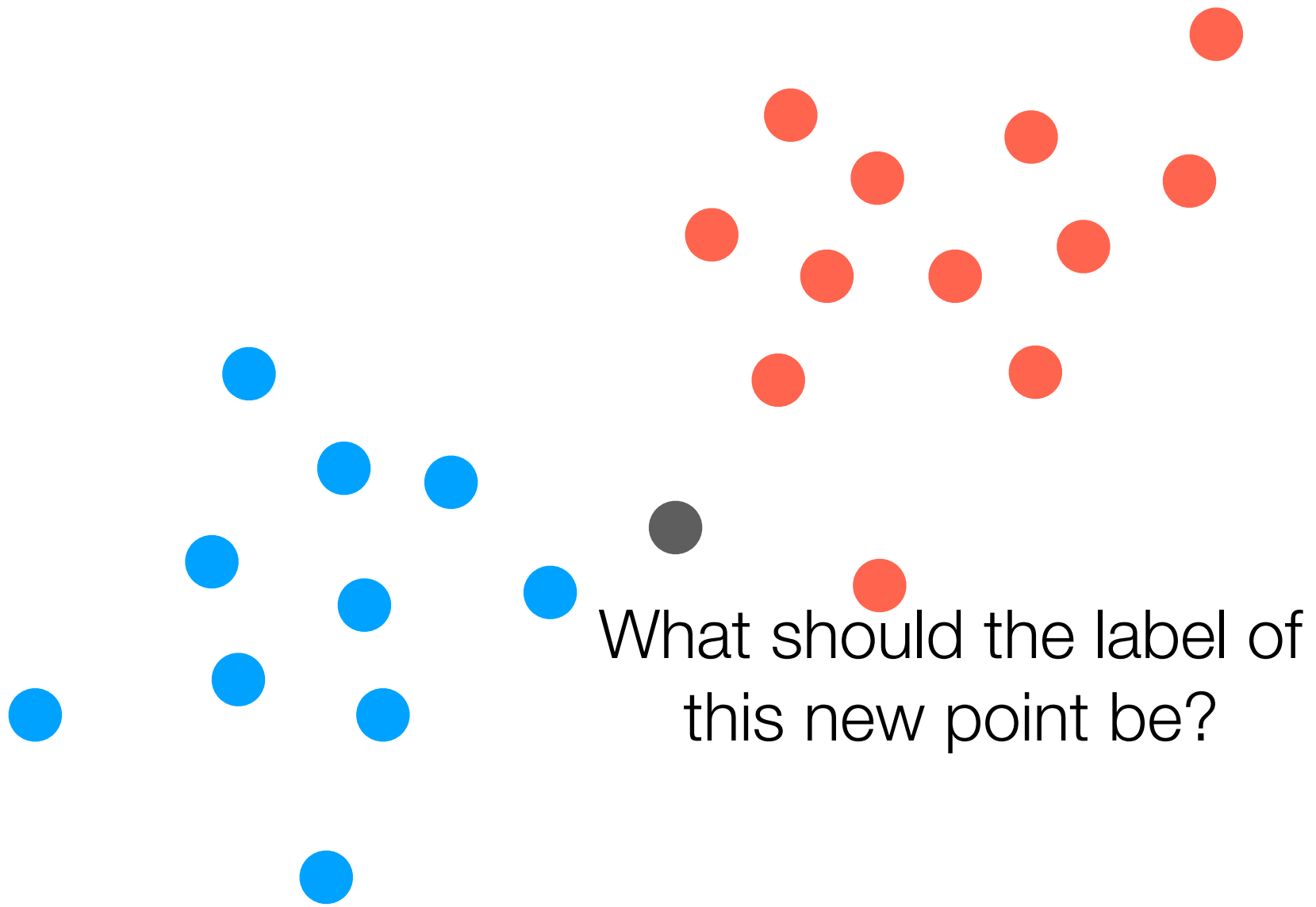
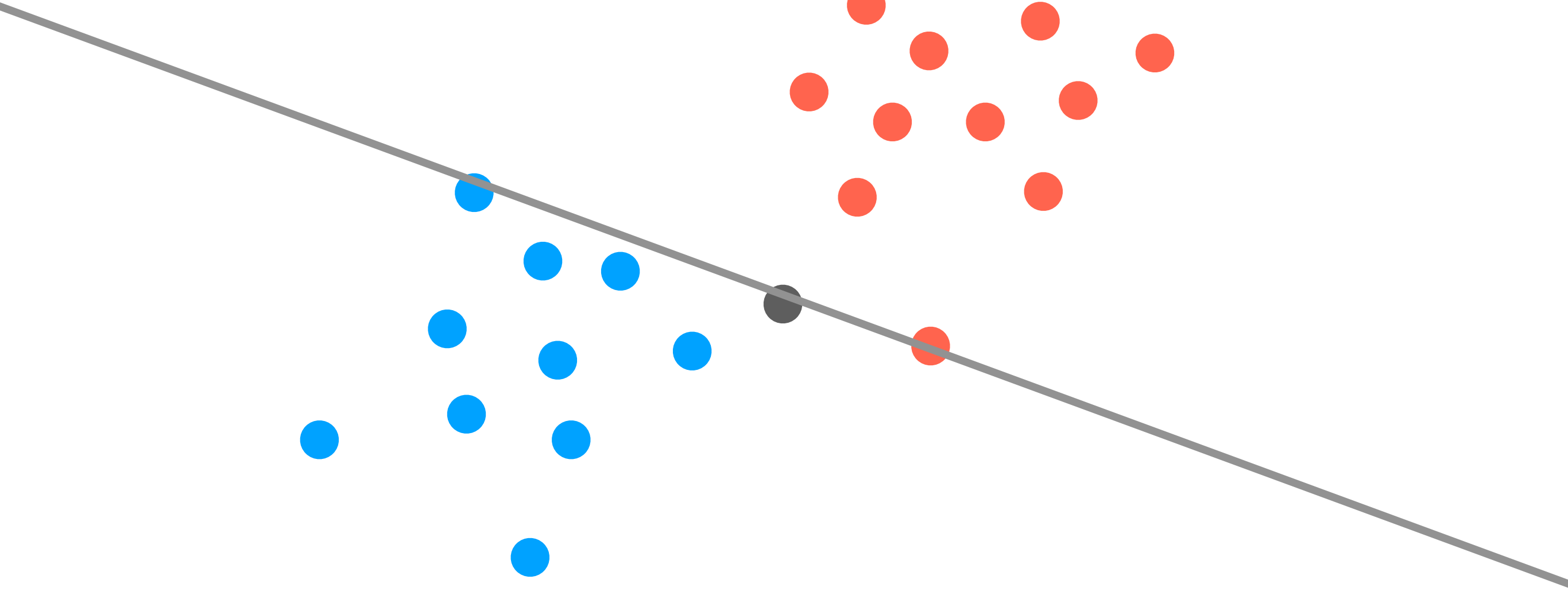


