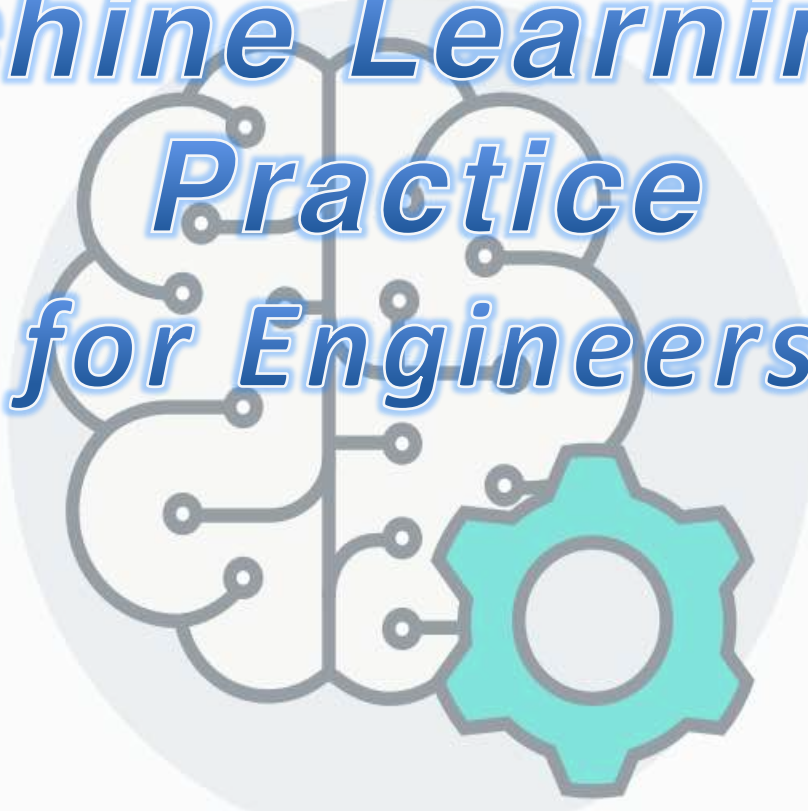


# *Machine Learning in Practice for Engineers*

A stylized graphic of a brain with circuit lines and a teal gear, symbolizing machine learning and engineering. The brain is composed of black outlines with small circles at the nodes, and a large teal gear is attached to the right side. The entire graphic is set against a light gray circular background.

**Chao Cai  
@AICon  
2018.1**



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王天一  
博士 副教授



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Etsy 数据科学主管



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# QCon

## 全球软件开发大会

# 成为软件技术专家 的必经之路

### [北京站] 2018

会议：2018年4月20-22日 / 培训：2018年4月18-19日

北京·国际会议中心

# 8折

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# ArchSummit

## 全球架构师峰会

2018 · 深圳站

从2012年开始算起，InfoQ已经举办了9场ArchSummit全球架构师峰会，有来自Microsoft、Google、Facebook、Twitter、LinkedIn、阿里巴巴、腾讯、百度等技术专家分享过他们的实践经验，至今累计已经为中国技术人奉上了近千场精彩演讲。

限时**7折**报名中，名额有限，速速报名吧！

● 2012.08.10-12 深圳站



● 2018.07.06-09 深圳站

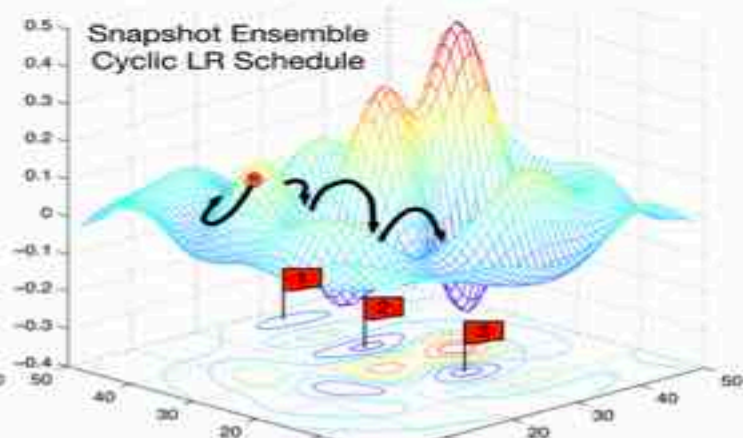
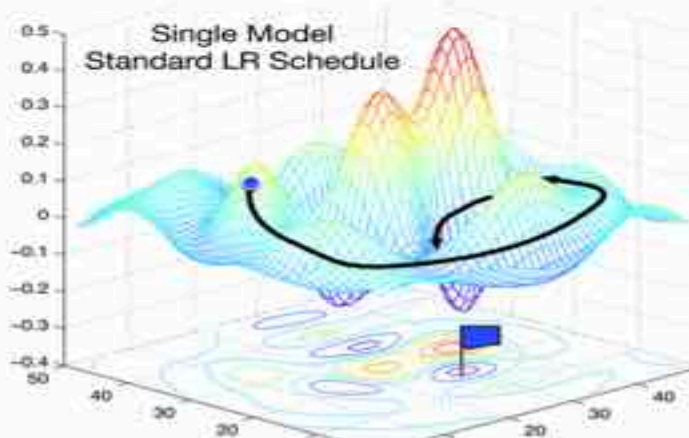
会议：07.06-07.07

