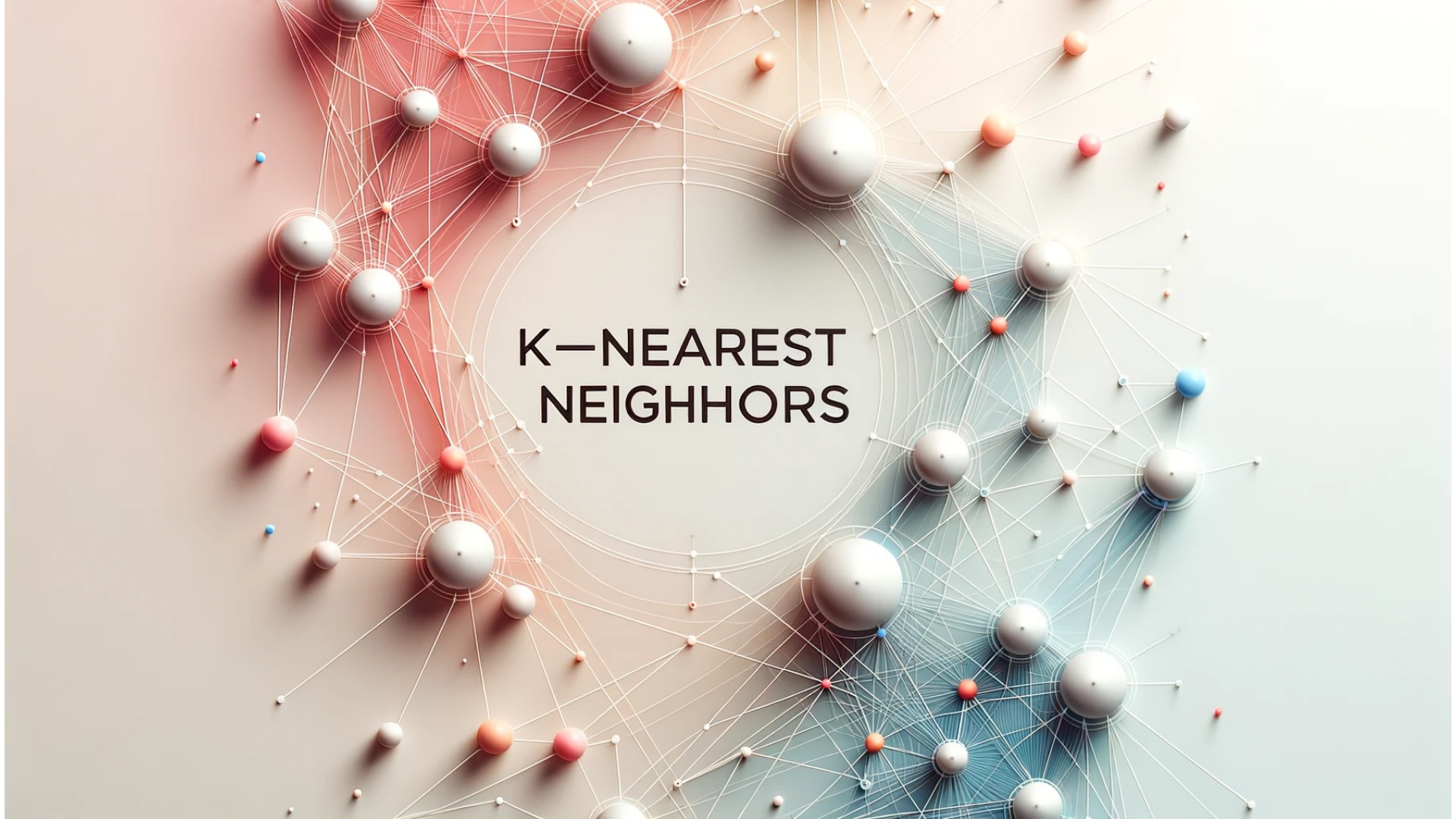

K—NEAREST
NEIGHHORS

KNN Classification

Theory and Intuition

KNN

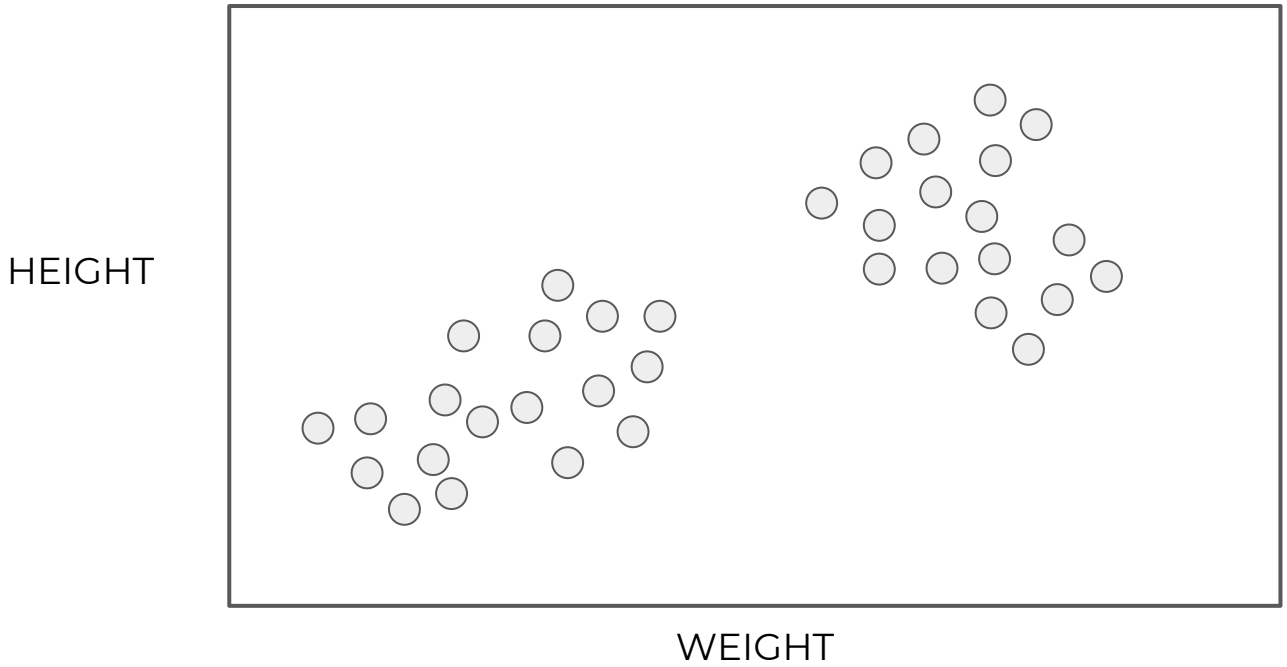
- K nearest neighbors is one of the simplest machine learning algorithms.
- It simply assigns a label to new data based on the **distance** between the old data and new data.
- Let’s go through the intuition with an example use case...

KNN

- Sexing chicks is still a very manual process:
  - en.wikipedia.org/wiki/Chick_sexing
  - Let’s imagine we gathered a dataset of baby chick heights and weights.
  - How could we train an algorithm to identify the sex of a new baby chick based on historical features?

