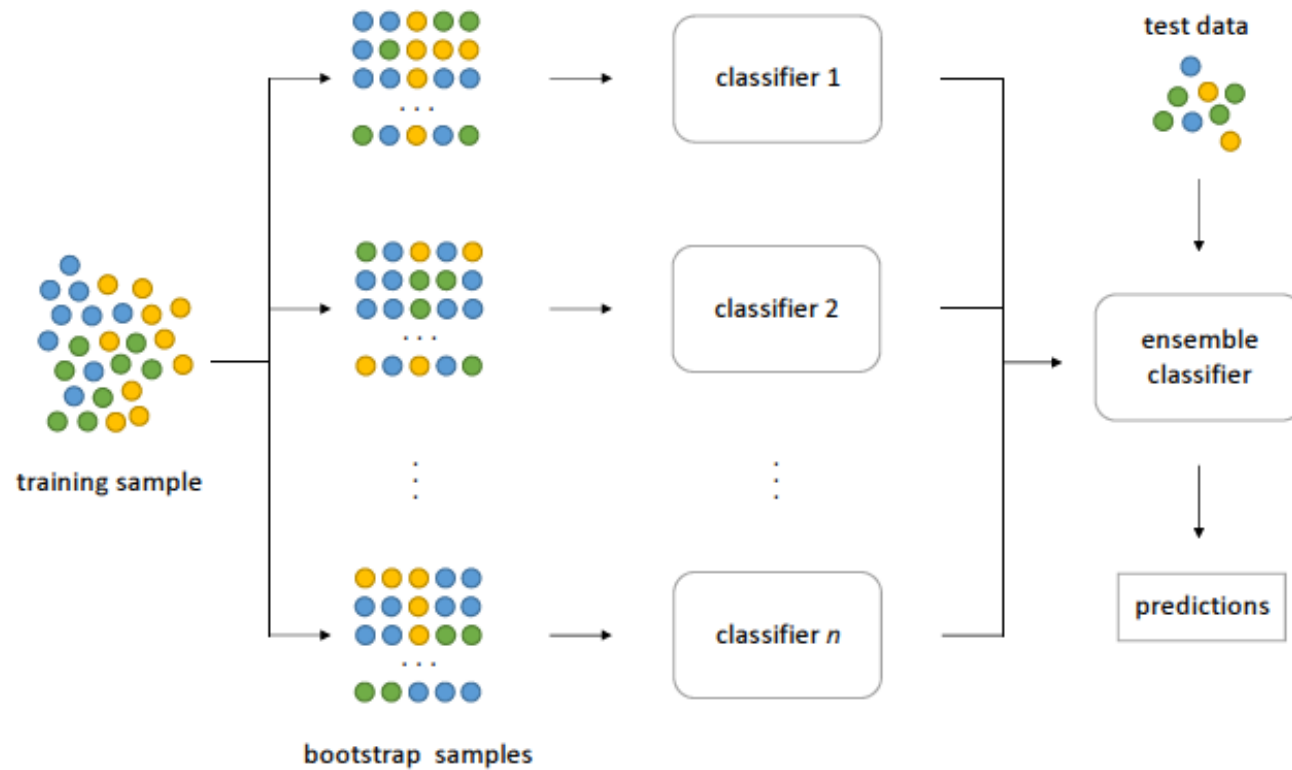




Bagging + Data Pre-Processing

Bagging



- Off-the-shelf algorithms optimize the accuracy
 - Not suitable for imbalanced datasets

Figure 5: The bagging approach. Several classifier are trained on bootstrap samples of the training data. Predictions on test data are obtained combining the predictions of the trained classifiers with a majority voting scheme.