培训：07.08-07.09



$$\begin{aligned}
 m_t &= \beta_1 m_{t-1} + (1 - \beta_1) g_t \\
 v_t &= \beta_2 v_{t-1} + (1 - \beta_2) g_t^2 \\
 \hat{m}_t &= \frac{m_t}{1 - \beta_1^t} \\
 \hat{v}_t &= \frac{v_t}{1 - \beta_2^t} \\
 \theta_{t+1} &= \theta_t - \frac{\eta}{\sqrt{\hat{v}_t} + \epsilon} \hat{m}_t - \eta w_t \theta_t
 \end{aligned}$$

$$\begin{aligned}
 m_t &= \beta_1 m_{t-1} + (1 - \beta_1) g_t \\
 v_t &= \beta_2 v_{t-1} + (1 - \beta_2) g_t^2 \\
 \hat{v}_t &= \max(\hat{v}_{t-1}, v_t) \\
 \theta_{t+1} &= \theta_t - \frac{\eta}{\sqrt{\hat{v}_t} + \epsilon} m_t
 \end{aligned}$$







# Common Traps



Accuracy  $\Rightarrow$  most important metric



$$\frac{2,000}{1,000,000}$$

No Information Rate = 99.8%

$$\text{Accuracy} = (TP + TN) / (P + N)$$

$$\text{Recall/Sensitivity/TPR} = TP / P$$

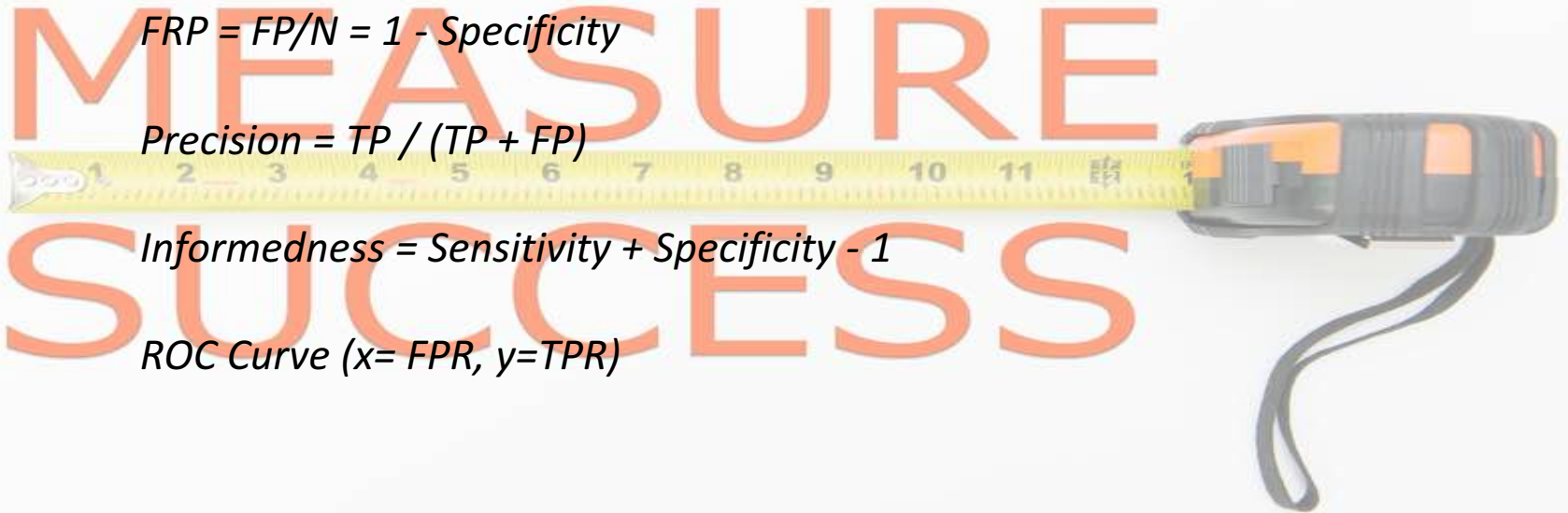
$$\text{Specificity} = TN / N$$

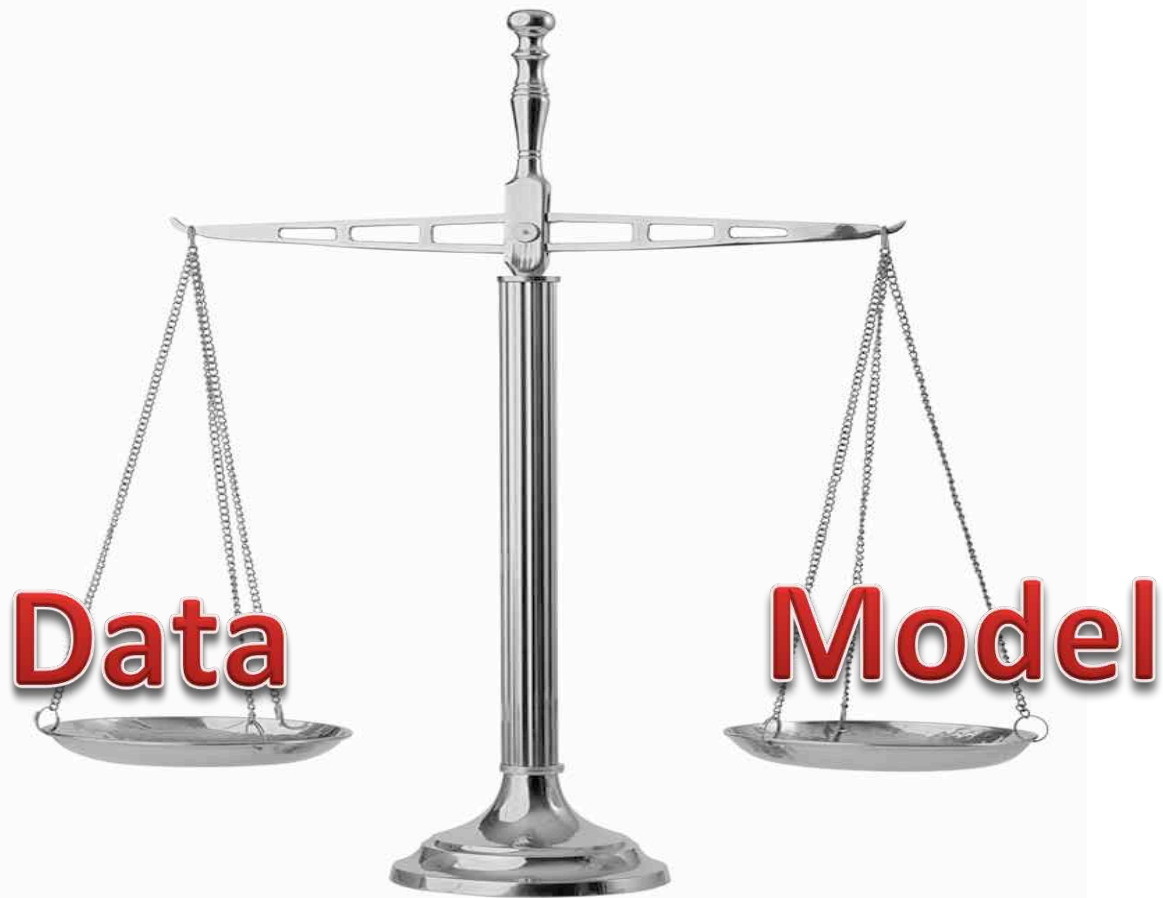
$$\text{FRP} = FP / N = 1 - \text{Specificity}$$

