## **Normal Equation Noninvertibility**

$$\theta = (X^T X)^{-1} X^T y$$

What if  $X^TX$  is non-invertible?

Some matrices do not have an inverse we call those non-invertible matrices. Singular or degenerate matrices (The issue or the problem of  $X^TX$  being non invertible should happen pretty rarely).

## Normal equation

$$\theta = (X^T X)^{-1} X^T y$$

- What if  $X^TX$  is non-invertible? (singular/degenerate)
- Octave: pinv (X'\*X) \*X'\*y

What if  $X^TX$  is non-invertible?

• Redundant features (linearly dependent).

E.g.  $x_1 = \text{size in } feet^2$ 

$$x_2 = \text{size in } m^2$$

 $x_1 = (3.28)^2 x_2$  (variables related).

The second thing that can cause  $X^TX$  to be non-invertible is if we are trying to run the learning algorithm with a lot of features.

• Too many features (e.g.  $m \le n$ ).

Solution: Delete some features, or use regularization.

a parameter vector theta which is,  $\theta \in \mathbb{R}^{101}$ 

## **Summary**

When implementing the normal equation in octave we want to use the 'pinv' function rather than 'inv.' The 'pinv' function will give us a value of  $\theta$  even if  $X^TX$  is not invertible.

If  $X^TX$  is noninvertible, the common causes might be having :

- Redundant features, where two features are very closely related (i.e. they are linearly dependent)
- Too many features (e.g.  $m \le n$ ). In this case, delete some features or use "regularization".

Solutions to the above problems include deleting a feature that is linearly dependent with another or deleting one or more features when there are too many features.