Bagging + Re-Sampling

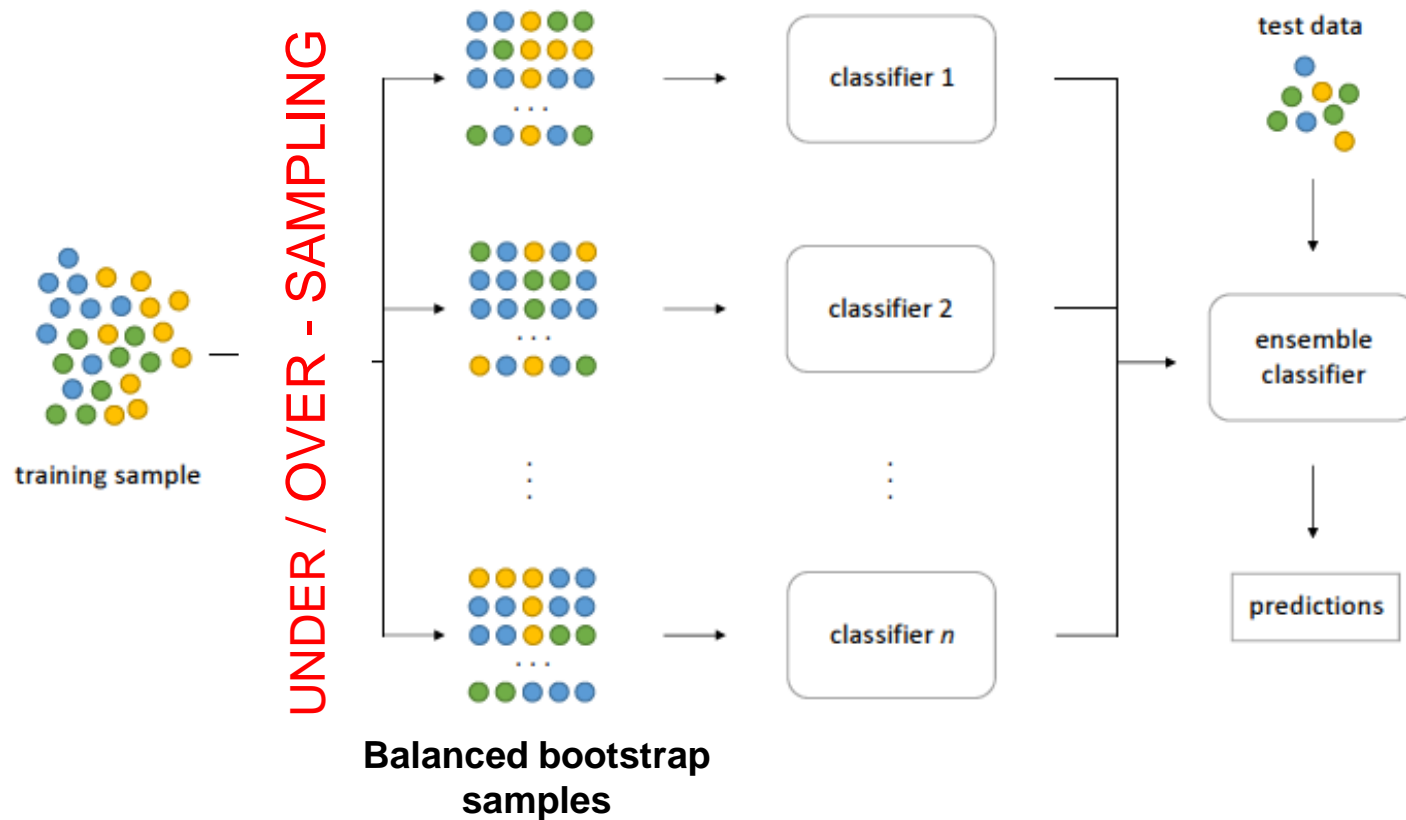
