In [15]:

```
import mglearn
import matplotlib.pyplot as plt
import pandas as pd
import numpy as np
import sklearn
```

In [2]:

```
from sklearn.datasets import load_breast_cancer from sklearn.model_selection import train_test_split
```

In [3]:

```
from matplotlib import font_manager, rc

plt.rcParams['axes.unicode_minus'] = False
font_name = font_manager.FontProperties(fname="C:/Windows/Fonts/malgun.ttf").get_name()
rc('font', family=font_name)

plt.rcParams['axes.unicode_minus'] = False
```

In [7]:

```
from sklearn.datasets import make_moons
```

In [9]:

```
Xm, ym = make_moons(n_samples=100, noise=0.25, random_state=3)
Xm_train, Xm_test, ym_train, ym_test = train_test_split(Xm, ym, stratify=ym, random_state=42)
cancer = load_breast_cancer()
Xc_train, Xc_test, yc_train, yc_test = train_test_split(cancer.data, cancer.target, random_state=0)
```

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In [10]:

```
from sklearn.linear_model import LogisticRegression
from sklearn.ensemble import BaggingClassifier

bagging = BaggingClassifier(LogisticRegression(), n_estimators=100, oob_score=True, n_jobs=1, r
andom_state=42)
bagging.fit(Xc_train, yc_train)
```

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to silence this warning.

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C:\ProgramData\Anaconda3\Iib\site-packages\sklearn\Iinear_model\Iogistic.py:433: Future\Uinear_model\Iogistic.py:433: Future\Uinear_model\Iogistic.py:433: Future\Uinear_model\Iogistic.py:433: Future\Uinear_model\Iinear_model\Iogistic.py:433: Future\Uinear_model\Iin

FutureWarning)

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FutureWarning)

C:\ProgramData\Anaconda3\Iib\site-packages\sklearn\Iinear_model\Iogistic.py:433: Future\Uinear_model\Iogistic.py:433: Future\Uinear_mig: Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.

FutureWarning)

C:\ProgramData\Anaconda3\Iib\site-packages\sklearn\Iinear_model\Iogistic.py:433: Future\Uinear_model\Iogistic.py:433: Future\Uinear_mig: Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.

FutureWarning)

C:\mathbb{W}\text{ProgramData\mathbb{W}}\text{Anaconda}\mathbb{W}\text{lib\mathbb{W}}\text{site-packages\mathbb{W}}\text{sklearn\mathbb{W}}\text{linear_model\mathbb{W}}\text{logistic.py:433: F uture\mathbb{W}}\text{uture\mathbb{W}}\text{arning: Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.

FutureWarning)

C:\mathbb{W}\text{ProgramData\mathbb{W}}\text{Anaconda3\mathbb{W}}\text{lib\mathbb{W}}\text{site-packages\mathbb{W}}\text{sklearn\mathbb{W}}\text{linear_model\mathbb{W}}\text{logistic.py:433: F uture\mathbb{W}}\text{uture\mathbb{W}}\text{arning: Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.

FutureWarning)

C:\mathbb{W}\text{ProgramDataWAnaconda3WIibWsite-packagesWsklearn\mathbb{W}\text{linear_model\mathbb{W}\text{logistic.py:433:} F uture\mathbb{W}\text{utureWarning:} Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.

FutureWarning)

C:\ProgramData\Anaconda3\Iib\site-packages\sklearn\Iinear_model\Iogistic.py:433: Future\Uinear_model\Iogistic.py:433: Future\Uinear_mig: Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.

