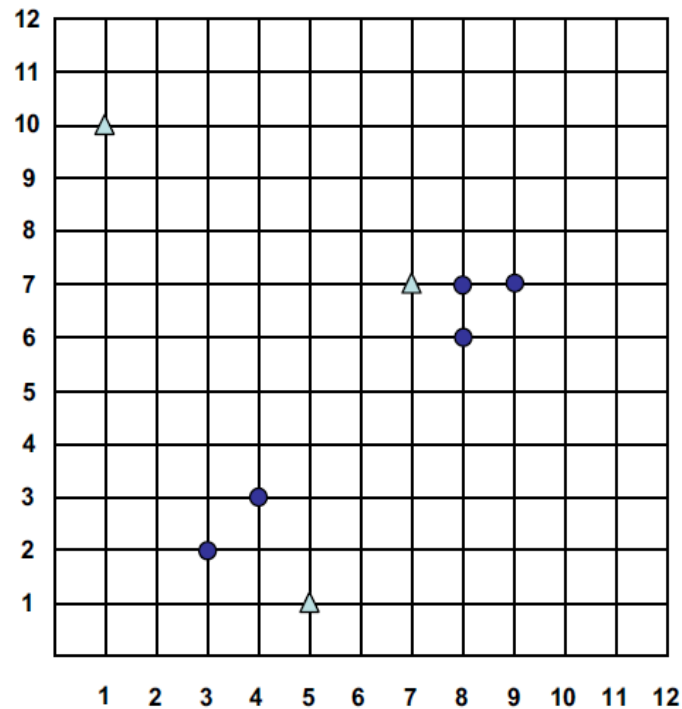


MMMO - Tutorial

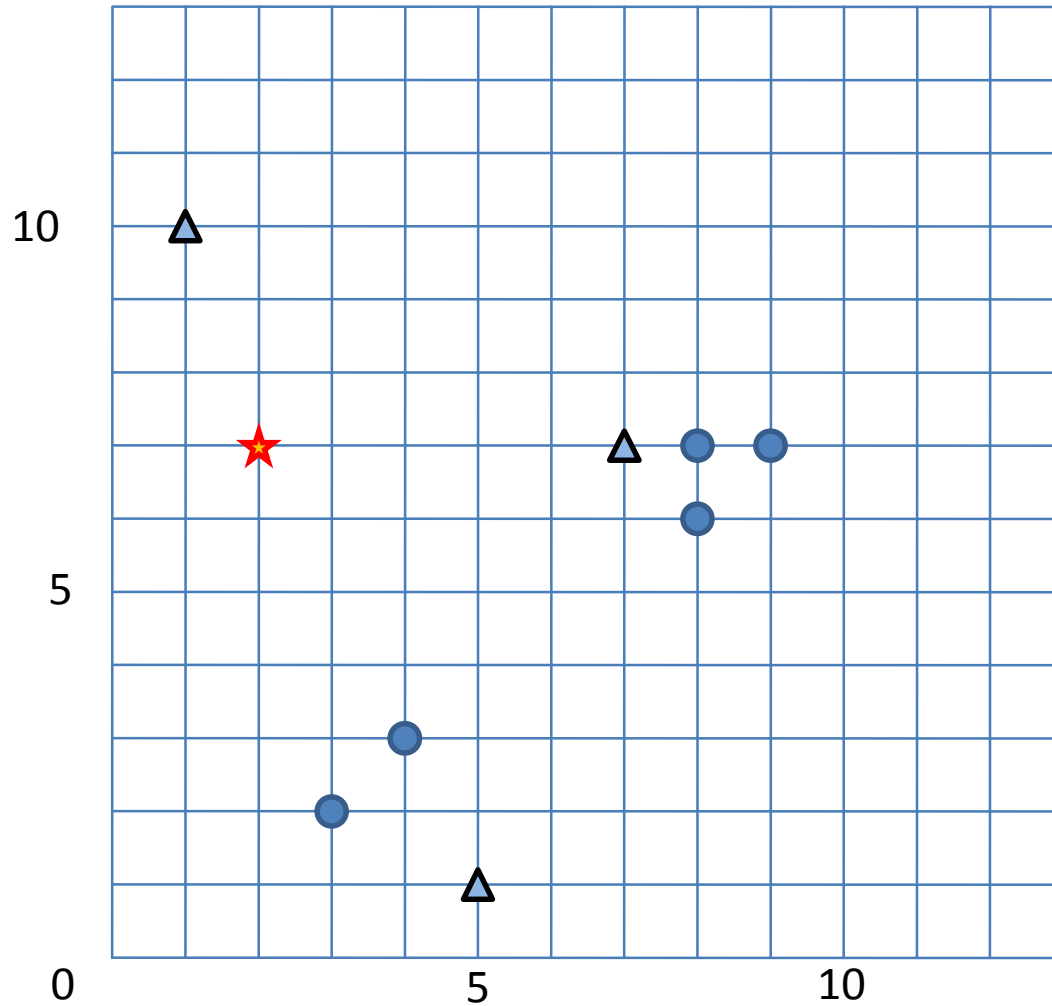
The following data set with 8 points (e.g. two-dimensionally feature vectors) is given. The triangles build one class and the circles build the other.

