



SMOTE



SMOTE

- Synthetic **M**inority **O**ver-sampling **T**echnique.
- Creates samples by interpolation
- Interpolation is a type of estimation, where we create new data points within the range of known data points



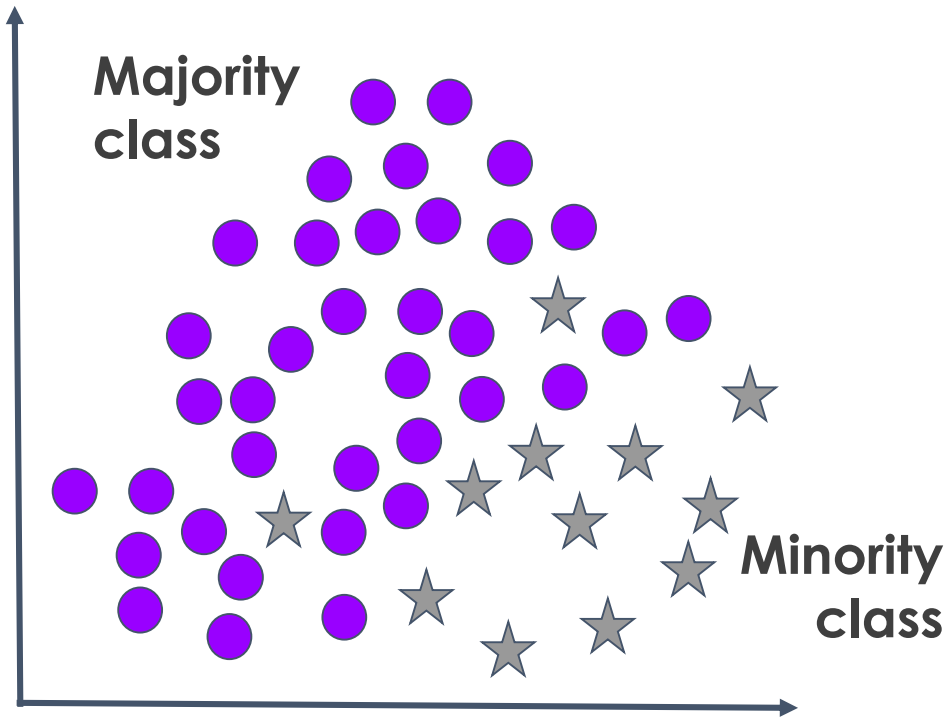
SMOTE

The minority class is “over-sampled” by creating “synthetic examples” instead of extracting data at random.

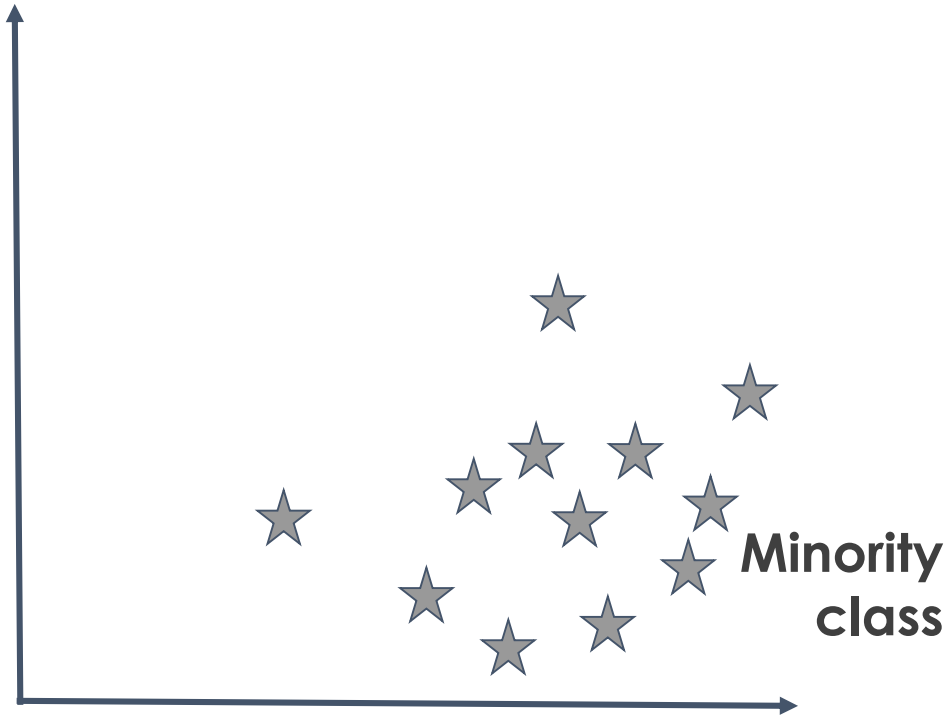
It prevents duplication. New observations from minority class will not be identical to original ones.



