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0%

accuracy\_df = comparison\_df[comparison\_df['Metric'] == 'accuracy']  
print('Filtered accuracy DataFrame:')  
print(accuracy\_df)  
  
Filtered accuracy DataFrame:  

	Model	CV Type	Metric	Mean	Std
0	Random Forest	KFold	accuracy	0.925000	0.055277
4	Random Forest	Stratified KFold	accuracy	0.933333	0.033333
8	SVM	KFold	accuracy	0.958333	0.052705
12	SVM	Stratified KFold	accuracy	0.950000	0.016667
16	Decision Tree	KFold	accuracy	0.916667	0.069722
20	Decision Tree	Stratified KFold	accuracy	0.933333	0.050000

Reasoning: I will create a bar plot to visualize the mean accuracy for each model and cross-validation type, including standard deviation as error bars, as instructed in the subtask.

20%

import matplotlib.pyplot as plt  
import seaborn as sns  
  
plt.figure(figsize=(10, 6))  
sns.barplot(x='Model', y='Mean', hue='CV Type', data=accuracy\_df, capsize=0.1, errorbar='sd')  
  
plt.title('Model Performance Comparison (Accuracy)', fontsize=14)  
plt.xlabel('Model and CV Type', fontsize=12)  
plt.ylabel('Mean Accuracy', fontsize=12)  
plt.ylim(0.85, 1.0) # Set y-axis limit for better visualization  
plt.legend(title='Cross-Validation Type')  
plt.grid(axis='y', linestyle='--', alpha=0.7)  
plt.tight\_layout()  
plt.show()  
print("Bar plot visualizing mean accuracy with standard deviation as error bars displayed.")

Model	CV Type	Mean Accuracy	Std
Random Forest	KFold	0.925000	0.055277
Random Forest	Stratified KFold	0.933333	0.033333
SVM	KFold	0.958333	0.052705
SVM	Stratified KFold	0.950000	0.016667
Decision Tree	KFold	0.916667	0.069722
Decision Tree	Stratified KFold	0.933333	0.050000

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```
'Mean': values.mean(),
'Std': values.std()
})

# Create the DataFrame
comparison_df = pd.DataFrame(data_rows)

print('Comparison table of model performance metrics:')
print(comparison_df)
```

Comparison table of model performance metrics:

	Model	CV Type	Metric	Mean	Std
0	Random Forest	KFold	accuracy	0.925000	0.055277
1	Random Forest	KFold	precision	0.936243	0.055596
2	Random Forest	KFold	recall	0.925000	0.055277
3	Random Forest	KFold	f1_score	0.926058	0.055151
4	Random Forest	Stratified KFold	accuracy	0.933333	0.033333
5	Random Forest	Stratified KFold	precision	0.946378	0.021933
6	Random Forest	Stratified KFold	recall	0.933333	0.033333
7	Random Forest	Stratified KFold	f1_score	0.932125	0.035037
8	SVM	KFold	accuracy	0.958333	0.052785
9	SVM	KFold	precision	0.963571	0.048874
10	SVM	KFold	recall	0.958333	0.052785
11	SVM	KFold	f1_score	0.958713	0.052557
12	SVM	Stratified KFold	accuracy	0.950000	0.016667
13	SVM	Stratified KFold	precision	0.957153	0.011912
14	SVM	Stratified KFold	recall	0.950000	0.016667
15	SVM	Stratified KFold	f1_score	0.949678	0.017164
16	Decision Tree	KFold	accuracy	0.916667	0.069722
17	Decision Tree	KFold	precision	0.928145	0.071131
18	Decision Tree	KFold	recall	0.916667	0.069722
19	Decision Tree	KFold	f1_score	0.917464	0.070296
20	Decision Tree	Stratified KFold	accuracy	0.933333	0.050000
21	Decision Tree	Stratified KFold	precision	0.942788	0.043369
22	Decision Tree	Stratified KFold	recall	0.933333	0.050000
23	Decision Tree	Stratified KFold	f1_score	0.932324	0.051195

[24] ✓ 0s

