

Online Learning

Ex. Shipping service website

chosen $y=1$

not $y=0$

$p(y=1|x;\theta)$ price logistic regression

Repeat forever {

Get (x,y) corresponding to user.

Update θ using (x,y) :

$$\theta_j := \theta_j - \alpha (h_\theta(x) - y) x_j \quad j = (0, \dots, n)$$

}

- It can adapt to changing user tastes changes over time

- It allows us to learn from a continuous stream of data,

Since we use each example once then no longer need to process it again

Map-reduce and Data parallelism

$$m=400, \text{ Batch gradient descent: } \theta_j := \theta_j - \alpha \frac{1}{400} \sum_{i=1}^{400} (h_\theta(x^{(i)}) - y^{(i)}) x_j^{(i)}$$

Machine 1 : Use $(x^{(1)}, y^{(1)}), \dots, (x^{(100)}, y^{(100)})$ $temp_j^{(1)}$
Machine : Use $(x^{(101)}, y^{(101)}), \dots, (x^{(200)}, y^{(200)})$ $temp_j^{(2)}$
Machine : Use $(x^{(201)}, y^{(201)}), \dots, (x^{(300)}, y^{(300)})$ $temp_j^{(3)}$
Machine : Use $(x^{(301)}, y^{(301)}), \dots, (x^{(400)}, y^{(400)})$ $temp_j^{(4)}$

} Combine

Many learning algorithms can be expressed as computing
sums of functions over the training set