SMOTE: how it works



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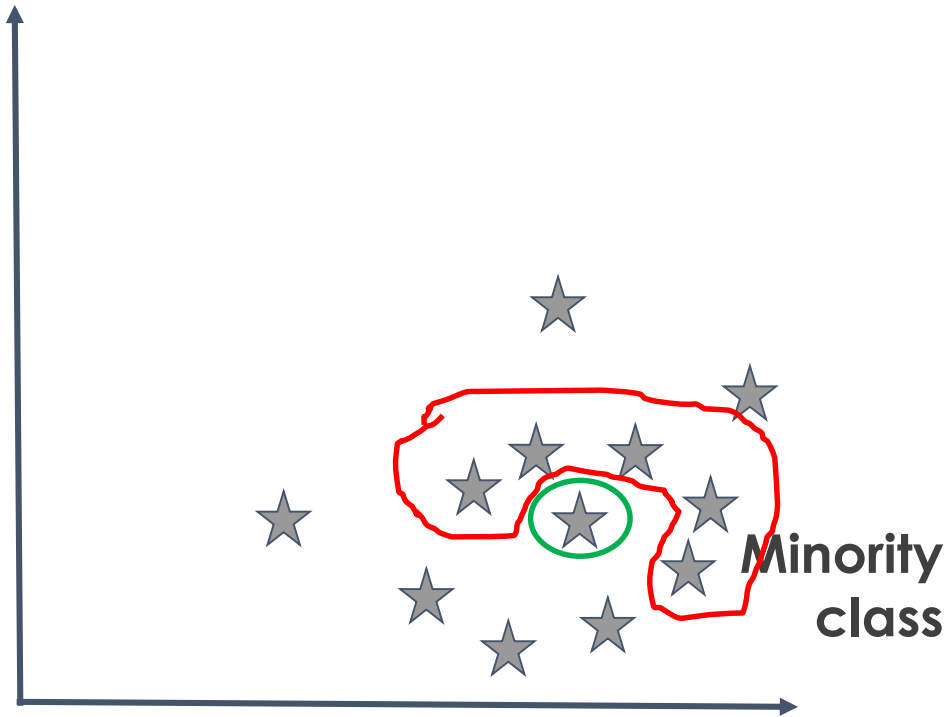


Looks only at the observations from the minority class.