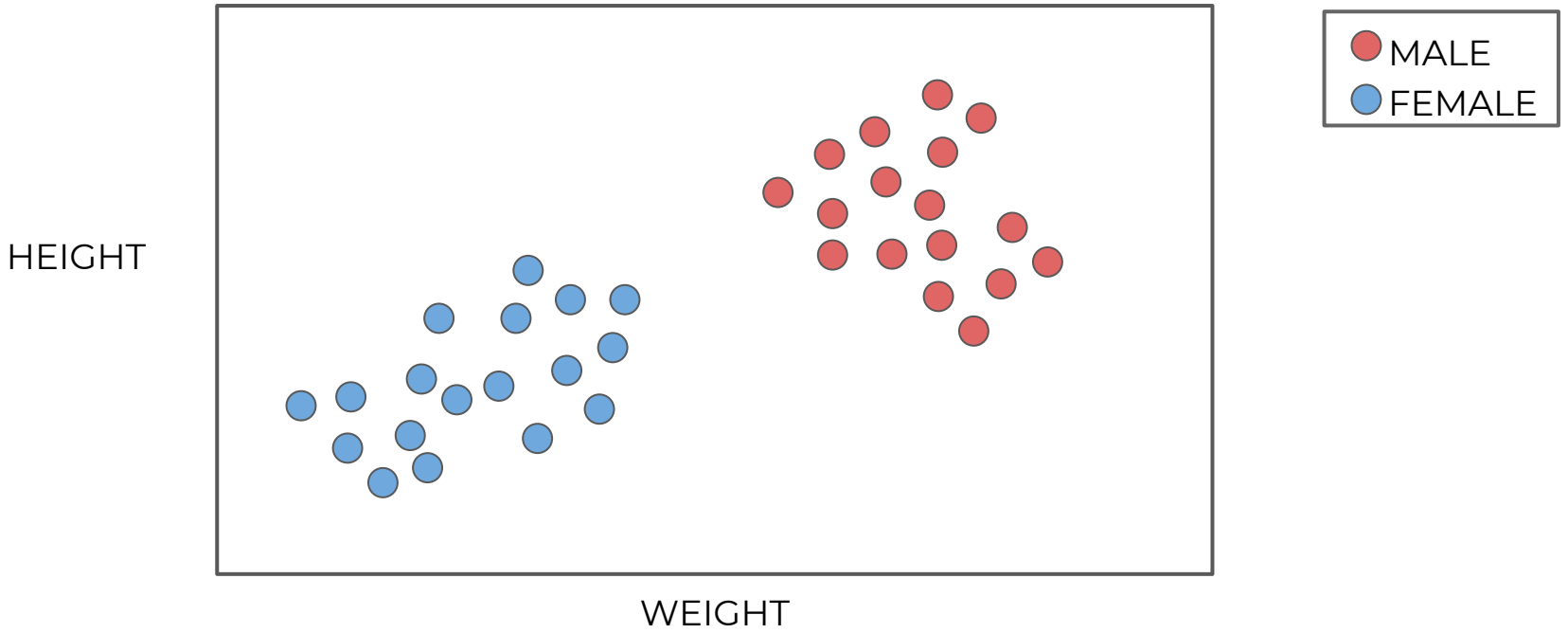
KNN

- Imagine a height and weight data set



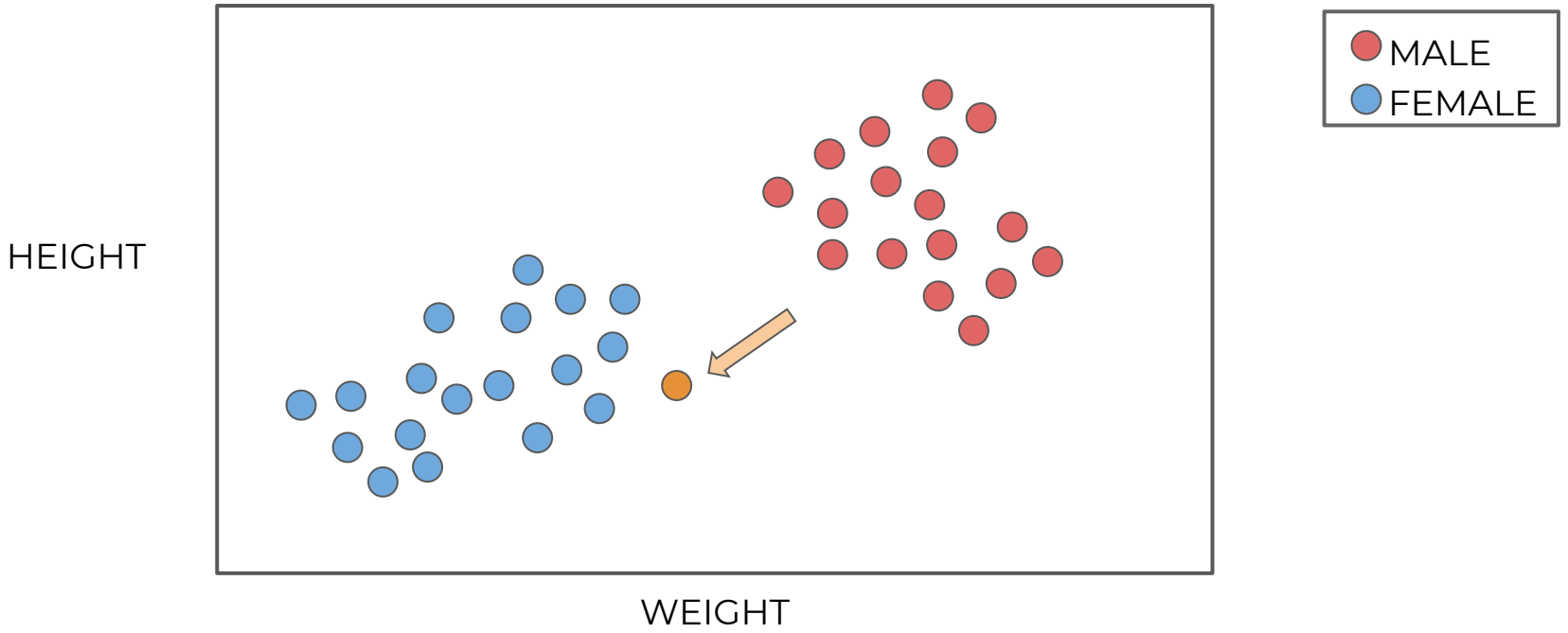
KNN

- We historically know the sex of the chicks:



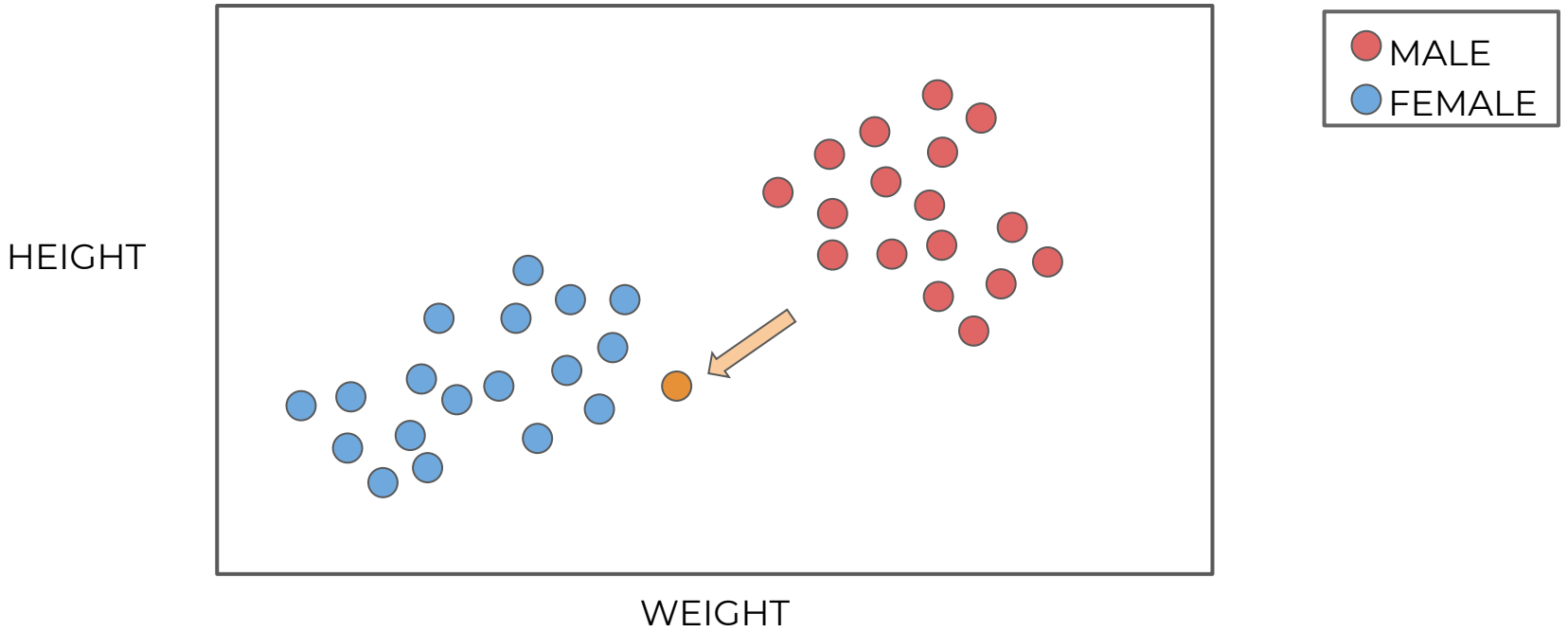
KNN

- How would we assign sex to a new point?



