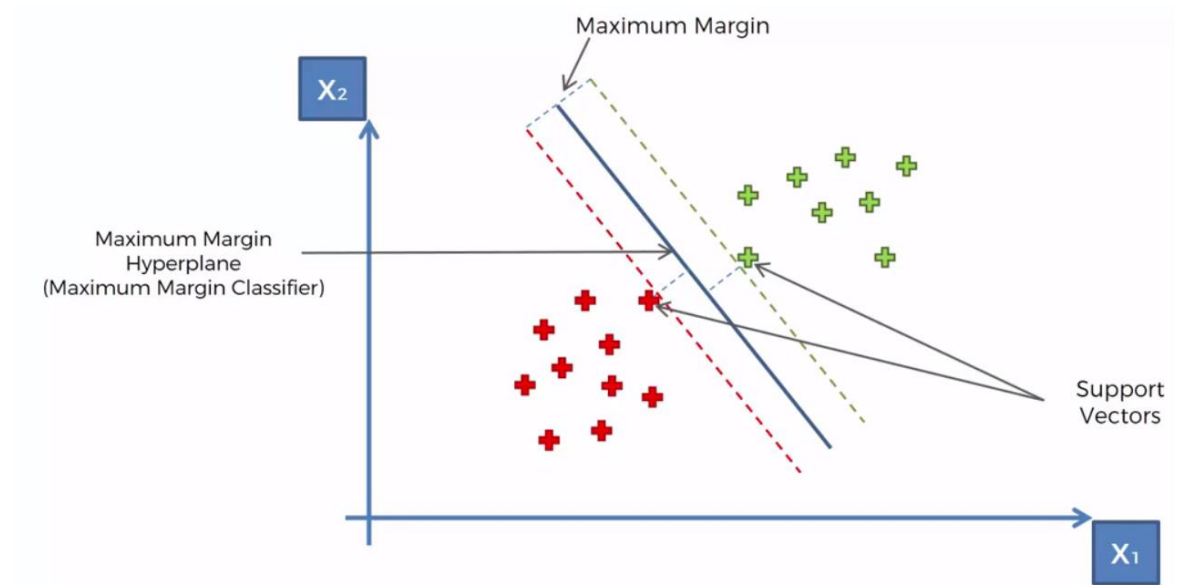


# Basic Machine Learning: Support Vector Machine

Goal

# Goal

Understanding the top five supervised algorithms  
which is Support Vector Machine algorithm.



# Outline

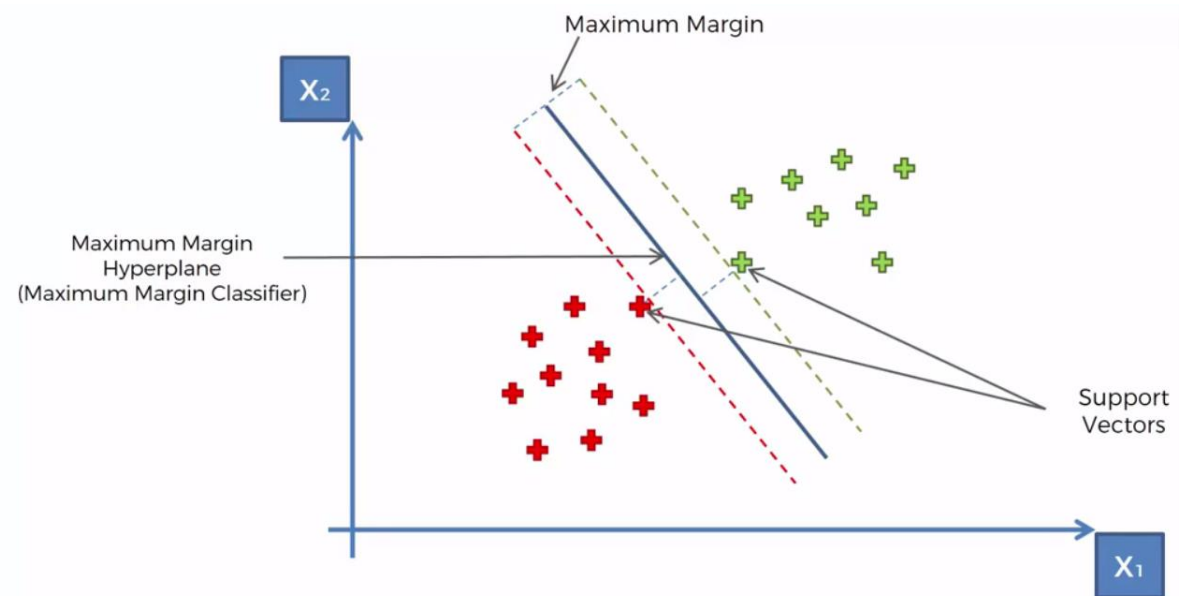
# Outline

- Support Vector Machine Algorithm
  - Concept
  - Application

Content

# Support Vector Machine (Concept)

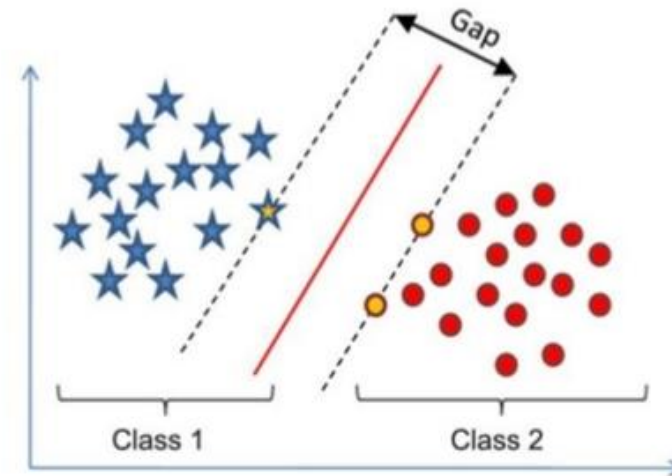
- Top 5 supervised algorithms
- Can be used for Classification & Regression problems
- Can generalize linear & nonlinear model
- Names in scikit-learn:
  - SVC (SVM Classifier)
  - SVR (SVM Regressor)



# Support Vector Machine (Concept)

- Find solution (hyperplane) with fewest errors
- Maximize margin separator to improve generalization

