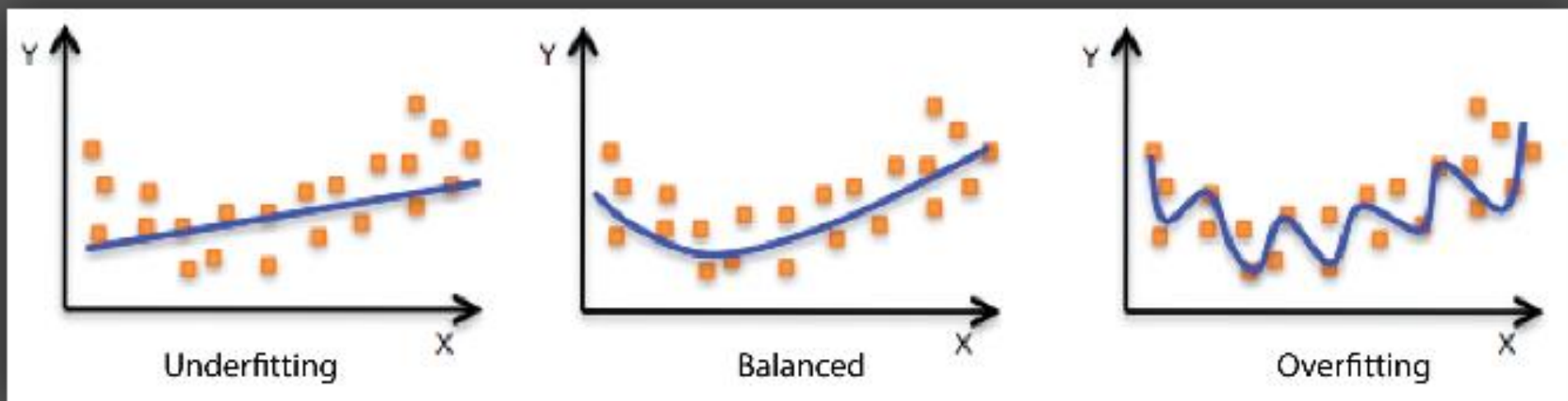




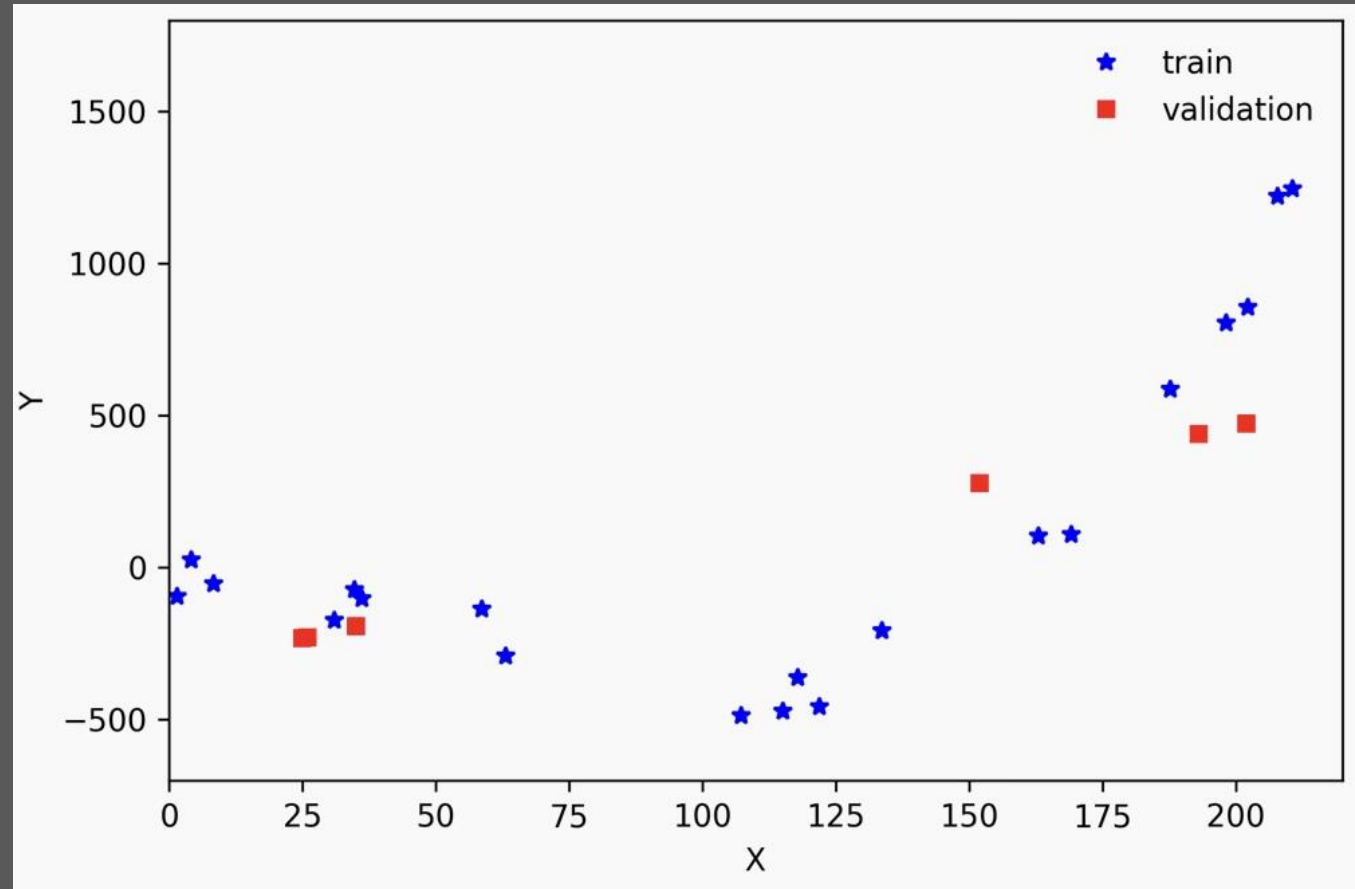
Discussion CAEsaaaaaar



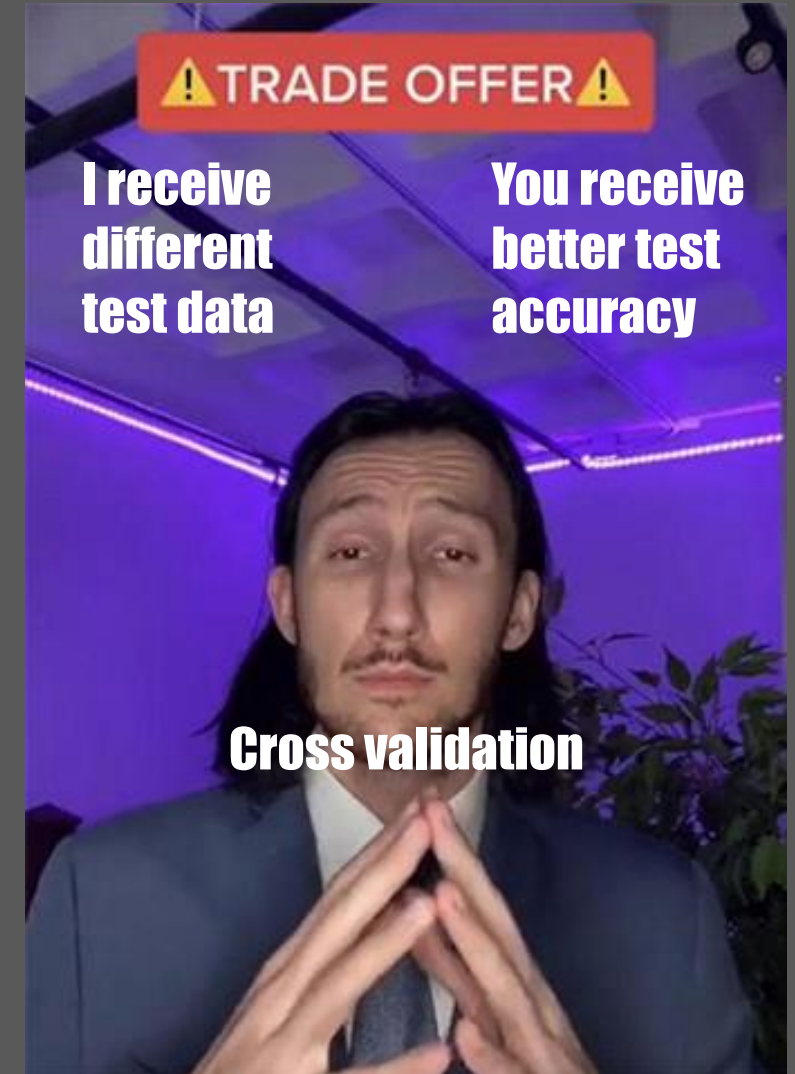
Recap



Motivation: we have validation dataset to measure how well the model is. But what if the validation dataset is poorly-chosen?