Finds its k nearest neighbours

Typically k is 5

SMOTE: how it works

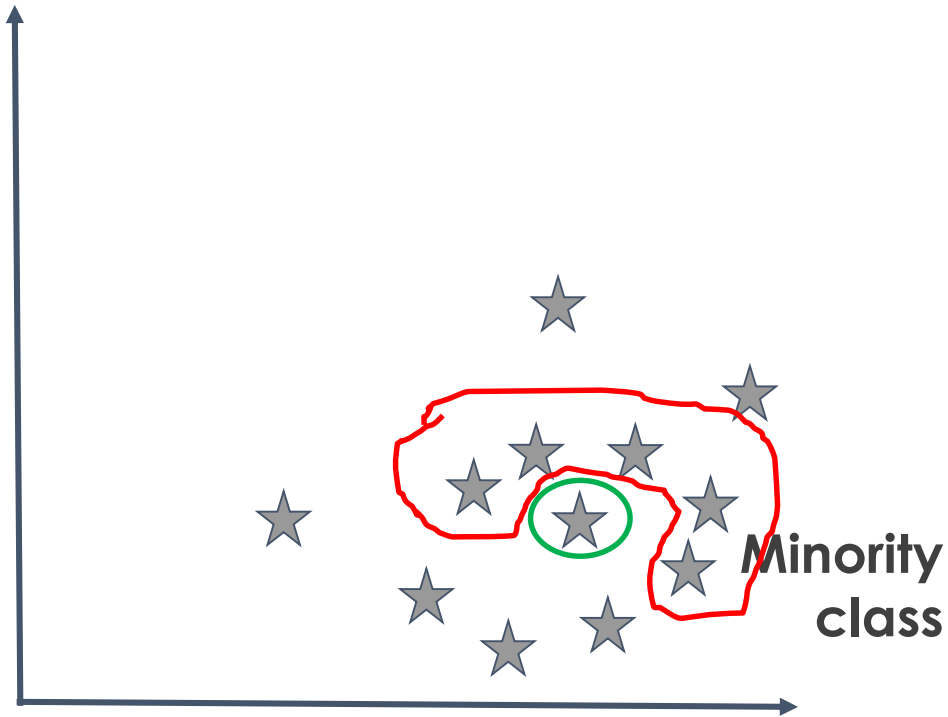


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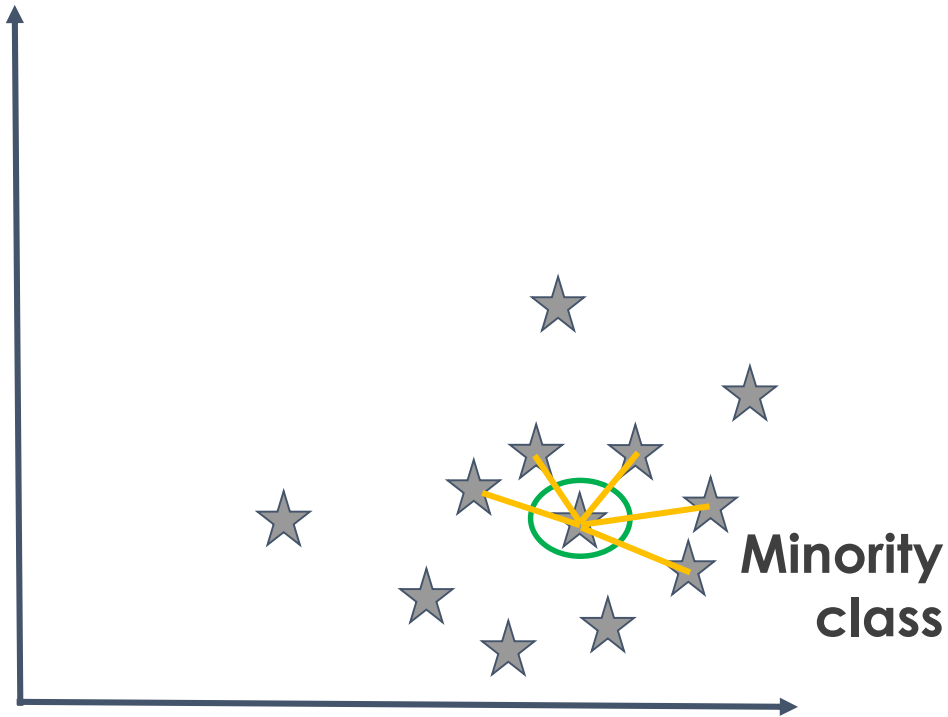
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SMOTE: how it works



