Random Forest models

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5/1/23

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```python
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.model_selection import cross_val_score
from sklearn.model_selection import GridSearchCV
from sklearn.metrics import (
    roc_curve,
    auc,
    roc_auc_score,
    confusion_matrix,
    classification_report,
    accuracy_score,
    precision_score,
    recall_score,
    f1_score,
    precision_recall_curve,
    average_precision_score,
)
from sklearn.ensemble import RandomForestClassifier
```

```python
# DIRECTORIES
input_path = "../data/processed/"
train_path = "../data/processed/train_data/"
test_path = "../data/processed/test_data/"
results_path = "../models/results/"
# FILES
# MOLECULAR DESCRIPTORS
molecular_descriptors_training_file = "molecular_descriptors_training.csv"
molecular_descriptors_test_file = "molecular_descriptors_test.csv"
# MACCS KEYS
maccs_keys_training_file = "maccs_keys_training.csv"
maccs_keys_test_file = "maccs_keys_test.csv"
# ECFP4 FINGERPRINTS
ecfp4_fingerprints_training_file = "ecfp4_fingerprints_training.csv"
ecfp4_fingerprints_test_file = "ecfp4_fingerprints_test.csv"
# RESULTS FILE
results_file = "results_table.csv"
```

```python
# LOAD DATA
# MOLECULAR DESCRIPTORS
## TRAINING
molecular_descriptors_training = pd.read_csv(
    train_path + molecular_descriptors_training_file
)
X_training_molecular_descriptors = molecular_descriptors_training.drop(
    columns=["activity"]
)
Y_training_molecular_descriptors = molecular_descriptors_training["activity"]
## TEST
molecular_descriptors_test = pd.read_csv(test_path + molecular_descriptors_test_file
X_test_molecular_descriptors = molecular_descriptors_test.drop(columns=["activity"])
Y_test_molecular_descriptors = molecular_descriptors_test["activity"]
# MACCS KEYS
## TRAINING
macc_keys_training = pd.read_csv(train_path + maccs_keys_training_file)
X_training_maccs_keys = macc_keys_training.drop(columns=["activity"])
Y_training_maccs_keys = macc_keys_training["activity"]
## TEST
macc_keys_test = pd.read_csv(test_path + maccs_keys_test_file)
X_test_maccs_keys = macc_keys_test.drop(columns=["activity"])
Y_test_maccs_keys = macc_keys_test["activity"]
# ECFP4 FINGERPRINTS
## TRAINING
ecfp4_fingerprints_training = pd.read_csv(train_path + ecfp4_fingerprints_training_f
X_training_ecfp4_fingerprints = ecfp4_fingerprints_training.drop(columns=["activity'
Y_training_ecfp4_fingerprints = ecfp4_fingerprints_training["activity"]
## TEST
ecfp4_fingerprints_test = pd.read_csv(test_path + ecfp4_fingerprints_test_file)
X_test_ecfp4_fingerprints = ecfp4_fingerprints_test.drop(columns=["activity"])
Y_test_ecfp4_fingerprints = ecfp4_fingerprints_test["activity"]
```

```
# DEFINE THE PARAMETERS TO EXPLORE
parameters = {
    "n_estimators": [10, 50, 100],
    "max_depth": [5, 10, 50],
    "min_samples_split": [5, 10, 20],
    "min_samples_leaf": [5, 10, 50],
    "max_features": ["sqrt", "log2"],
}
```

Chapter 1

RANDOM FOREST MODEL FOR MOLECULAR DESCRIPTORS

```
# BUILD A RANDOM FOREST MODEL FOR MOLECULAR DESCRIPTORS. USE GRID SEARCH TO EXPLORE ALL THE PO
# DEFINE THE MODEL
rf_model = RandomForestClassifier(random_state=0)

# DEFINE THE GRID SEARCH
grid_molecular_descriptors = GridSearchCV(
    estimator=rf_model,
    param_grid=parameters,
    scoring="roc_auc",
    cv=5,
    n_jobs=-1,
    verbose=3,
)
# TRAIN THE MODEL
grid_molecular_descriptors.fit(
    X_training_molecular_descriptors, Y_training_molecular_descriptors
)
```

```
Fitting 5 folds for each of 162 candidates, totalling 810 fits
```

```
GridSearchCV(cv=5, estimator=RandomForestClassifier(random_state=0), n_jobs=-1,
             param_grid={'max_depth': [5, 10, 50],
                         'max_features': ['sqrt', 'log2'],
                         'min_samples_leaf': [5, 10, 50],
                         'min_samples_split': [5, 10, 20],
                         'n_estimators': [10, 50, 100]},
             scoring='roc_auc', verbose=3)
```