## Basic concept of SVM

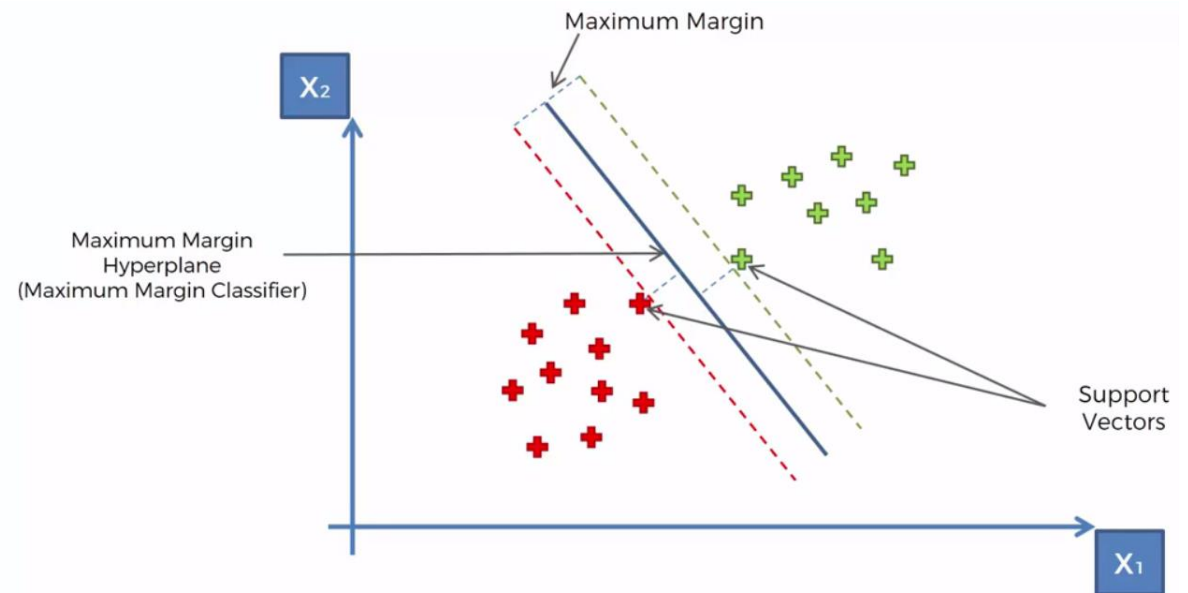


Find a linear decision surface ("hyperplane") that can separate classes and has the largest distance (i.e., largest "gap" or "margin") between border-line patients (i.e., "support vectors")

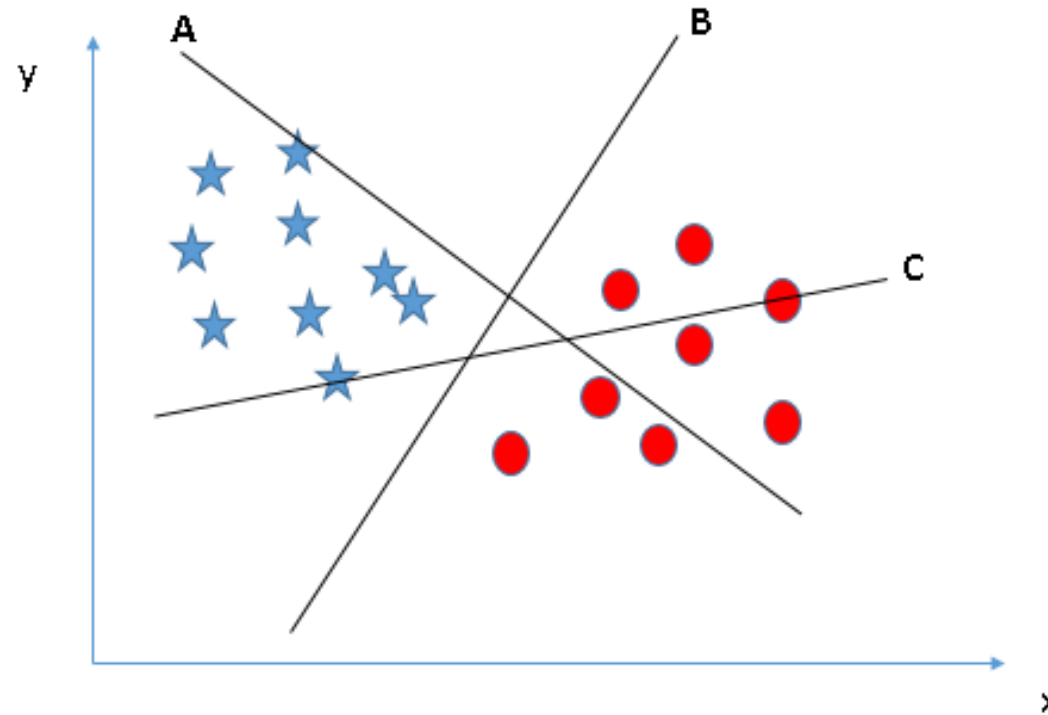


# Support Vector Machine (Concept)

- What is Support Vector?
- The borderline data points that is “supporting” the construction of the hyperplane
- More support vectors doesn't mean better
- What is Margin?
- (Perpendicular) gap between classes
- Higher margin = better separating hyperplane