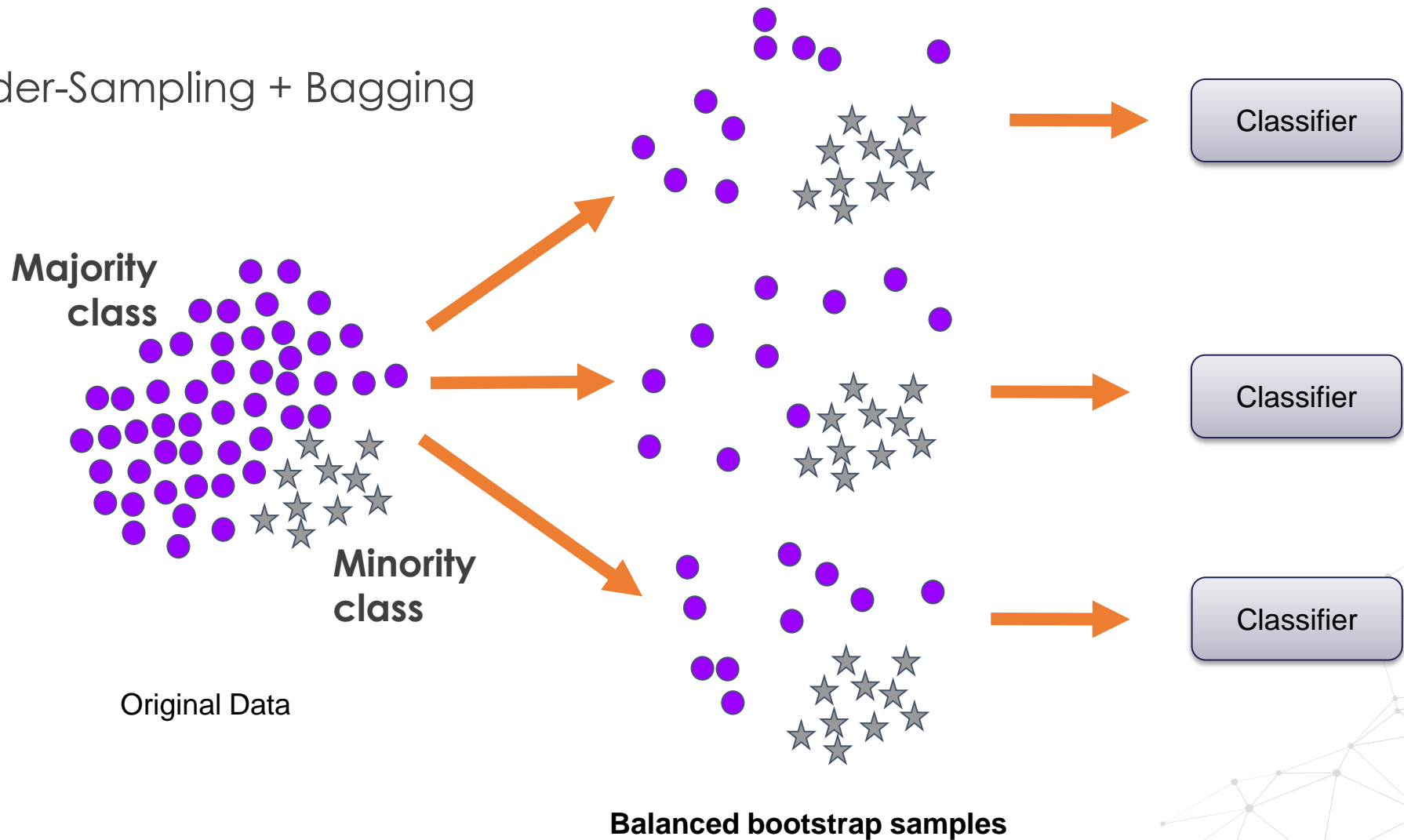