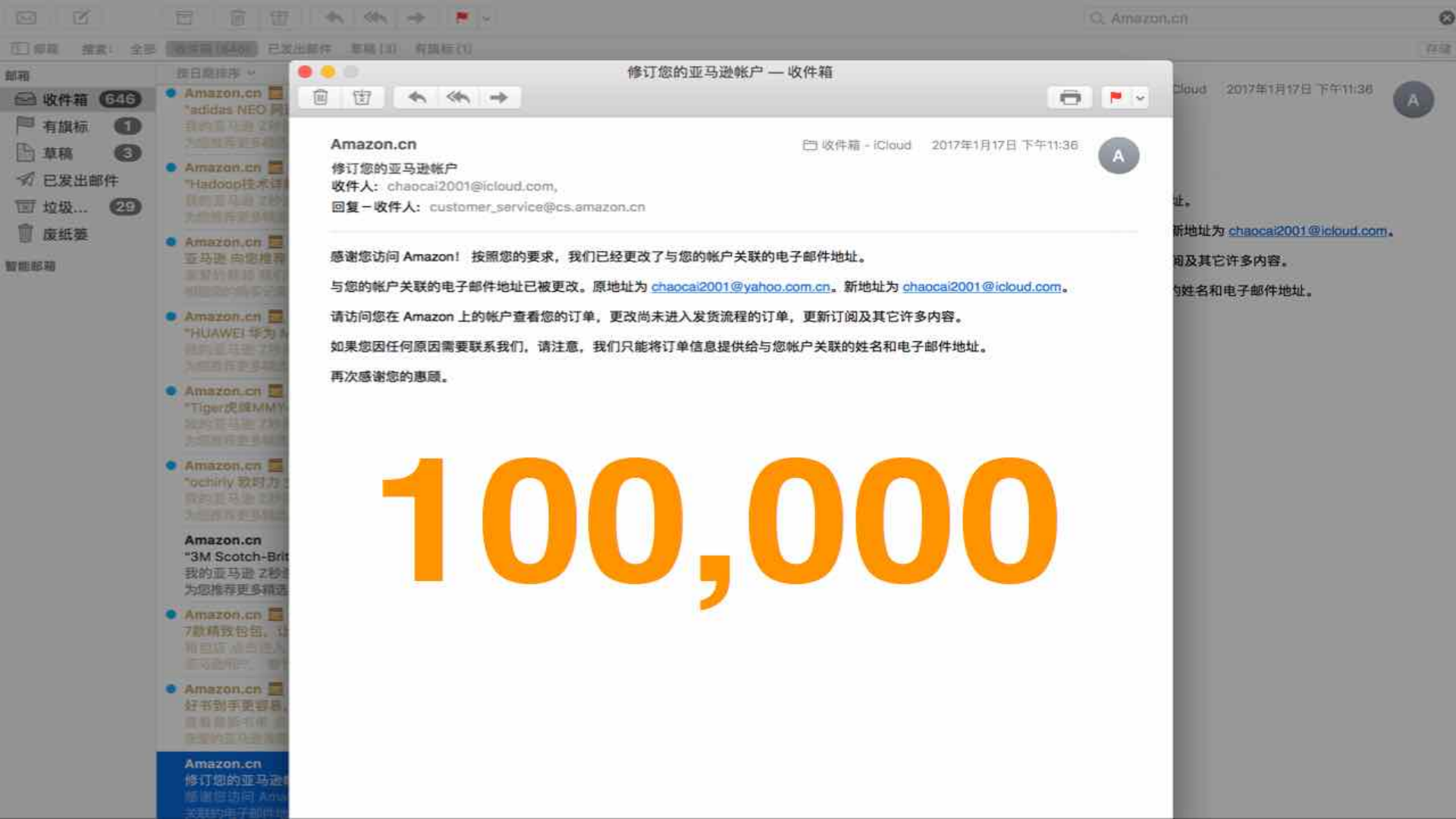
$$\text{Precision} = TP / (TP + FP)$$

$$\text{Informedness} = \text{Sensitivity} + \text{Specificity} - 1$$

$$\text{ROC Curve (x=FPR, y=TPR)}$$







## 修订您的亚马逊帐户 - 收件箱

Amazon.cn

收件箱 - iCloud 2017年1月17日 下午11:36

修订您的亚马逊帐户

收件人: chaocai2001@icloud.com,

回复 - 收件人: customer\_service@cs.amazon.cn

感谢您访问 Amazon! 按照您的要求, 我们已经更改了与您的帐户关联的电子邮件地址。

与您的帐户关联的电子邮件地址已被更改。原地址为 [chaocai2001@yahoo.com.cn](mailto:chaocai2001@yahoo.com.cn)。新地址为 [chaocai2001@icloud.com](mailto:chaocai2001@icloud.com)。