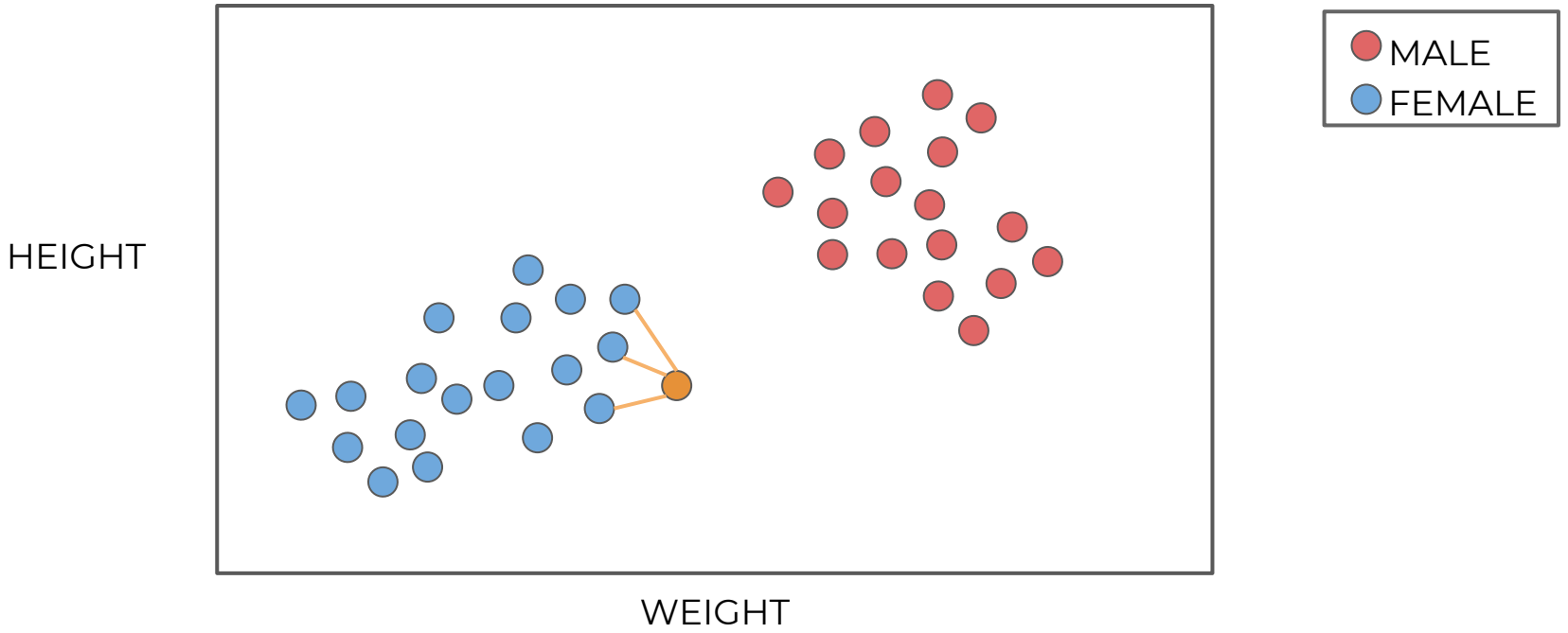
KNN

- We intuitively “know” this is likely female.



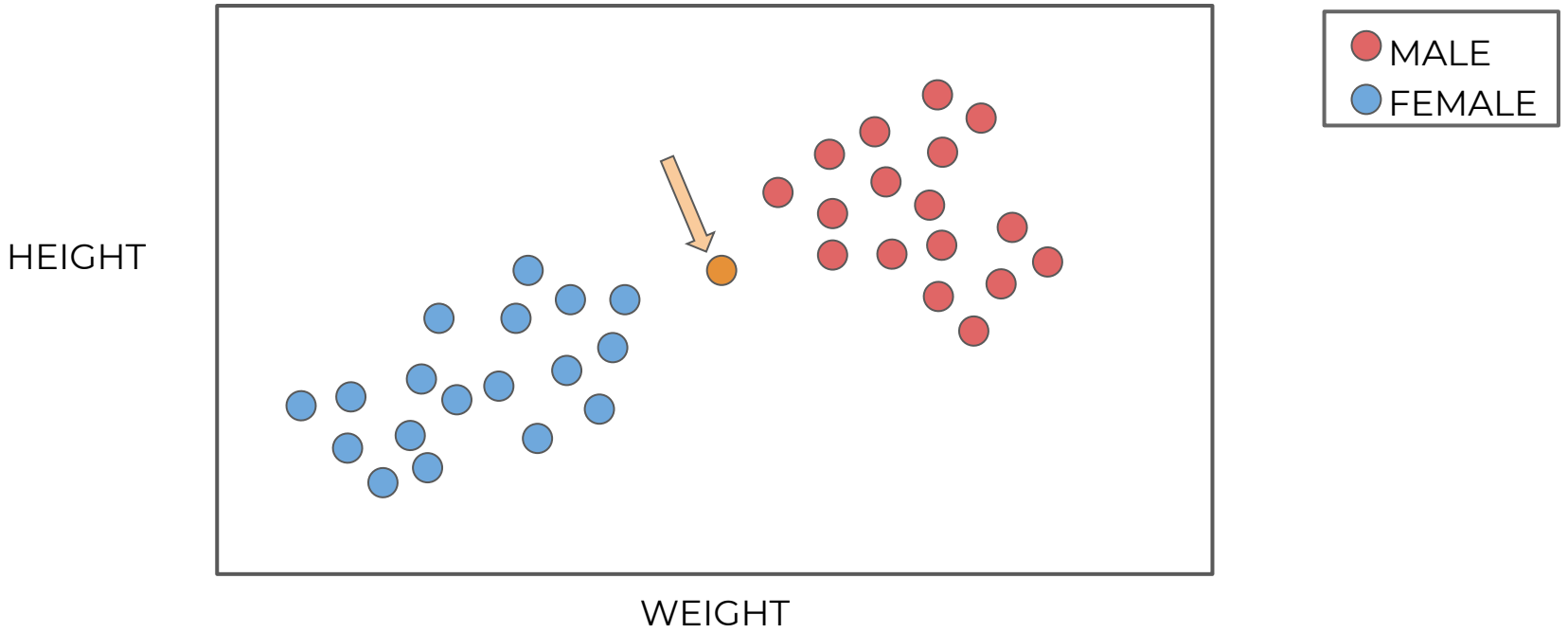
KNN

- Intuition comes from **distance** to points!



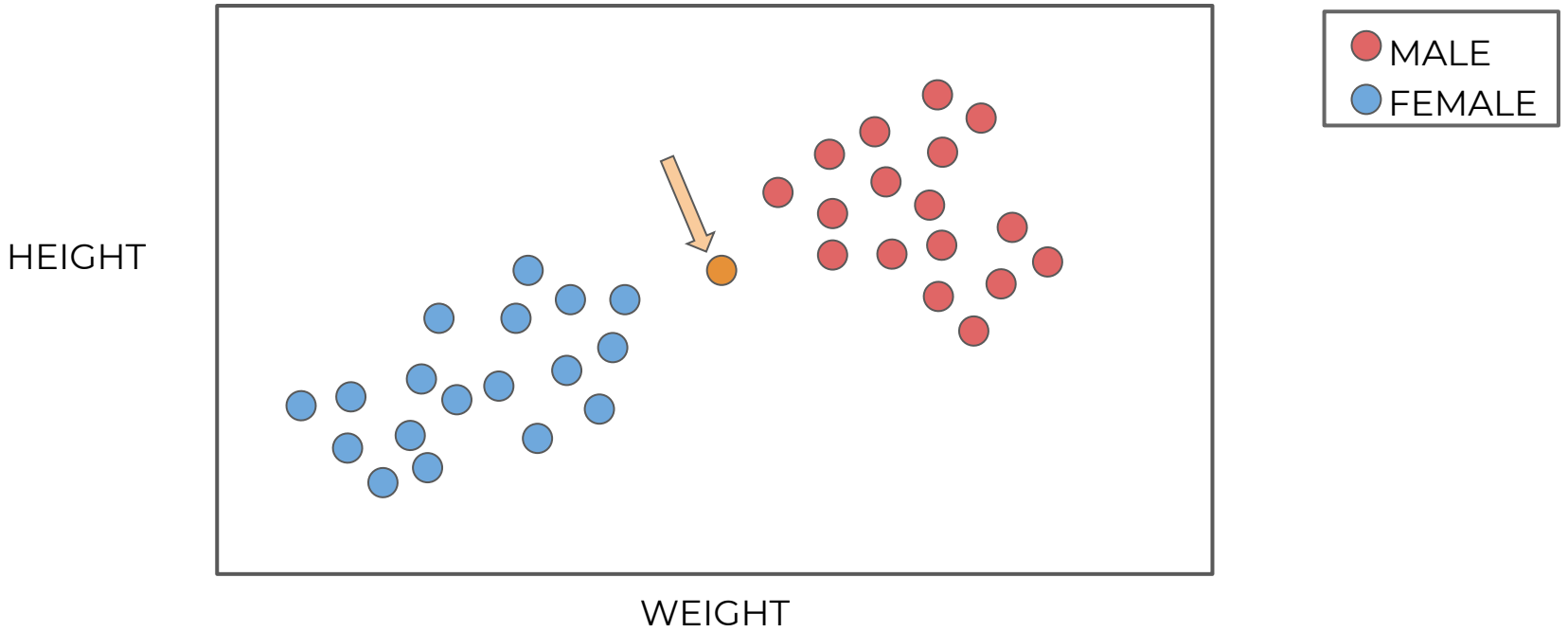
KNN

- What about a less obvious point?



