit_transform(X_test)
```

In [18]:
```
from sklearn.cross_validation import KFold

def run_cv(X,y,clf_class,**kwargs):
    # Construct a kfolds object
    kf = KFold(len(y),n_folds=5,shuffle=True)
    y_pred = y.copy()

    # Iterate through folds
    for train_index, test_index in kf:
        X_train, X_test = X[train_index], X[test_index]
        y_train = y[train_index]
        # Initialize a classifier with key word arguments
        clf = clf_class(**kwargs)
        clf.fit(X_train,y_train)
        y_pred[test_index] = clf.predict(X_test)
    return y_pred
```

In [19]:
```
from sklearn.svm import SVC
from sklearn.ensemble import RandomForestClassifier as RF
from sklearn.neighbors import KNeighborsClassifier as KNN

def accuracy(y_true,y_pred):
    # NumPy interpretes True and False as 1. and 0.
    return np.mean(y_true == y_pred)

print("K-nearest-neighbors (training set):")
print("%.3f" % accuracy(y_train, run_cv(X_train,y_train,KNN)))
print("K-nearest-neighbors (test set):")
print("%.3f" % accuracy(y_test, run_cv(X_test,y_test,KNN)))
```

```
print('Support vector machines (training set):')
print("%.3f" % accuracy(y_train, run_cv(X_train,y_train,SVC)))
print('Support vector machines (test set):')
print("%.3f" % accuracy(y_test, run_cv(X_test,y_test,SVC)))
print("Random forest (training set):")
print("%.3f" % accuracy(y_train, run_cv(X_train,y_train,RF)))
print("Random forest (test set):")
print("%.3f" % accuracy(y_test, run_cv(X_test,y_test,RF)))
```

```
K-nearest-neighbors (training set):
0.730
K-nearest-neighbors (test set):
0.720

/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
  max_iter=self.max_iter, random_seed=random_seed)
/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
  max_iter=self.max_iter, random_seed=random_seed)
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/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
  max_iter=self.max_iter, random_seed=random_seed)

Support vector machines (training set):
0.767

/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
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/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
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Support vector machines (test set):
0.756
Random forest (training set):
0.736
Random forest (test set):
0.721
```

In [21]:
```
from sklearn.metrics import confusion_matrix

y_train = np.array(y_train)
class_names = np.unique(y_train)

confusion_matrices_training = [
    ( "K-Nearest-Neighbors training", confusion_matrix(y_train,run_cv(X_train,y_train,KNN)) ),
    ( "Support Vector Machines training", confusion_matrix(y_train,run_cv(X_train,y_train,SVC)
    ( "Random Forest taining", confusion_matrix(y_train,run_cv(X_train,y_train,RF)) ),
```

```
]

y_test = np.array(y_test)
class_names = np.unique(y_test)

confusion_matrices_test = [
    ( "K-Nearest-Neighbors test", confusion_matrix(y_test,run_cv(X_test,y_test,KNN)) ),
    ( "Support Vector Machines test", confusion_matrix(y_test,run_cv(X_test,y_test,SVC)) ),
    ( "Random Forest test", confusion_matrix(y_test,run_cv(X_test,y_test,RF)) ),
]

#draw_confusion_matrices(confusion_matrices,class_names)
confusion_matrices_training, confusion_matrices_test
```

```
/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
  max_iter=self.max_iter, random_seed=random_seed)
/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
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/home/ubuntu/miniconda3/lib/python3.3/site-packages/sklearn/svm/base.py:233: DeprecationWarning: using a
  max_iter=self.max_iter, random_seed=random_seed)
```

```
Out[21]: ([('K-Nearest-Neighbors training', array([[3322, 1419],
                 [1113, 3608]])),
           ('Support Vector Machines training', array([[3451, 1290],
                 [ 934, 3787]])),
           ('Random Forest taining', array([[3623, 1118],
                 [1407, 3314]]))],
          [('K-Nearest-Neighbors test', array([[823, 350],
                 [301, 892]])), ('Support Vector Machines test', array([[832, 341],
                 [233, 960]])), ('Random Forest test', array([[890, 283],
                 [387, 806]]))])
```