请访问您在 Amazon 上的帐户查看您的订单, 更改尚未进入发货流程的订单, 更新订阅及其它许多内容。

如果您因任何原因需要联系我们, 请注意, 我们只能将订单信息提供给与您帐户关联的姓名和电子邮件地址。

再次感谢您的惠顾。

100,000

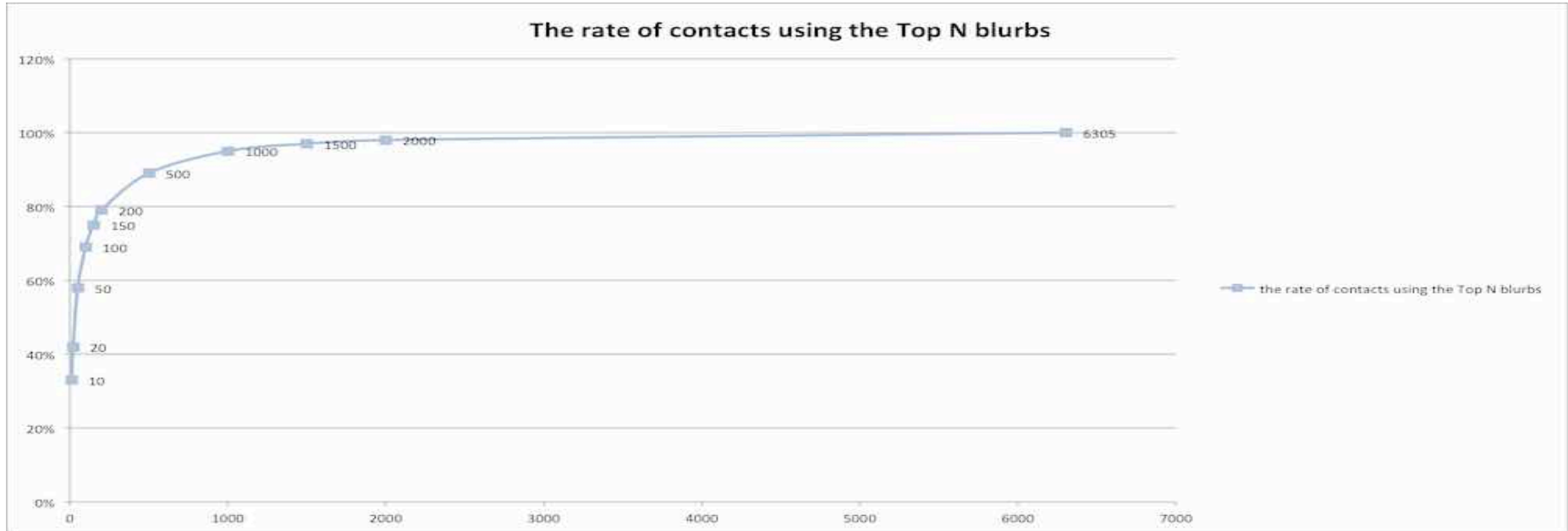


**NO**



**YES**

# Recommend by TopN



More is Better?



---

NORTH CAROLINA

TM

```
> head(Advertising)
```

	TV	Radio	Newspaper	Sales
1	230.1	37.8	69.2	22.1
2	44.5	39.3	45.1	10.4
3	17.2	45.9	69.3	9.3
4	151.5	41.3	58.5	18.5
5	180.8	10.8	58.4	12.9
6	8.7	48.9	75.0	7.2

...

```
model<-train(Sales ~., data=Advertising, method="glm",trControl=ctrl)
```

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )	
(Intercept)	2.938889	0.311908	9.422	<2e-16	***
TV	0.045765	0.001395	32.809	<2e-16	***
Radio	0.188530	0.008611	21.893	<2e-16	***
Newspaper	-0.001037	0.005871	-0.177	0.86	

---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

RMSE    Rsquared  
1.723615 0.8914224

```
model<-train(Sales ~TV+Radio , data=Advertising, method="glm",trControl=ctrl)
```

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )	
(Intercept)	2.92110	0.29449	9.919	<2e-16	***
TV	0.04575	0.00139	32.909	<2e-16	***
Radio	0.18799	0.00804	23.382	<2e-16	***

---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

RMSE    Rsquared  
1.676055 0.8975927



**Only Supervised?**



Iteration 10

Clustering



## Most Helpful Customer Reviews

20 of 20 people found the following review helpful

★★★★★ **Love it!**

By [Patricia E. Svatos](#) on May 23, 2014

**Verified Purchase**

Not a camera for professionals but has everything you'd desire for day-to-day photos. Easy to use and I highly recommend it. Also bought one for my 7-year old twins to send Grandma photos. Small enough to carry it in my purse for those unexpected photo opportunities. They also enjoy it.

[Comment](#) | Was this review helpful to you?

18 of 18 people found the following review helpful

★★★★★ **Nice little Camera for a Novice.**

By [Michael C. Danford](#) on June 7, 2014

**Verified Purchase**

Ordered this a couple days ago and it arrived at the specified time. It takes great photos, it's easy to use, and loading images onto my computer was breeze. Window 7 loaded all the drivers etc. and it worked fine. I bought a small tripod a few years ago. It mounts right on it, and takes crystal clear photos. Great little camera for a limited amount of money.

[Comment](#) | Was this review helpful to you?

6 of 6 people found the following review helpful

★★★★★ **It was perfect. He carried it in his pocket**

By [GK](#) on July 8, 2014

**Verified Purchase**

The camera was for our son for a trip out west. It was perfect. He carried it in his pocket. He took amazing pictures from a moving car! He could zoom and focus. Now that he is home we can see the pictures. Some of them look like a professional photographer. The camera is that good! He loved the camera. The battery is long lasting and it was easy to carry. We loved the camera because of the great photos!

[Comment](#) | Was this review helpful to you?

13 of 17 people found the following review helpful



[Ad Feedback](#)

## Customer Images



## Most Recent Customer Reviews

★★★★★ **Great camera, but it is already broken**

Great camera, but it is already broken. We have only had it for a month. We have been very pleased with it until it broke. It won't zoom out anymore and it won't turn on.

Published 10 hours ago by [Jamie Loucks](#)

★★★★★ **Five Stars**

Great

Published 2 days ago by [Deserie](#)

★★★★★ **sort of**

I have had 2 point and shoot cameras so far and this one is the worst of them all. The other cameras were Samsungs and they were easier to operate than this one. [Read more](#)

Published 3 days ago by [twf2nd](#)

★★★★★ **Five Stars**

I love this camera! It is easy to use and takes great photos! Would highly

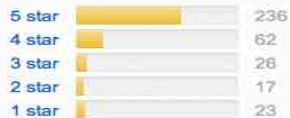




## Customer Reviews

★★★★★ (364)

4.3 out of 5 stars



[See all 364 customer reviews](#)

### Popular Discussion Topics beta: what do you think?

"Image Quality" 228

"Zoom" 66

"Ease of Use" 54

"Video Quality" 26

"Features" 23

All Topics

Hot topics extracted from review

**Quality** is great and very fine!

Kath Chandler

So the next morning I decided to see how nice the **pictures** are in good lighting.

Reviewer

I have just started photographing birds, butterflies, etc and the **pictures** have been great.

Peggy Thornton

The **pictures** are great!

Michael DENNISUK

Great camera for the price, **picture quality** is good.

L. Maloney

**Pictures** are beautiful and am learning more about the features everyday.

Karen

Topic related snippets from customer review

### Most Helpful Customer Reviews

461 of 473 people found the following review helpful

★★★★★ **A nifty little camera**

By **Nematoda** on December 25, 2013

I'm just a point-and-shoot guy, and all I wanted was a good point-and-shoot camera with a powerful zoom lens, and good picture quality for an admittedly undiscerning eye. I got all that and more with this camera. Since there are plenty of "expert" reviews, I'm not going to say anything about the ins-and-outs of the camera. So, for what it's worth, here are my random comments.

1. Besides the 30x optical zoom on the SX510, the other cool feature is the wifi capability. Setting up the wifi was not particularly intuitive, but I eventually got everything working. I read one review from a mac owner that the wifi would not transfer pictures wirelessly from the camera to the the Apple computer. That's not true. All you need to do is download some Canon software (available here: [...]) Once you download and install the software, you need to connect your computer to the camera via your home wifi network. Again, this isn't very intuitive, but it's not too difficult either. After the connection is made, you'll be able to transfer photos from the camera to your Apple computer via the "Image Sync" command.