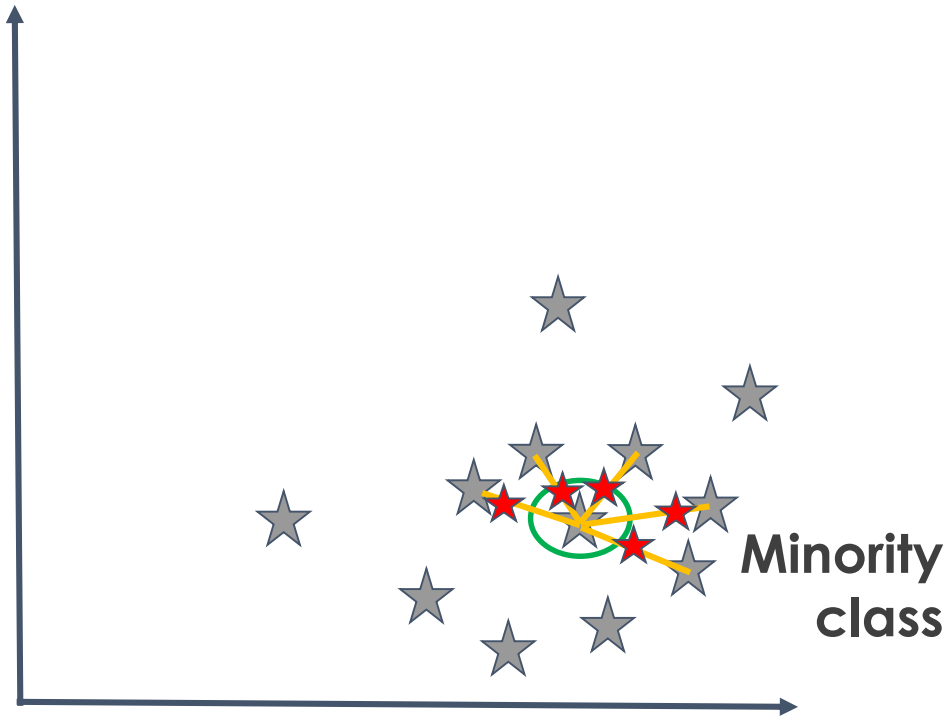
Determines the **distance** between the neighbours and the sample we want to generate a new observation from

SMOTE: how it works



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SMOTE: how it works

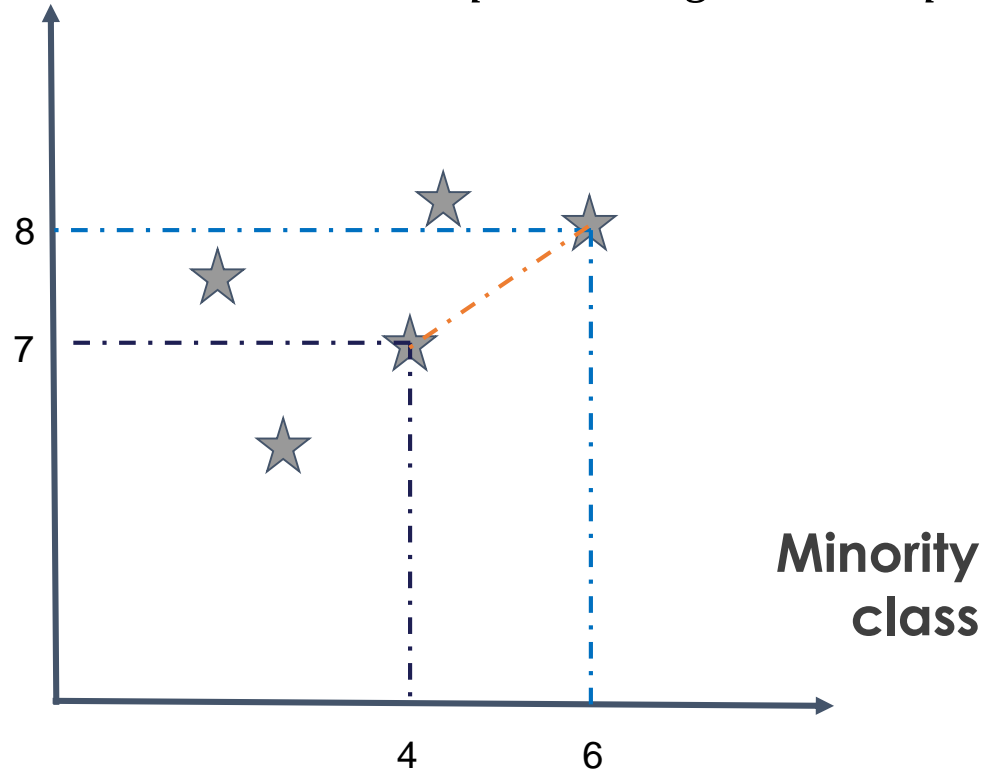


Multiplies that distance by a **random number** and adds it to the original sample to place the new observation in the dataset