```
accuracy_df = comparison_df[comparison_df['Metric'] == 'accuracy']
print('Filtered accuracy DataFrame:')
print(accuracy_df)
```

Filtered accuracy DataFrame:

	Model	CV Type	Metric	Mean	Std
0	Random Forest	KFold	accuracy	0.925000	0.055277
4	Random Forest	Stratified KFold	accuracy	0.933333	0.033333

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import pandas as pd

# Prepare data for comparison table

data\_rows = []

for key, values in cv\_results.items():

if 'stratified' in key:

model\_metric = key.replace('stratified', '')

cv\_type = 'Stratified KFold'

else:

model\_metric = key

cv\_type = 'KFold'

model\_name = ''

metric = ''

if model\_metric.startswith('svm\_'):

model\_name = 'SVM'

metric = model\_metric.replace('svm\_', '')

elif model\_metric.startswith('dt\_'):

model\_name = 'Decision Tree'

metric = model\_metric.replace('dt\_', '')

elif any(m in model\_metric for m in ['accuracy', 'precision', 'recall', 'f1\_score']):

# For Random Forest, initial keys are just metric names

model\_name = 'Random Forest'

metric = model\_metric

if model\_name:

data\_rows.append({

'Model': model\_name,

'CV Type': cv\_type,

'Metric': metric,

'Mean': values.mean(),

'Std': values.std()

})

# Create the DataFrame

comparison\_df = pd.DataFrame(data\_rows)

print("Comparison table of model performance metrics:")

print(comparison\_df)

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```

    results_summary['Model'].append(model_name)
    results_summary['CV Type'].append(cv_type)
    results_summary['Metric'].append(metric)
    results_summary['Mean'].append(values.mean())
    results_summary['Std'].append(values.std())
    continue

else:
    continue # Skip other prefixed metrics not explicitly handled for RF

# Ensure Random Forest is added for all its metrics correctly, handling potential duplicates
if model_name == 'Random Forest':
    if not any(d['Model'] == 'Random Forest' and d['CV Type'] == cv_type and d['Metric'] == metric for d in results_summary['Model']):
        results_summary['Model'].append(model_name)
        results_summary['CV Type'].append(cv_type)
        results_summary['Metric'].append(metric)
        results_summary['Mean'].append(values.mean())
        results_summary['Std'].append(values.std())
    else: # For SVM and Decision Tree
        results_summary['Model'].append(model_name)
        results_summary['CV Type'].append(cv_type)
        results_summary['Metric'].append(metric)
        results_summary['Mean'].append(values.mean())
        results_summary['Std'].append(values.std())

# Special handling for Random forest metrics to ensure they are added correctly
rf_kfold_metrics = ['accuracy', 'precision', 'recall', 'f1_score']
for metric in rf_kfold_metrics:
    if metric in cv_results and not any(d['Model'] == 'Random Forest' and d['CV Type'] == 'Kfold' and d['Metric'] == metric for d in results_summary['Model']):
        results_summary['Model'].append('Random Forest')
        results_summary['CV Type'].append('Kfold')
        results_summary['Metric'].append(metric)
        results_summary['Mean'].append(cv_results[metric].mean())
        results_summary['Std'].append(cv_results[metric].std())

rf_skfold_metrics = [f'{m}_stratified' for m in rf_kfold_metrics]
for metric_key in rf_skfold_metrics:
    metric = metric_key.replace('_stratified', '')
    if metric_key in cv_results and not any(d['Model'] == 'Random Forest' and d['CV Type'] == 'Stratified Kfold' and d['Metric'] == metric for d in results_summary['Model']):
        results_summary['Model'].append('Random Forest')
        results_summary['CV Type'].append('Stratified Kfold')
        results_summary['Metric'].append(metric)

```

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Import pandas as pd

```
# Prepare data for comparison table
results_summary = {
    'Model': [],
    'CV Type': [],
    'Metric': [],
    'Mean': [],
    'Std': []
}

for key, values in cv_results.items():
    if '_stratified' in key:
        model_metric = key.replace('_stratified', '')
        cv_type = 'Stratified KFold'
    else:
        model_metric = key
        cv_type = 'KFold'

    if model_metric.startswith('svm_'):
        model_name = 'SVM'
        metric = model_metric.replace('svm_', '')
    elif model_metric.startswith('dt_'):
        model_name = 'Decision Tree'
        metric = model_metric.replace('dt_', '')
    elif model_metric.startswith('accuracy'): # Random Forest results are stored without model prefix initially
        model_name = 'Random Forest'
        metric = model_metric
    if '_stratified' in key:
        metric = model_metric.replace('_stratified', '')
    if not any(d['Model'] == 'Random Forest' and d['CV Type'] == cv_type and d['Metric'] == metric for d in results_summary['Model']):
        results_summary['Model'].append(model_name)
        results_summary['CV Type'].append(cv_type)
        results_summary['Metric'].append(metric)
        results_summary['Mean'].append(values.mean())
        results_summary['Std'].append(values.std())
        continue
    else:
        continue # Skip other prefixed metrics not explicitly handled for RF

# Ensure Random Forest is added for all its metrics correctly, handling potential duplicates
if model_name == 'Random Forest':
```

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```
[24] ✓ 0s
from sklearn.tree import DecisionTreeClassifier
print("DecisionTreeClassifier imported successfully.")