Advertisement



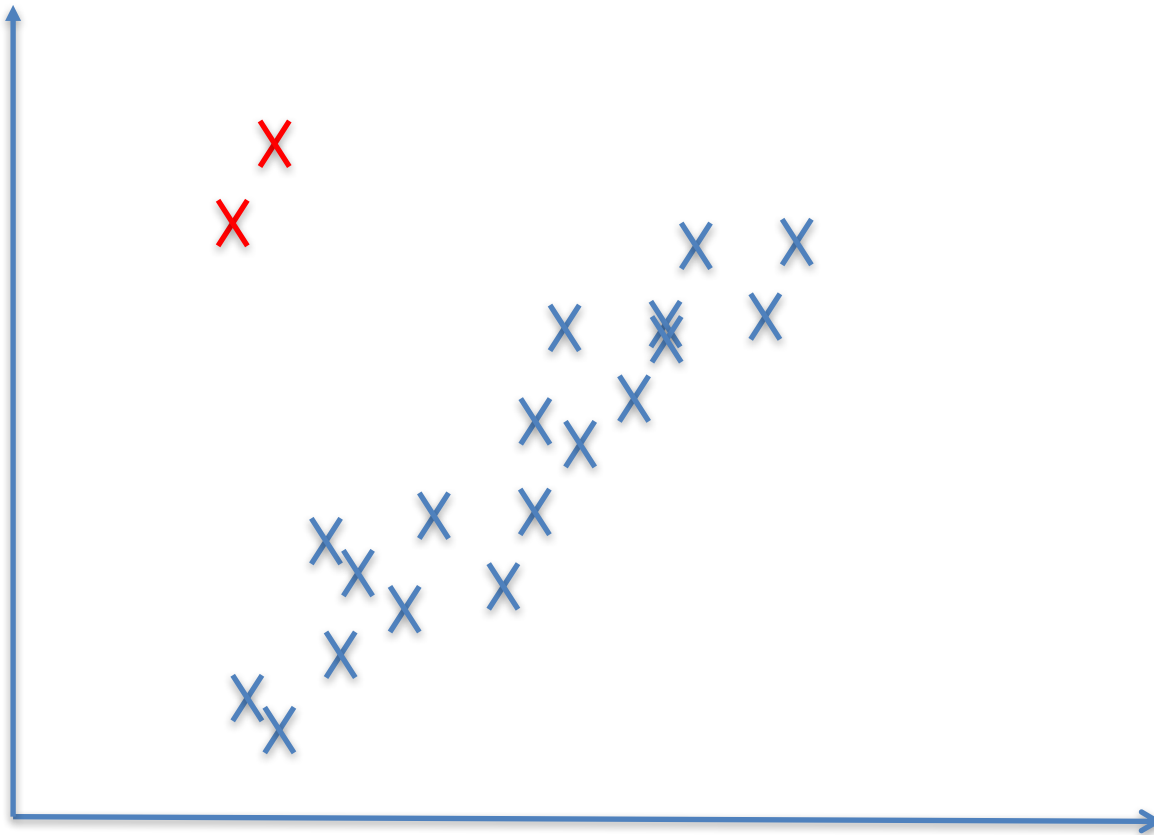
# Challenges and Solutions



# Imbalanced Data



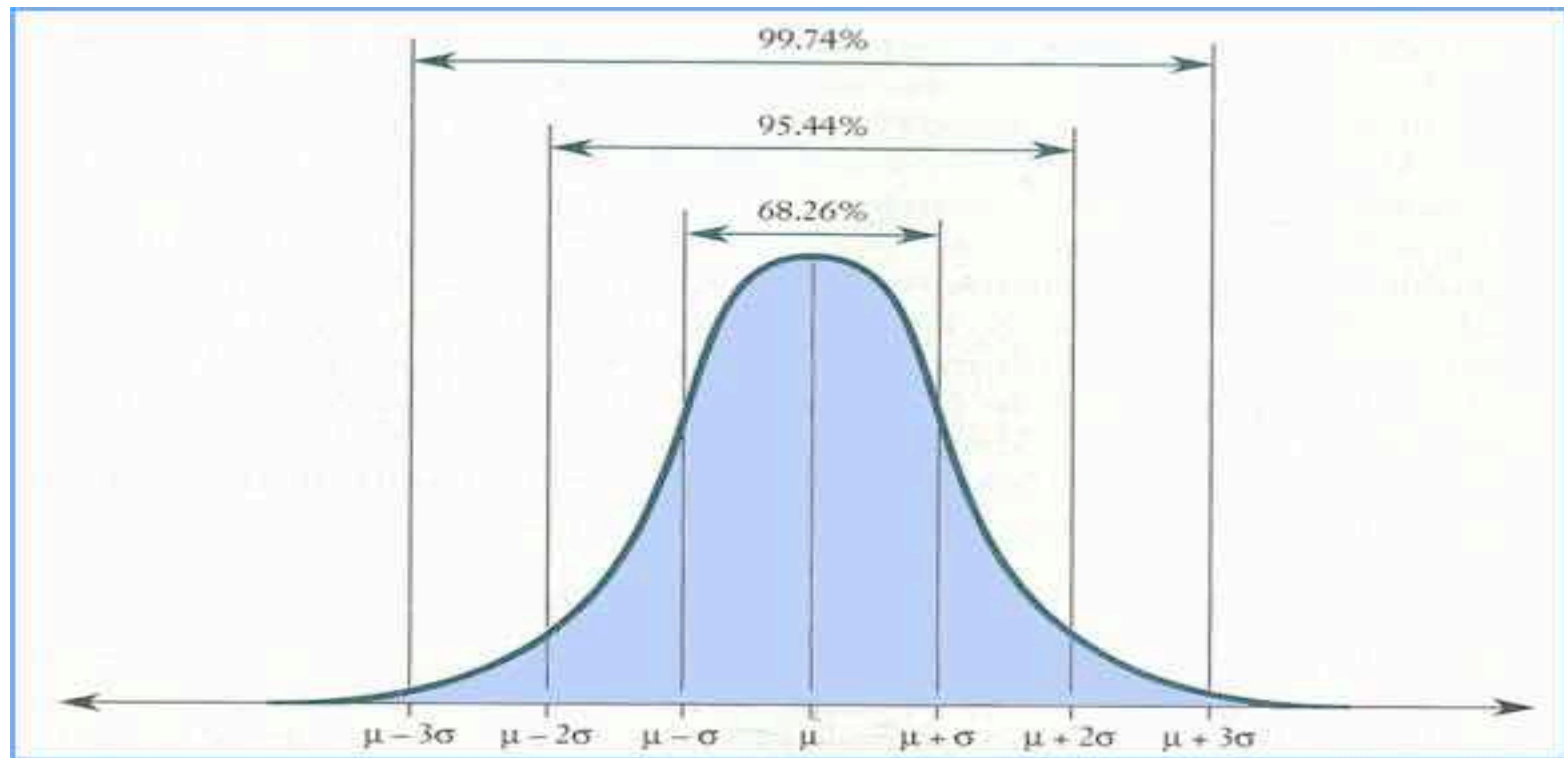
Memory  
Usage



CPU Usage

A 3D rendering of a grid of white spheres, arranged in a perspective that recedes into the distance. One sphere in the lower-left foreground is colored red, standing out from the rest of the white spheres. The text "Anomaly Detection" is centered over the image.