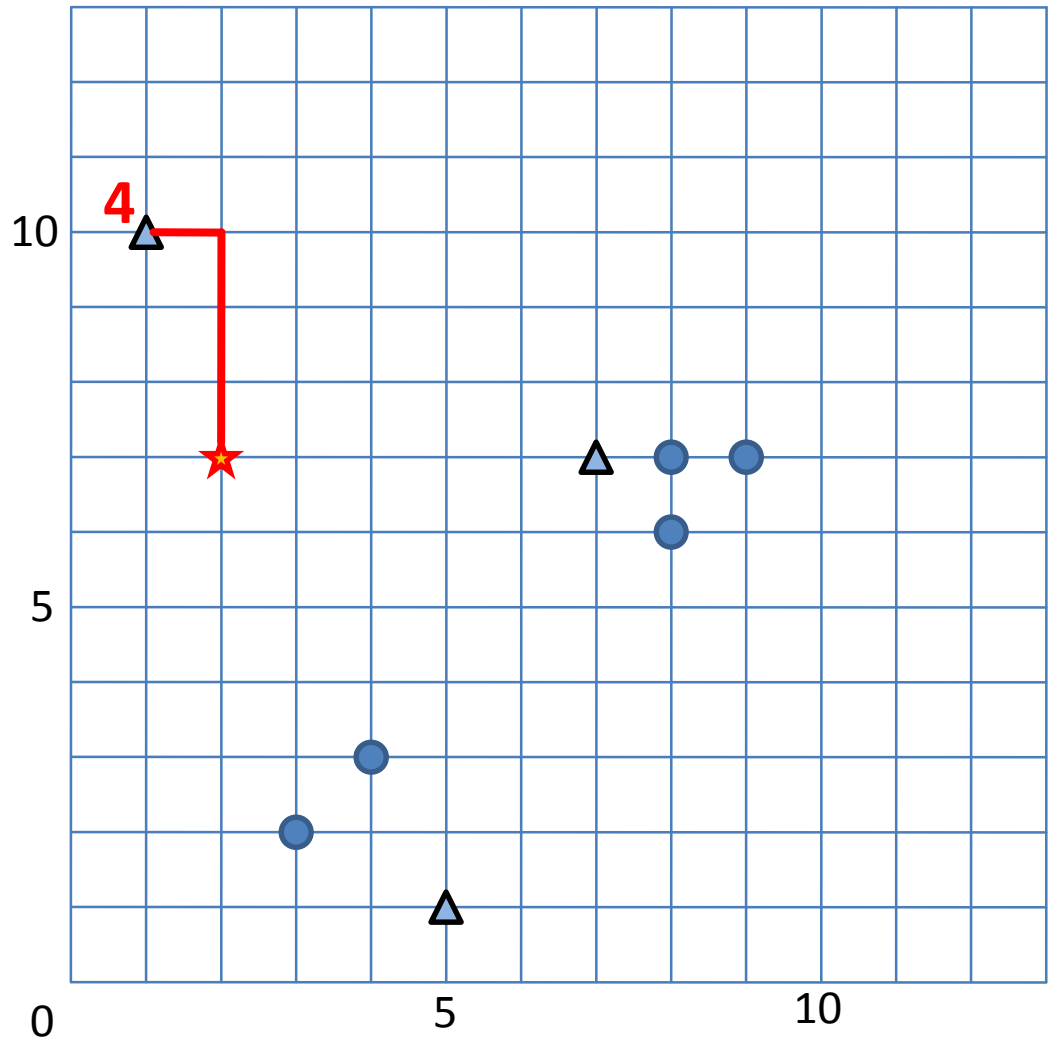


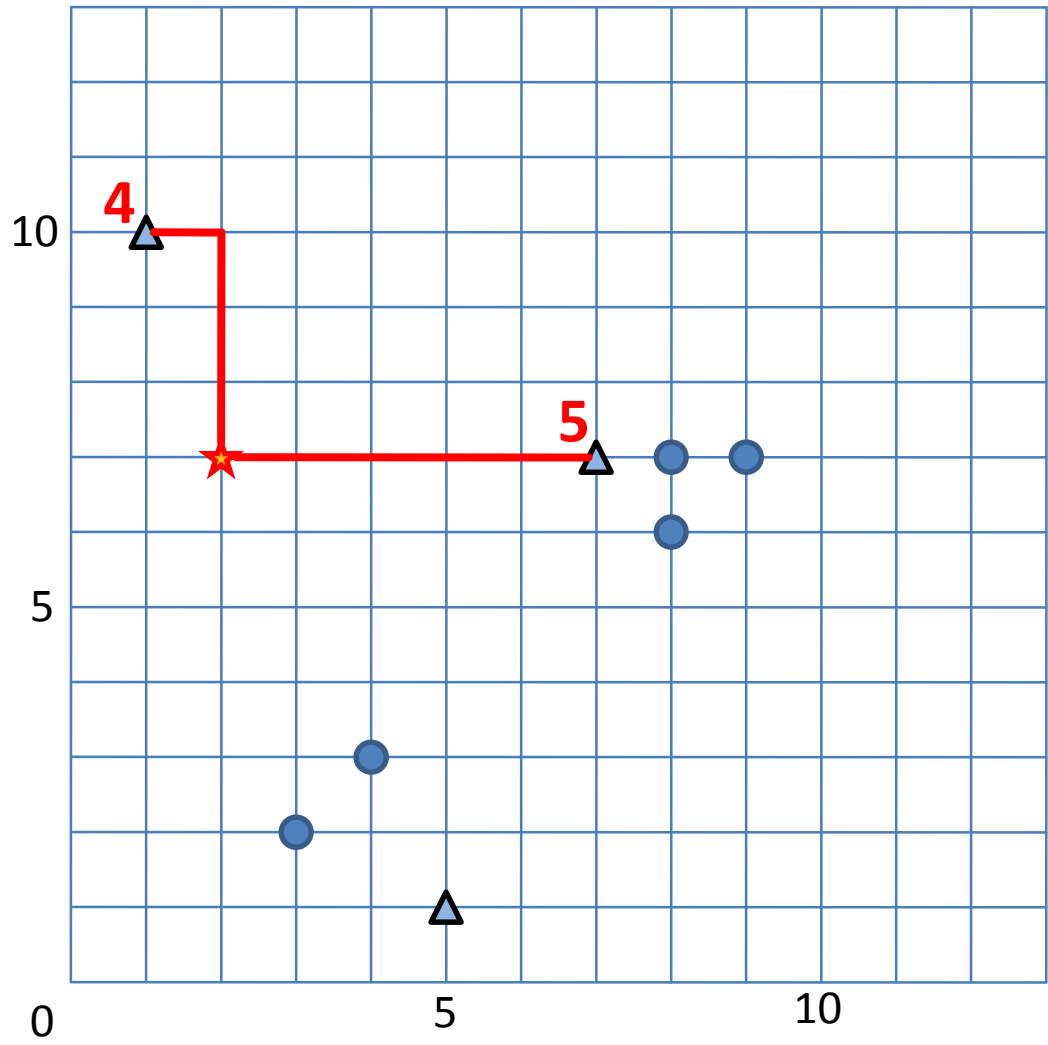
In the following the classes of data points should be determined with the k -nearest neighbors algorithm. As distance function between two points the Manhattan distance (l_1 norm) shall be used:

$$L_1(x, y) = \sum_{i=1}^d |x_i - y_i|$$

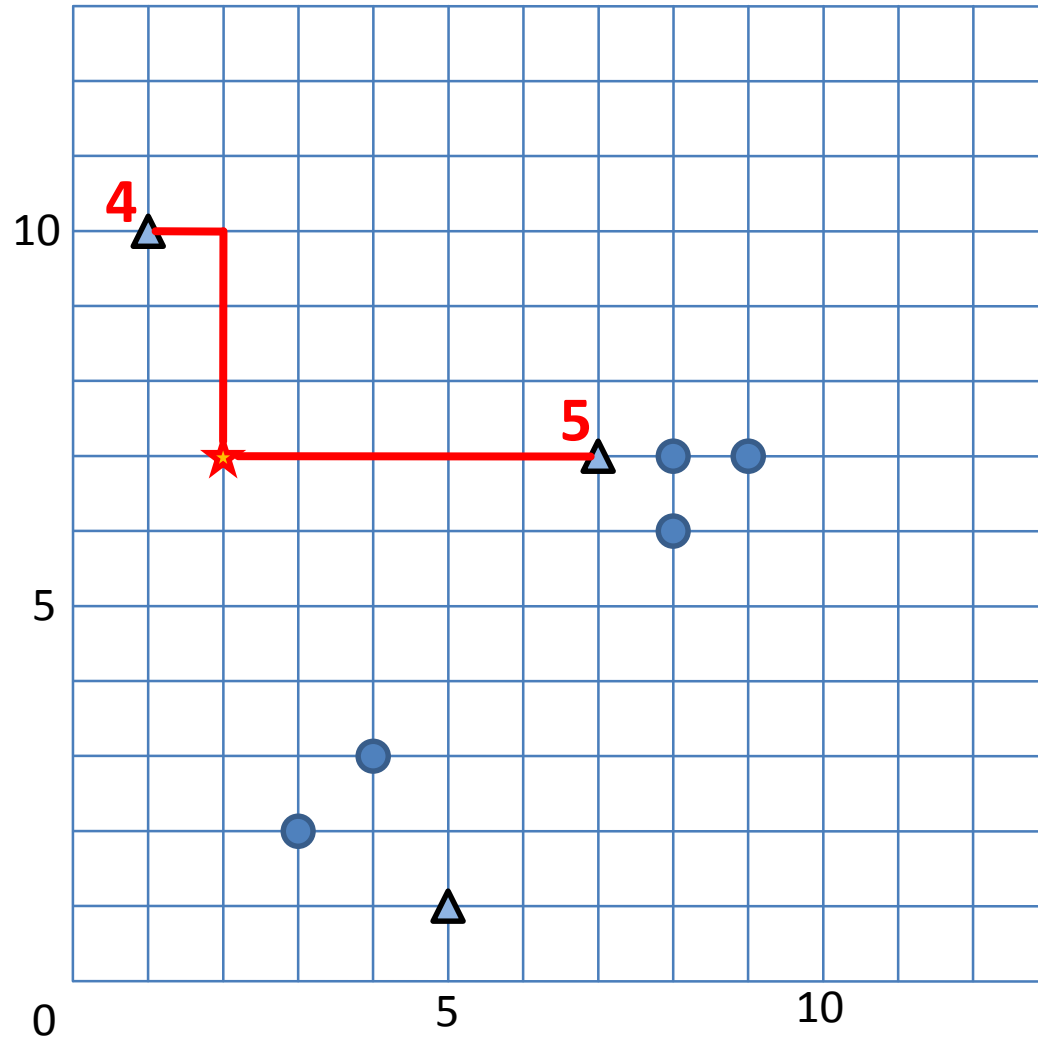
Determine the class of point (2,7) for $k = 2$ using the class of majority of its k -nearest neighbors, i.e. the point is assigned to the class which occurs most often among its k -nearest neighbors.





