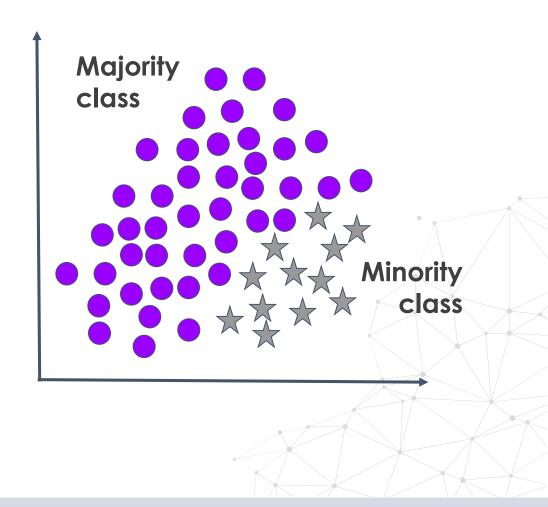


#### **Under-sampling methods**

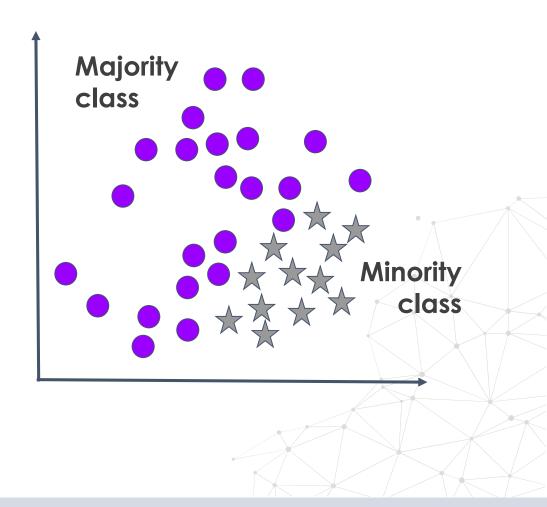
Process of **reducing** the number of samples from the Majority Class





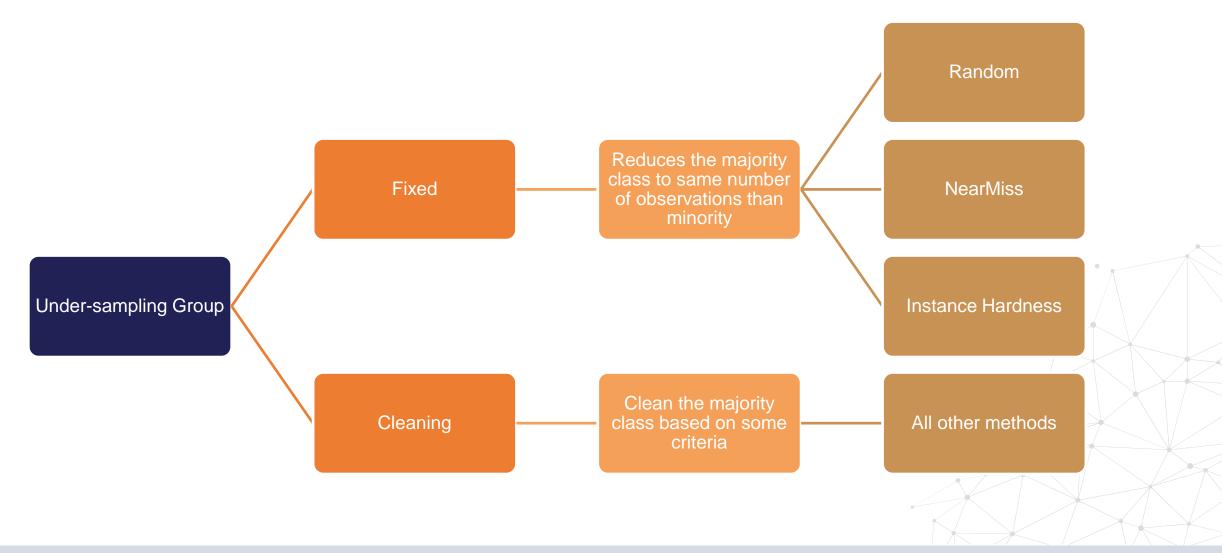
#### **Under-sampling methods**

Process of **reducing** the number of samples from the Majority Class





### Fixed vs Cleaning under- sampling

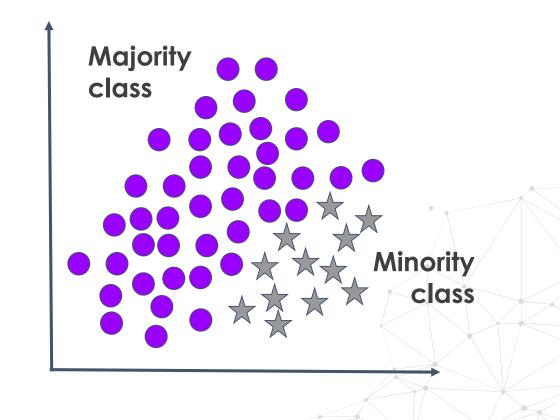




#### **Balancing ratio**

$$R(x) = \frac{X(minority)}{X(majority)}$$

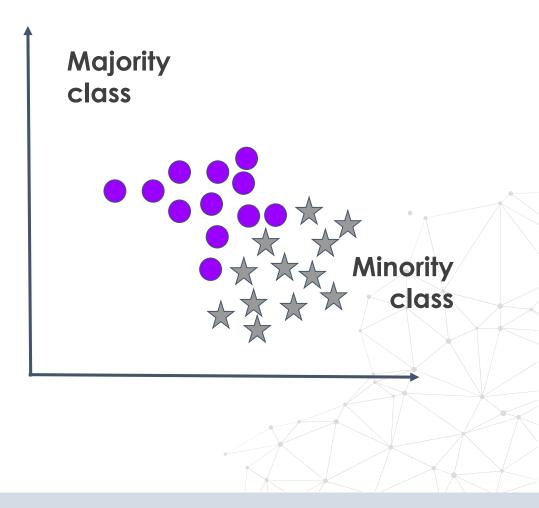
- If  $X(min) = X(maj) \rightarrow R(x) = 1$
- If  $X(min) = 1/2 \times X(maj) \rightarrow R(x) = 0.5$





#### Fixed Under-sampling

• Remove samples from the majority class until R(x) = 1

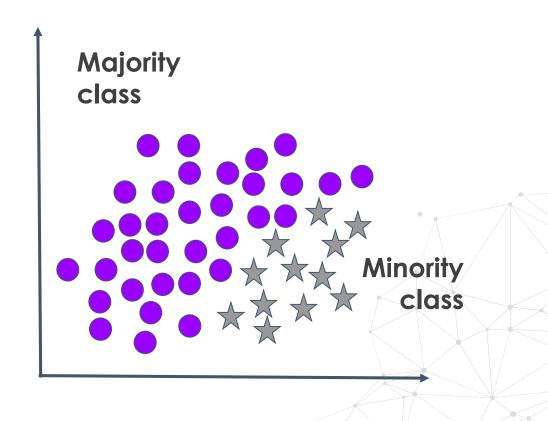




#### Fixed Under-sampling

• Remove samples from the majority class until R(x) = 1

 But, user could determine otherwise, for example R(x) = 0.5, that is twice as many from the majority class as those from the minority.





#### **Under-sampling criteria**

Random Undersampling ENN, RENN, AllKNN

Tomek Links

**NCR** 

Instance Hardness

**CNN** 

**NearMiss** 

One Sided Selection

Random

Remove Noisy observations

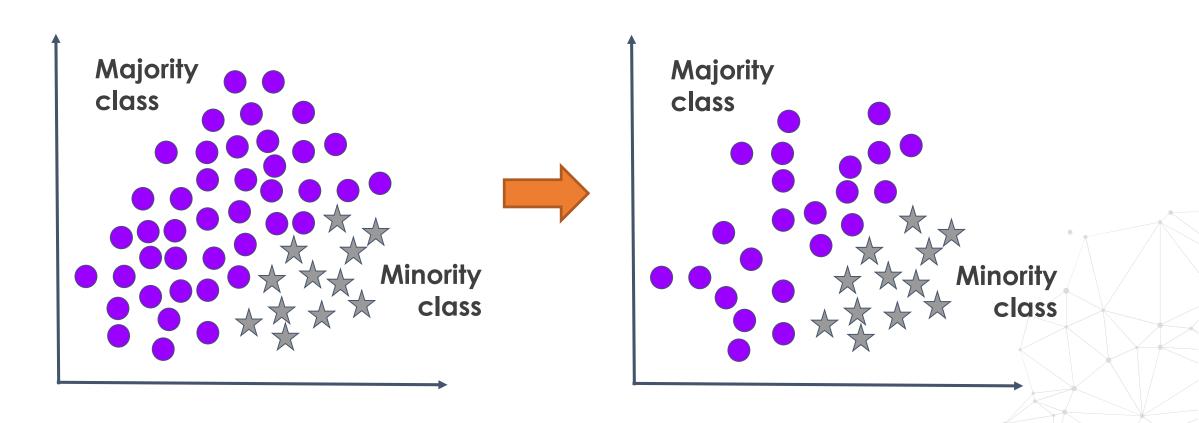
Retain observations in the boundary

Both

# Under-sampling criteria



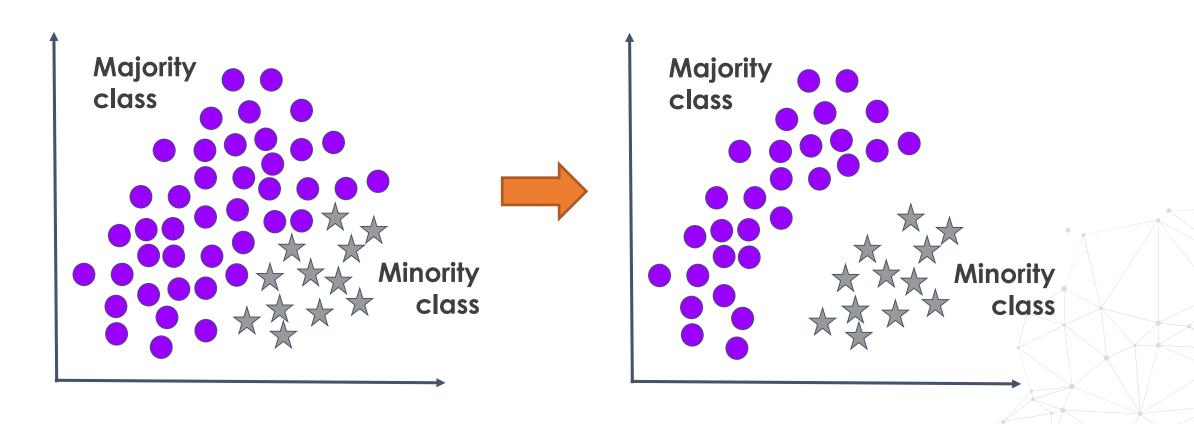
#### Random under-sampling



Observations are removed at random.



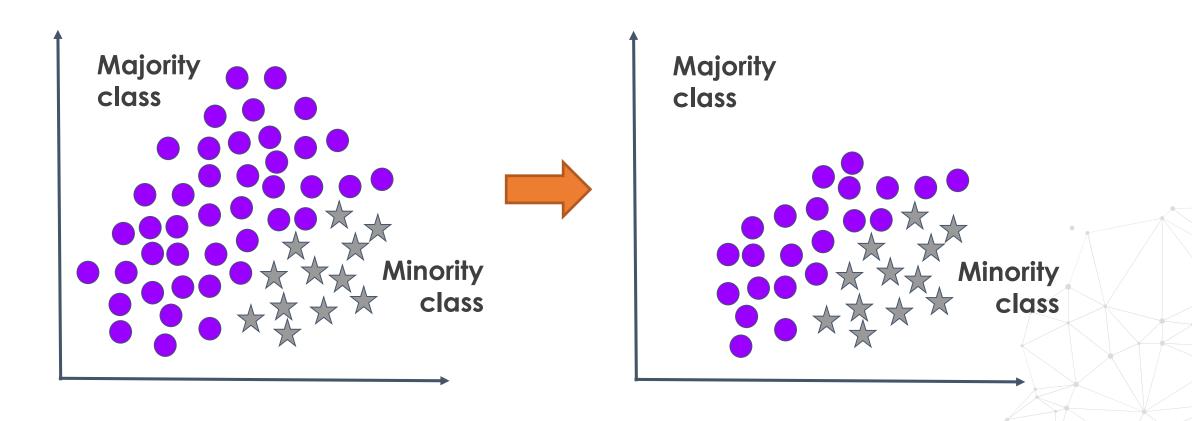
#### Remove noisy observations



Observations similar to the opposite class are preferentially removed.



#### Retain closer observations



Observations similar to the opposite class are preferentially retained.





## THANK YOU

www.trainindata.com