# Anomaly Detection



$$f(x, \mu, \sigma) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{(x-\mu)^2}{2\sigma^2}}$$

Feature Vector  $X \{X_1, X_2, X_3 \dots X_n\}$

Given new example  $x$ , compute  $p(x)$ :

$$p(x) = \prod_{j=1}^n p(x_j; \mu_j, \sigma_j^2) = \prod_{j=1}^n \frac{1}{\sqrt{2\pi}\sigma_j} \exp\left(-\frac{(x_j - \mu_j)^2}{2\sigma_j^2}\right)$$

Anomaly if  $p(x) < \varepsilon$

### **Multivariate Gaussian (Normal) distribution**

Parameters  $\mu, \Sigma$

$$p(x; \mu, \Sigma) = \frac{1}{(2\pi)^{\frac{n}{2}} |\Sigma|^{\frac{1}{2}}} \exp\left(-\frac{1}{2}(x - \mu)^T \Sigma^{-1}(x - \mu)\right)$$

# Anomaly detection vs. Supervised ML

## **Anomaly detection**

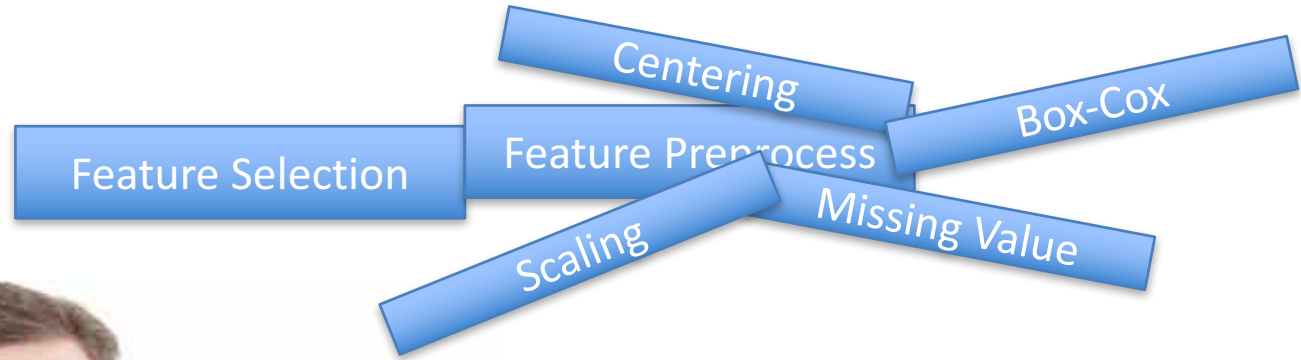
- Very small number of the anomaly (positive) samples
- Large number of the normal (negative) samples

## **Supervised ML**

- Large number of the positive and negative samples.

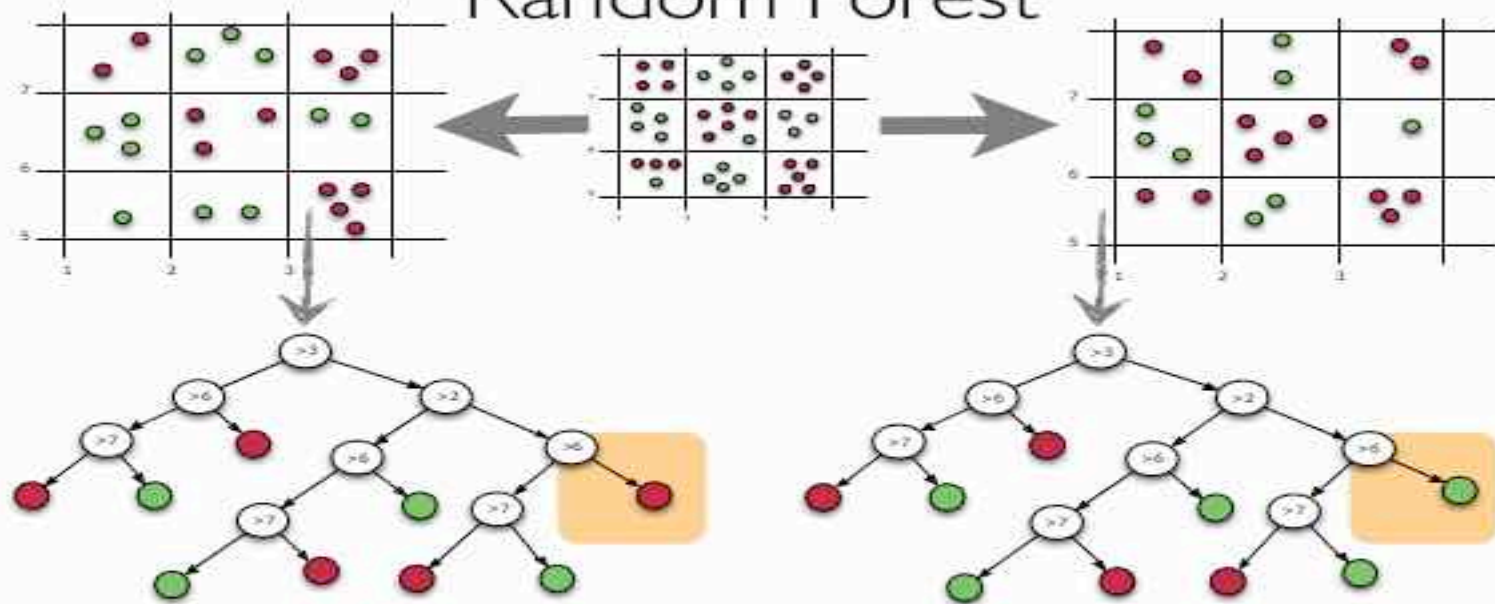


# Feature preprocessing is hard





# Random Forest



- Each tree sees part of the training sets and captures part of the information it contains



# Amazon Content Compliance



amazon



Content Compliance  
Service



# No enough Labeled Data



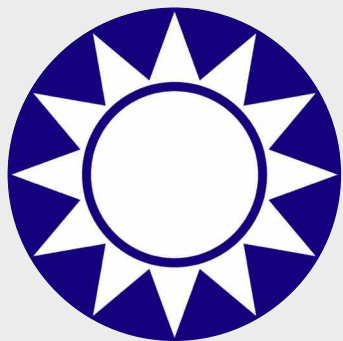
# Image Augmentation



....