DecisionTreeClassifier imported successfully.

[25] ✓ 0s
import warnings
warnings.filterwarnings('ignore')

# Instantiate SVM and Decision Tree models
svm_model = SVC(random_state=42)
dt_model = DecisionTreeClassifier(random_state=42)
print("SVM and Decision Tree models instantiated.")

# Evaluate SVM with K-fold cross-validation
print("\n--- SVM K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(svm_model, X_train, y_train, cv=kfold, scoring=scorer)
    cv_results[f'svm_{metric_name}'] = scores
    print(f"SVM - KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

# Evaluate SVM with Stratified K-fold cross-validation
print("\n--- SVM Stratified K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(svm_model, X_train, y_train, cv=skfold, scoring=scorer)
    cv_results[f'svm_{metric_name}_stratified'] = scores
    print(f"SVM - Stratified KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

# Evaluate Decision Tree with K-fold cross-validation
print("\n--- Decision Tree K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(dt_model, X_train, y_train, cv=kfold, scoring=scorer)
    cv_results[f'dt_{metric_name}'] = scores
    print(f"Decision Tree - KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

# Evaluate Decision Tree with Stratified K-fold cross-validation
print("\n--- Decision Tree Stratified K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(dt_model, X_train, y_train, cv=skfold, scoring=scorer)
    cv_results[f'dt_{metric_name}_stratified'] = scores
    print(f"Decision Tree - Stratified KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")
```

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```
from sklearn.tree import DecisionTreeClassifier
print("DecisionTreeClassifier imported successfully.")

# Instantiate SVM and Decision Tree models
svm_model = SVC(random_state=42)
dt_model = DecisionTreeClassifier(random_state=42)
print("SVM and Decision Tree models instantiated.")

# Evaluate SVM with K-fold cross-validation
print("\n--- SVM K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(svm_model, X_train, y_train, cv=kfold, scoring=scorer)
    cv_results[f'svm_{metric_name}'] = scores
    print(f"SVM - KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

# Evaluate SVM with Stratified K-fold cross-validation
print("\n--- SVM Stratified K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(svm_model, X_train, y_train, cv=skfold, scoring=scorer)
    cv_results[f'svm_{metric_name}_stratified'] = scores
    print(f"SVM - Stratified KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

# Evaluate Decision Tree with K-fold cross-validation
print("\n--- Decision Tree K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(dt_model, X_train, y_train, cv=kfold, scoring=scorer)
    cv_results[f'dt_{metric_name}'] = scores
    print(f"Decision Tree - KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

# Evaluate Decision Tree with Stratified K-fold cross-validation
print("\n--- Decision Tree Stratified K-fold Cross-Validation ---")
for metric_name, scorer in scoring.items():
    scores = cross_val_score(dt_model, X_train, y_train, cv=skfold, scoring=scorer)
    cv_results[f'dt_{metric_name}_stratified'] = scores
    print(f"Decision Tree - Stratified KFold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")
```

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[11] ✓ 10s

from sklearn.model\_selection import GridSearchCV  
  
param\_grid = {  
 'n\_estimators': [10, 50, 100],  
 'max\_depth': [None, 10, 20],  
 'min\_samples\_split': [2, 5, 10]  
}  
  
grid\_search = GridSearchCV(estimator=rf\_model, param\_grid=param\_grid, cv=skfold, scoring='accuracy', n\_jobs=-1)  
grid\_search.fit(X\_train, y\_train)  
  
print("Best Hyperparameters:", grid\_search.best\_params\_)  
print("Best Score:", grid\_search.best\_score\_)  
  
Best Hyperparameters: {'max\_depth': None, 'min\_samples\_split': 10, 'n\_estimators': 50}  
Best Score: 0.95

[12] ✓ 0s

from sklearn.svm import SVC  
print("SVC imported successfully.")  
  
SVC imported successfully.

Task

Reasoning:  
  
The next step in the plan is to implement K-fold and Stratified K-fold cross-validation for the Support Vector Machine (SVM) and Decision Tree models. I'll start by importing the `DecisionTreeClassifier` and instantiating both models. Then, I'll apply the previously defined `KFold` and `StratifiedKFold` objects along with the `scoring` dictionary to evaluate these models. This will allow us to calculate and report the accuracy, precision, recall, and F1-score for each model.