```
# WE GET THE BEST KNN MODEL
best_model_molecular_descriptors = grid_molecular_descriptors.best_estimator_
best_model_name = "Random Forest Molecular Descriptors"
```

```
# PREDICT
Y_pred_molecular_descriptors = best_model_molecular_descriptors.predict(
    X_test_molecular_descriptors
)
# EVALUATE
accuracy = accuracy_score(Y_test_molecular_descriptors, Y_pred_molecular_descriptors
precision = precision_score(Y_test_molecular_descriptors, Y_pred_molecular_descripto
recall = recall_score(Y_test_molecular_descriptors, Y_pred_molecular_descriptors)
auc_molecular_descriptors = roc_auc_score(
    Y_test_molecular_descriptors, Y_pred_molecular_descriptors
)
# AUC TRAINING
Y_pred_train_molecular_descriptors = best_model_molecular_descriptors.predict(
    X_training_molecular_descriptors
)
auc_train_molecular_descriptors = roc_auc_score(
    Y_training_molecular_descriptors, Y_pred_train_molecular_descriptors
)

# CREATE DATAFRAME WITH RESULTS
results_molecular_descriptors = pd.DataFrame(
    {
        "model_name": [best_model_name],
        "accuracy": [round(accuracy, 2)],
        "precision": [round(precision, 2)],
        "recall": [round(recall, 2)],
        "auc": [round(auc_molecular_descriptors, 2)],
        "auc_train": [round(auc_train_molecular_descriptors, 2)],
    }
)
```

```
# SAVE TABLE_RESULTS.CSV
table_results = pd.read_csv(results_path + results_file)
table_results = table_results.append(results_molecular_descriptors)
table_results.to_csv(results_path + results_file, index=False)
```

```
/var/folders/3s/vv1d0lmn7g134m4psncn2_q80000gn/T/ipykernel_15004/4156157498.py:3: FutureWarning:

The frame.append method is deprecated and will be removed from pandas in a future version. Use pa
```

Chapter 2

RANDOM FOREST MODEL FOR MACCS KEYS

```
# BUILD A RANDOM FOREST MODEL FOR MACCS KEYS. USE GRID SEARCH TO EXPLORE ALL THE POSSIBLE COMB
# DEFINE THE MODEL
rf_model = RandomForestClassifier(random_state=0)

# DEFINE THE GRID SEARCH
grid_maccs_keys = GridSearchCV(
    estimator=rf_model,
    param_grid=parameters,
    scoring="roc_auc",
    cv=5,
    n_jobs=-1,
    verbose=1,
)
# TRAIN THE MODEL
grid_maccs_keys.fit(X_training_maccs_keys, Y_training_maccs_keys)
```

```
Fitting 5 folds for each of 162 candidates, totalling 810 fits
```

```
GridSearchCV(cv=5, estimator=RandomForestClassifier(random_state=0), n_jobs=-1,
             param_grid={'max_depth': [5, 10, 50],
                         'max_features': ['sqrt', 'log2'],
                         'min_samples_leaf': [5, 10, 50],
                         'min_samples_split': [5, 10, 20],
                         'n_estimators': [10, 50, 100]},
            scoring='roc_auc', verbose=1)
```

```
# WE GET THE BEST RANDOM FOREST MODEL
best_model_maccs_keys = grid_maccs_keys.best_estimator_
best_model_name = "Random Forest MACCS Keys"
```

```
# PREDICT
Y_pred_maccs_keys = best_model_maccs_keys.predict(X_test_maccs_keys)
# EVALUATE
accuracy = accuracy_score(Y_test_maccs_keys, Y_pred_maccs_keys)
precision = precision_score(Y_test_maccs_keys, Y_pred_maccs_keys)
recall = recall_score(Y_test_maccs_keys, Y_pred_maccs_keys)
auc_maccs_keys = roc_auc_score(Y_test_maccs_keys, Y_pred_maccs_keys)
# AUC TRAINING
Y_pred_train_maccs_keys = best_model_maccs_keys.predict(X_training_maccs_keys)
auc_train_maccs_keys = roc_auc_score(Y_training_maccs_keys, Y_pred_train_maccs_keys)