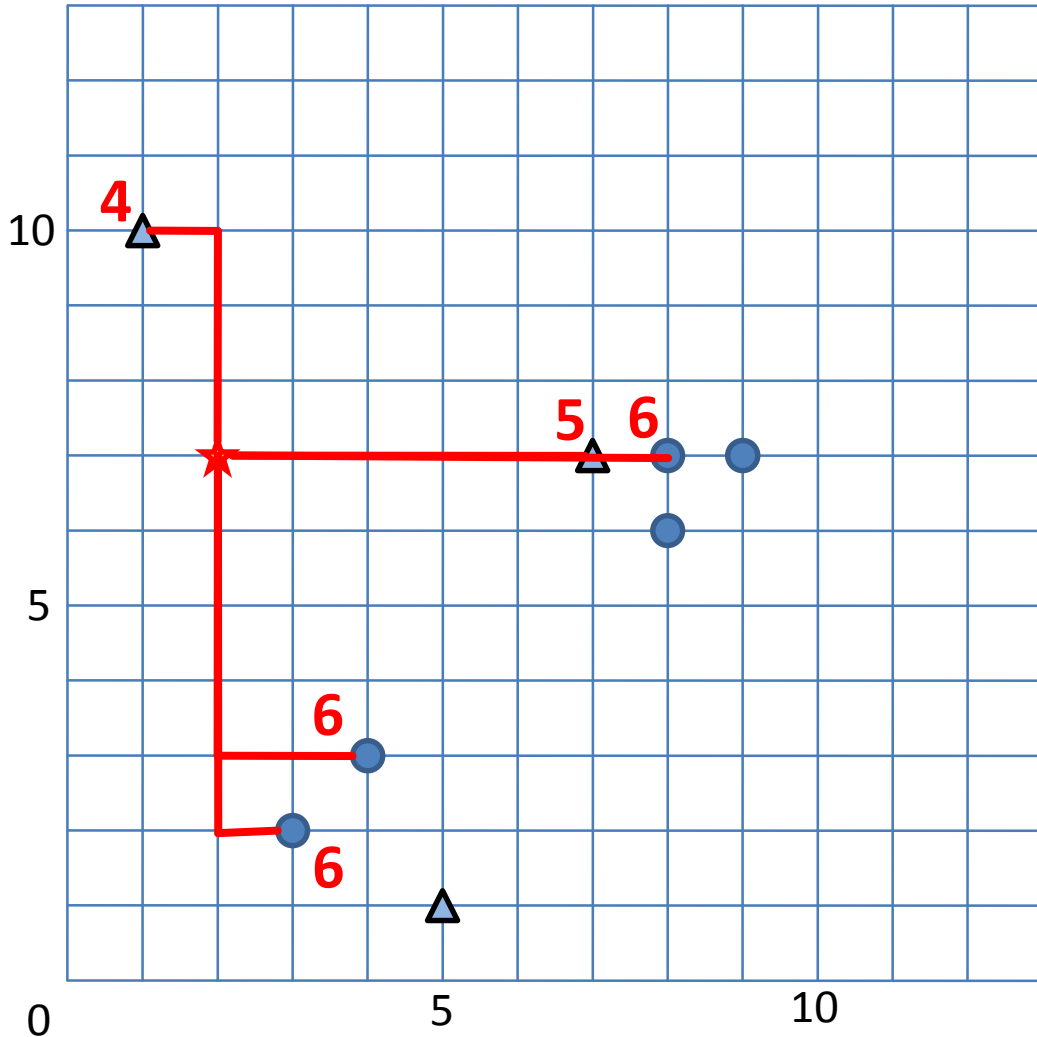


Thus, for $k=2$ ★ is classified as ▲



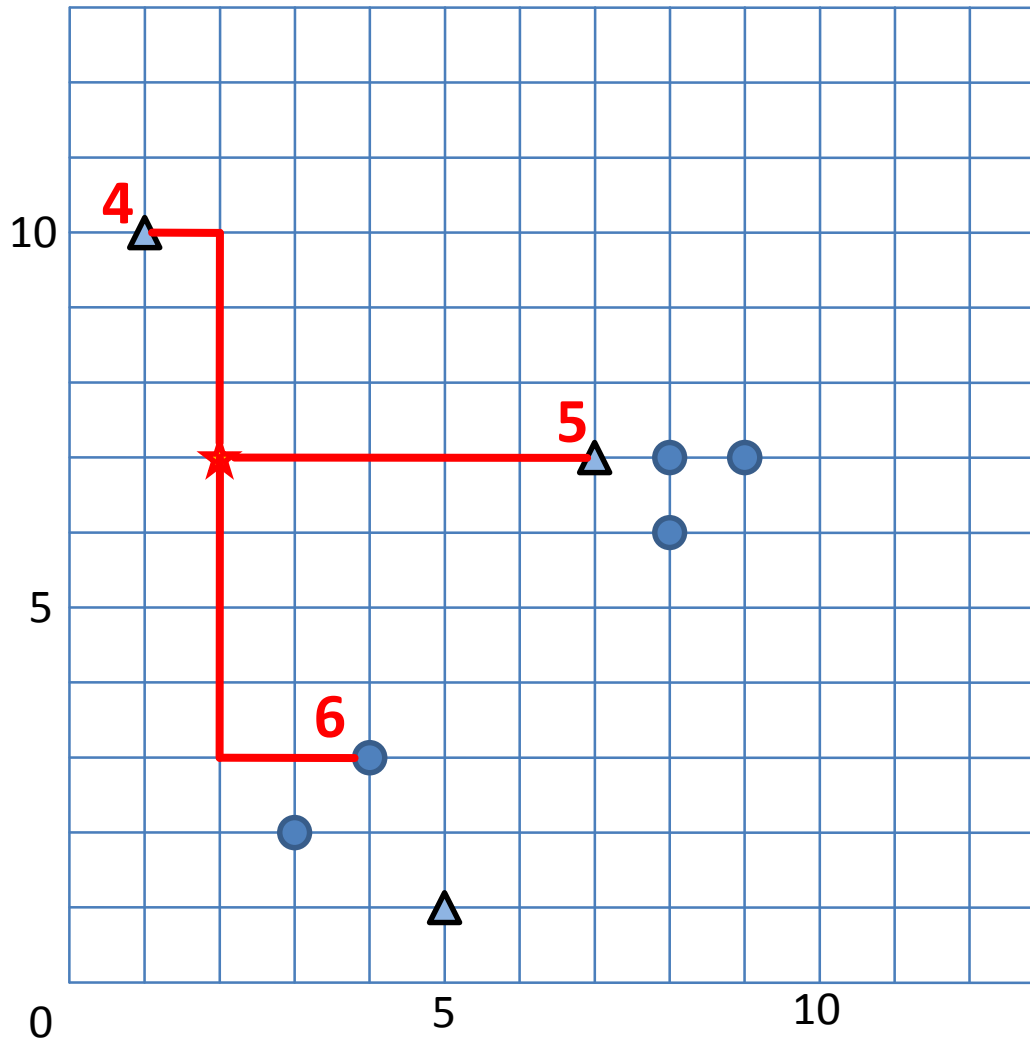
Determine the class of point (2,7) for $k=3$ using the class of majority of its k -nearest neighbors.

=> Special case: several points have the distance 6 to the query point



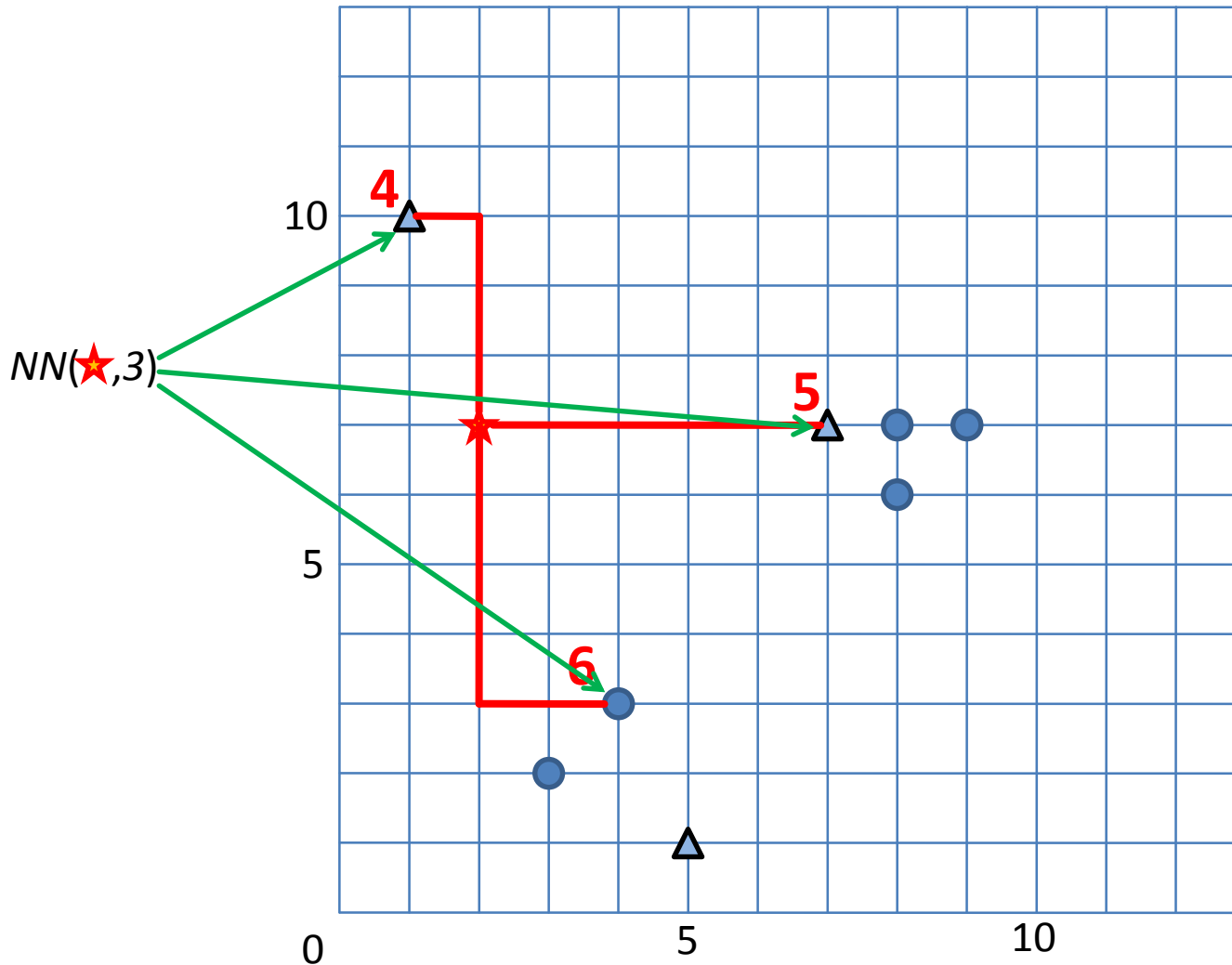
Alternative 1: Nondeterministic definition of kNN: Set $NN(q,k) \subseteq DB$ with exactly k objects such that:

$$\forall o \in NN(q,k), \forall o' \in DB - NN(q,k) : dist(q,o) \leq dist(q,o')$$