**95-865: Support vector
machines (another discriminative
prediction method)**

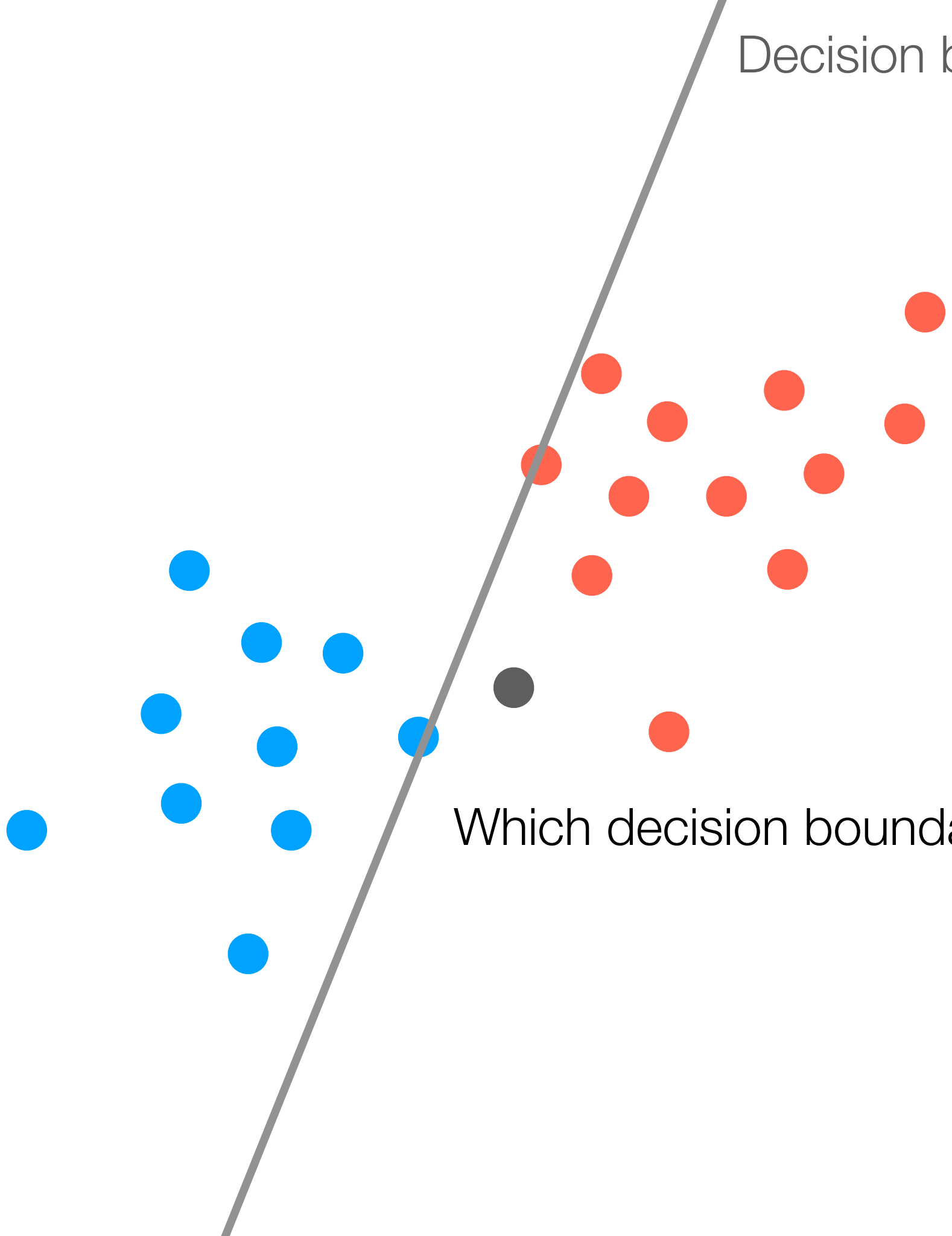
Slides by George Chen



Decision boundary

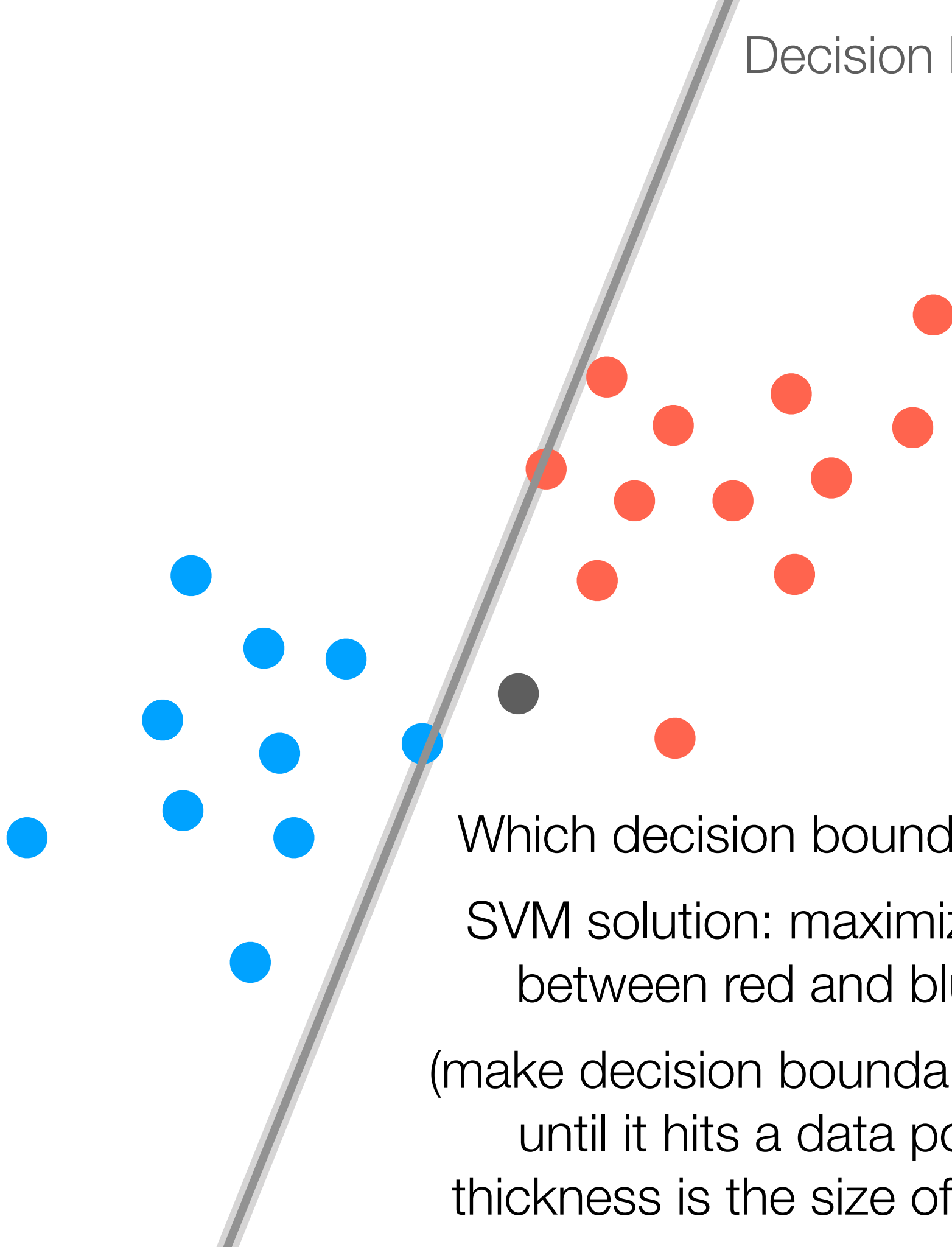


Decision boundary



Which decision boundary is best?

Decision boundary



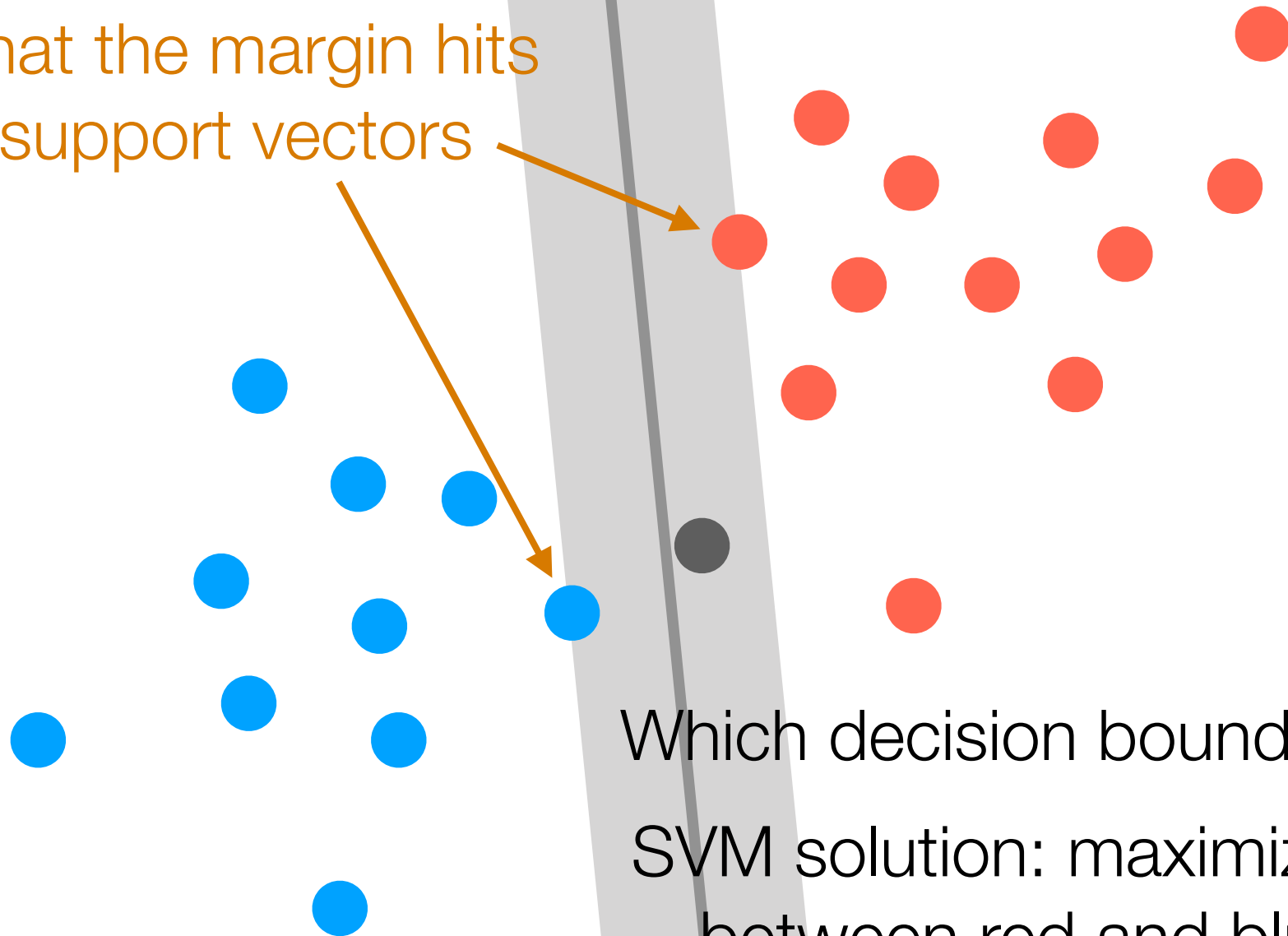
Which decision boundary is best?

SVM solution: maximize “margin”
between red and blue points

(make decision boundary line thicker
until it hits a data point—this
thickness is the size of the margin)