$$\text{New sample} = \text{original sample} - \text{factor} * (\text{original sample} - \text{neighbour})$$

SMOTE: numerical example

*New sample = original sample - factor * (original sample - neighbour)*

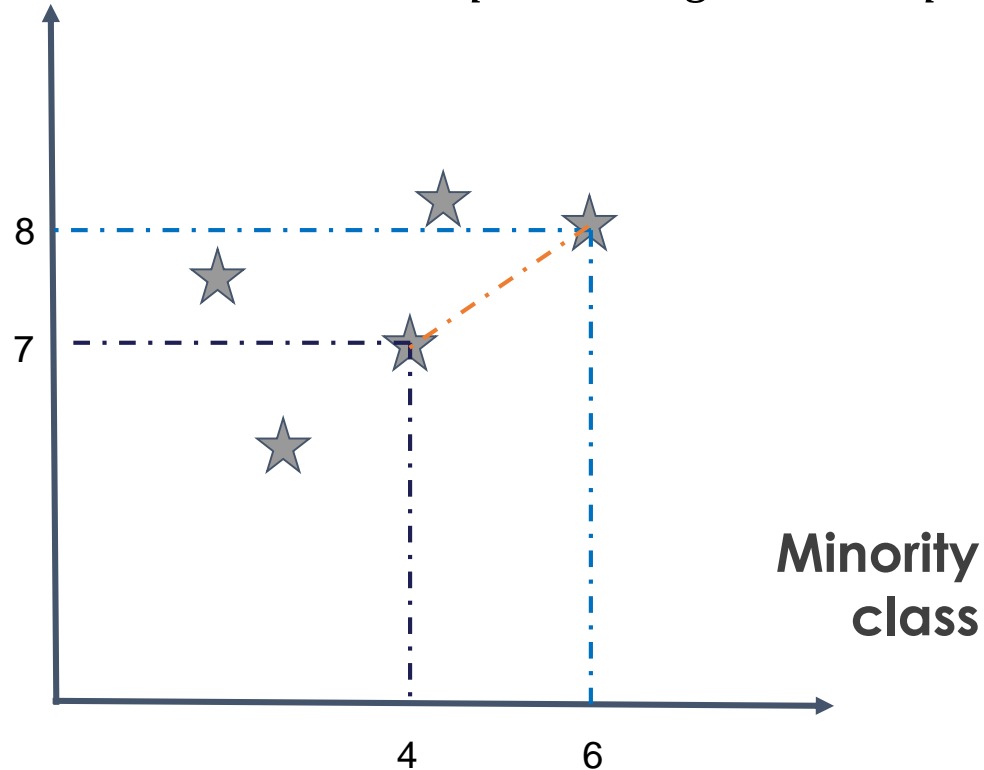


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$$X_{\text{neig}} = (6, 8)$$

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$$\text{New sample} = (4, 7) - 0.8 * ((4, 7) - (6, 8))$$