# CREATE DATAFRAME WITH RESULTS
results_maccs_keys = pd.DataFrame(
    {
        "model_name": [best_model_name],
        "accuracy": [round(accuracy, 2)],
        "precision": [round(precision, 2)],
        "recall": [round(recall, 2)],
        "auc": [round(auc_maccs_keys, 2)],
        "auc_train": [round(auc_train_maccs_keys, 2)],
    }
)
```

```
# SAVE TABLE_RESULTS.CSV
table_results = pd.read_csv(results_path + results_file)
table_results = table_results.append(results_maccs_keys)
table_results.to_csv(results_path + results_file, index=False)
```

```
/var/folders/3s/vv1d0lmn7g134m4psncn2_q80000gn/T/ipykernel_15004/2186010174.py:3: Futu

The frame.append method is deprecated and will be removed from pandas in a future vers
```

Chapter 3

RANDOM FOREST MODEL FOR ECFP4

```
# BUILD A RANDOM FOREST MODEL FOR ECFP4. USE GRID SEARCH TO EXPLORE ALL THE POSSIBLE COMBINATI
# DEFINE THE MODEL
rf_model = RandomForestClassifier(random_state=0)

# DEFINE THE GRID SEARCH
grid_ecfp4 = GridSearchCV(
    estimator=rf_model,
    param_grid=parameters,
    scoring="roc_auc",
    cv=5,
    n_jobs=-1,
    verbose=1,
)
# TRAIN THE MODEL USING PROGRESS BARS


grid_ecfp4.fit(X_training_ecfp4_fingerprints, Y_training_ecfp4_fingerprints)
```

```
Fitting 5 folds for each of 162 candidates, totalling 810 fits
```

```
GridSearchCV(cv=5, estimator=RandomForestClassifier(random_state=0), n_jobs=-1,
             param_grid={'max_depth': [5, 10, 50],
                         'max_features': ['sqrt', 'log2'],
                         'min_samples_leaf': [5, 10, 50],
                         'min_samples_split': [5, 10, 20],
                         'n_estimators': [10, 50, 100]},
            scoring='roc_auc', verbose=1)
```

```
# WE GET THE BEST RANDOM FOREST MODEL
best_model_ecfp4 = grid_ecfp4.best_estimator_
best_model_name = "Random Forest ECFP4"
```

```
# PREDICT
Y_pred_ecfp4_fingerprints = best_model_ecfp4.predict(X_test_ecfp4_fingerprints)
# EVALUATE
accuracy = accuracy_score(Y_test_ecfp4_fingerprints, Y_pred_ecfp4_fingerprints)
precision = precision_score(Y_test_ecfp4_fingerprints, Y_pred_ecfp4_fingerprints)
recall = recall_score(Y_test_ecfp4_fingerprints, Y_pred_ecfp4_fingerprints)
auc_ecfp4_fingerprints = roc_auc_score(
    Y_test_ecfp4_fingerprints, Y_pred_ecfp4_fingerprints
)
# AUC TRAINING
Y_pred_train_ecfp4 = best_model_ecfp4.predict(X_training_ecfp4_fingerprints)
auc_train_ecfp4 = roc_auc_score(Y_training_ecfp4_fingerprints, Y_pred_train_ecfp4)

# CREATE DATAFRAME WITH RESULTS
results_ecfp4 = pd.DataFrame(
    {
        "model_name": [best_model_name],
        "accuracy": [round(accuracy, 2)],
        "precision": [round(precision, 2)],
        "recall": [round(recall, 2)],
        "auc": [round(auc_ecfp4_fingerprints, 2)],
        "auc_train": [round(auc_train_ecfp4, 2)],
    }
)
```