FutureWarning)

Out[10]:

BaggingClassifier(base_estimator=LogisticRegression(C=1.0, class_weight=None, dual =False. fit intercept=True.

intercept_scaling=1, max_iter=100, multi_class='warn', n_jobs=None, penalty='l2', random_state=None, solver='warn', tol=0.0001, verbose=0, warm_start=False), bootstrap=True, bootstrap_features=False, max_features=1.0, nax_samples=1.0, n_estimators=100, n_jobs=1, oob_score=True, random state=42. verbose=0. warm start=False)

In [12]:

```
print("훈련 세트 정확도: {:.3f}".format(bagging.score(Xc_train, yc_train)))
print("테스트 세트 정확도: {:.3f}".format(bagging.score(Xc_test, yc_test)))
print("00B 세트 정확도: {:.3f}".format(bagging.oob_score_))
```

훈련 세트 정확도: 0.962 테스트 세트 정확도: 0.958 00B 세트 정확도: 0.948

In [13]:

```
from sklearn.tree import DecisionTreeClassifier
bagging = BaggingClassifier(DecisionTreeClassifier(), n_estimators=5, n_jobs=-1, random_state=42)
bagging.fit(Xm_train, ym_train)
```

Out[13]:

In [16]:

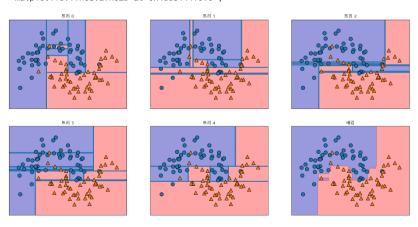
```
fig, axes = plt.subplots(2, 3, figsize=(20, 10))

for i, (ax, tree) in enumerate(zip(axes.ravel(), bagging.estimators_)):
    ax.set_title("트리 {}".format(i))
    mglearn.plots.plot_tree_partition(Xm, ym, tree, ax=ax)

mglearn.plots.plot_2d_separator(bagging, Xm, fill=True, ax=axes[-1, -1], alpha=.4)

axes[-1, -1].set_title("배장")
mglearn.discrete_scatter(Xm[:, 0], Xm[:, 1], ym)
```

Out[16]:



In [17]:

```
bagging = BaggingClassifier(DecisionTreeClassifier(), n_estimators=100, oob_score=True, n_jobs=-1, random_state=42)
bagging.fit(Xc_train, yc_train)

print("훈련 세트 정확도: {:.3f}".format(bagging.score(Xc_train, yc_train)))
print("테스트 세트 정확도: {:.3f}".format(bagging.score(Xc_test, yc_test)))
print("00B 세트 정확도: {:.3f}".format(bagging.oob_score_))
```

훈련 세트 정확도: 1.000 테스트 세트 정확도: 0.965 00B 세트 정확도: 0.951

엑스트라 트리

In [18]:

```
from sklearn.ensemble import ExtraTreesClassifier

xtree = ExtraTreesClassifier(n_estimators=5, n_jobs=-1, random_state=0)
xtree.fit(Xm_train, ym_train)
```

Out[18]:

```
ExtraTreesClassifier(bootstrap=False, class_weight=None, criterion='gini', max_depth=None, max_features='auto', max_leaf_nodes=None, min_impurity_decrease=0.0, min_impurity_split=None, min_samples_leaf=1, min_samples_split=2, min_weight_fraction_leaf=0.0, n_estimators=5, n_jobs=-1, oob_score=False, random_state=0, verbose=0, warm_start=False)
```

In [19]:

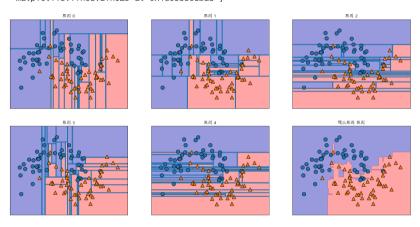
```
fig, axes = plt.subplots(2, 3, figsize=(20, 10))

for i, (ax, tree) in enumerate(zip(axes.ravel(), xtree.estimators_)):
    ax.set_title("트리 {}".format(i))
    mglearn.plots.plot_tree_partition(Xm, ym, tree, ax=ax)

mglearn.plots.plot_2d_separator(xtree, Xm, fill=True, ax=axes[-1, -1], alpha=.4)
axes[-1, -1].set_title("엑스트라 트리")
mglearn.discrete_scatter(Xm[:, 0], Xm[:, 1], ym)
```