Decision boundary

The points that the margin hits
are called support vectors



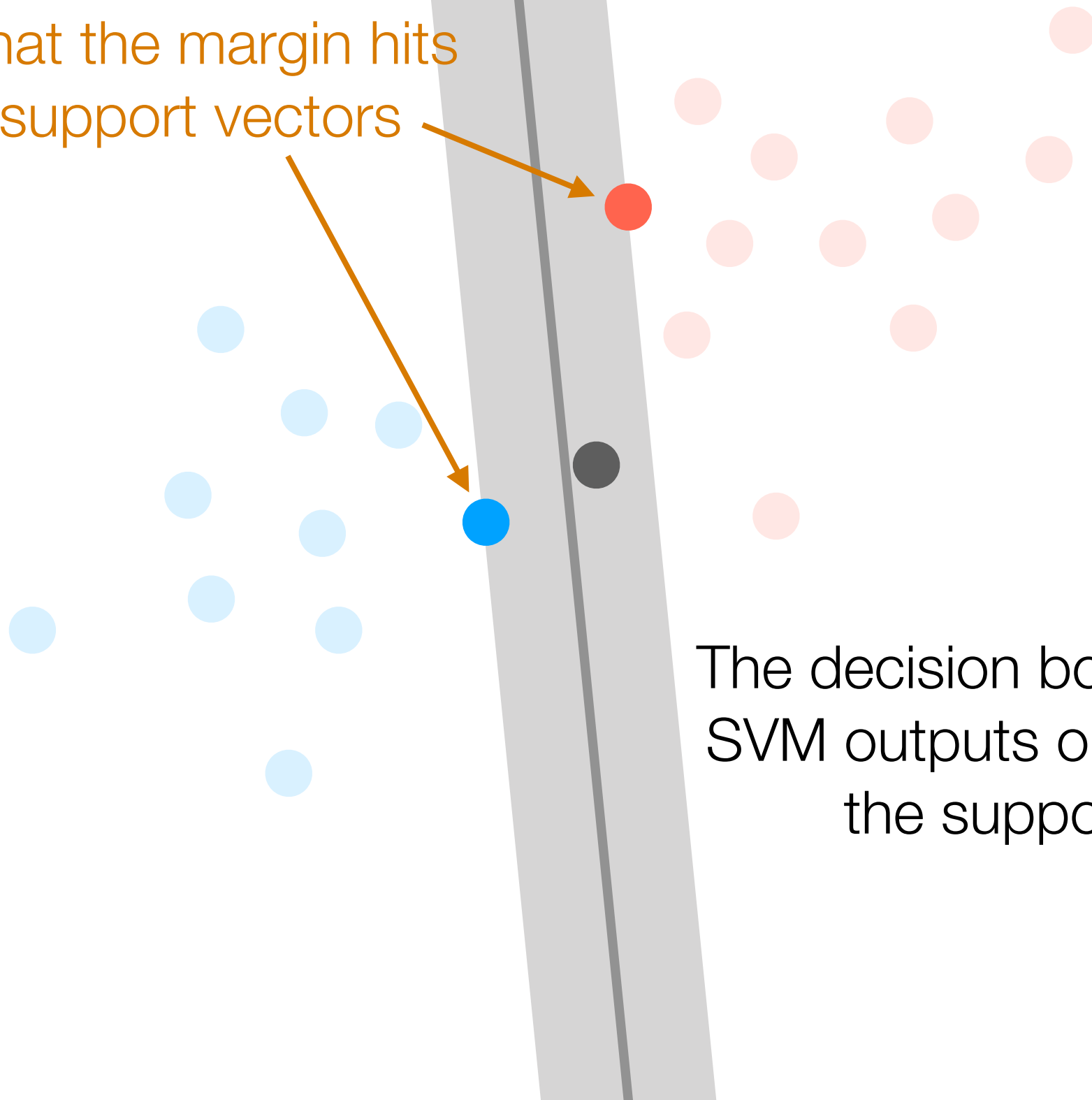