Figure 5: The bagging approach. Several classifier are trained on bootstrap samples of the training data. Predictions on test data are obtained combining the predictions of the trained classifiers with a majority voting scheme.

- Off-the-shelf algorithms optimize the accuracy
 - Not suitable for imbalanced datasets
- Use under- or over-sampling to create balanced datasets
 - During bootstrap

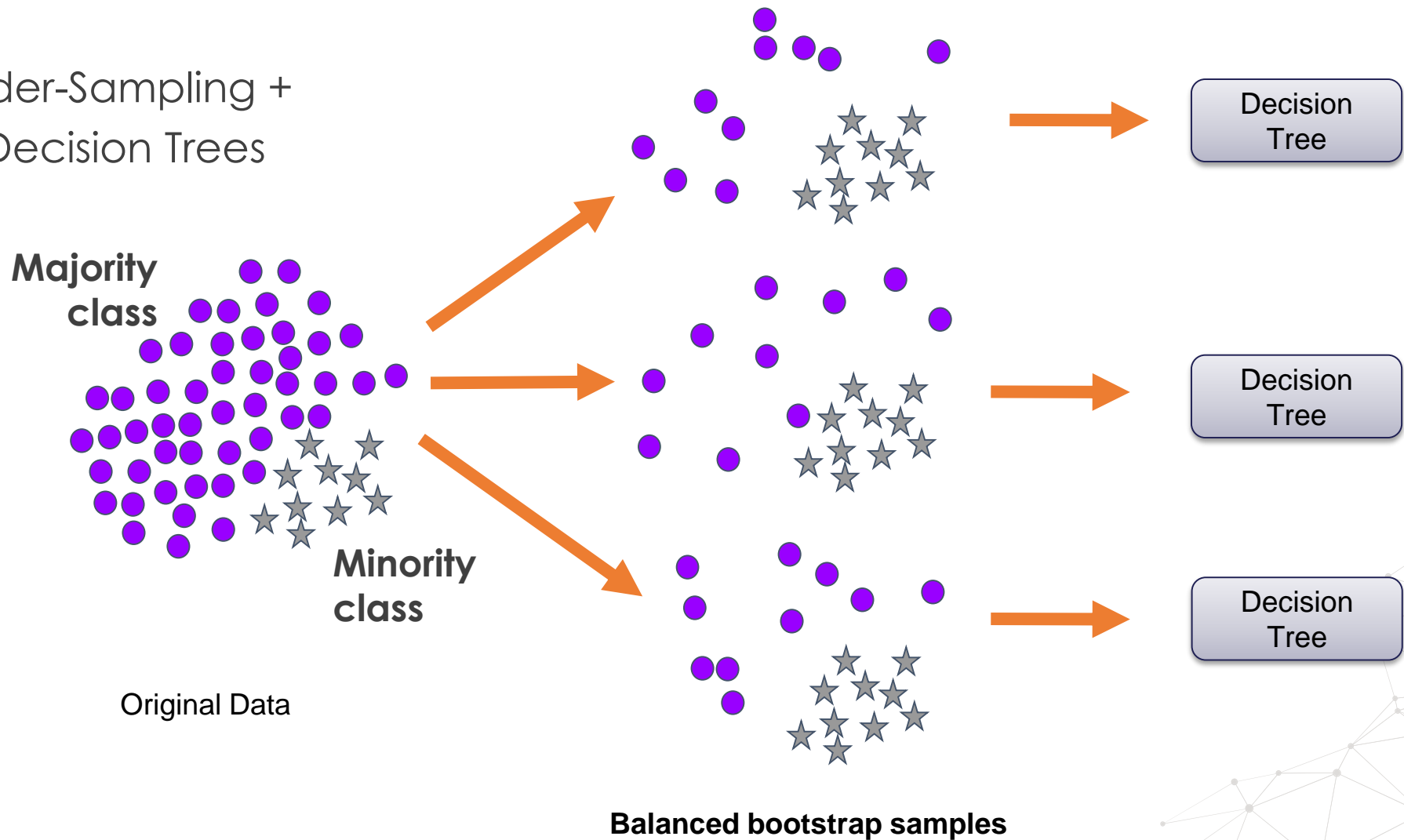
UnderBagging

Random Under-Sampling + Bagging



Balanced Random Forests

Random Under-Sampling +
Bagging of Decision Trees



UnderBagging with Imbalanced Learn

Random Under-Sampling + Bagging

`imblearn.ensemble`: Ensemble methods

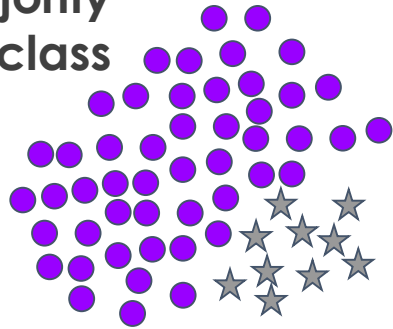
The `imblearn.ensemble` module include methods generating under-sampled subsets combined inside an ensemble.

<code>ensemble.BalancedBaggingClassifier ([...])</code>	A Bagging classifier with additional balancing.
<code>ensemble.BalancedRandomForestClassifier ([...])</code>	A balanced random forest classifier.