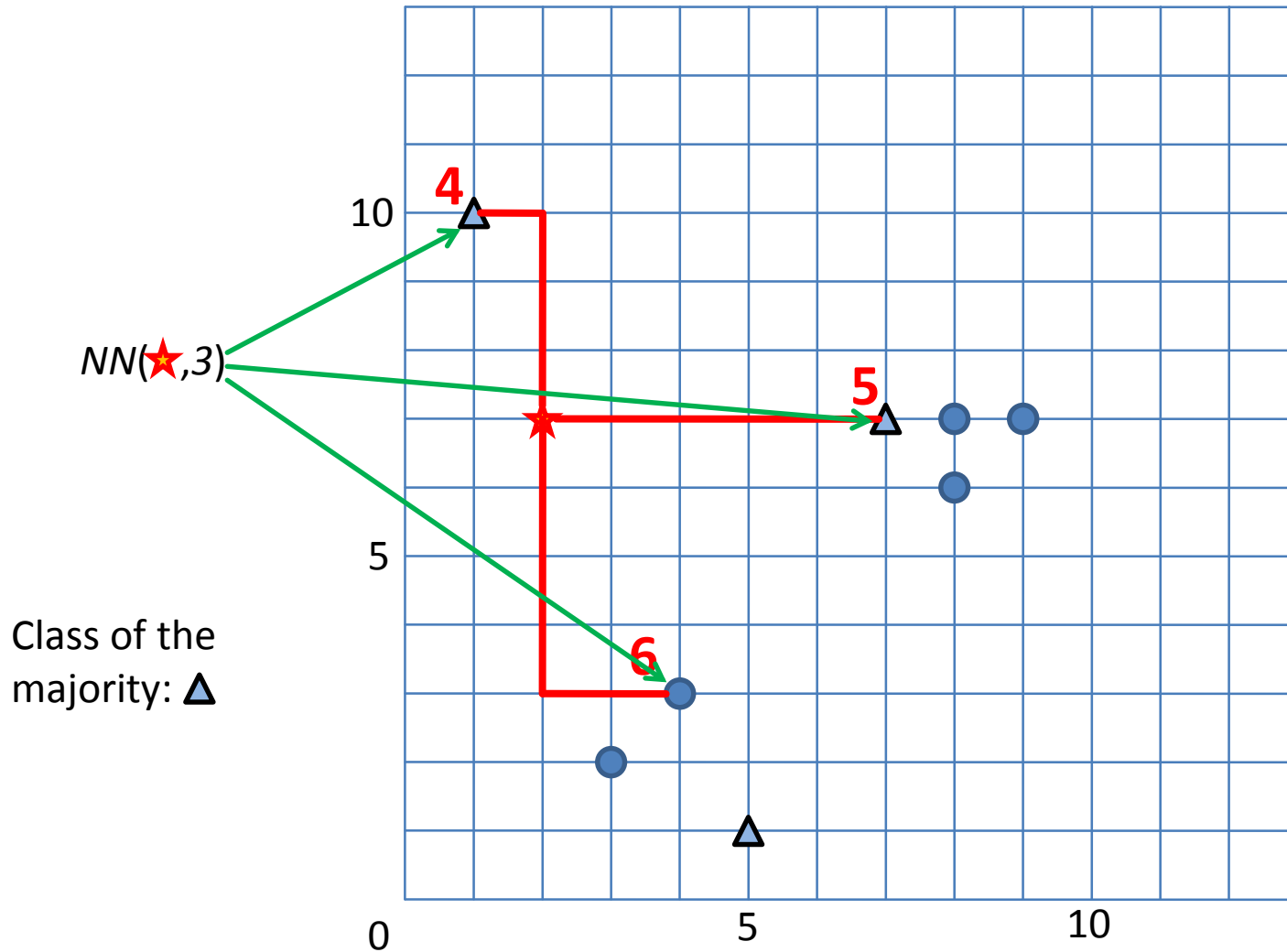
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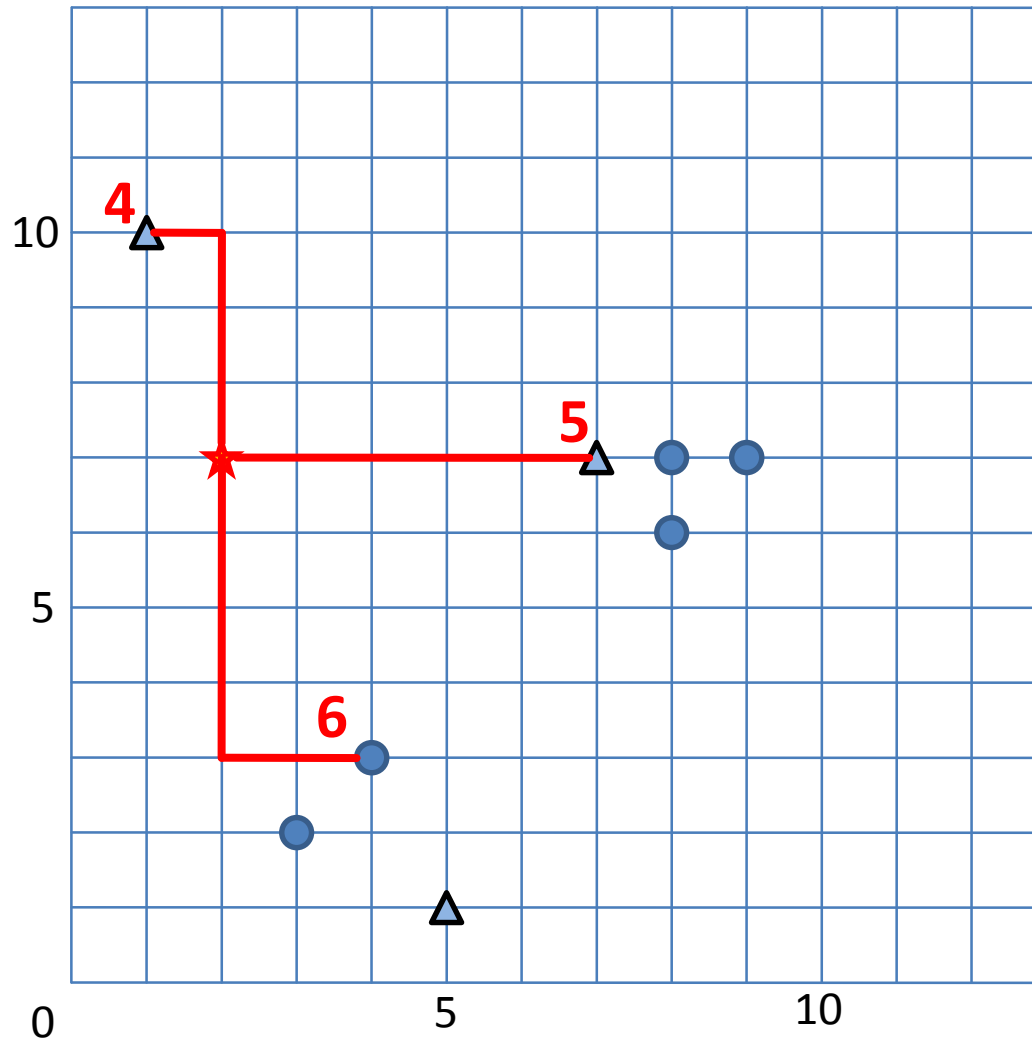
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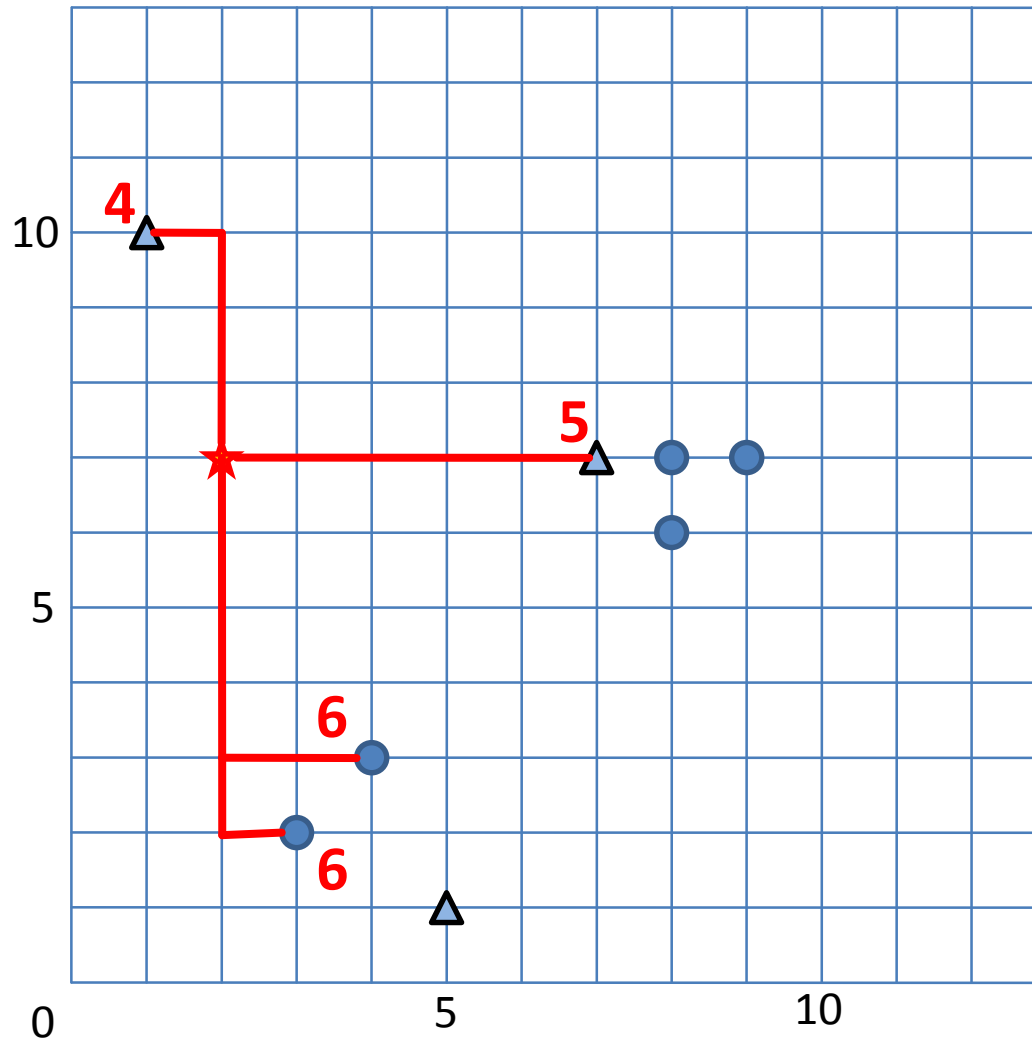
Deterministic definition of kNN: Set $NN(q,k) \subseteq DB$ with at least k objects such that:

$$\forall o \in NN(q,k), \forall o' \in DB - NN(q,k) : dist(q,o) < dist(q,o')$$



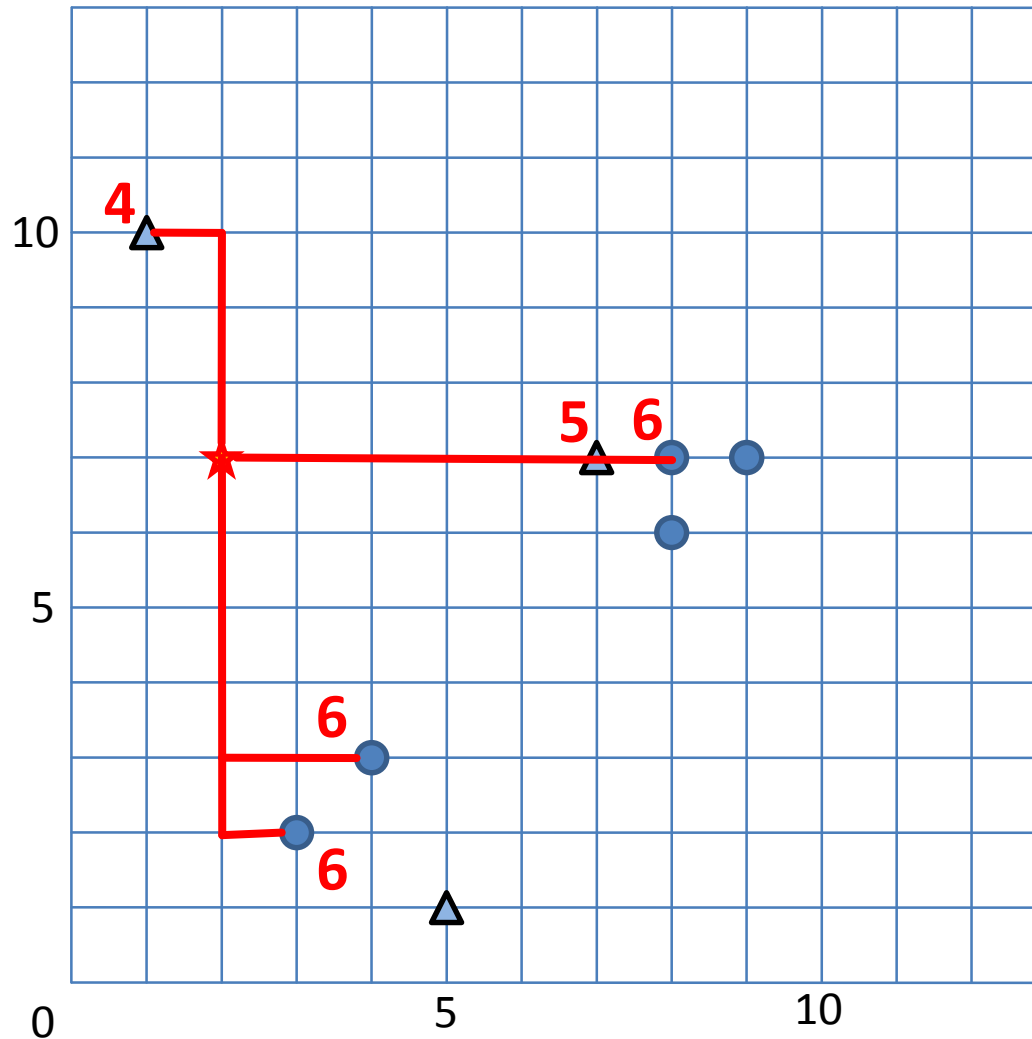
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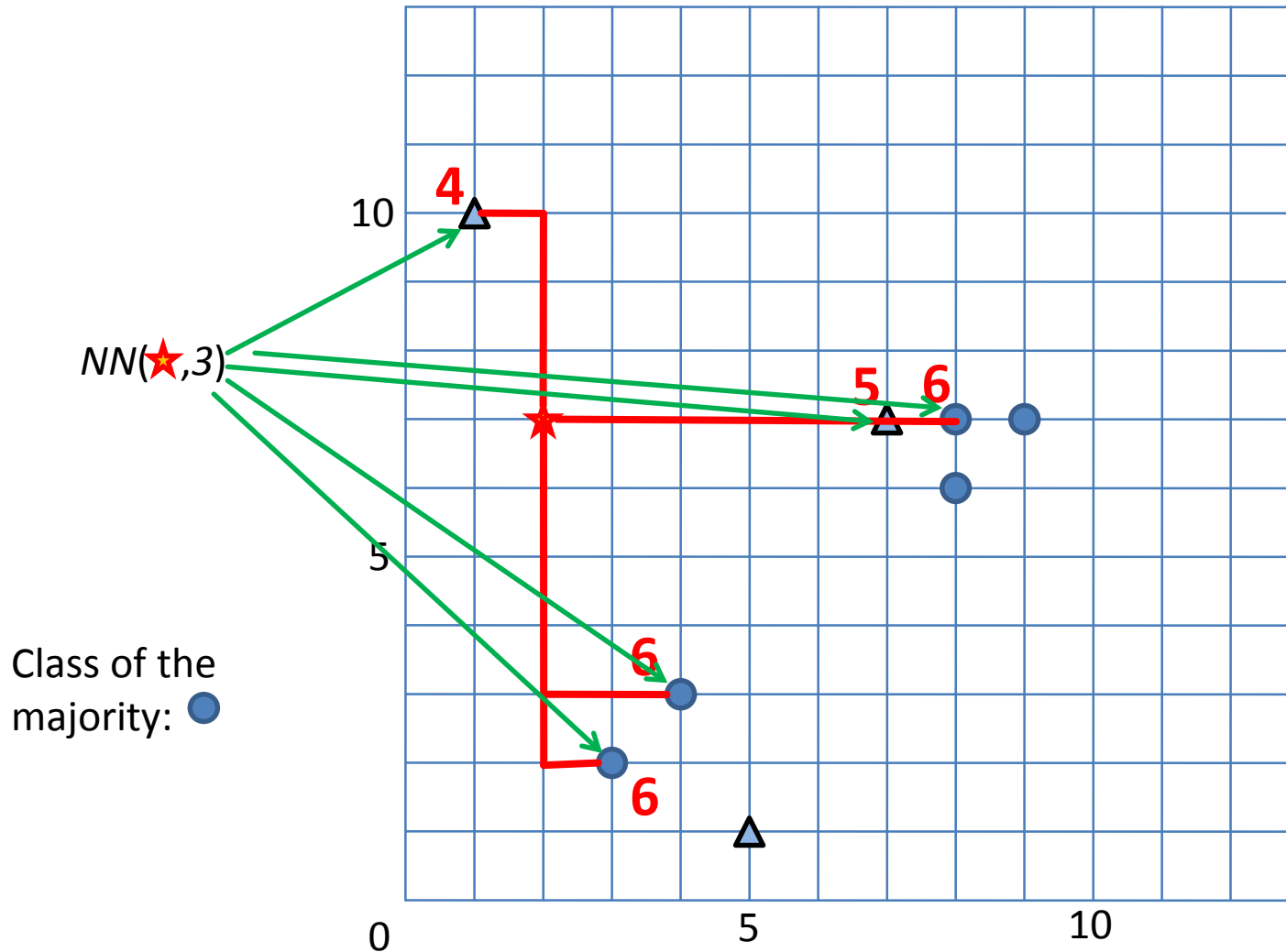
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Deterministic definition of kNN: Set $NN(q,k) \subseteq DB$ with at least k objects such that:

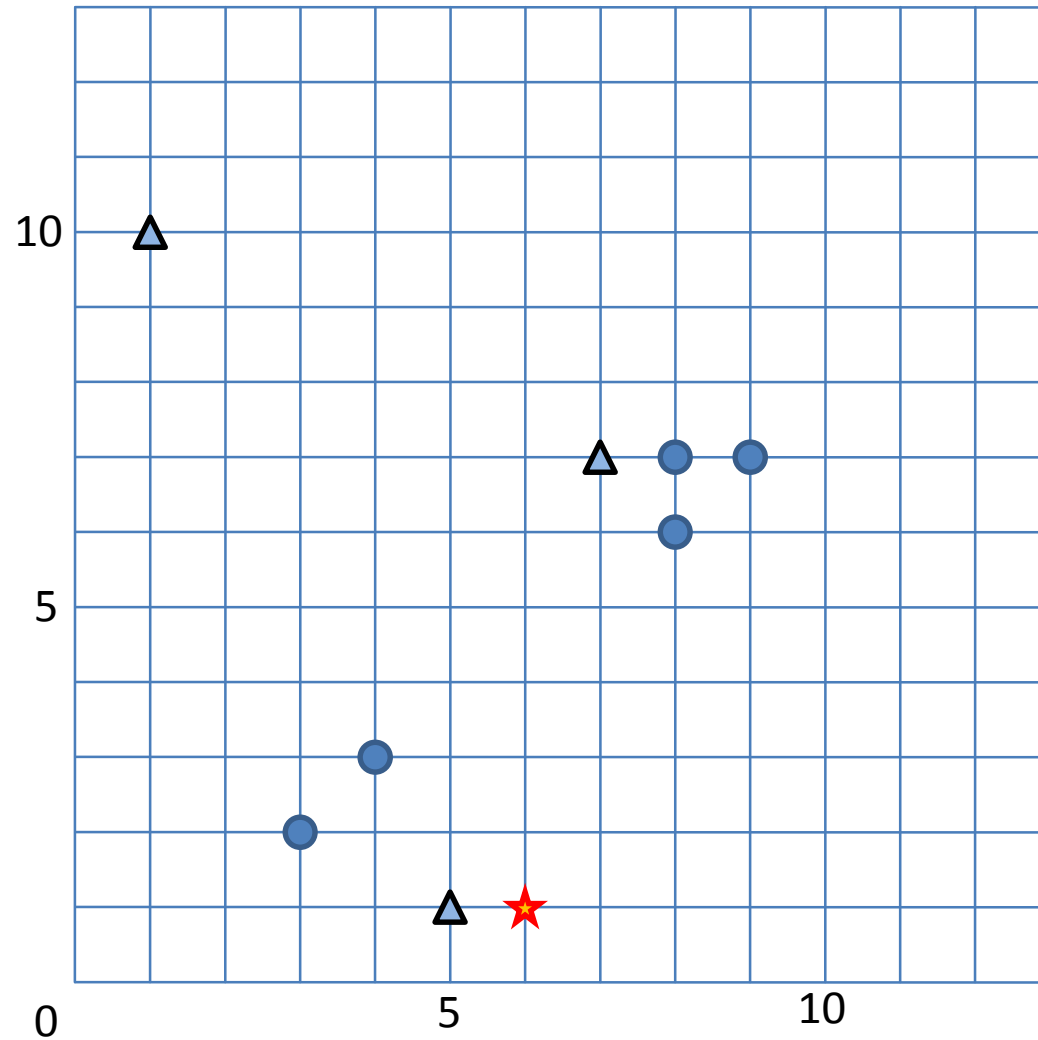
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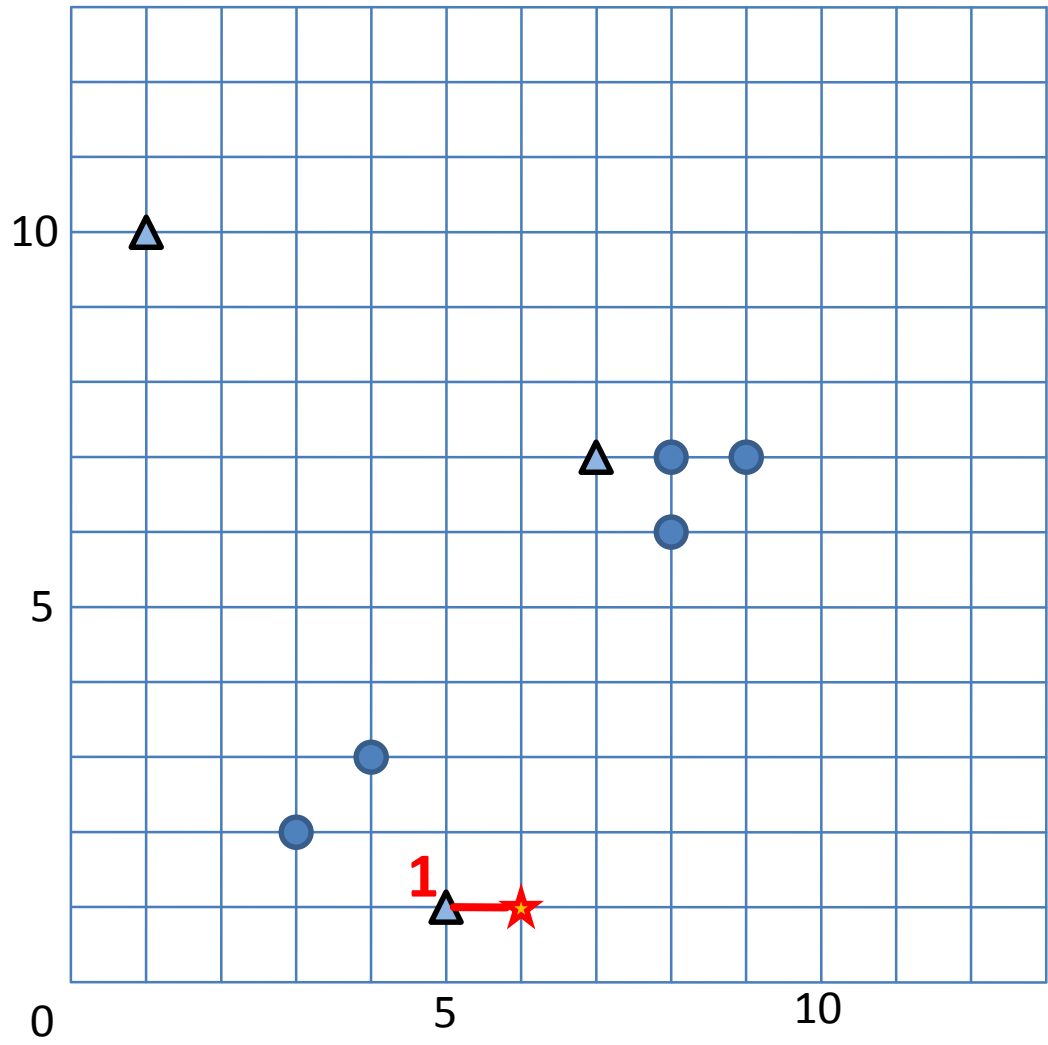


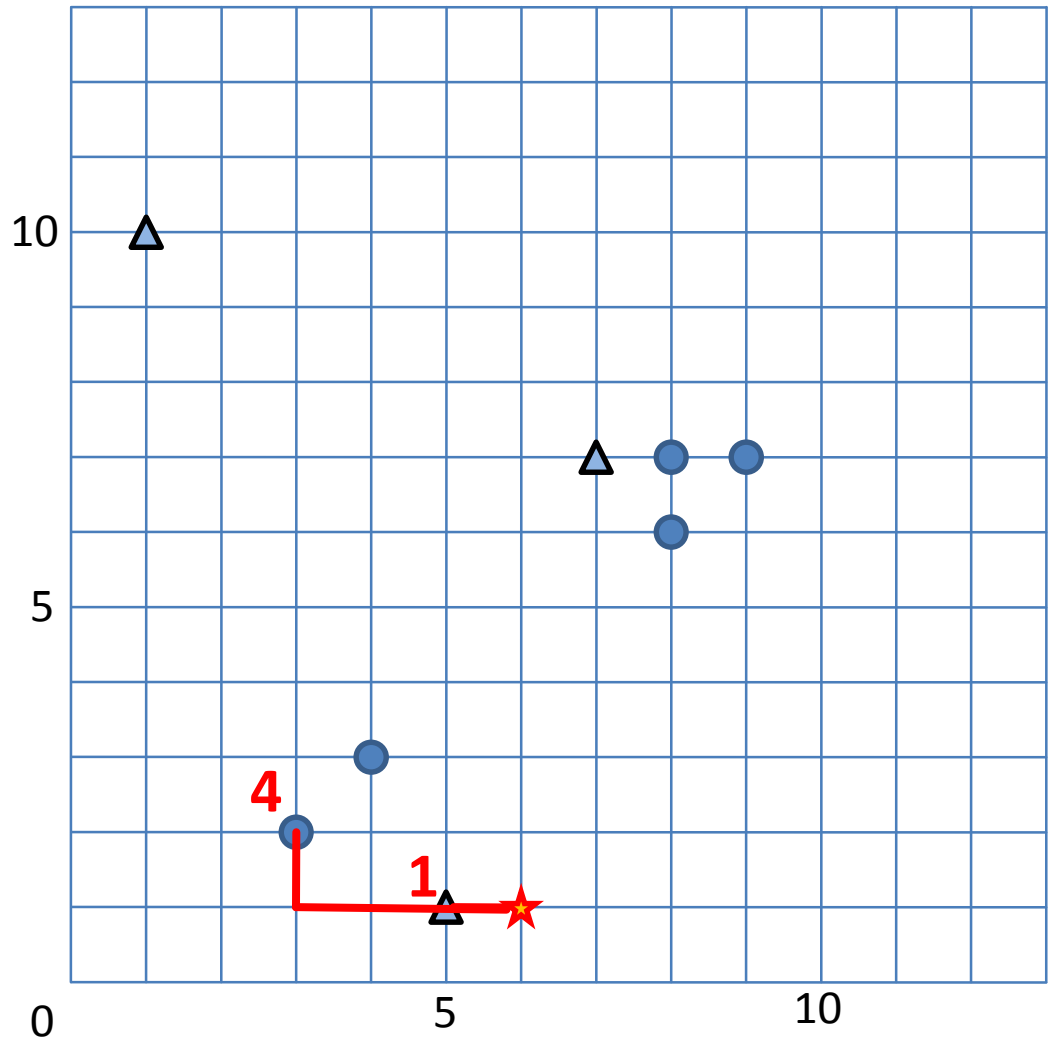
Determine the class of point (2,7) for $k=5$ using the class of majority of its k -nearest neighbors.