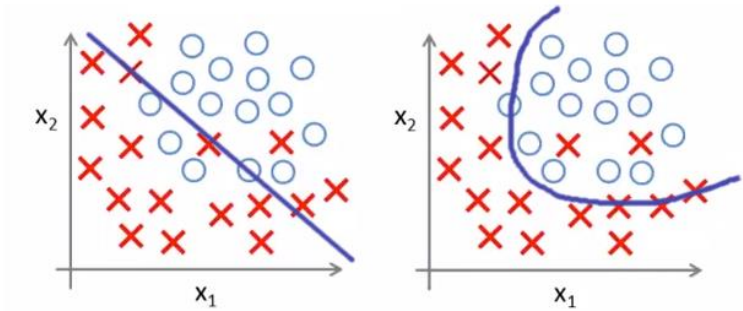


Solution: repeat the trials,
change validation dataset,
average accuracy across all
trials

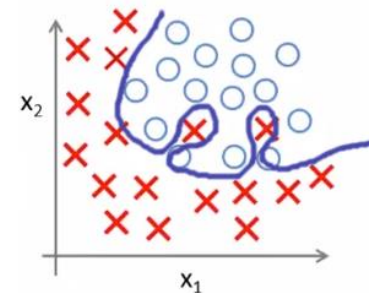


Recap: We can make the model more complex to capture non-linear data

Problem: What is the right degree of complexity?



$$h_{\theta}(x) = g(\theta_0 + \theta_1 x_1 + \theta_2 x_2) \quad g(\theta_0 + \theta_1 x_1 + \theta_2 x_2 + \theta_3 x_1^2 + \theta_4 x_2^2 + \theta_5 x_1 x_2)$$



$$g(\theta_0 + \theta_1 x_1 + \theta_2 x_1^2 + \theta_3 x_1^2 x_2 + \theta_4 x_1^2 x_2^2 + \theta_5 x_1^2 x_2^3 + \theta_6 x_1^3 x_2 + \dots)$$

Solution:

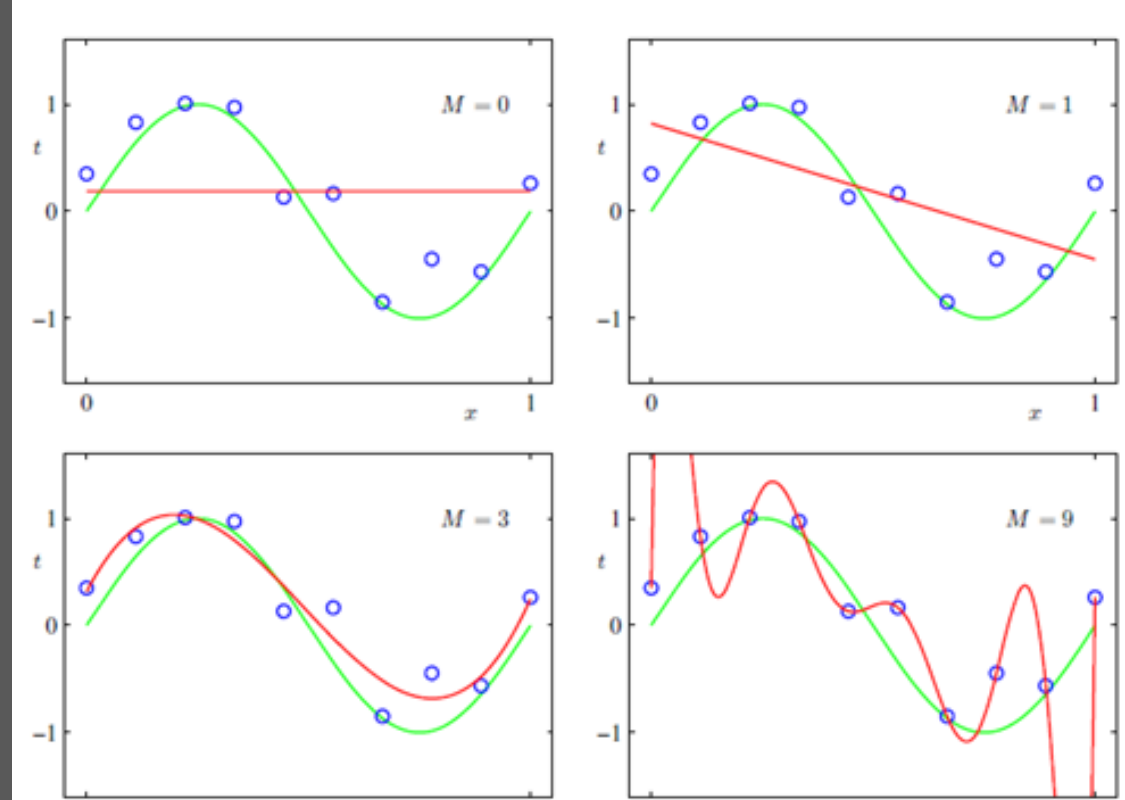
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Regularization