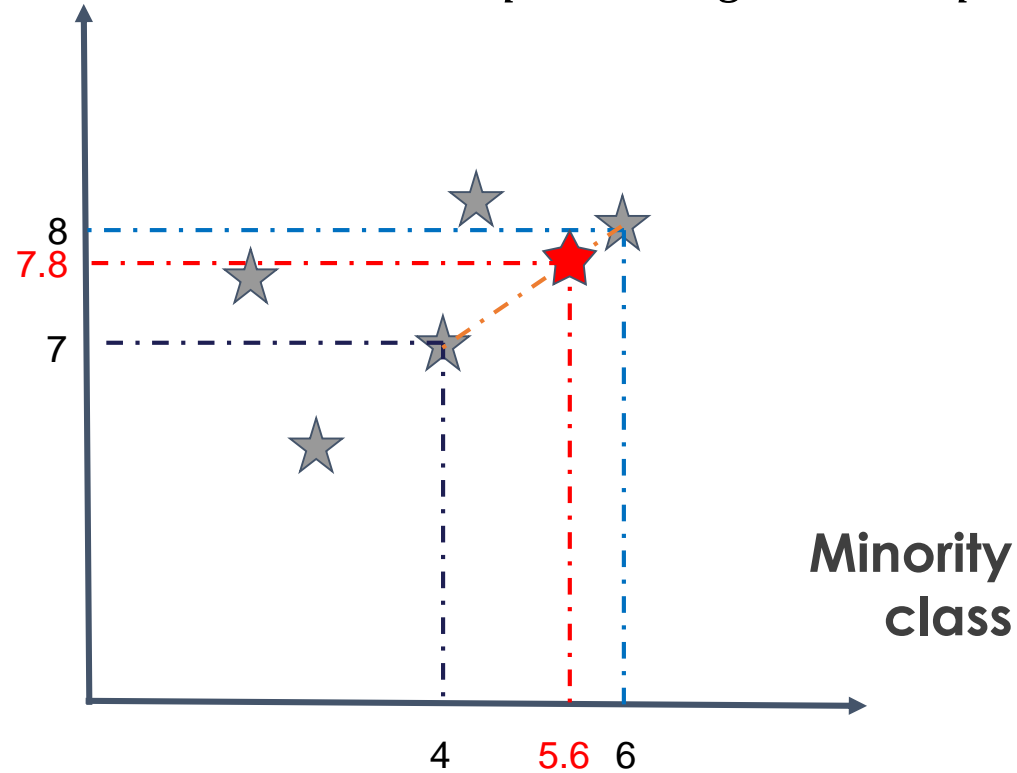
$$\text{New sample} = (4, 7) - 0.8 * ((-2, -1))$$