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[14]:

cv\_results = {}  
for metric\_name, scorer in scoring.items():  
 scores = cross\_val\_score(rf\_model, X\_train, y\_train, cv=kfold, scoring=scorer)  
 cv\_results[metric\_name] = scores  
 print(f"Random Forest - Kfold {metric\_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")  
  
print("K-fold cross-validation completed for Random Forest Classifier.")

Random Forest - Kfold Accuracy: Mean = 0.9250, Std = 0.0553  
Random Forest - Kfold Precision: Mean = 0.9362, Std = 0.0556  
Random Forest - Kfold Recall: Mean = 0.9250, Std = 0.0553  
Random Forest - Kfold F1\_score: Mean = 0.9261, Std = 0.0552  
K-fold cross-validation completed for Random Forest Classifier.

[11]:

from sklearn.model\_selection import StratifiedKFold  
print("StratifiedKFold imported successfully.")

StratifiedKFold imported successfully.

[10]:

skfold = StratifiedKFold(n\_splits=5, shuffle=True, random\_state=42)  
print("StratifiedKFold object instantiated successfully.")

StratifiedKFold object instantiated successfully.

[11]:

for metric\_name, scorer in scoring.items():  
 scores = cross\_val\_score(rf\_model, X\_train, y\_train, cv=skfold, scoring=scorer)  
 cv\_results[f'{metric\_name}\_stratified'] = scores  
 print(f"Random Forest - Stratified Kfold {metric\_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")  
  
print("Stratified K-fold cross-validation completed for Random Forest Classifier.")

Random Forest - Stratified Kfold Accuracy: Mean = 0.9333, Std = 0.0333  
Random Forest - Stratified Kfold Precision: Mean = 0.9464, Std = 0.0219  
Random Forest - Stratified Kfold Recall: Mean = 0.9333, Std = 0.0333  
Random Forest - Stratified Kfold F1\_score: Mean = 0.9321, Std = 0.0350  
Stratified K-fold cross-validation completed for Random Forest Classifier.

[14]:

from sklearn.model\_selection import GridSearchCV  
  
param\_grid = {  
 'n\_estimators': [10, 50, 100]

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```
[7] ✓ 0s from sklearn.model_selection import Kfold, cross_val_score
print("Kfold and cross_val_score imported successfully.")

Kfold and cross_val_score imported successfully.

[8] ✓ 0s from sklearn.metrics import make_scorer, accuracy_score, precision_score, recall_score, f1_score
print("Scoring metrics functions imported successfully.")

Scoring metrics functions imported successfully.

[11] ✓ 0s rf_model = RandomForestClassifier(random_state=42)
print("RandomForestClassifier model instantiated.")

RandomForestClassifier model instantiated.

[14] ✓ 0s kfold = Kfold(n_splits=5, shuffle=True, random_state=42)
print("Kfold object instantiated.")

Kfold object instantiated.

[31] ✓ 0s scoring = {
    'accuracy': make_scorer(accuracy_score),
    'precision': make_scorer(precision_score, average='weighted'),
    'recall': make_scorer(recall_score, average='weighted'),
    'f1_score': make_scorer(f1_score, average='weighted')
}
print("Scoring metrics dictionary created successfully.")

Scoring metrics dictionary created successfully.

[41] ✓ 0s cv_results = {}
for metric_name, scorer in scoring.items():
    scores = cross_val_score(rf_model, X_train, y_train, cv=kfold, scoring=scorer)
    cv_results[metric_name] = scores
    print(f"Random Forest - Kfold {metric_name.capitalize()}: Mean = {scores.mean():.4f}, Std = {scores.std():.4f}")

print("K-fold cross-validation completed for Random Forest Classifier.")

Random Forest - Kfold Accuracy: Mean = 0.9250, Std = 0.0553
Random Forest - Kfold Precision: Mean = 0.9342, Std = 0.0506
```

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```
[1] from sklearn.datasets import load_iris
[2] iris_data = load_iris()
    print("Iris dataset loaded successfully.")
... Iris dataset loaded successfully.
[3] X = iris_data.data
    y = iris_data.target
    print("Features (X) and target (y) extracted from Iris dataset.")
Features (X) and target (y) extracted from Iris dataset.
[4] Start coding or generate with AI.
[5] from sklearn.model_selection import train_test_split
    print("train_test_split function imported successfully.")
train_test_split function imported successfully.
[6] X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
    print("Dataset split into training and testing sets successfully.")
Dataset split into training and testing sets successfully.
[7] from sklearn.ensemble import RandomForestClassifier
    print("RandomForestClassifier imported successfully.")
RandomForestClassifier imported successfully.
[8] from sklearn.model_selection import KFold, cross_val_score
    print("KFold and cross_val_score imported successfully.")
```

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