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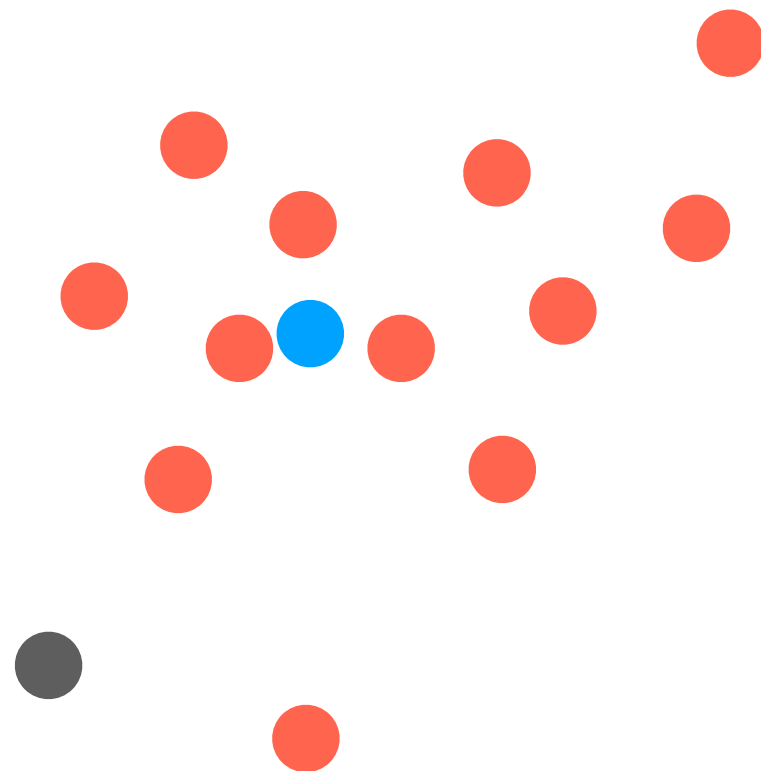
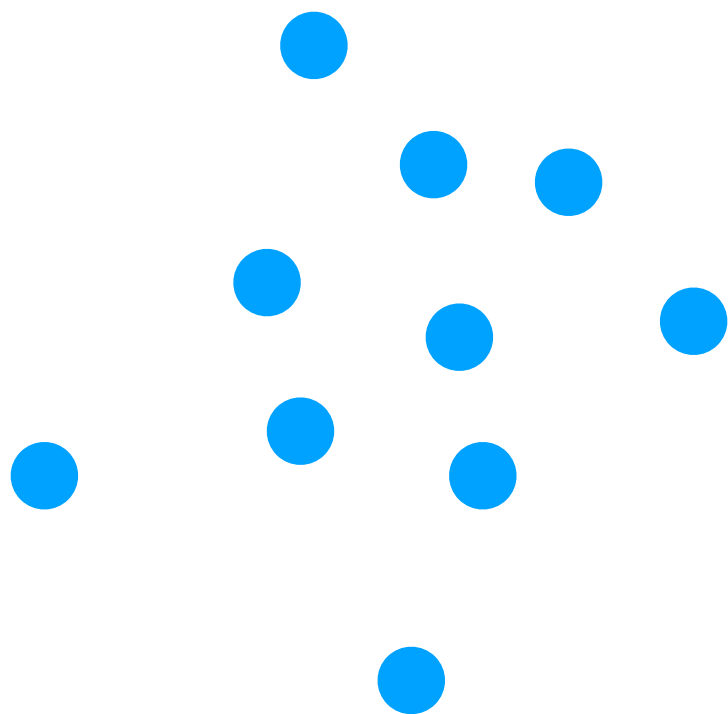
Decision boundary