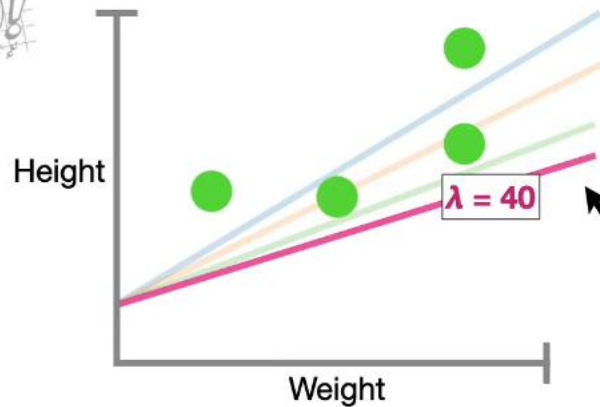


Key takeaway: We find a way to make the model underfits, so we can get higher testing accuracy even if training accuracy is low

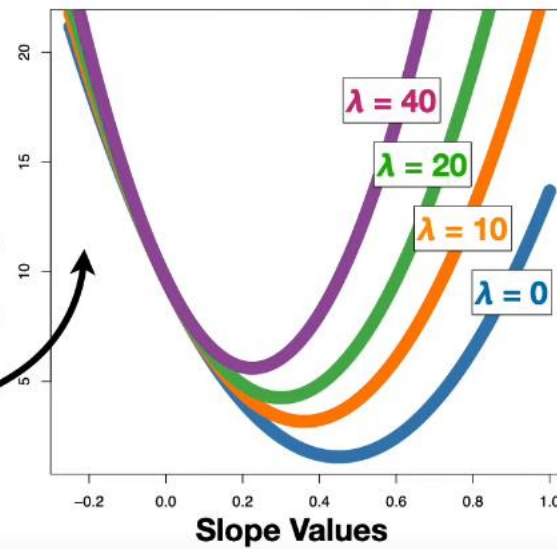
Note: there is another type of regularization, which is called **Lasso**

The difference is that the penalty term, we use **absolute** instead of squaring the parameters

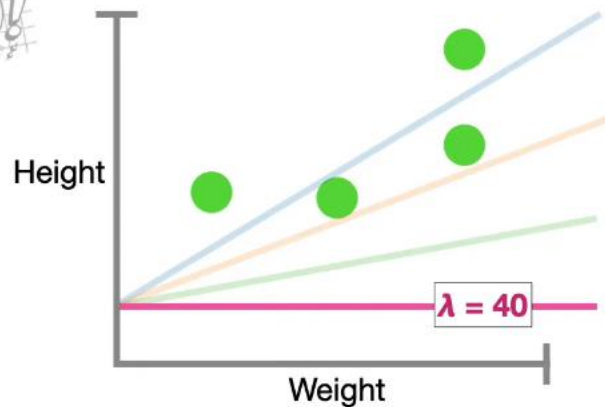
Ridge	Lasso
Squared the parameters	Take absolute of the parameters
Parameters get close to zero	Parameters can reach zero
Better when we believe every parameters are useful	Can exclude useless parameters



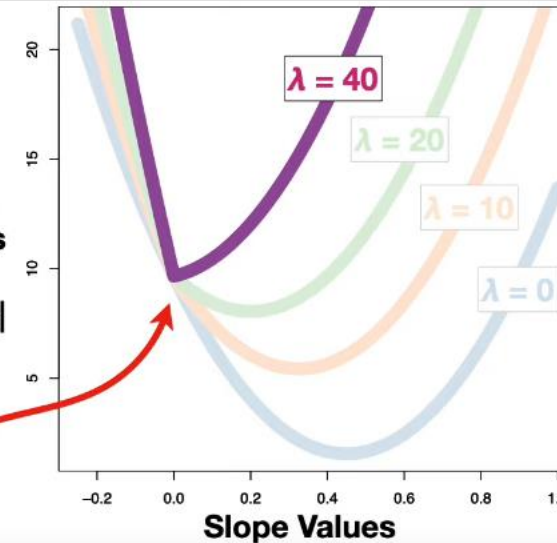
Sum of
Squared
Residuals
+
 $\lambda \times \text{Slope}^2$



...the optimal slope gets closer and closer to 0, but it doesn't equal 0.



Sum of
Squared
Residuals
+
 $\lambda \times |\text{Slope}|$



Now the lowest point in the **purple curve**, aka, the optimal slope given the **Absolute Value Penalty** when $\lambda = 40$, is 0.

Statquest Youtube video:
Ridge vs Lasso Regression,
Visualized!!!

https://www.youtube.com/watch?v=Xm2C_gTAI8c

But you know, I learned something today



- We use cross validation to average models across all trials, instead of accidentally pick the invalid test data
- We use ridge/lasso regression to lower training accuracy, but get higher test accuracy