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2. Review and the Lambda parameter


Introduction and Review

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Outline

- Understanding optimization view of learning
 - large margin linear classification
 - regularization, generalization
- Optimization algorithms
 - preface: gradient descent optimization
 - stochastic gradient descent
 - quadratic program



 0:00 / 0:00

 Speed 1.50x









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Welcome back.

This is machine learning lecture number four.

Last time, we talked about how to formulate maximum margin linear classification as an optimization problem.

Today, we're going to try to understand the solutions to that optimization problem and how to find those solutions.

If you recall, our objective function for a learning problem, the objective function,

Distance from a line to a point in terms of components

1.0/1 point (graded)

In a 2 dimensional space, a line L is given by $L : ax + by + c = 0$, and a point P is given by $P = (x_0, y_0)$. What is d , the shortest distance between L and P ? Express d in terms of a, b, c, x_0, y_0 .

$(a*x_0+b*y_0+c)/\sqrt{a^2+b^2}$



STANDARD NOTATION

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You have used 1 of 3 attempts

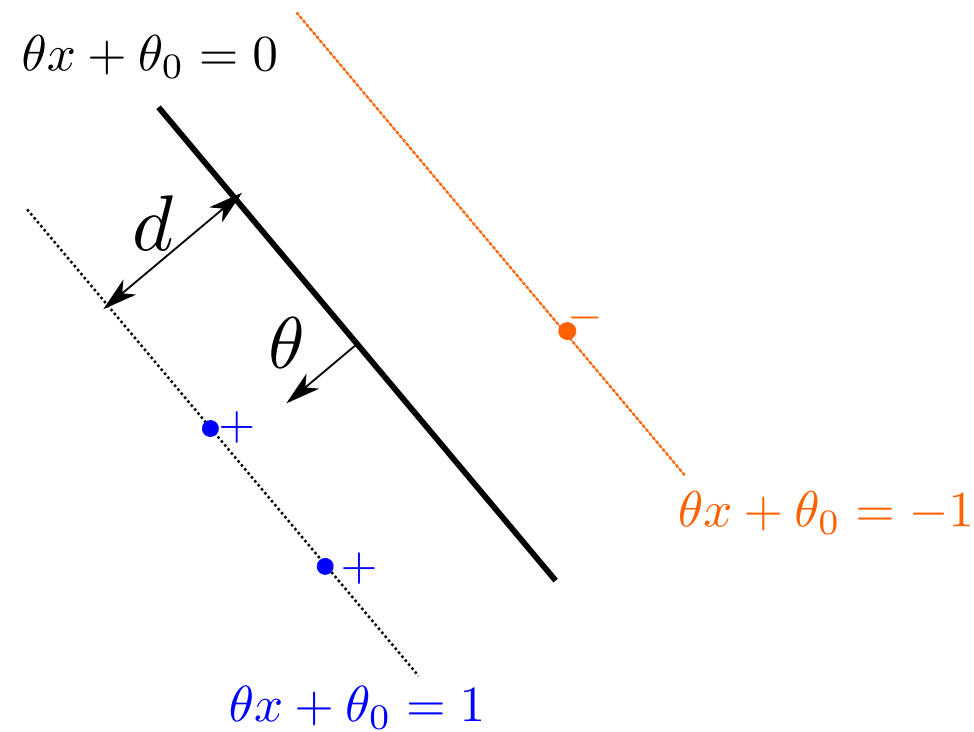
Varying Lambda in the Geometric Sense

1/1 point (graded)

Remember that the objective

$$J(\theta, \theta_0) = \frac{1}{n} \sum_{i=1}^n \text{Loss}_h(y^{(i)}(\theta \cdot x^{(i)} + \theta_0)) + \frac{\lambda}{2} \|\theta\|^2.$$

In the picture below, what happens to d , the distance between the decision boundary and the margin boundary, as we increase λ ?



☐ d decreases

☒ d increases ✓

☐ d converges to λ

Hint: You can answer with your intuition in this question. To see whether d converges to λ , think of a simple setting where we are working in 1 dimension with just two points with labels $x_1 = -1, x_2 = 2, y_1 = -1, y_2 = 1$ and assume that λ is large enough where it dominates the loss function and pushes θ close enough to 0 where all points are margin violators.

Solution:

Increasing λ means we put more weight on maximizing the margin. Thus d increases.

It is not true that d always converges to λ as λ increases. Here is a counter example:

Consider a simple setting where we are working in 1 dimension with just two points with labels $x_1 = -1, x_2 = 2, y_1 = -1, y_2 = 1$ and assume that λ is large enough where it dominates the loss function and pushes θ close enough to 0 where all points are margin violators.

$$J = \frac{1}{2}[(1 - \theta + \theta_0) + (1 - 2\theta - \theta_0)] + \frac{\lambda}{2}\theta^2$$

Solve this explicitly by taking $\frac{\partial J}{\partial \theta} = 0$:

$$\begin{aligned}\frac{-3}{2} + \lambda\theta &= 0 \\ \theta &= \frac{3}{2\lambda} \\ d &= \frac{1}{\theta} = \frac{2}{3}\lambda.\end{aligned}$$

You have used 2 of 2 attempts

i Answers are displayed within the problem

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5

1

17

6

2

2

<p>? <u>Margin violators.</u></p> <p><u>Hi. Am I right that margin violators is points between dec. boundary and marginal boundary? (Even if not, I will call points between dec bou. and mar. bou as margin violat...</u></p>	7
<p>💬 <u>Why would we want to push the margin boundaries out?</u></p> <p><u>Is this a means of adjusting the sensitivity of the classifier, sacrificing certain events within the margin for the sake of increasing the MB?</u></p>	2
<p>💬 <u>How is question 1 related to this particular lecture segment?</u></p> <p><u>Just curious, why this question was put here.</u></p>	1
<p>💬 <u>[Staff] - parsing error</u></p> <p><u>Hi Staff, I think I have given the correct formula for distance.. But it gave a an error like this.. **Could not parse '\' / sqrt(.....) \' as a formula.** Is it because of the **...</u></p>	3
<p>? <u>Varying Lambda in the Geometric Sense: x missing superscript</u></p>	2
<p>💬 <u>[staff] Typos in solution for "Varying Lambda in the Geometric Sense"</u></p> <p>👤 <u>Community TA</u></p>	2
<p>? <u>Distance from a point to line</u></p> <p><u>Is this distance the signed distance or unsigned distance? My answer with the unsigned distance was marked wrong and I do not know why,</u></p>	5

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