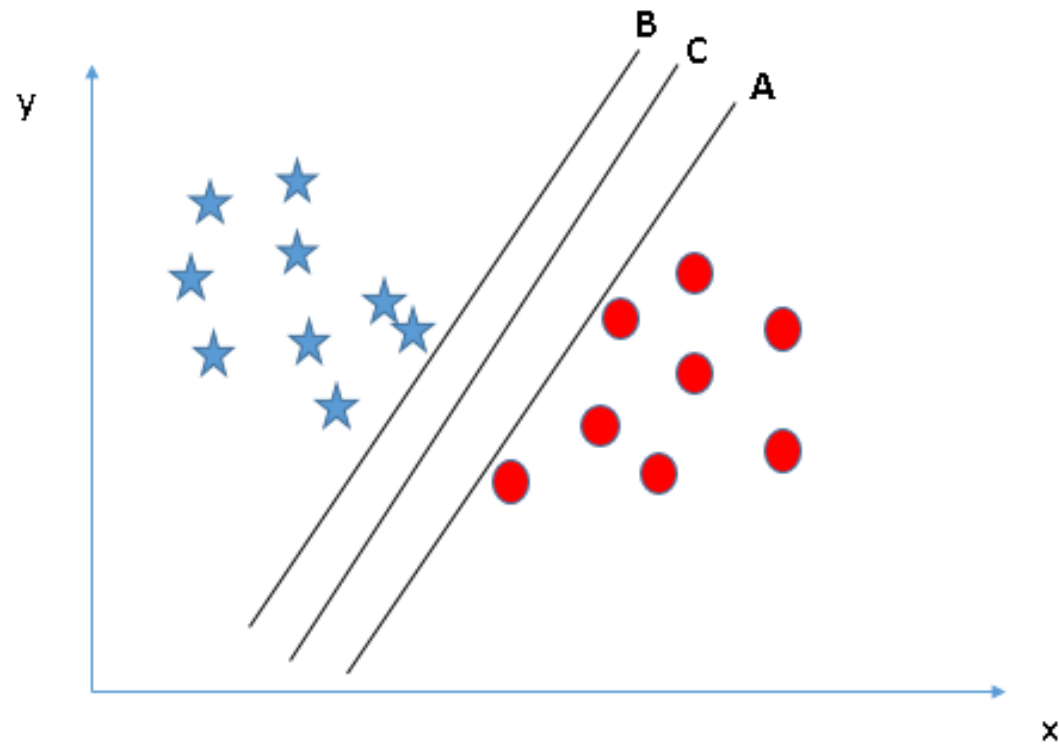


# Support Vector Machine (Concept)



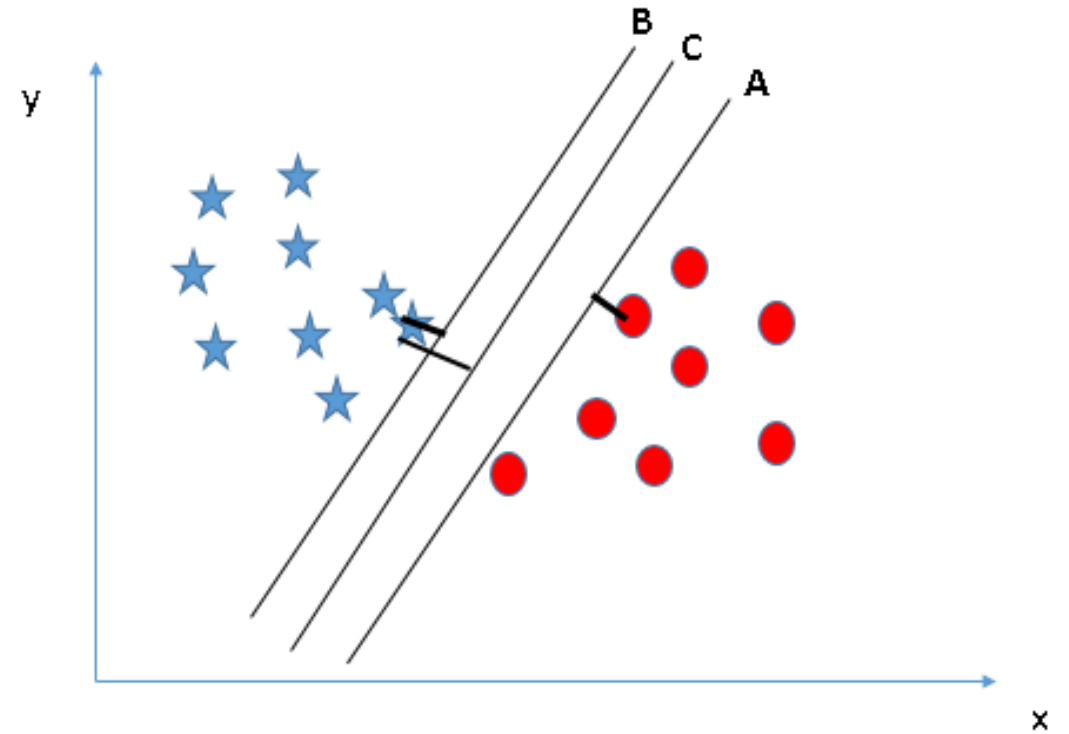
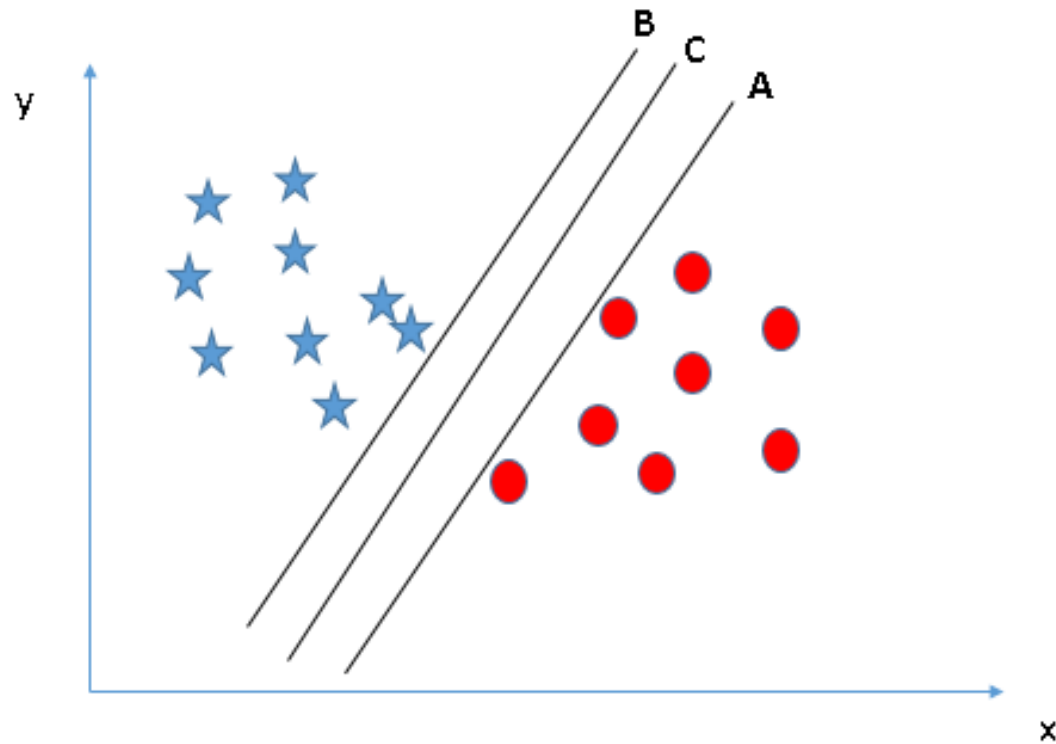
Scenario 1

# Support Vector Machine (Concept)



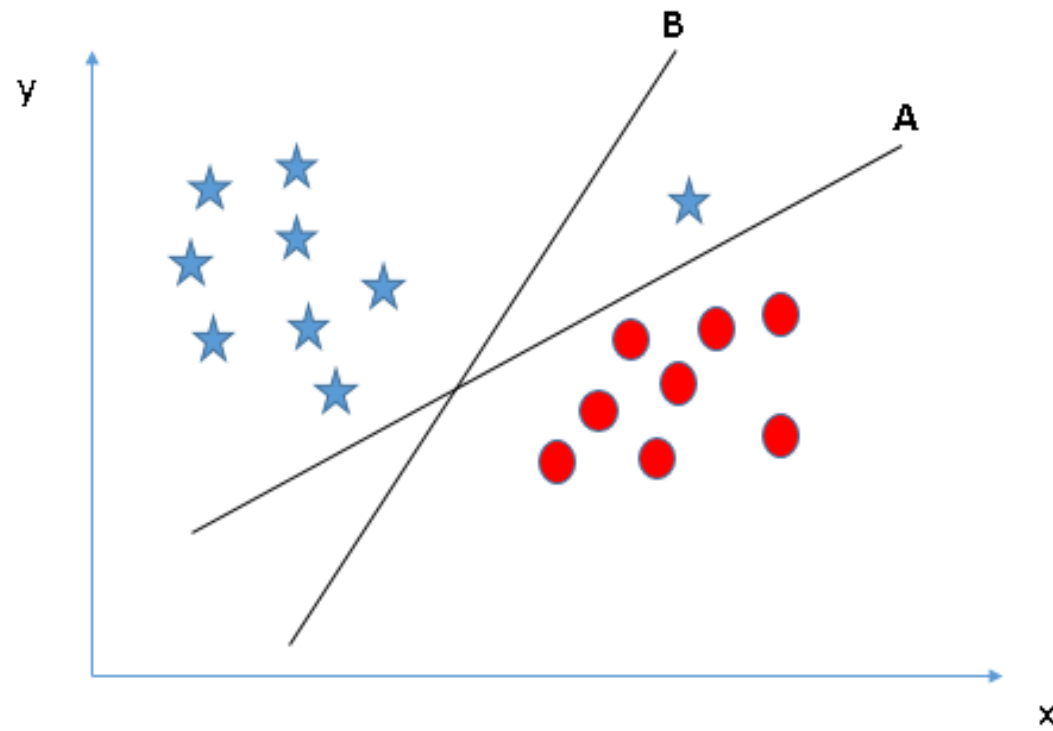
Scenario 2

# Support Vector Machine (Concept)



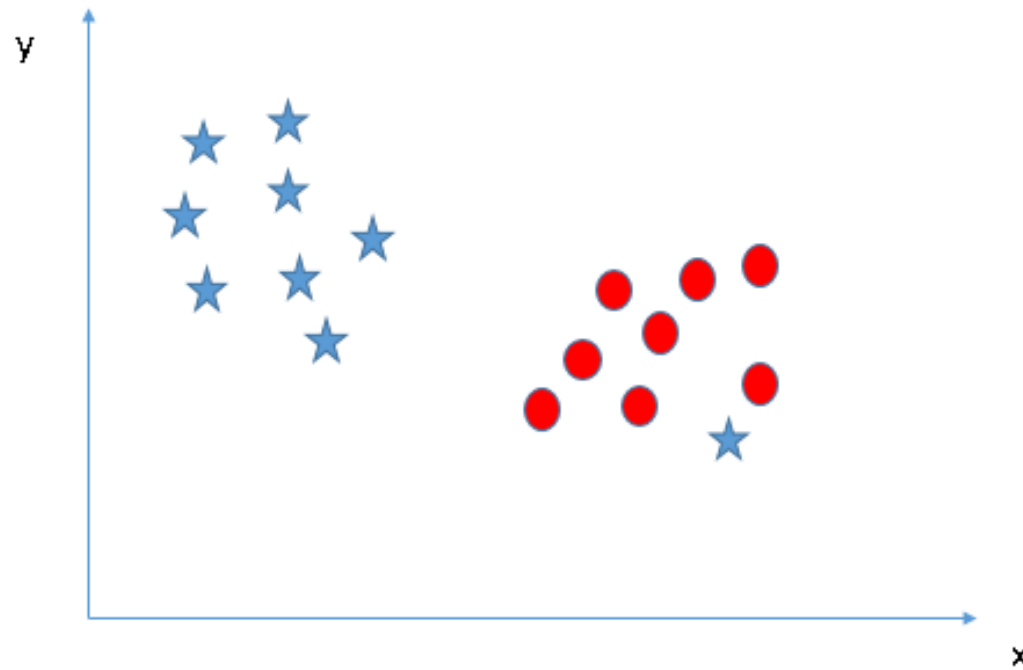
Scenario 2

# Support Vector Machine (Concept)



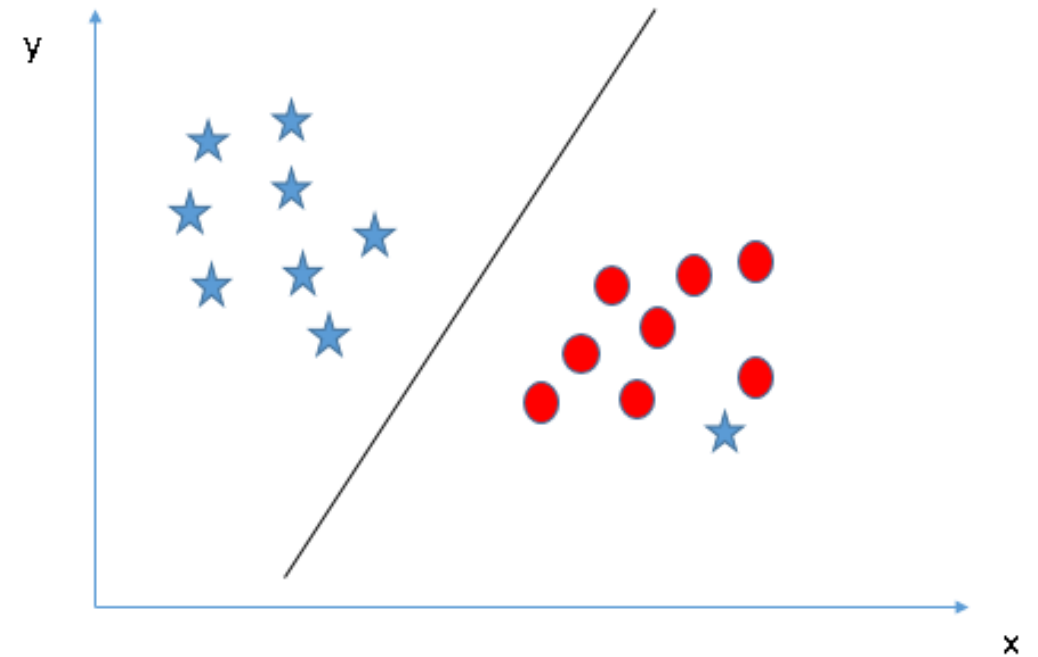
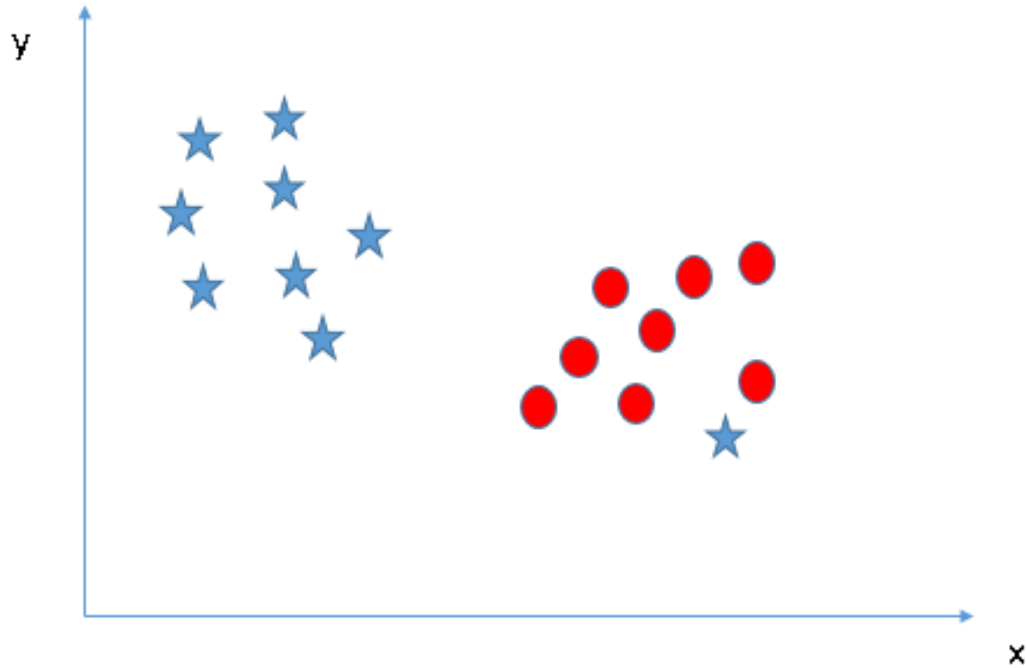
Scenario 3

# Support Vector Machine (Concept)



Scenario 4

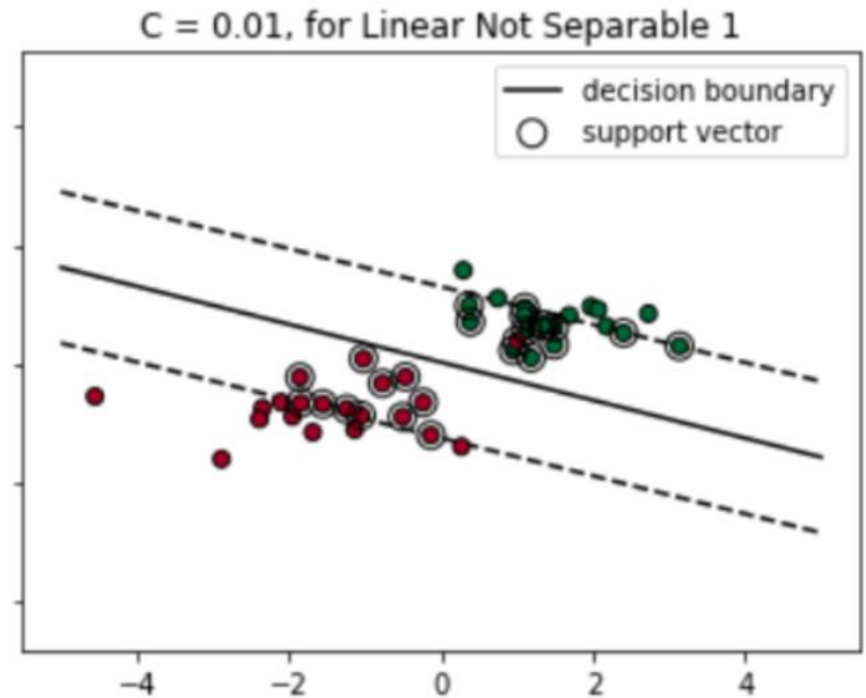
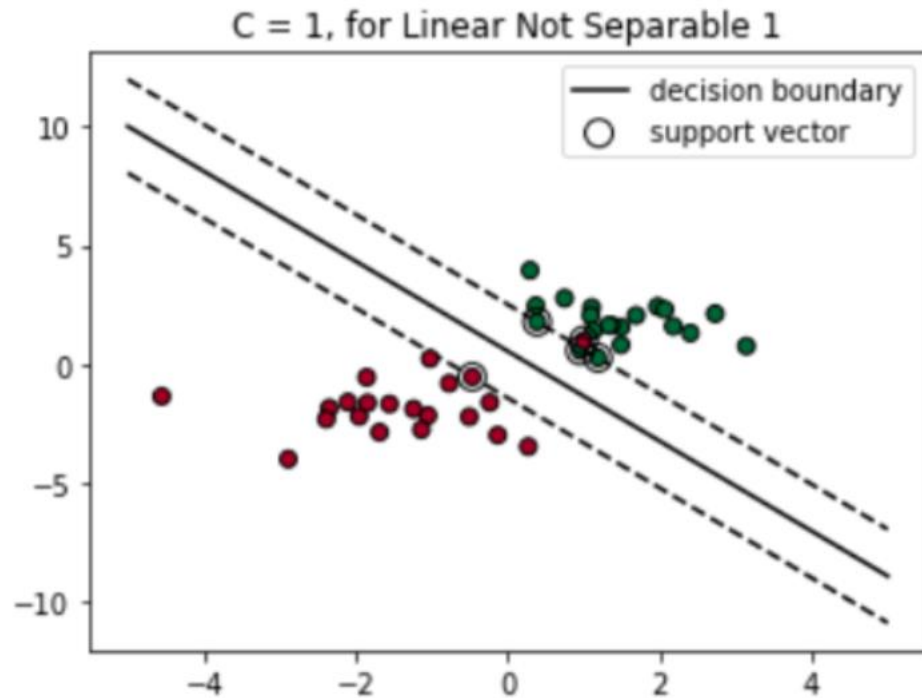
# Support Vector Machine (Concept)



Scenario 4

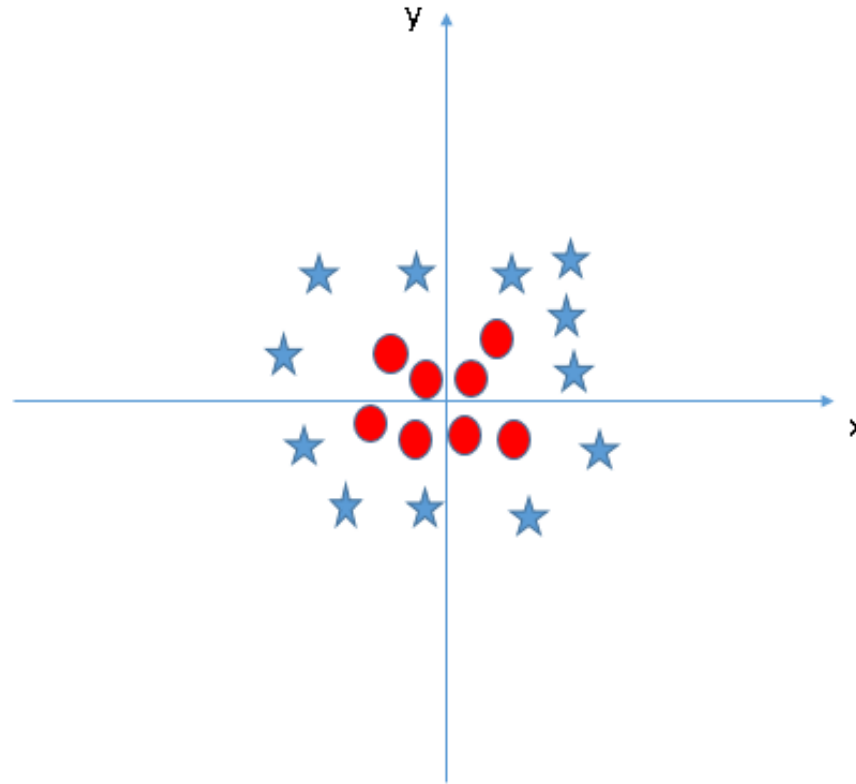
# Support Vector Machine (Concept)

```
from sklearn.svm import SVC, LinearSVC
from sklearn.metrics import confusion_matrix
```



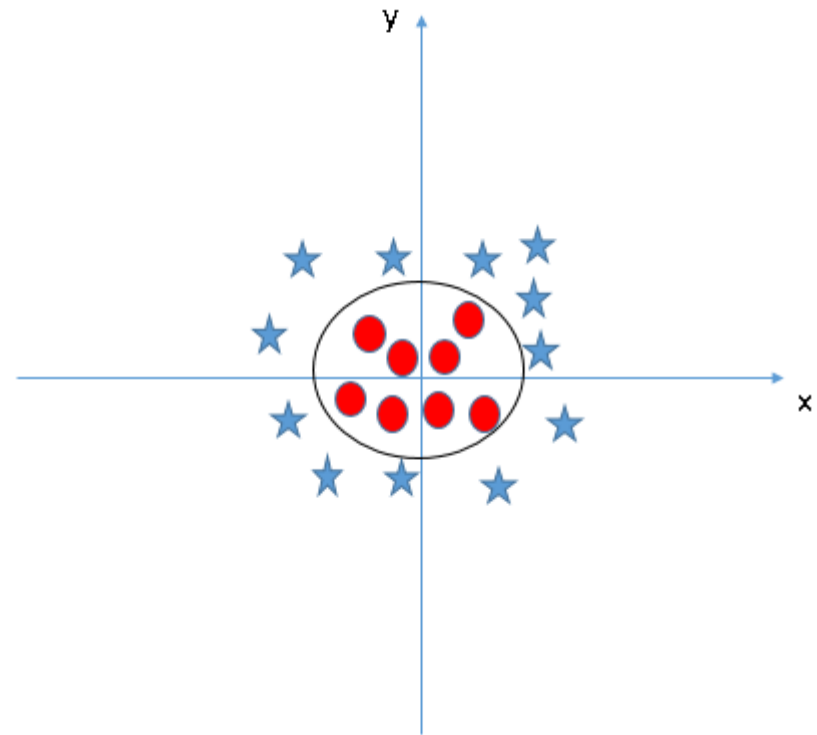
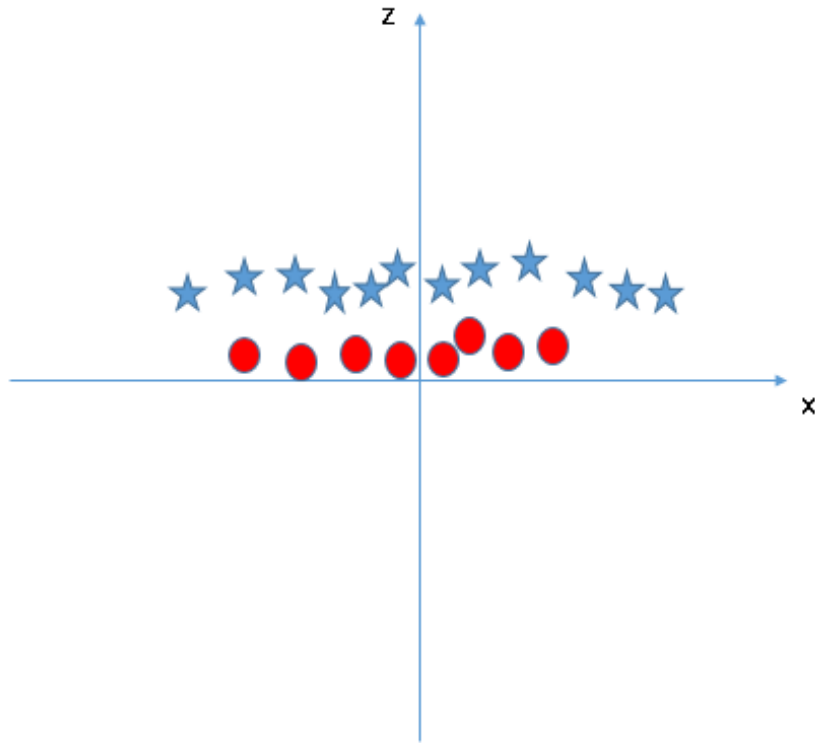


# Support Vector Machine (Concept)



Scenario 5

# Support Vector Machine (Concept)

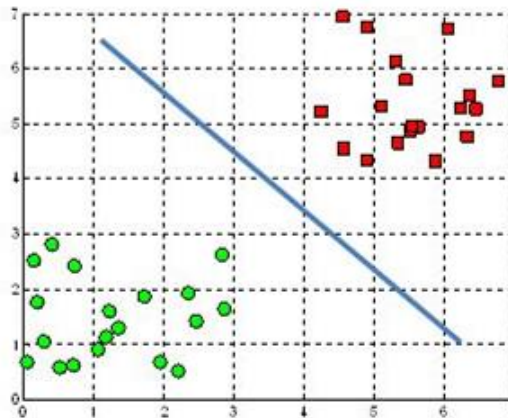


Scenario 6

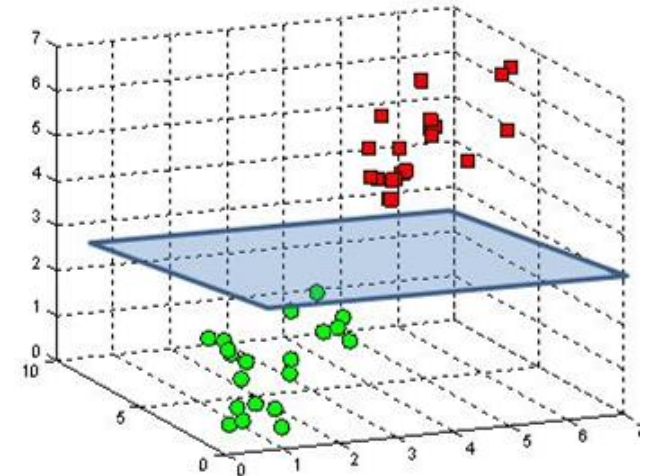
# Support Vector Machine (Concept)

- What is Decision Surface?
- Hyperplane is a linear decision surface that splits the space into two parts
- Hyperplane is a binary classifier

A hyperplane in  $\mathbb{R}^2$  is a line



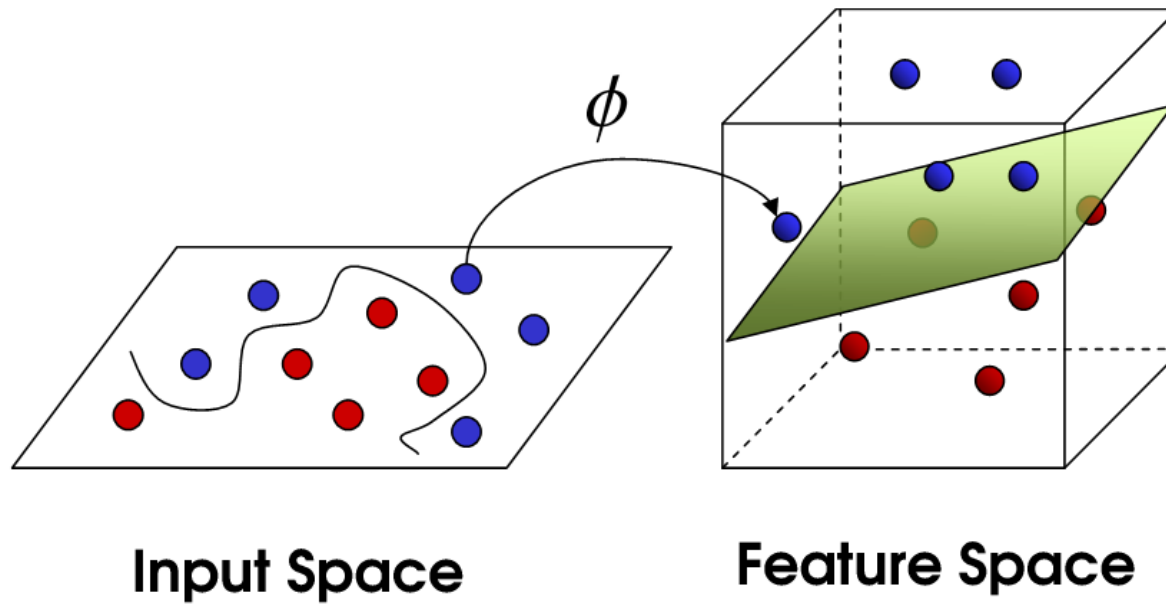
A hyperplane in  $\mathbb{R}^3$  is a plane



A hyperplane in  $\mathbb{R}^n$  is an  $n-1$  dimensional subspace

# Support Vector Machine (Concept)

- Sometimes our data is linearly separable, But sometimes it is not!



# Support Vector Machine (Concept)

- What is SVM Kernel?
- Kernel: Mapping function that transforms a given space into some other (usually very high dimensional space)
- They can provide both linear and nonlinear model

## Linear Kernel

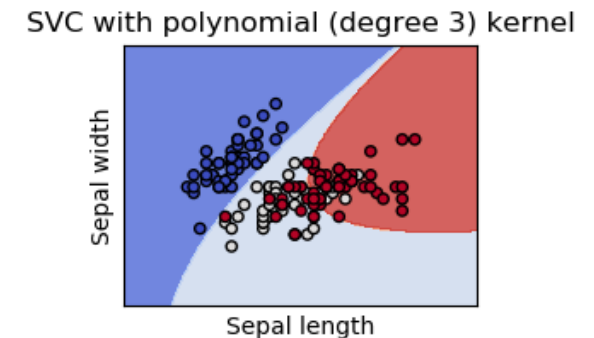
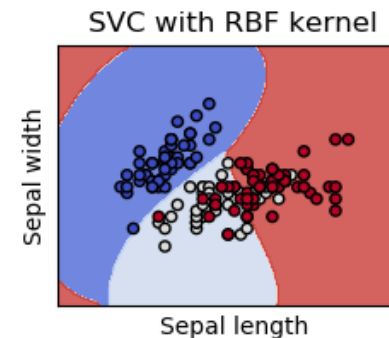
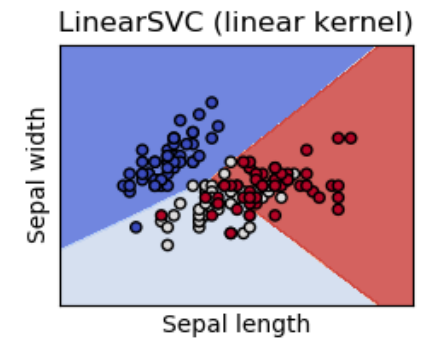
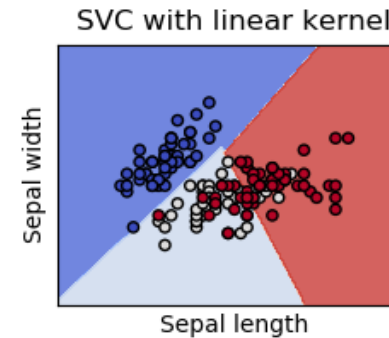
$$K(x_i, x_j) = x_i \cdot x_j$$

## Polynomial Kernel

$$K(x_i, x_j) = (x_i \cdot x_j + c)^d$$

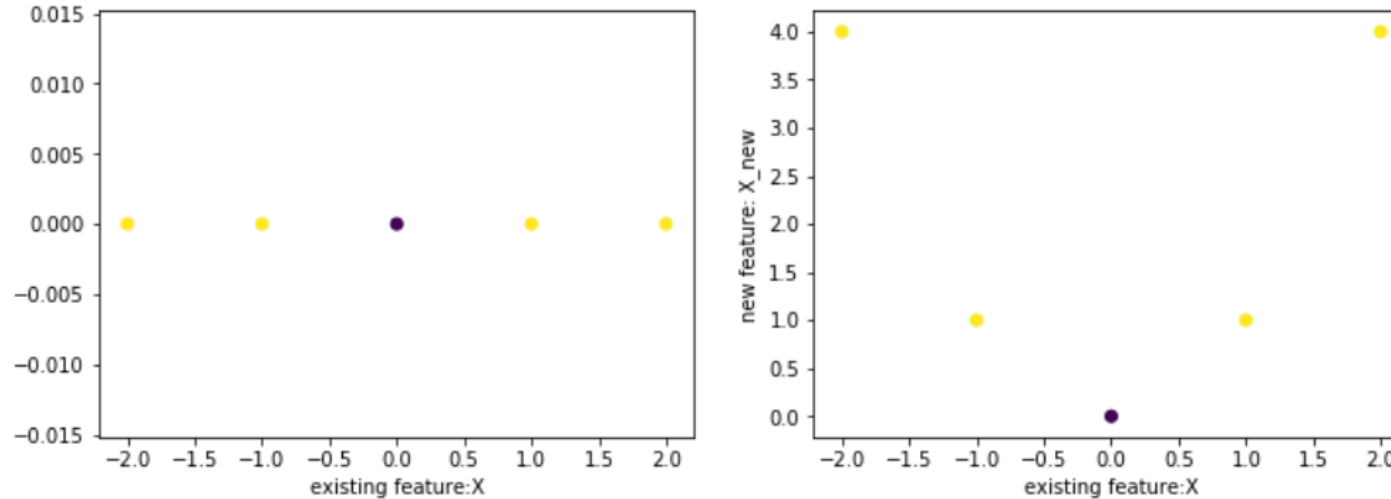
## RBF Kernel

$$K(x_i, x_j) = \exp(-\gamma ||x_i - x_j||^2)$$

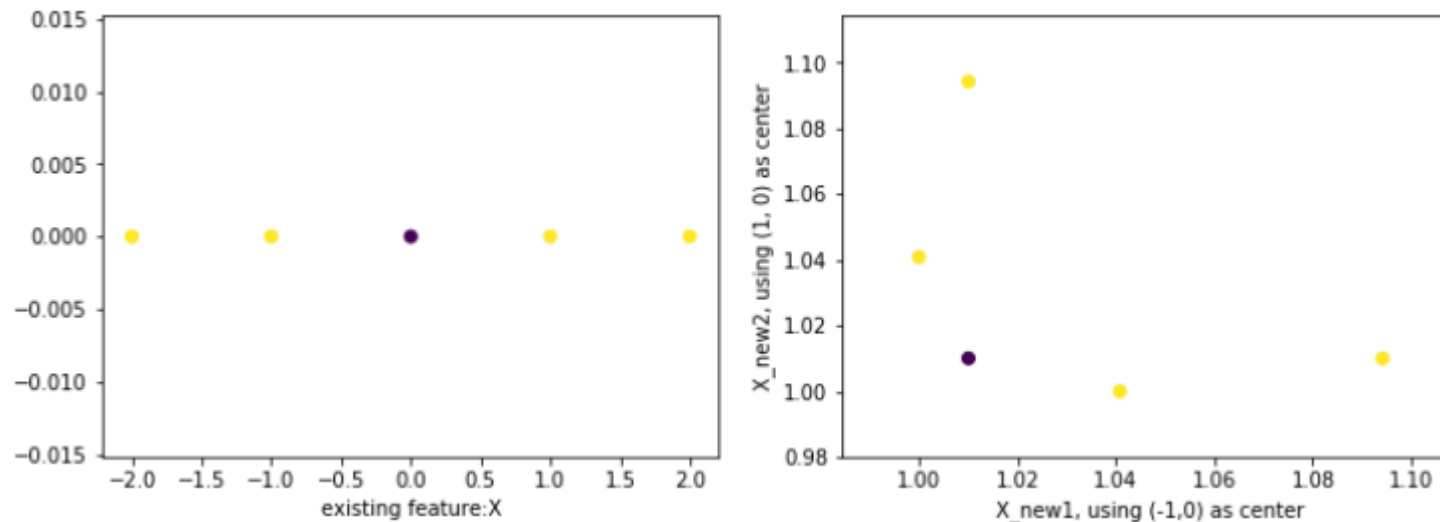


# Support Vector Machine (Concept)

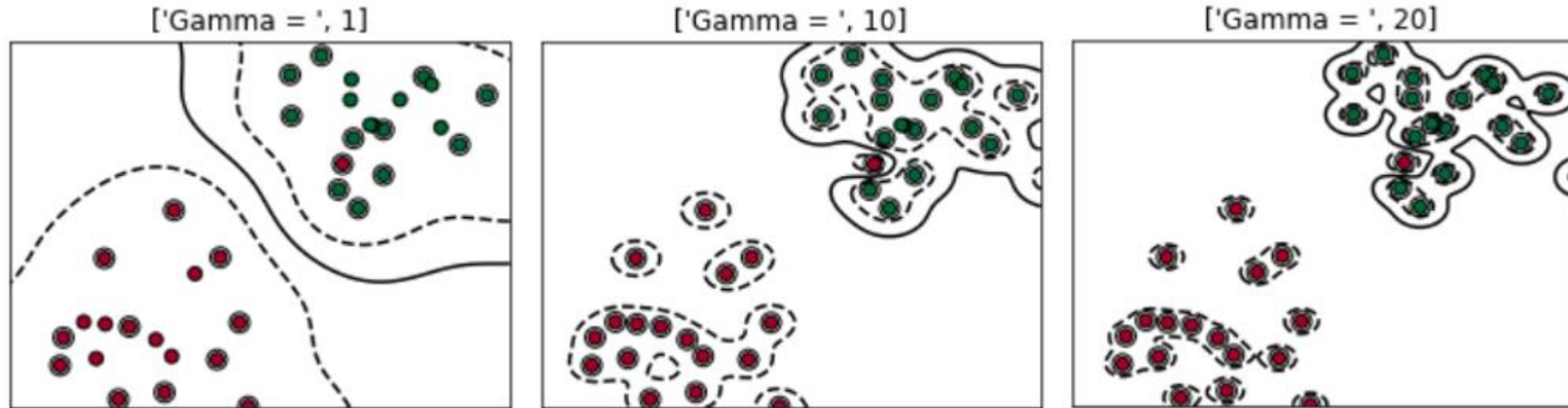
**Polynomial  
Kernel**



**RBF Kernel**

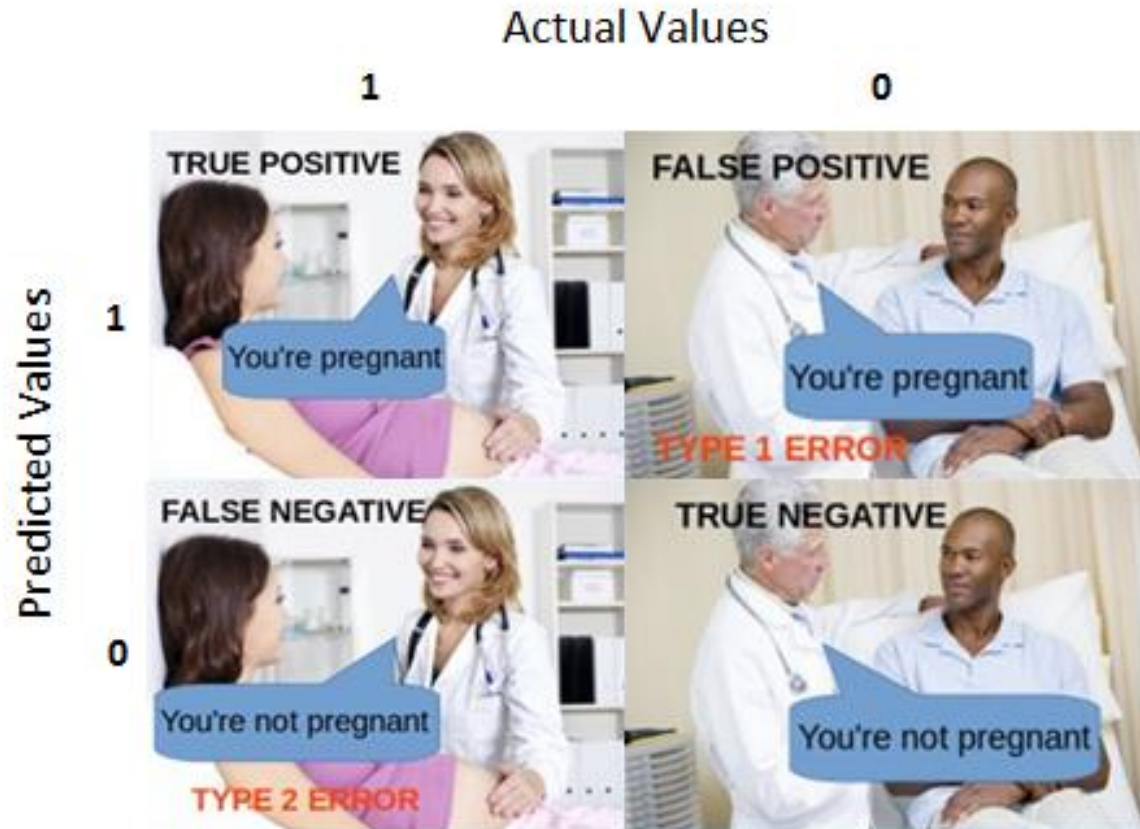


# Support Vector Machine (Concept)

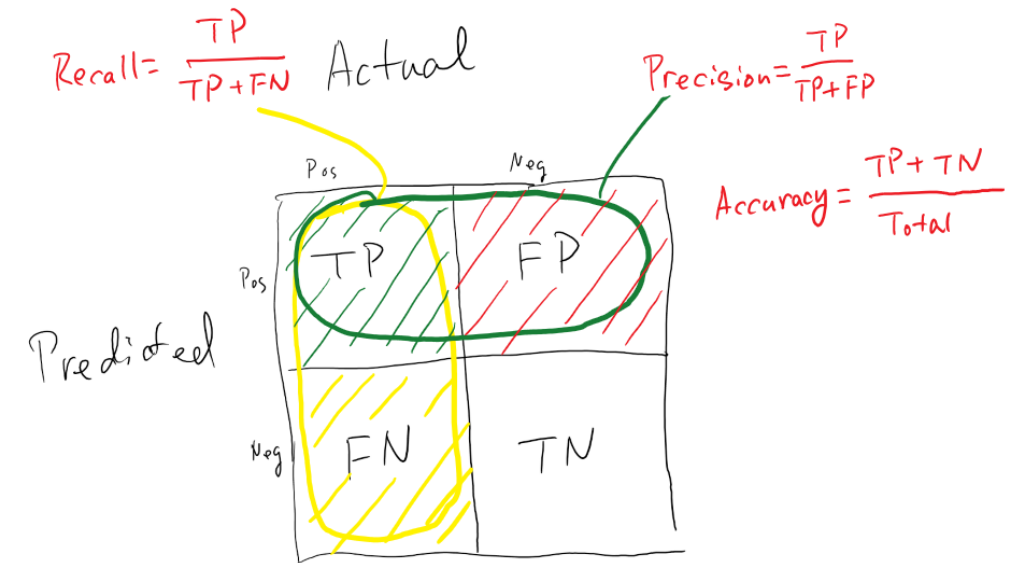


RBF Kernel

# Confusion Matrix



Confusion Matrix		Target			
		Positive	Negative		
Model	Positive	a	b	Positive Predictive Value	$a/(a+b)$
	Negative	c	d	Negative Predictive Value	$d/(c+d)$
		Sensitivity	Specificity	Accuracy = $(a+d)/(a+b+c+d)$	
		$a/(a+c)$	$d/(b+d)$		





Thanks!