The points that the margin hits
are called support vectors



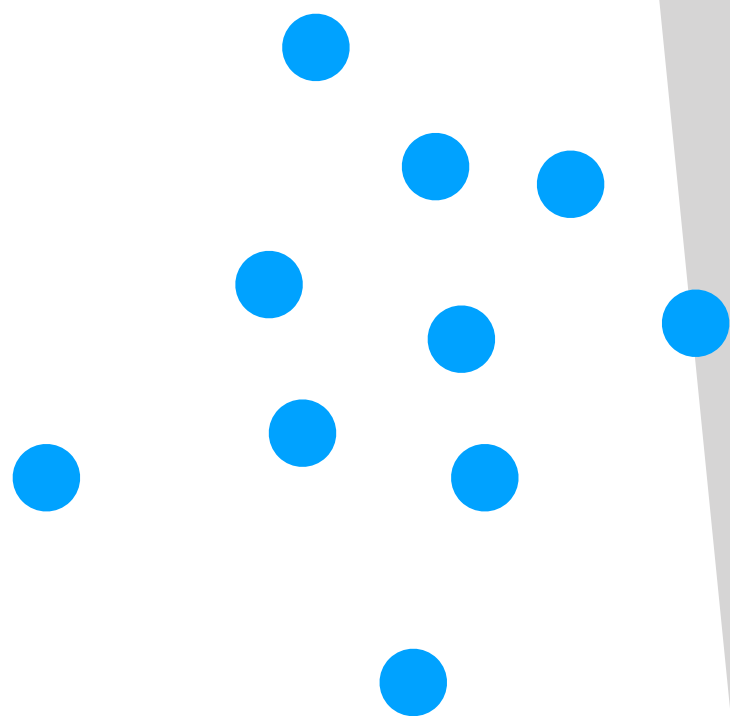
The decision boundary that the
SVM outputs only depends on
the support vectors

What if the points cannot actually be separated by a line?



Hyperparameter C is a penalty for a point being on the wrong side of the decision boundary

What if the points cannot actually be separated by a line?



