# Lecture 2 Anomaly Introduction

Ref: Outlier Analysis, Charu C Agrawal

# Surveillance~observing for Defined Undefined

- For terrorists Osama
- Intruders
- Abandoned baggage
- Objects (e.g. Red ferrari)
- Wrong way driving

- Anomaly
- Abnormality
- Unexpected
- Unusual
- Outlier detection

## **Anomaly Definition**

- Anomaly detection is the identification of rare events.
- Anomaly detection is identification of events or observations, represented as data point, that differ significantly from majority of the data.
- An anomaly is a data point that is significantly different from rest of the data.

### Intrusion in Computers

- Data: systems calls, network traffic, etc.
- Task: Detection intrusion of a malware/ virus
- Anti-virus

### Credit card fraud

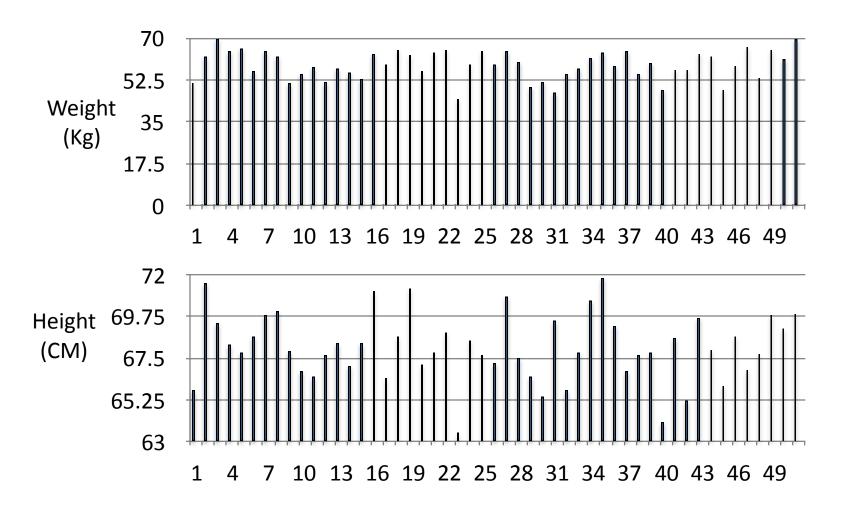
- Data: number of transactions, amount
- Task: Detect credit card theft, cloning
- Action: block, give warning

## More Anomaly Applications

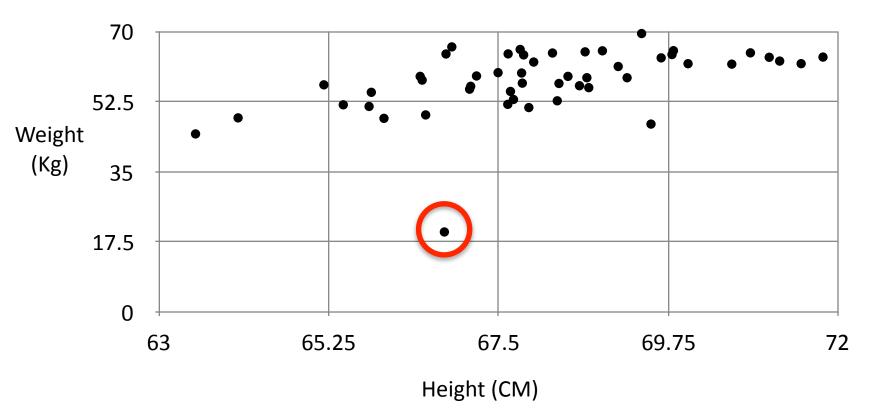
- Law enforcement
- Bank fraud detection
- Medical problem detection
- Malfunctioning equipments
- Structural defects
- Earth sciences

Problem: given a data point, how to identify whether it is normal or abnormal?

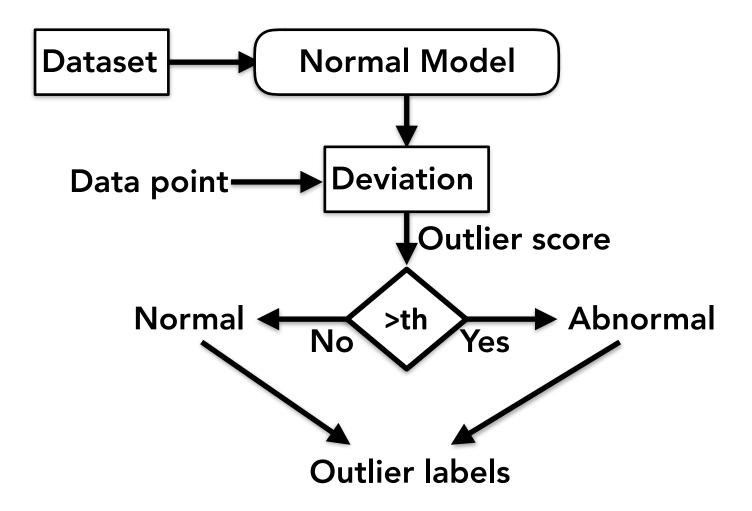
### Height-Weight Data



#### **Try Data Visualization**



## **Typical Anomaly Model**



# Q: How much deviations is sufficient to call a dat point anomaly?

The deviation could be due to noise in observations also!

The deviation threshold chosen on an ad hoc basis according to application-specific criteria!

#### **Z-value Test**

Calculate Z value for  $i^{th}$  data point  $Z_i = \frac{X_i - \mu}{\sigma}$ 

where 
$$\mu = \frac{1}{n} \sum_{i=1}^{n} X_i$$
 and  $\sigma = \sqrt{\frac{1}{n} \sum_{i=1}^{n} (X_i - \mu)^2}$ 

Large Z value indicates anomaly, rule of thumb is  $Z \ge 3$ 

#### Limitations

- Data may not be Gaussian distributed
- Sufficient samples may not be available to robustly estimate mean and standard deviation