```
# SAVE TABLE_RESULTS.CSV
table_results = pd.read_csv(results_path + results_file)
table_results = table_results.append(results_ecfp4)
table_results.to_csv(results_path + results_file, index=False)
```

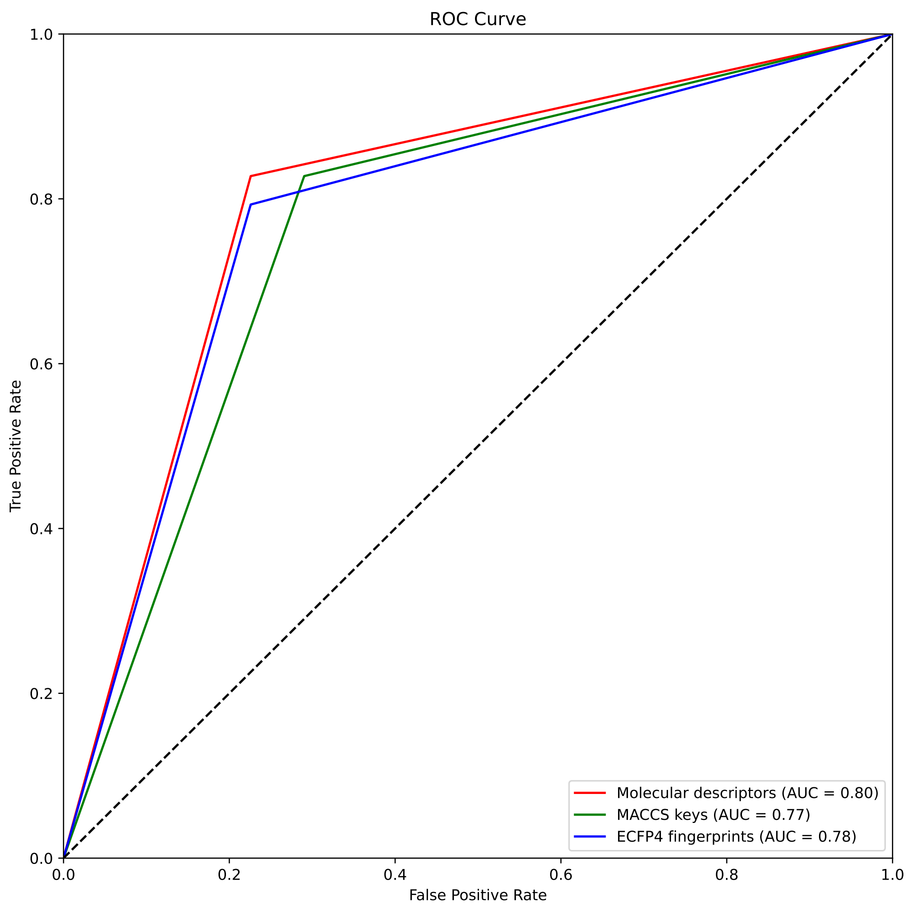
```
/var/folders/3s/vv1d0lmn7g134m4psncn2_q80000gn/T/ipykernel_15004/3957559514.py:3: Futu

The frame.append method is deprecated and will be removed from pandas in a future vers
```

Chapter 4

RESULTS FOR RANDOM FOREST MODELS

```
# GET FPR AND TPR FOR ALL MODELS
# MOLECULAR DESCRIPTORS
fpr_molecular_descriptors, tpr_molecular_descriptors, _ = roc_curve(
    Y_test_molecular_descriptors, Y_pred_molecular_descriptors
)
# MACCS KEYS
fpr_maccs_keys, tpr_maccs_keys, _ = roc_curve(Y_test_maccs_keys, Y_pred_maccs_keys)
# ECFP4 FINGERPRINTS
fpr_ecfp4_fingerprints, tpr_ecfp4_fingerprints, _ = roc_curve(
    Y_test_ecfp4_fingerprints, Y_pred_ecfp4_fingerprints
)
```

```
# PLOT ALL THE ROC CURVES IN THE SAME PLOT
plt.figure(figsize=(10, 10))
plt.plot(
    fpr_molecular_descriptors,
    tpr_molecular_descriptors,
    color="red",
    label="Molecular descriptors (AUC = %0.2f)" % auc_molecular_descriptors,
)
plt.plot(
    fpr_maccs_keys,
    tpr_maccs_keys,
    color="green",
    label="MACCS keys (AUC = %0.2f)" % auc_maccs_keys,
)
plt.plot(
    fpr_ecfp4_fingerprints,
    tpr_ecfp4_fingerprints,
    color="blue",
    label="ECFP4 fingerprints (AUC = %0.2f)" % auc_ecfp4_fingerprints,
)
plt.plot([0, 1], [0, 1], color="black", linestyle="--")
plt.xlim([0.0, 1.0])
plt.ylim([0.0, 1.0])
plt.xlabel("False Positive Rate")
plt.ylabel("True Positive Rate")
plt.title("ROC Curve")
plt.legend(loc="lower right")
plt.savefig(results_path + "knn_roc_curve.png")
plt.show()
```



```
# DROP DUPLICATES FROM TABLE_RESULTS.CSV ACCORDING TO MODEL_NAME
table_results = pd.read_csv(results_path + results_file)
table_results = table_results.drop_duplicates(subset=["model_name"])
table_results.to_csv(results_path + results_file, index=False)
```