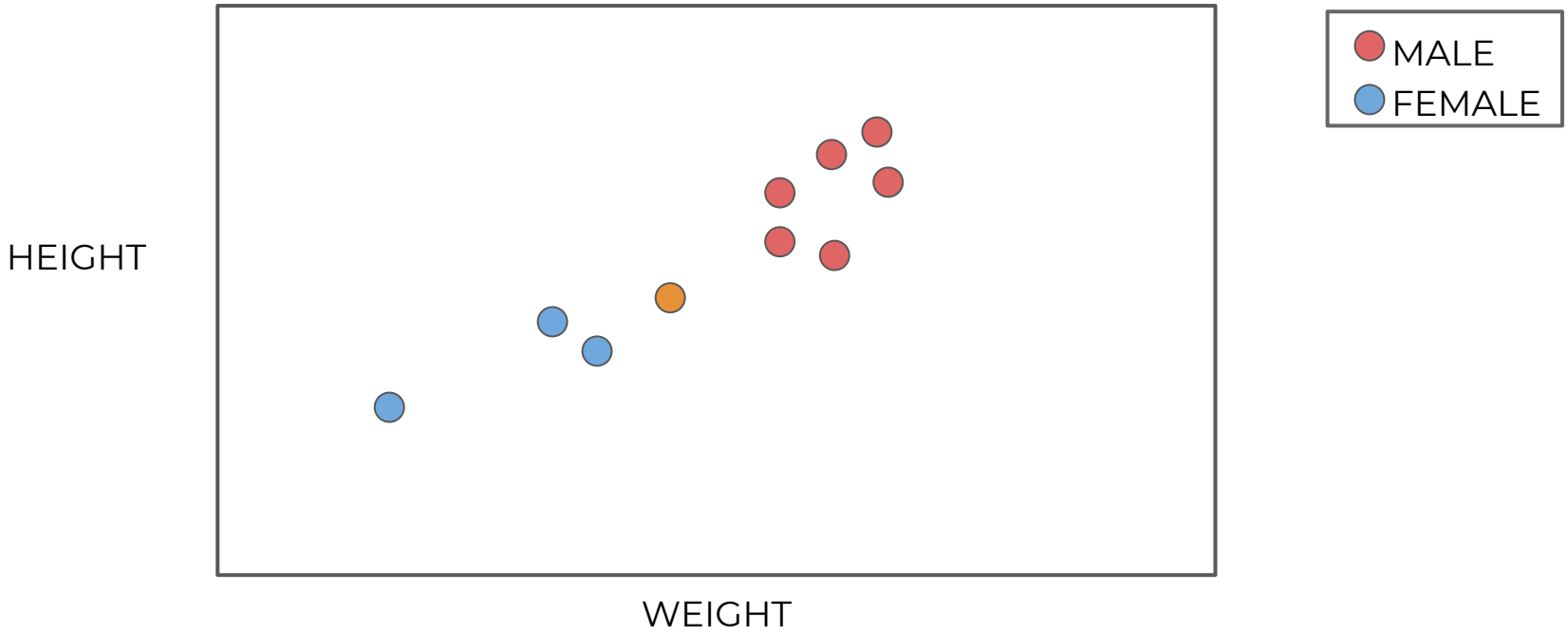
KNN

- How many points to we consider?



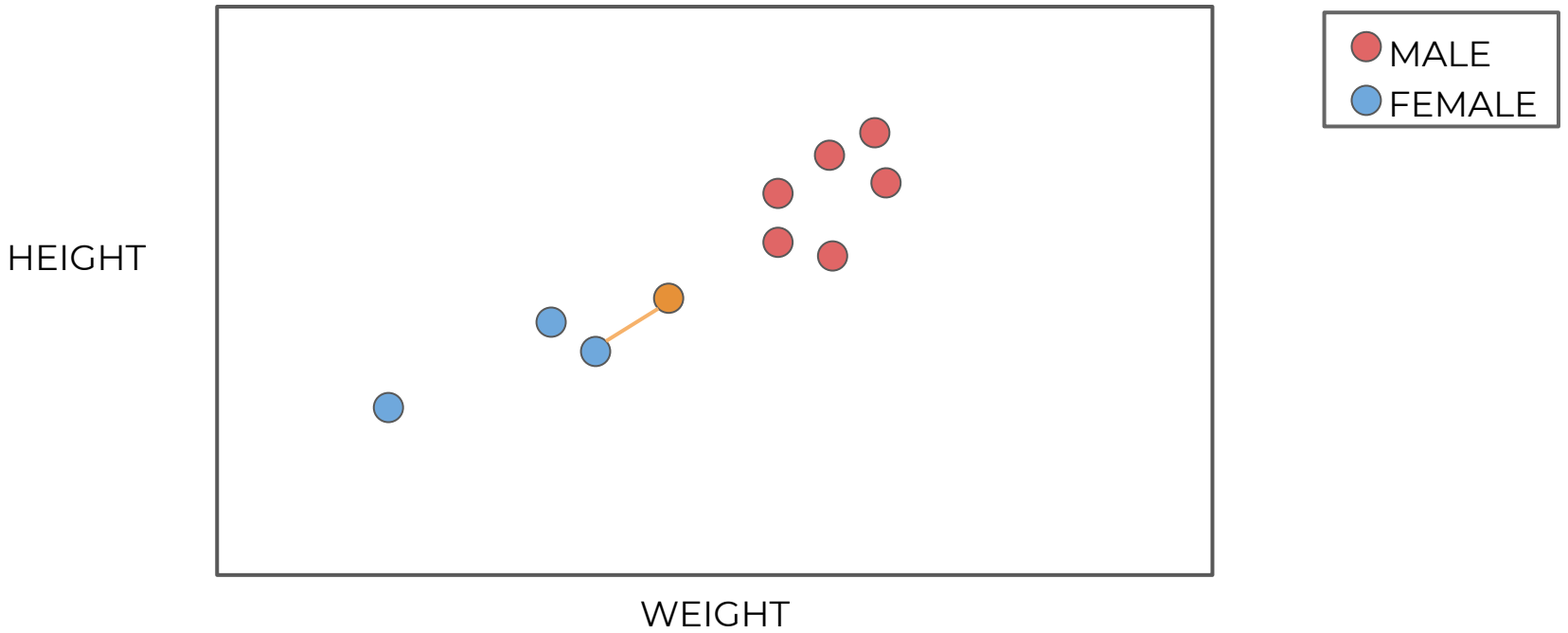
KNN

- Let’s imagine a situation like this:



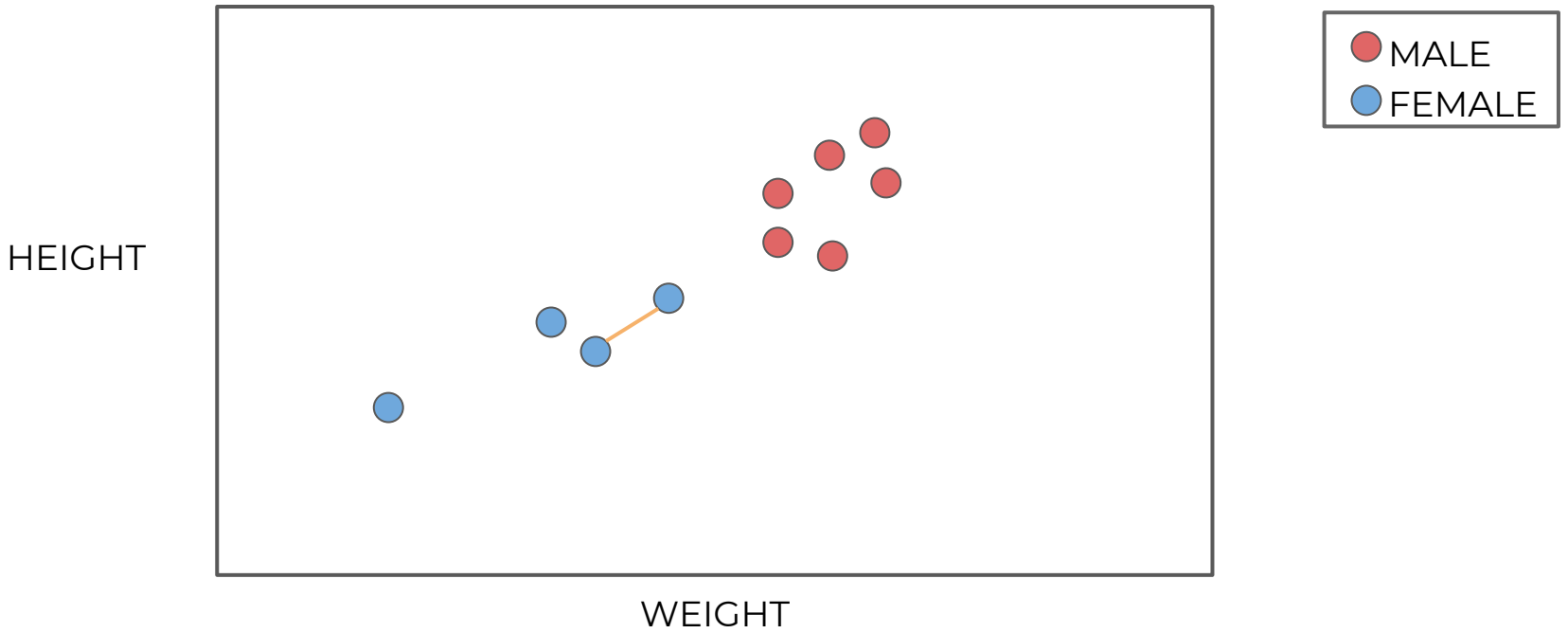
KNN

- K=1



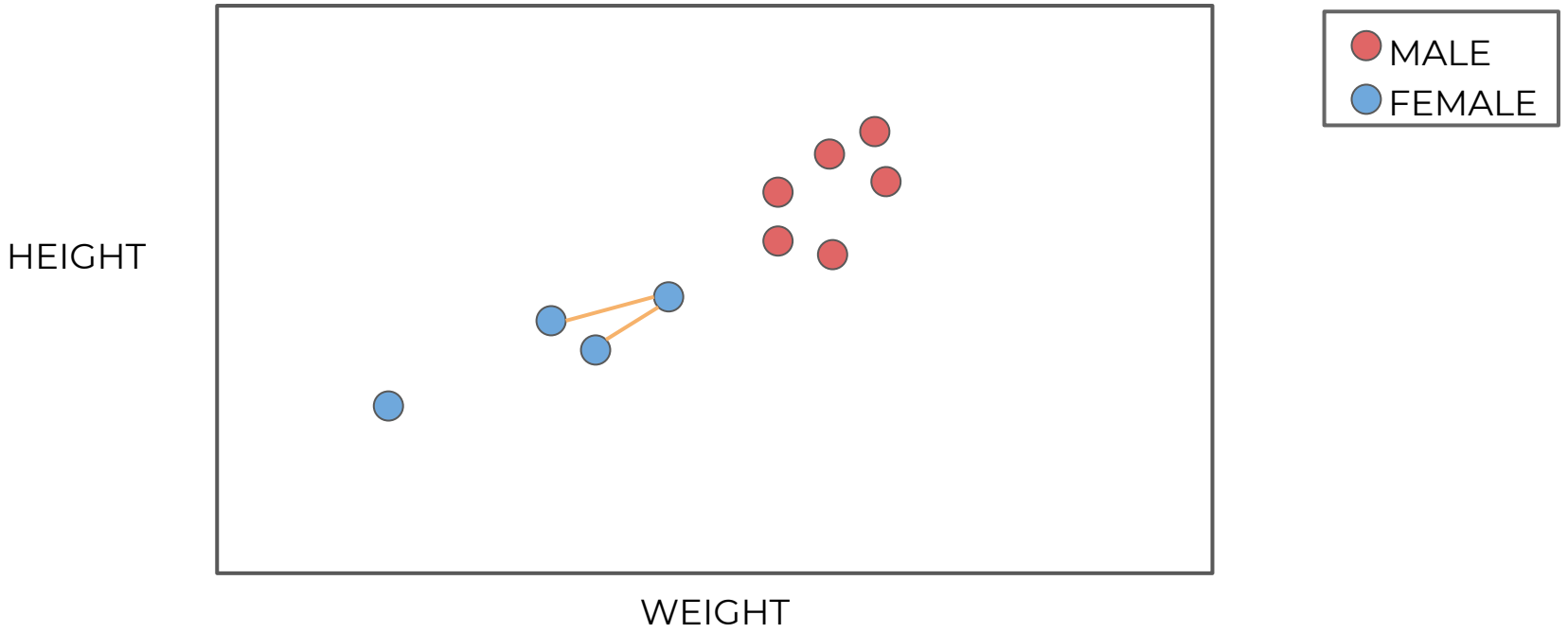
KNN

- K=1



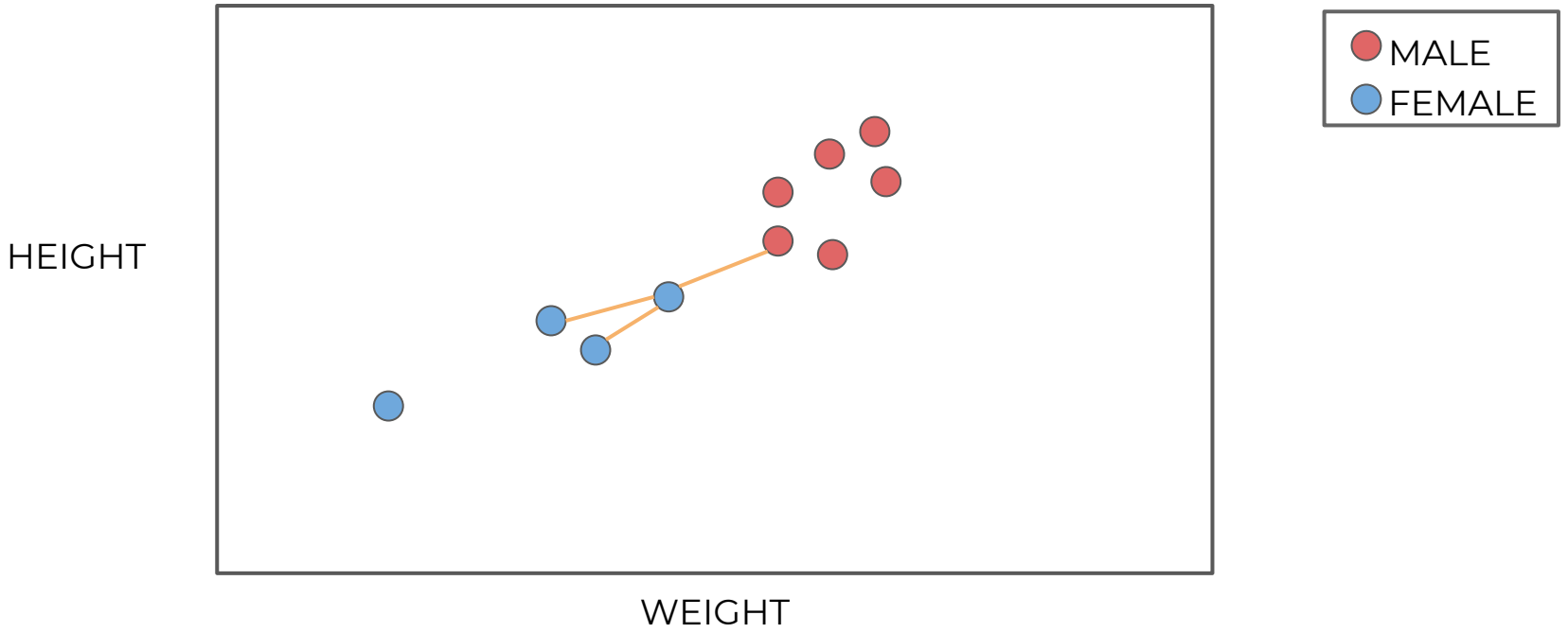
KNN

- K=2



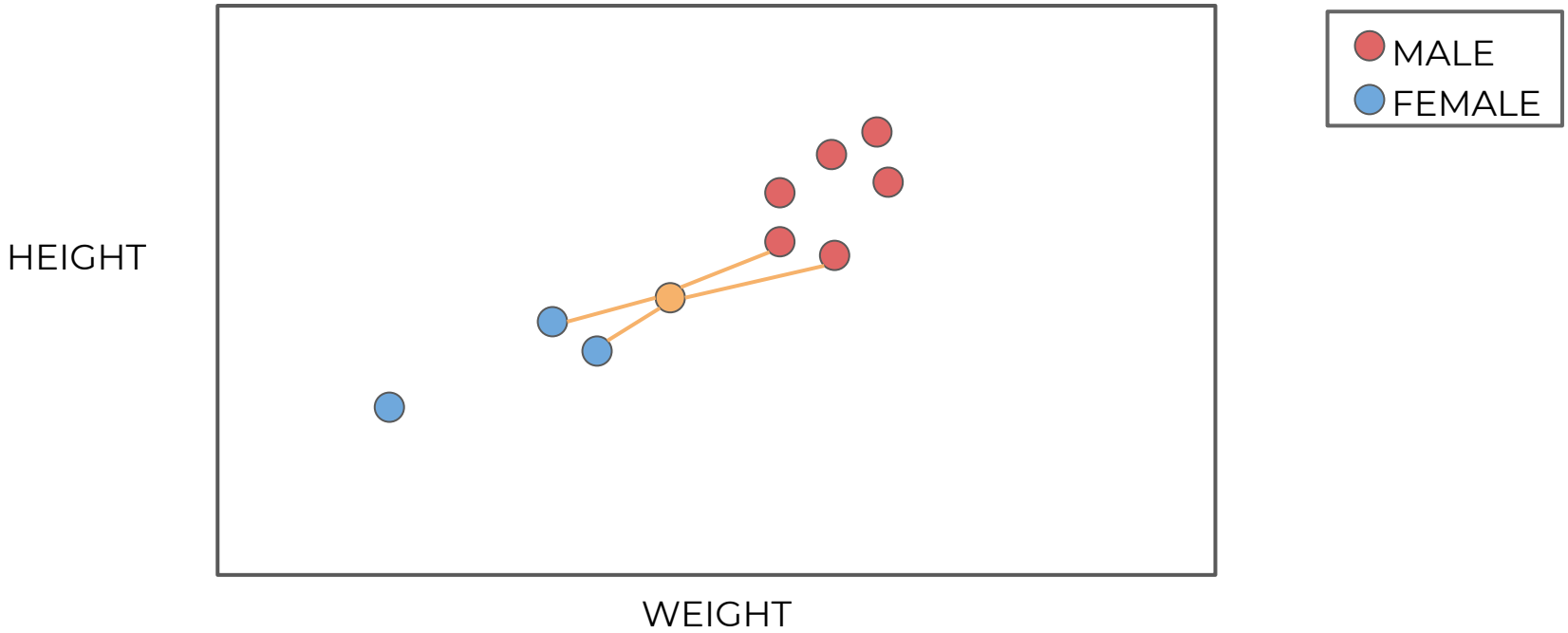
KNN

- K=3



KNN

- K=4 leads to a tie!