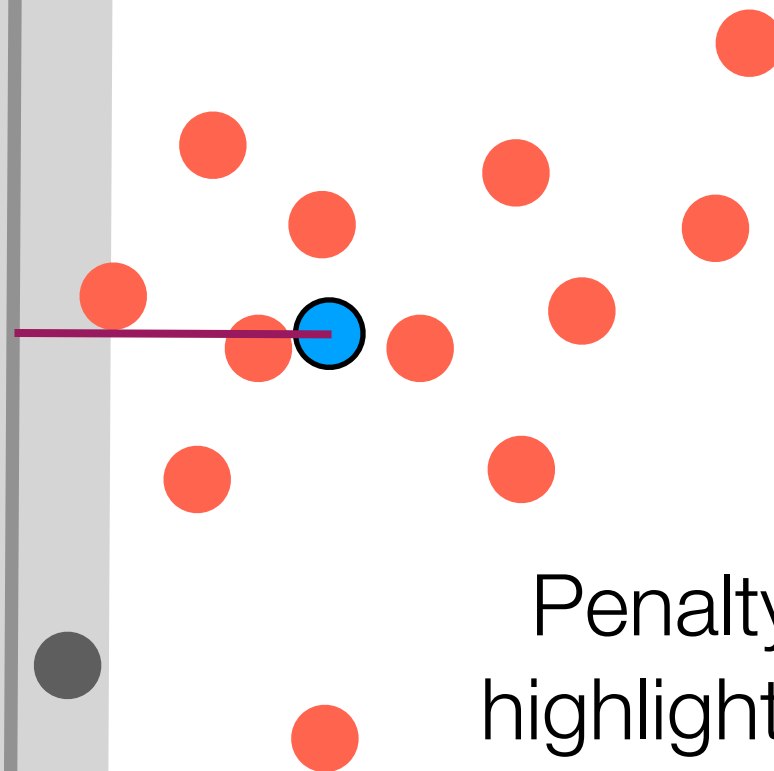
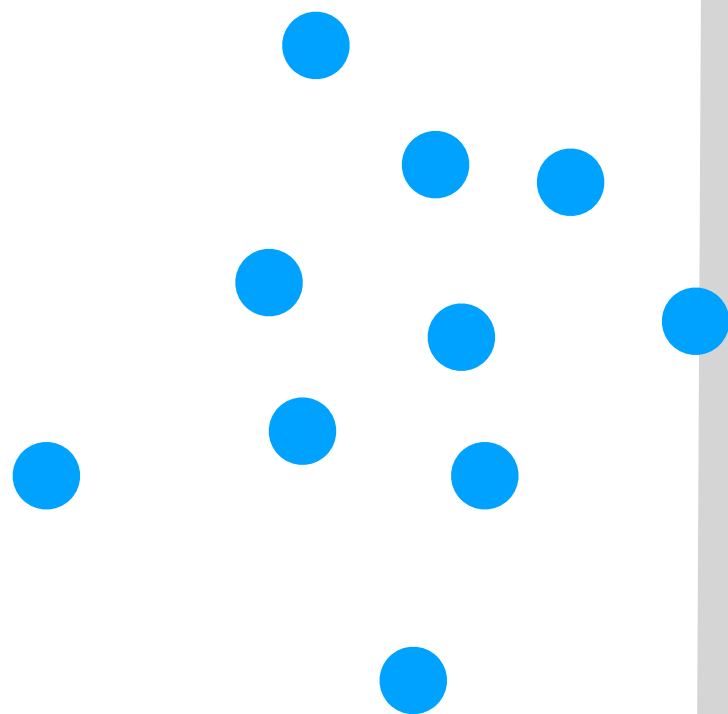
Larger $C \rightarrow$ work harder to fit all points

Penalty incurred for highlighted blue point:
 $C \times$ length of purple line

Hyperparameter C is a penalty for a point being on the wrong side of the decision boundary

C-Support Vector Classification

What if the points cannot actually be separated by a line?



Penalty incurred for highlighted blue point:
 $C \times \text{length of purple line}$

Larger $C \rightarrow$ work harder to fit all points

Hyperparameter C is a penalty for a point being on the wrong side of the decision boundary

C-Support Vector Classification

- Basic version measures distance using Euclidean distance
 - Turns out to correspond to measuring similarity between two points by taking their dot product
 - This is called **linear svm**
- Can instead use a different similarity function (“kernel” function) instead (popular choice: Gaussian kernel, also called “radial basis function” kernel)
 - This is called **kernel svm**
- Also: support vector *regression* (these are all in sklearn)