OverBagging

Random Over-Sampling + Bagging

Majority
class

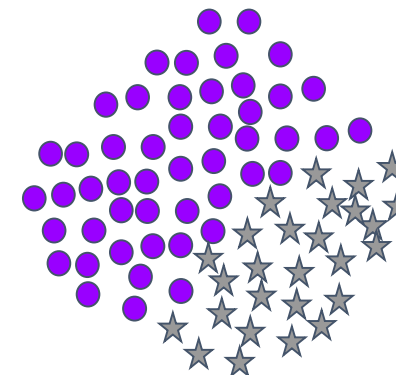
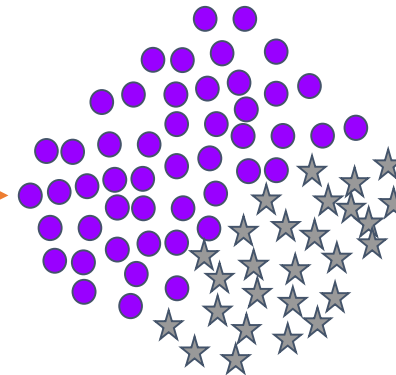
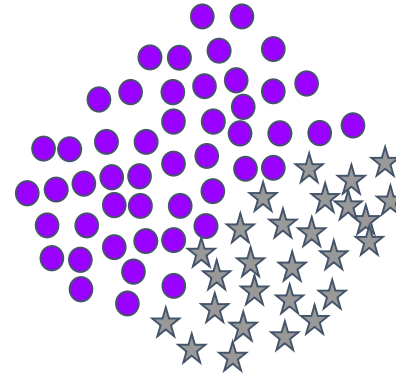


Minority
class

Original Data

Bootstrap with replacement:

- from majority AND minority
- final balancing ratio = 1



Classifier

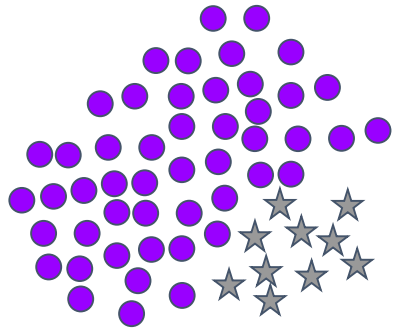
Classifier

Classifier

Balanced bootstrap samples

SMOTEBagging

SMOTE + Bagging

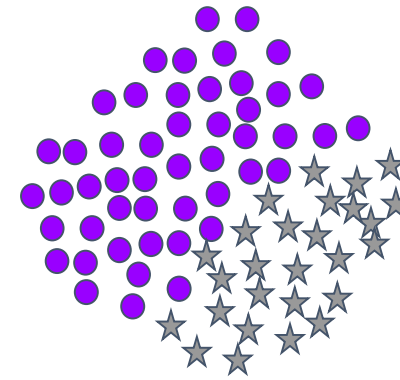


Original Data

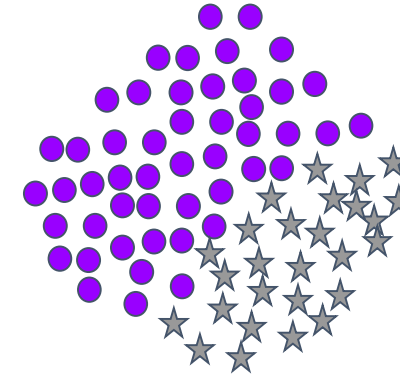
- Majority class bootstrapped with replacement

Minority class:

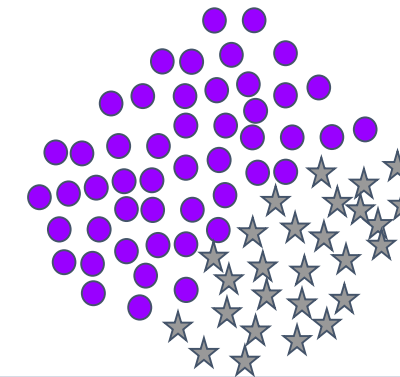
- A % is bootstrapped with replacement from 10-100% on each iteration
- The rest are created by SMOTE till desired balancing ratio is reached



Classifier



Classifier



Classifier

Balanced samples

Ensemble approaches