KNN

- Tie considerations and options:
  - Always choose an odd K.
  - In case of tie,simply reduce K by 1 until tie is broken.
  - Randomly break tie.
  - Choose nearest class point.

KNN

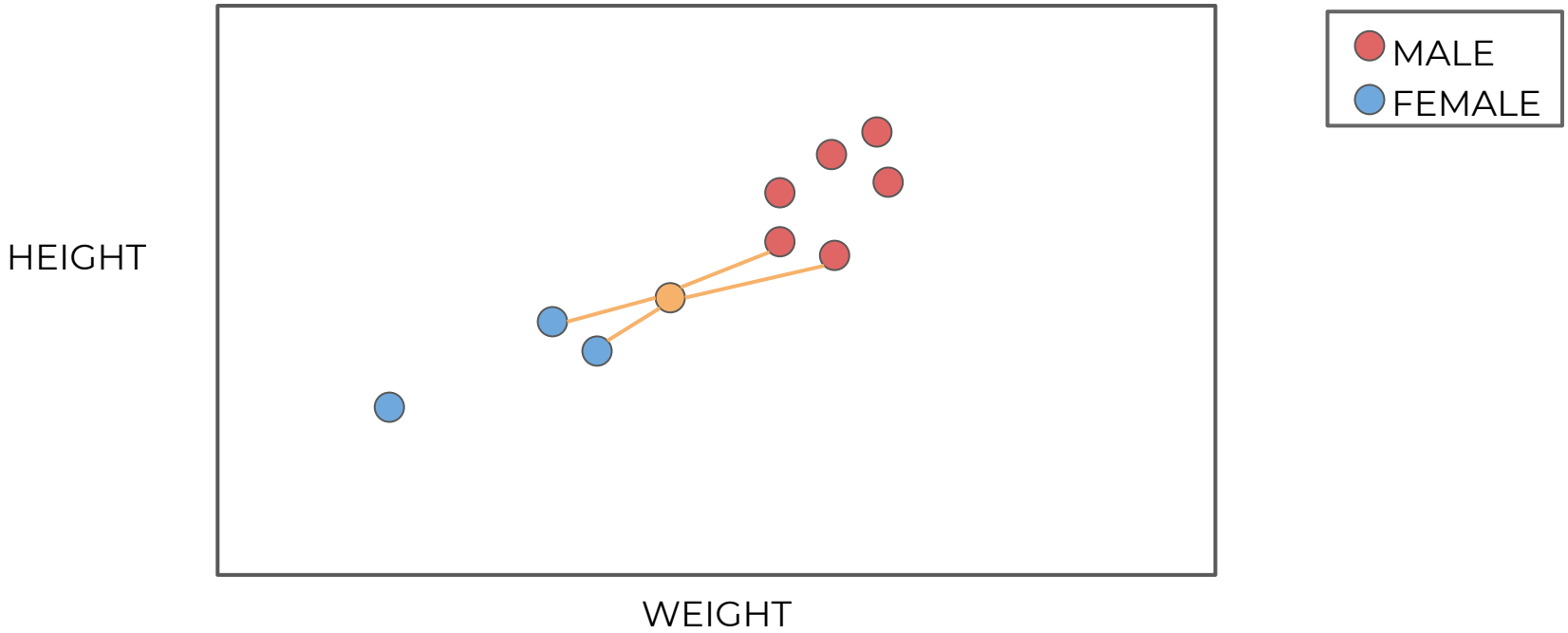
- What does Scikit-Learn do in case of tie?
  - *Warning: Regarding the Nearest Neighbors algorithms, if it is found that two neighbors, neighbor k+1 and k, have identical distances but different labels, the results will depend on the ordering of the training data.*

KNN

- What does Scikit-Learn do in case of tie?
  - *In the case of ties, the answer will be the class that happens to appear first in the set of neighbors.*
  - *Results are ordered by distance, so it chooses the class of the closest point.*

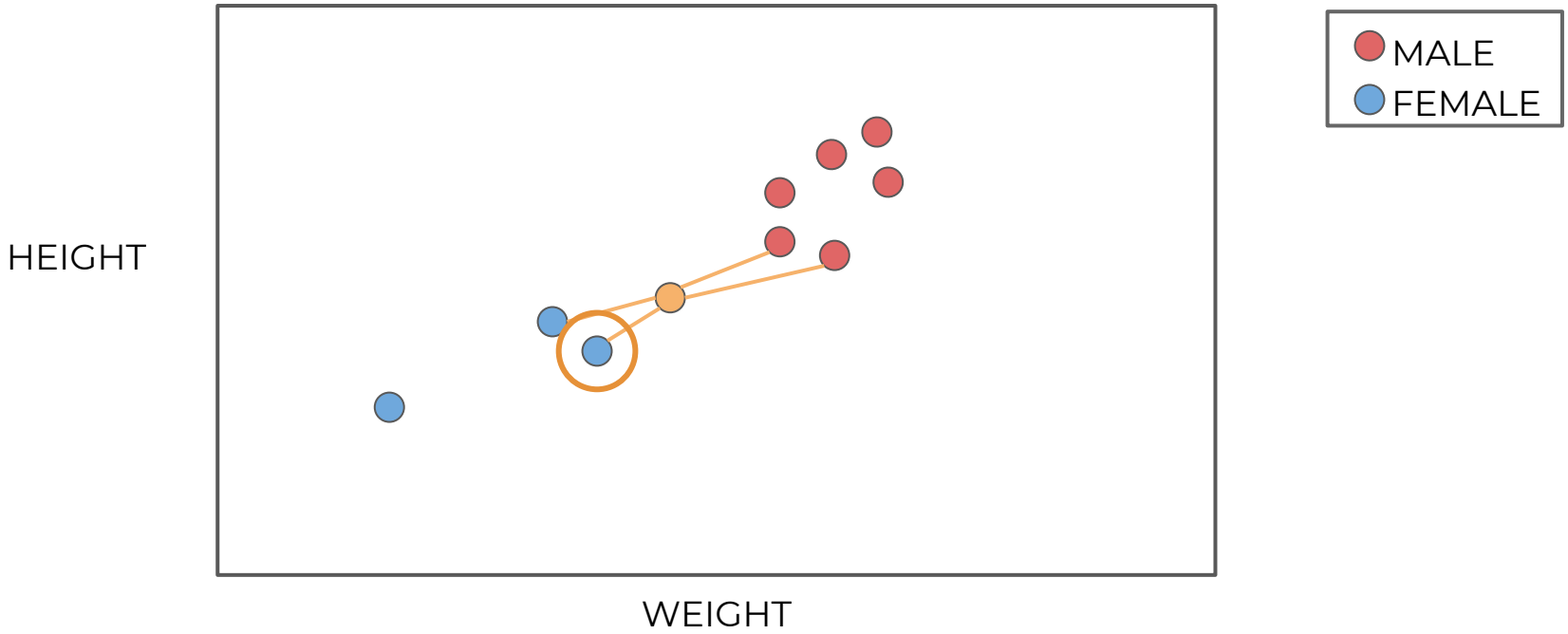
KNN

- K=4 leads to a tie!