# Image Compliance D

I see you.

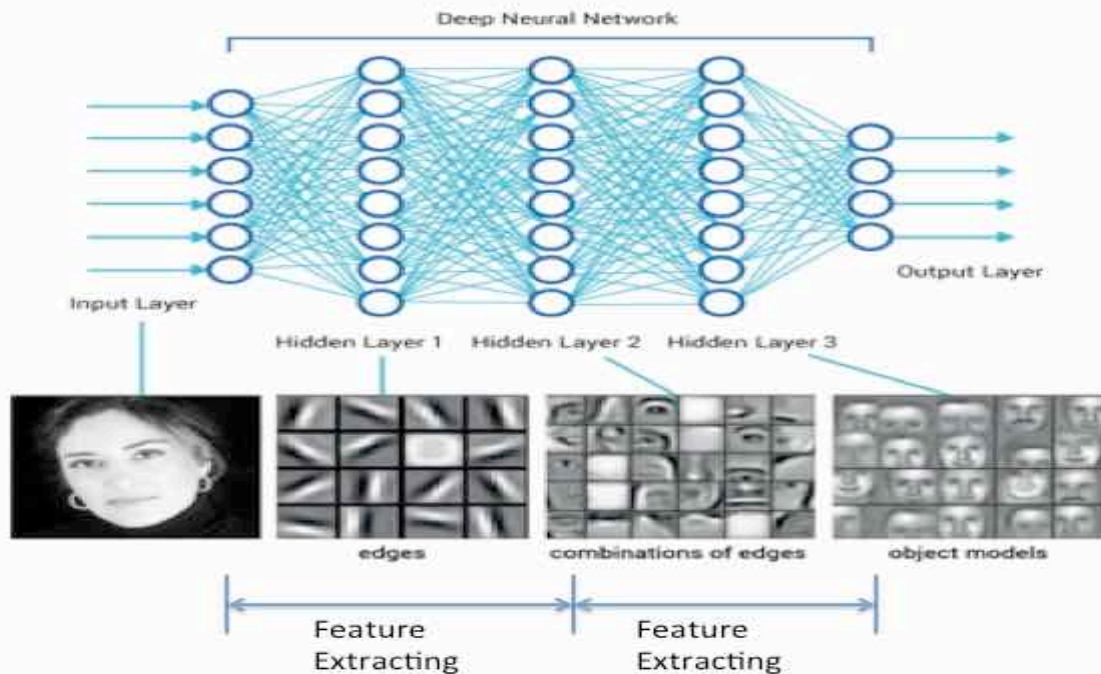


# No Bible for constructing DNN



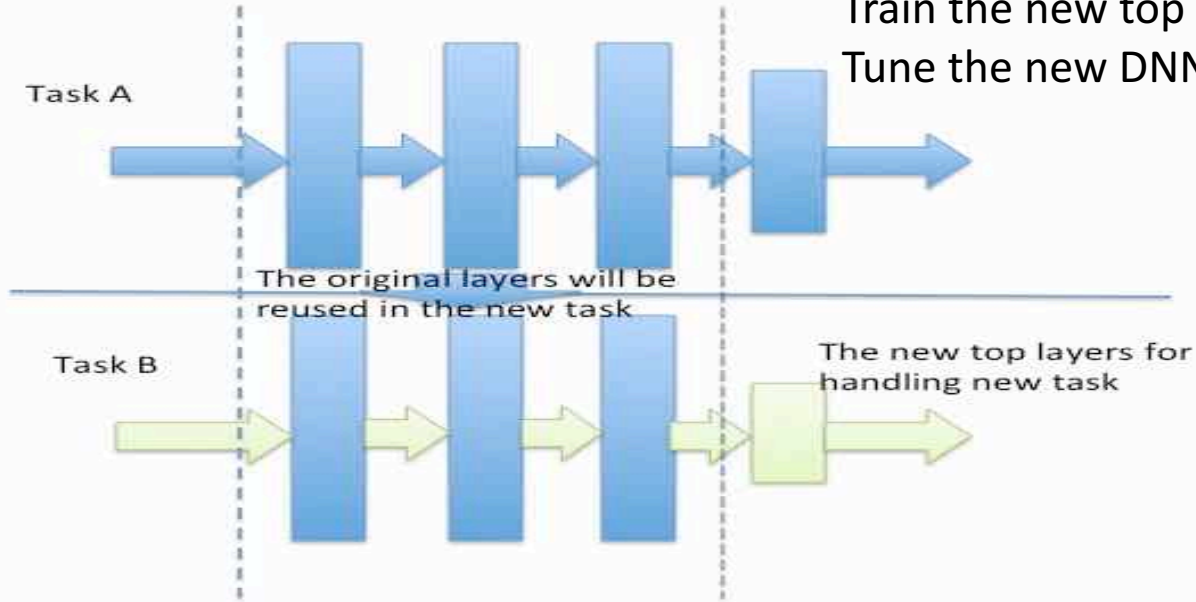


# Transfer Learning



# Transfer Learning

Remove the top layer of the original DNN  
Build the new top layers on the original DNN  
Train the new top layers  
Tune the new DNN finely



# Where do you start from...

- Start from your case
- Start from your data
- Start from the simple



# For More

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