$$\text{New sample} = (4, 7) - ((-1.6, -0.8))$$

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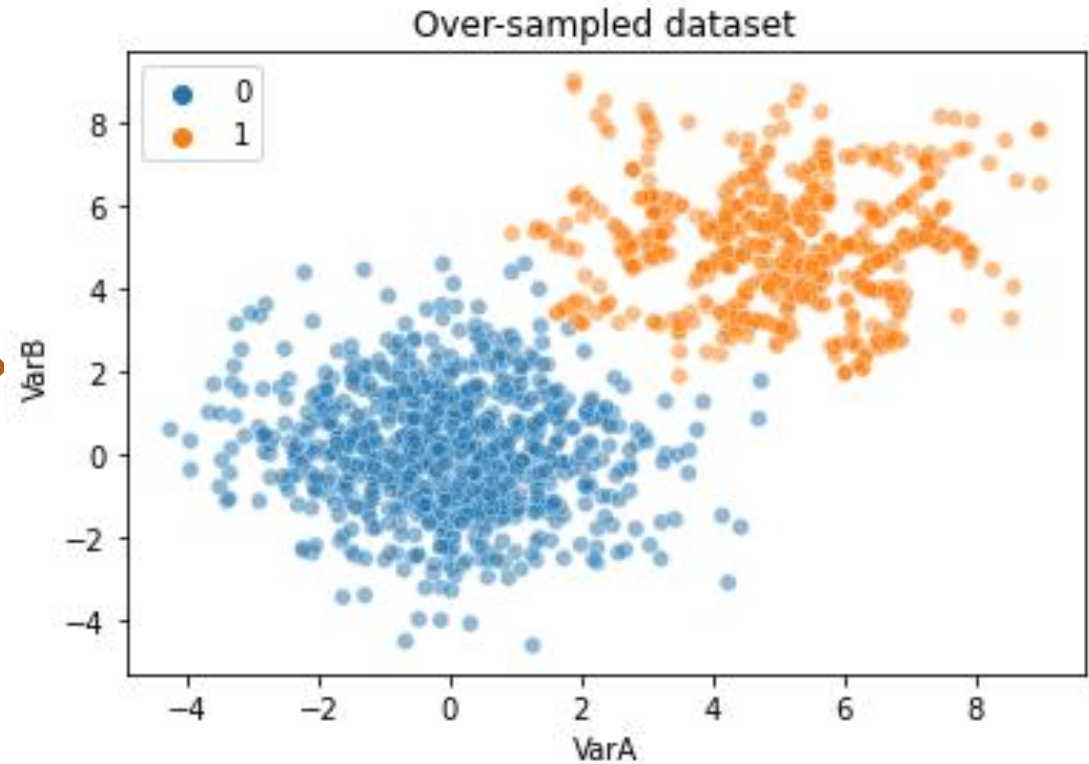
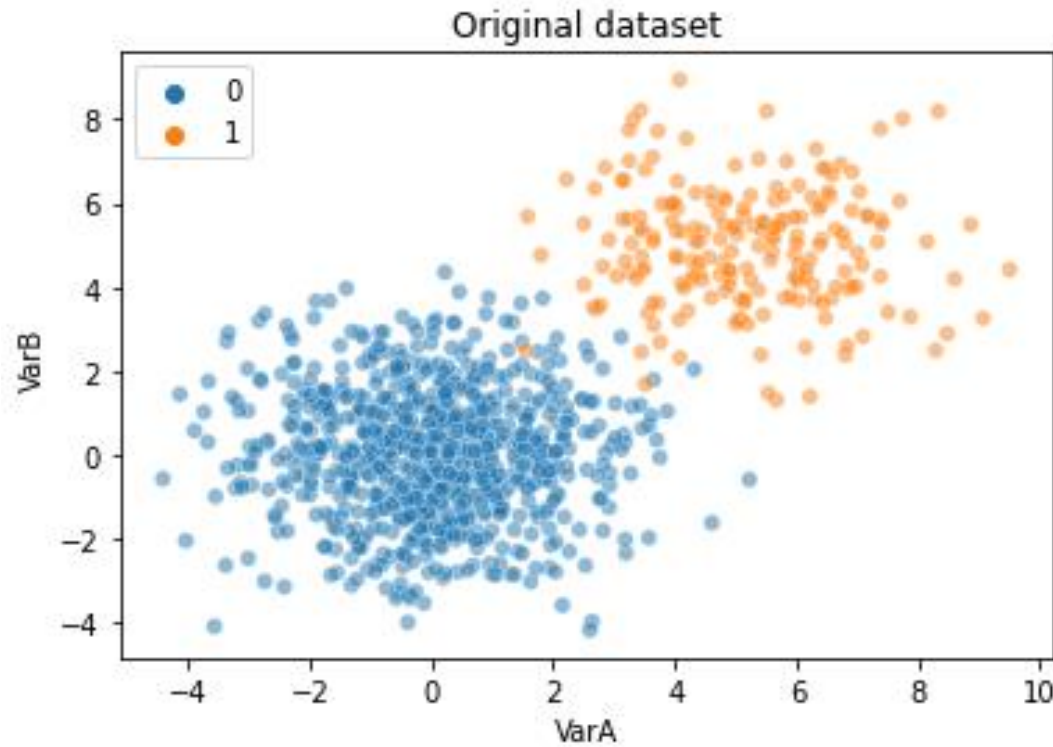
SMOTE: Python implementation

1. Isolates minority class samples
2. Trains KNN and finds K nearest neighbours to each sample of minority class
3. Determines how many new samples need to be generated
4. Selects from which samples a new sample will be generated (random)
5. Selects the neighbour that will be used to extrapolate the sample (random)
6. Finds a random factor
7. Creates the new sample

Imbalanced-learn: SMOTE

```
ros = SMOTE(strategy = 'auto',  
            random_state = 29,  
            k_neighbours = 5)  
  
X_res, y_res = ros.fit_resample(X, y)
```

Imbalanced-learn: SMOTE



THANK YOU

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