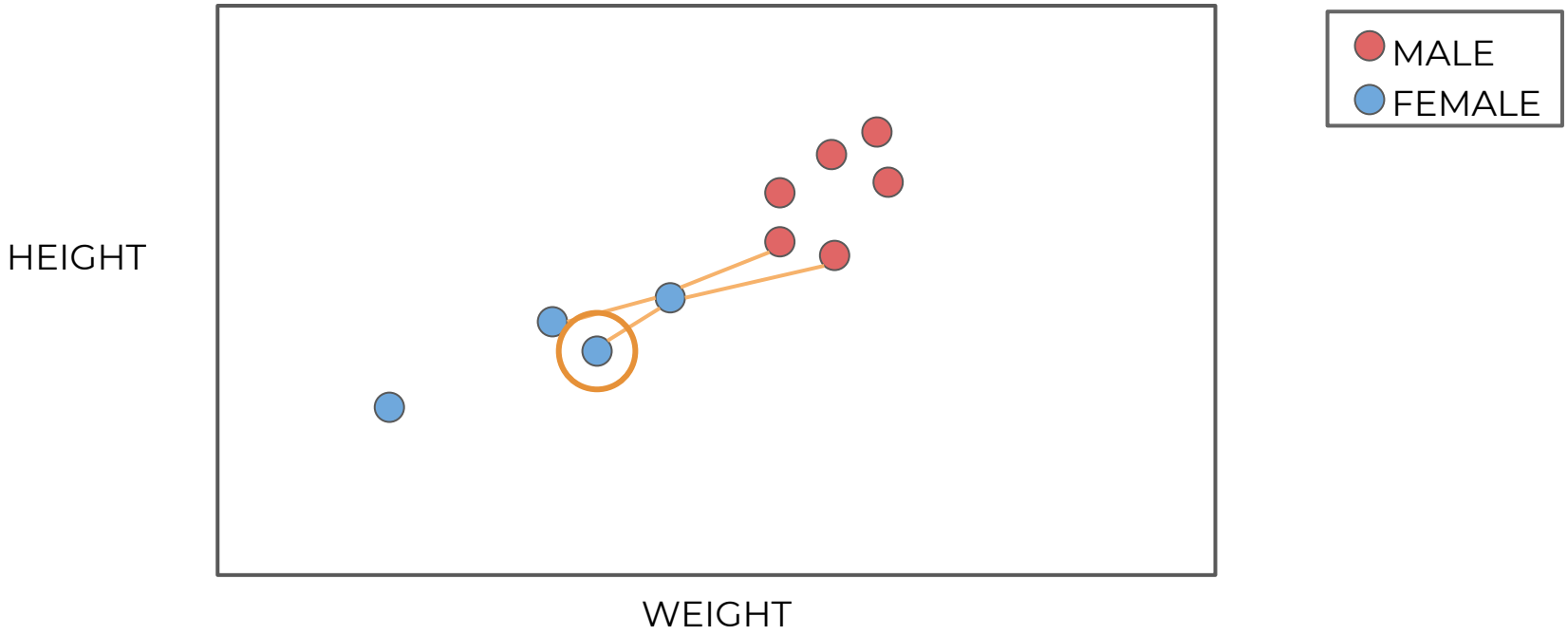
KNN

- Choose closest K



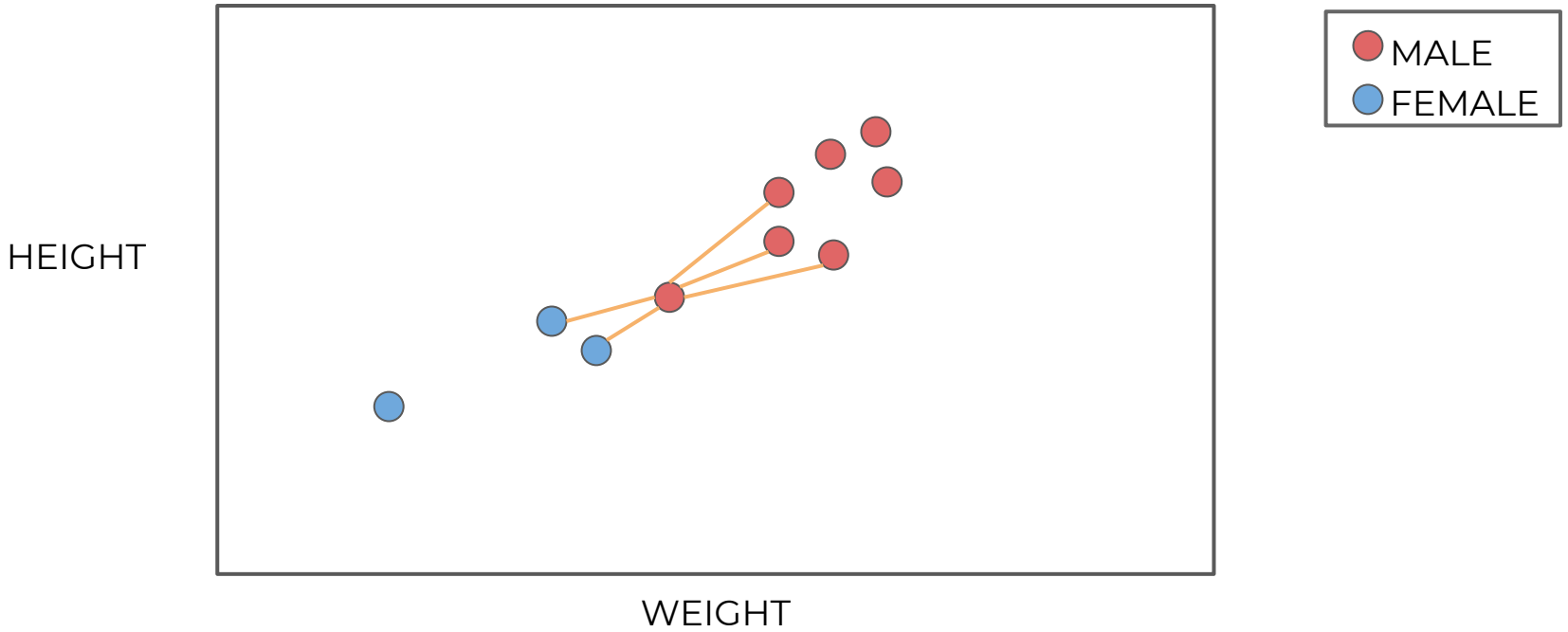
KNN

- Choose closest K



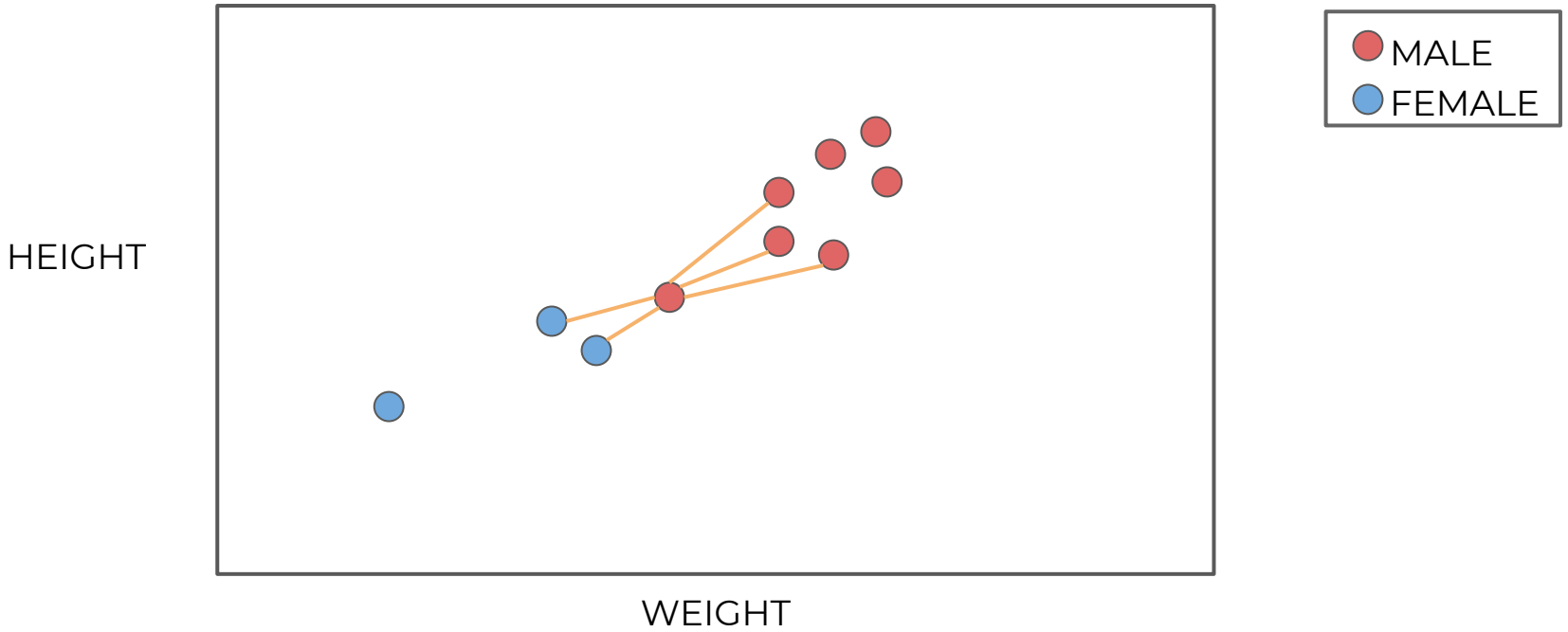
KNN

- K=5 causes a switch from previous K values.



KNN

- How to choose best K value?

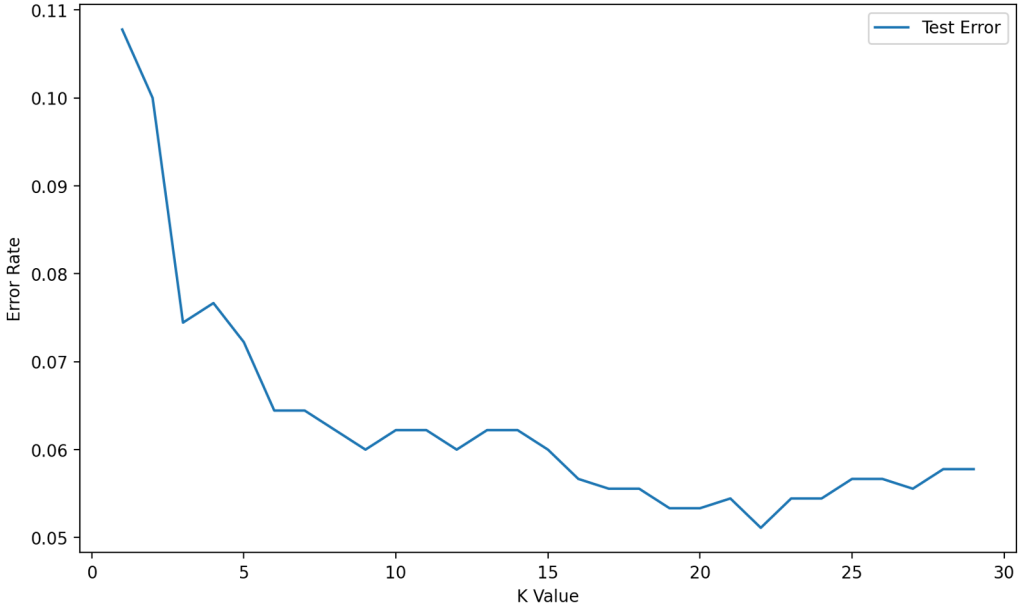


KNN

- We want a K value that **minimizes** error:
  - Error = 1 - Accuracy
- Two methods:
  - Elbow method.
  - Cross validate a grid search of multiple K values and choose K that results in lowest error or highest accuracy.

