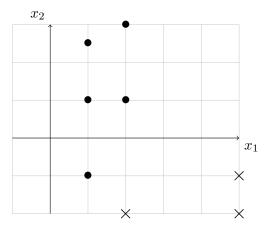
## **Nearest Neighbors**

1. (8 points) Consider the following 2D dataset:

x	y
(1,-1)	+1
(1, 1)	+1
(1, 2.5)	+1
(2, -2)	-1
(2, 1)	+1
(2, 3)	+1
(5, -1)	-1
(5, -2)	-1

The dataset is plotted below, with positively labeled points as solid points ( $\bullet$ ) and negatively labeled points as X marks ( $\times$ ):



Break ties in distance by choosing the point with smaller  $x_1$  coordinate, and if still tied, by smaller  $x_2$  coordinate.

(a) Compute the leave-one-out cross validation accuracy (i.e., average 8-fold cross validation accuracy) of the 1-nearest-neighbor learning algorithm on this dataset.

**Solution:** 6/8. When left out of the training set, the point at (1,-1) will be misclassified during testing; similarly for the point at (2,-2).

(b) Compute the leave-one-out cross validation accuracy of the 3-nearest-neighbor learning algorithm on this dataset.

**Solution:** 7/8. Now only the point at (2,-2) will be misclassified during testing, when left out of the training set.

(c) In the case of the 1-nearest-neighbor learning algorithm, is it possible to strictly increase the leave-one-out cross validation accuracy on this dataset by changing the label of a single point in the original dataset? If so, give such a point.

**Solution:** Yes. Change either point at (2, -2) to +1, or point at (1, -1) to -1.

(d) How about in the case of the 3-nearest neighbor algorithm? If so, give such a point.

**Solution:** No, not possible. If we try to change the point at (2, -2) to +1, then that point will be correctly predicted during cross-validation as +1. Unfortunately, with that change the two points at (5,-1) and (5,-2) will now be misclassified, making our cross-validation accuracy worse.