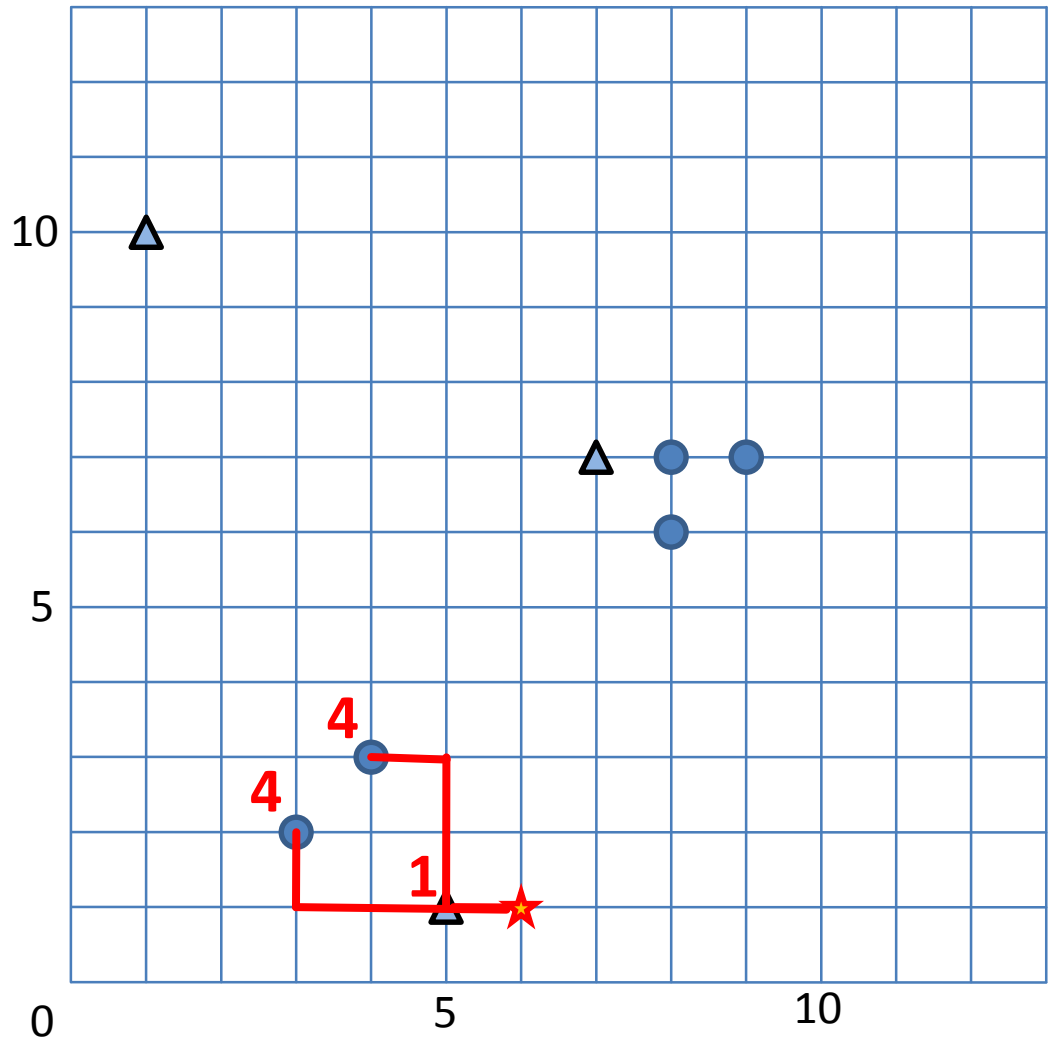
Analogously to the deterministic alternative of the exercise before

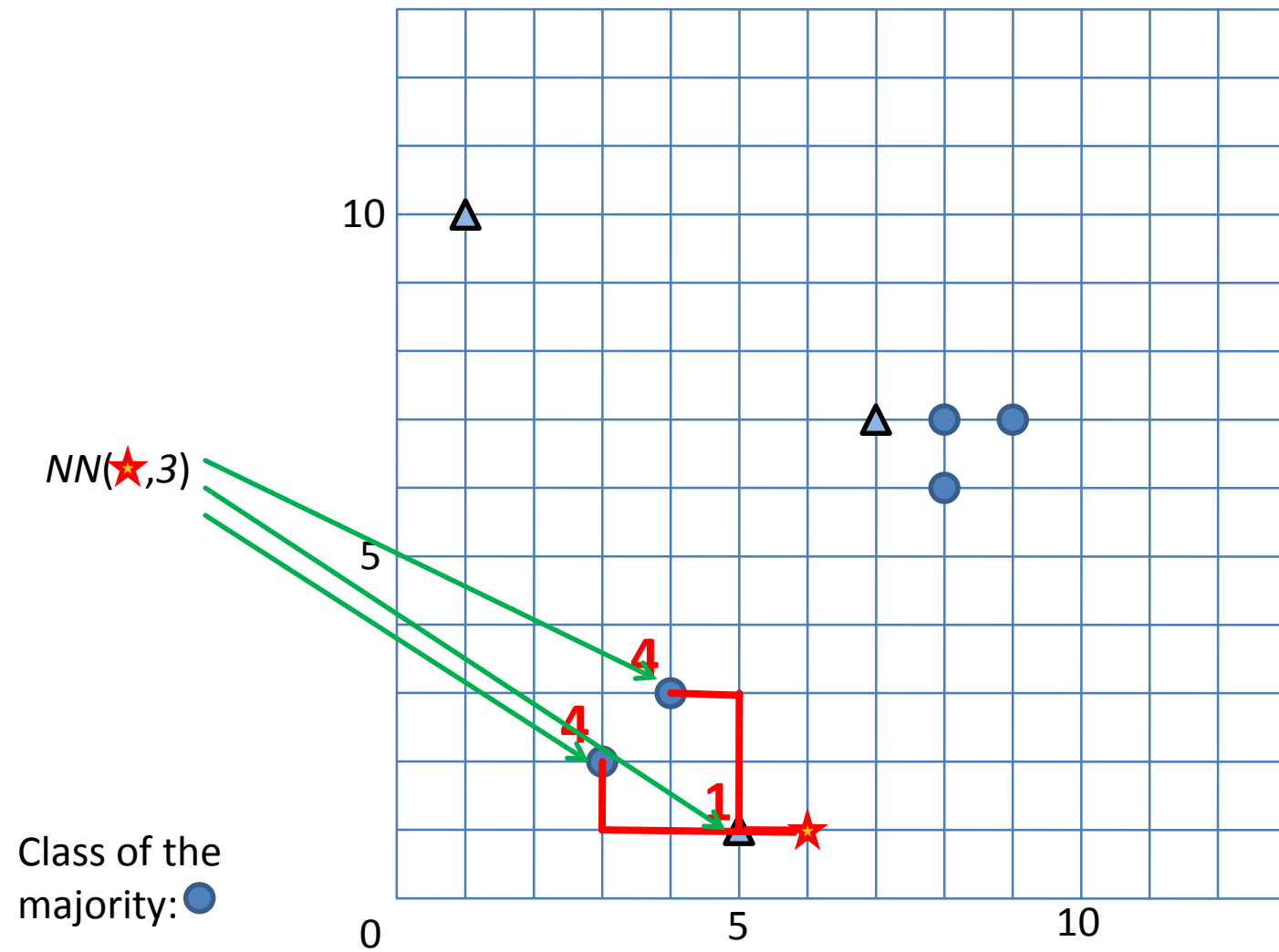
Determine the class of point (6,1) for $k=3$ using the class of majority of its k -nearest neighbors.



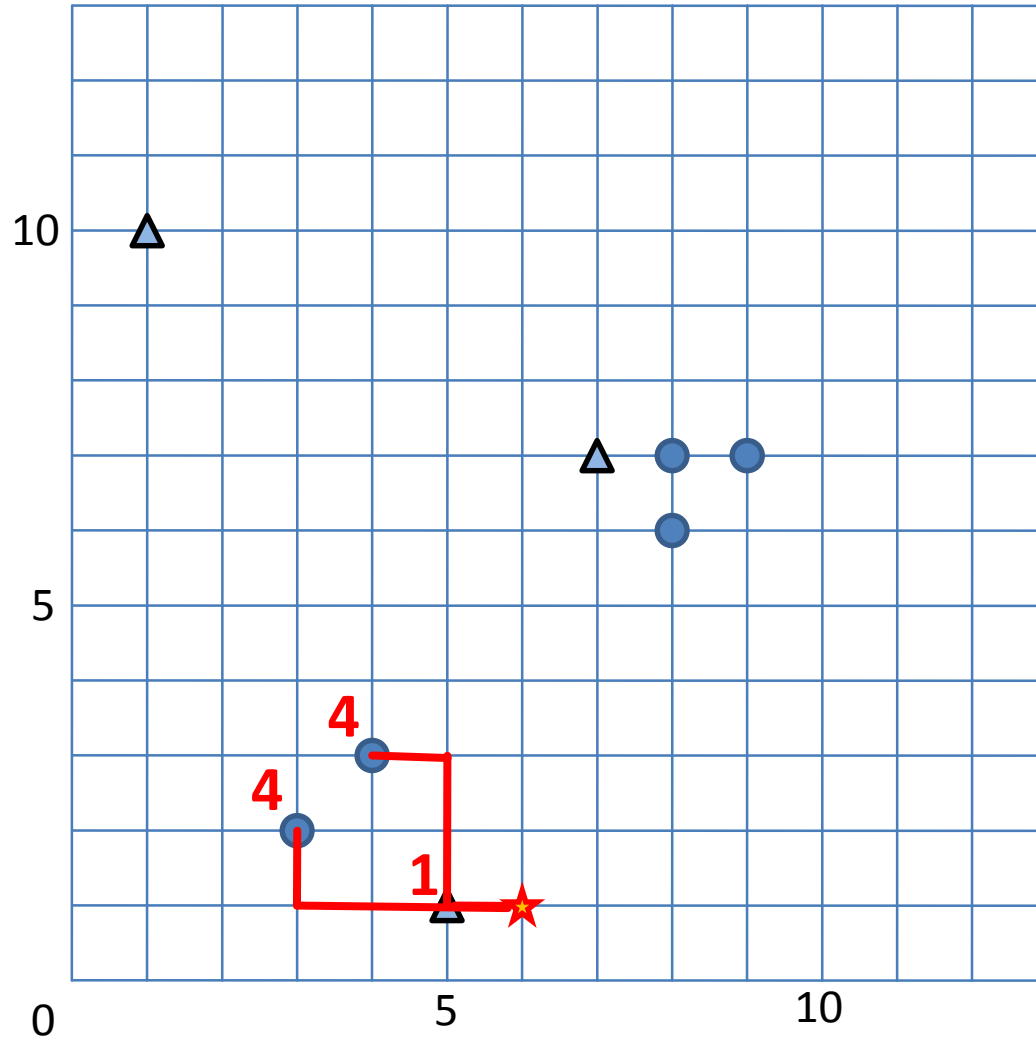


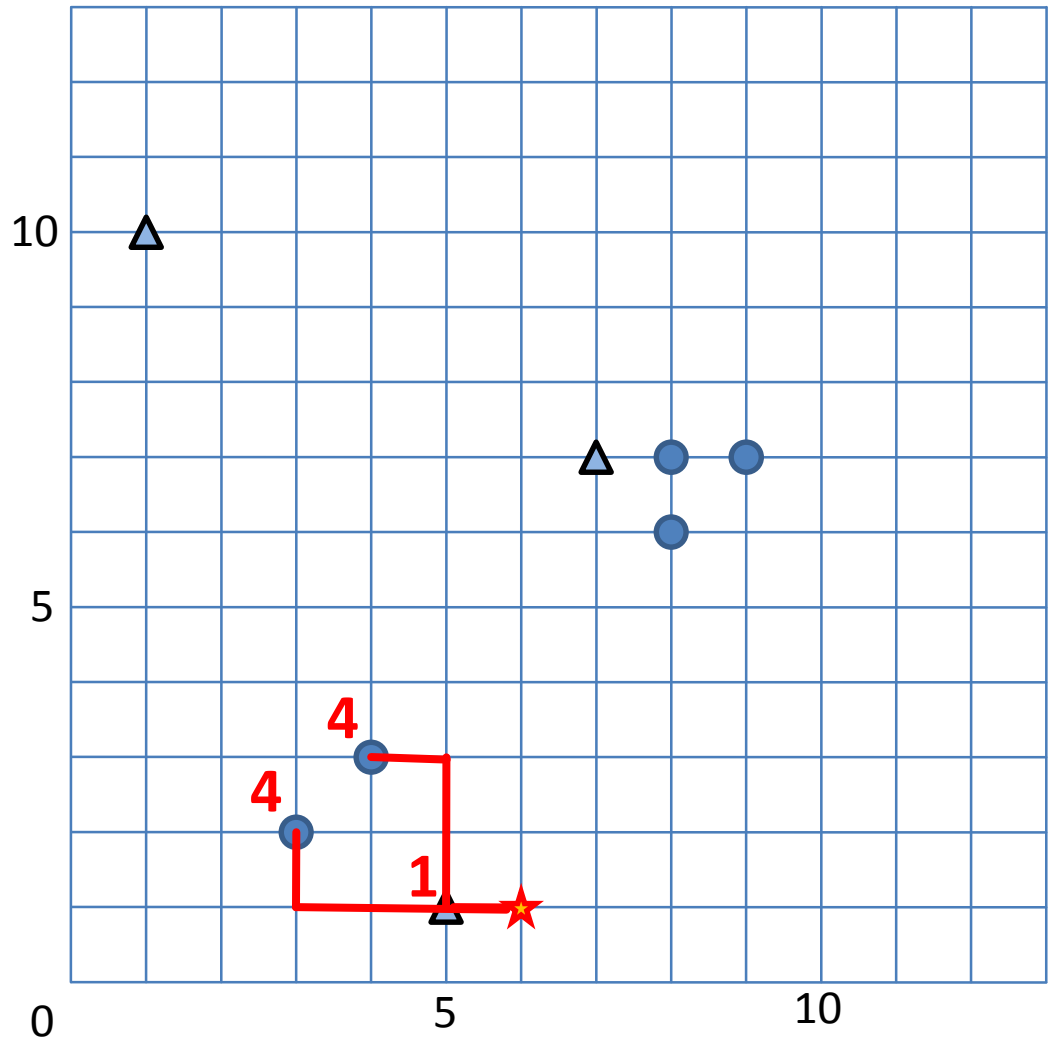






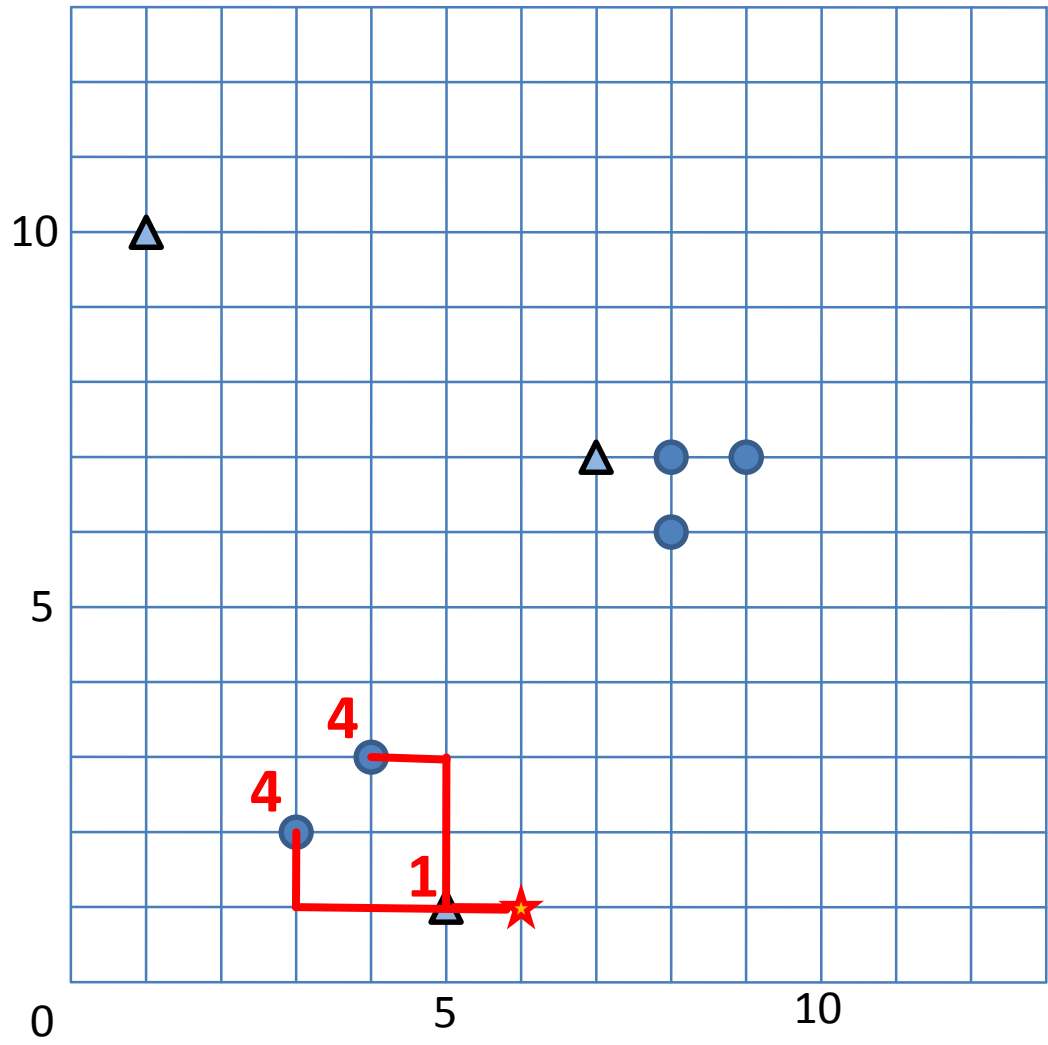
Determine the class of point (6,1) for $k=3$ using the class of majority of its k -nearest neighbors weighting the classes with inverse Manhattan distance.





Weighting(\bullet) = $\frac{1}{4} + \frac{1}{4} = \frac{1}{2}$

Weighting(\triangle) = $\frac{1}{1} = 1$



Weighting(\bullet) = $\frac{1}{4} + \frac{1}{4} = \frac{1}{2}$

Weighting(\blacktriangle) = $\frac{1}{1} = 1$

Highest weight: \blacktriangle