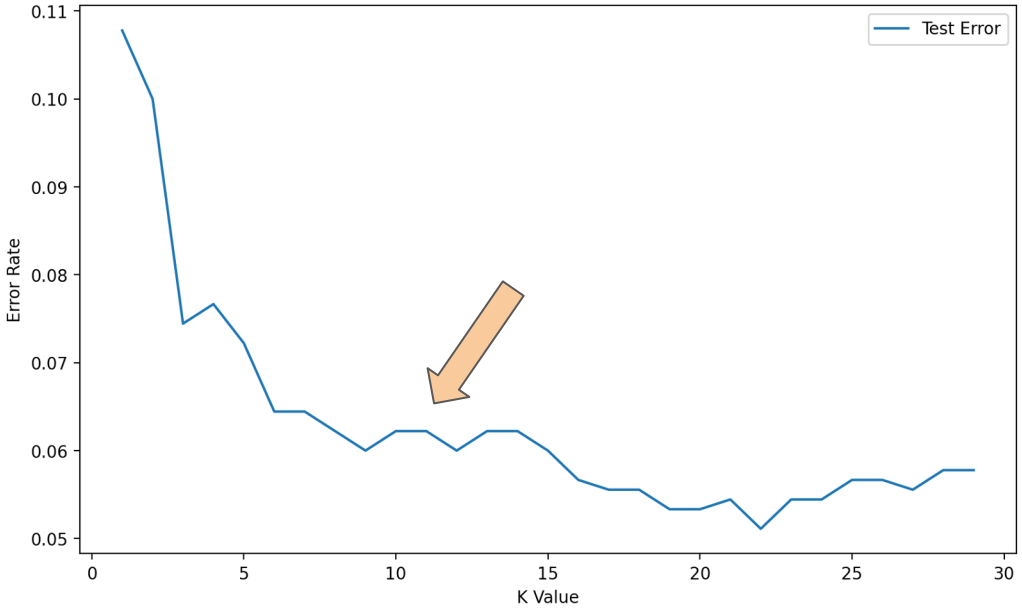
KNN

- Elbow method:



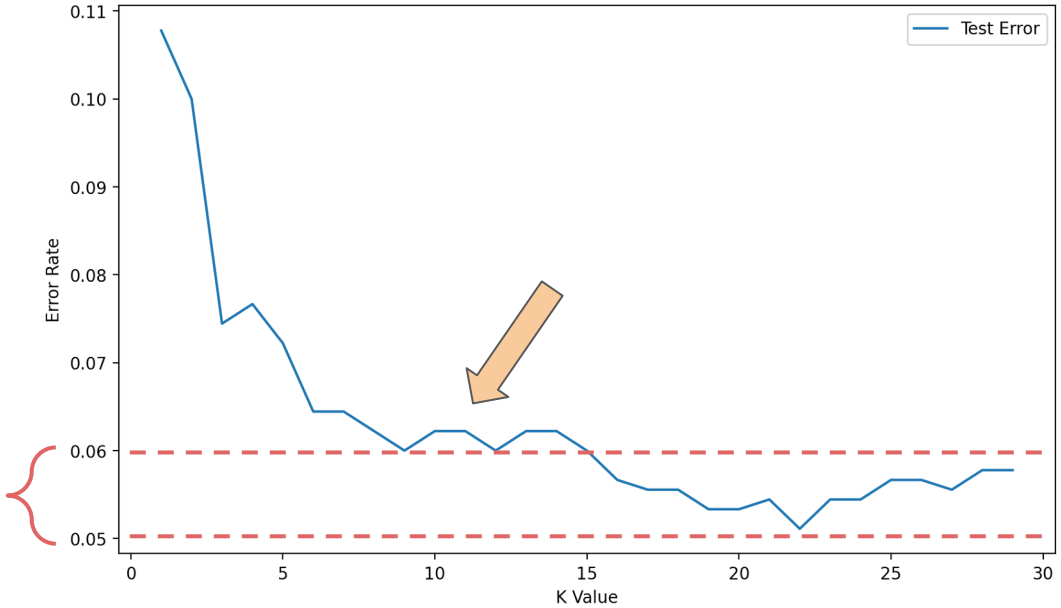
KNN

- Elbow method:



KNN

- Elbow method:



KNN

- Cross validation only takes into account the K value with the lowest error rate across multiple folds.
- This could result in a more complex model (higher value of K).
- Consider the context of the problem to decide if larger K values are an issue.

KNN

- KNN Algorithm
  - Choose K value.
  - Sort feature vectors (N dimensional space) by distance metric.
  - Choose class based on K nearest feature vectors.

KNN

- KNN Considerations:
  - Distance Metric
    - Many ways to measure distance:
      - Minkowski
      - Euclidean
      - Manhattan
      - Chebyshev

KNN

- KNN Considerations:
  - Scaling for Distance
    - Features could have vastly different value ranges!

KNN

- KNN Considerations:
  - Scaling for Distance
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KNN

- KNN Considerations:
  - Scaling for Distance
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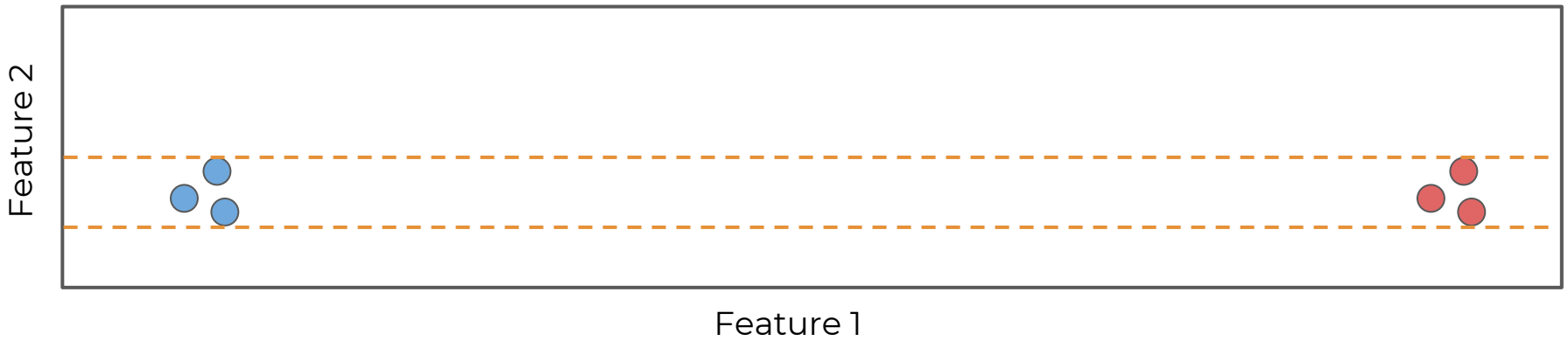
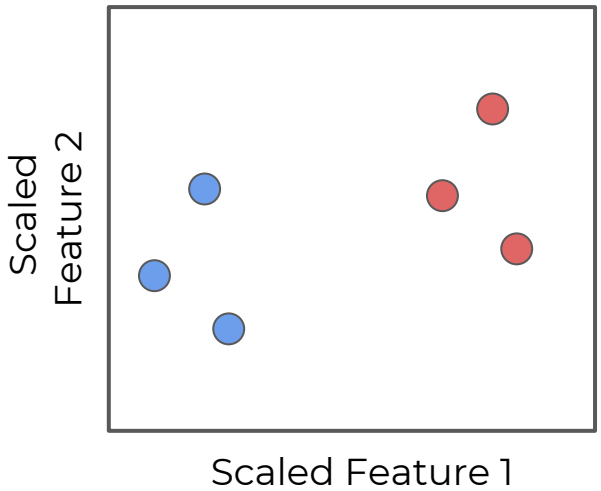


KNN

- KNN Considerations:
  - Scaling is necessary for KNN.



KNN

- While the KNN Algorithm is relatively simple, keep in mind the following considerations:
    - Choosing the optimal K value.
    - Scaling features.
- Let’s continue to explore how to perform KNN for classification!

KNN Classification

Coding Part One: Data and Model

KNN

- Let’s test your new skills on a real data set.
- We’ll be analyzing sonar frequencies to help distinguish between rocks or sea mines!