Out [19]:

[<matplotlib.lines.Line2D at 0x1de9335f5c0> <matplotlib.lines.Line2D at 0x1de933e8ba8>



In [22]:

```
xtree = ExtraTreesClassifier(n_estimators=100, n_jobs=-1, random_state=0)
xtree.fit(Xc_train, yc_train)
print("훈련 세트 정확도: {:.3f}".format(bagging.score(Xc_train, yc_train)))
print("테스트 세트 정확도: {:.3f}".format(bagging.score(Xc_test, yc_test)))
```

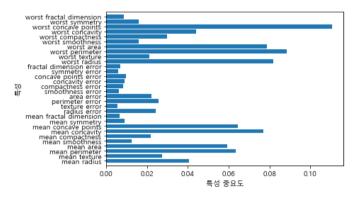
훈련 세트 정확도: 1.000 테스트 세트 정확도: 0.972

In [23]:

```
n_features = cancer.data.shape[1]
plt.barh(range(n_features), xtree.feature_importances_, align='center')
plt.yticks(np.arange(n_features), cancer.feature_names)
plt.xlabel("특성 중요도")
plt.ylabel("특성")
plt.ylim(-1, n_features)
```

Out [23]:

(-1, 30)



AdaBoost

In [25]:

```
from sklearn.ensemble import AdaBoostClassifier

ada = AdaBoostClassifier(n_estimators=5, random_state=42)
ada.fit(Xm_train, ym_train)
```

Out[25]:

AdaBoostClassifier(algorithm='SAMME.R', base_estimator=None, learning_rate=1.0, n_estimators=5, random_state=42)

In [26]:

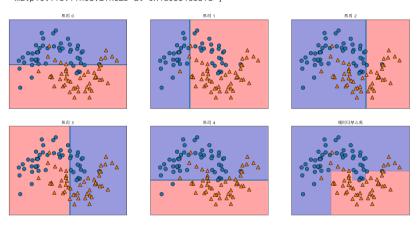
```
fig, axes = plt.subplots(2, 3, figsize=(20, 10))

for i, (ax, tree) in enumerate(zip(axes.ravel(), ada.estimators_)):
    ax.set_title("트리 {}".format(i))
    mglearn.plots.plot_tree_partition(Xm, ym, tree, ax=ax)

mglearn.plots.plot_2d_separator(ada, Xm, fill=True, ax=axes[-1, -1], alpha=.4)
    axes[-1, -1].set_title("에이다부스트")
    mglearn.discrete_scatter(Xm[:, 0], Xm[:, 1], ym)
```

Out [26]:

[<matplotlib.lines.Line2D at 0x1de90916390>,
<matplotlib.lines.Line2D at 0x1de931eb5f8>]



In [27]:

```
ada = AdaBoostClassifier(n_estimators=100, random_state=42)
ada.fit(Xc_train, yc_train)
```

Out [27]:

AdaBoostClassifier(algorithm='SAMME.R', base_estimator=None, learning_rate=1.0, n_estimators=100, random_state=42)

In [28]:

```
print("훈련 세트 정확도: {:.3f}".format(ada.score(Xc_train, yc_train)))
print("테스트 세트 정확도: {:.3f}".format(ada.score(Xc_test, yc_test)))
```

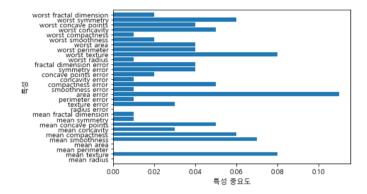
훈련 세트 정확도: 1.000 테스트 세트 정확도: 0.986

In [29]:

```
n_features = cancer.data.shape[1]
plt.barh(range(n_features), ada.feature_importances_, align='center')
plt.yticks(np.arange(n_features), cancer.feature_names)
plt.xlabel("특성 중요도")
plt.ylabel("특성")
plt.ylim(-1, n_features)
```

Out[29]:

(-1, 30)



In []: