# Critical Infrastructures (of today and tomorrow)

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#### **Outline**

- What are the challenges to today's critical infrastructures?
- Overview of the emerging infrastructures
  - A post-disaster communication network as an extreme case
- Own work in 2003-2005 in one of the first European projects on critical infrastructures

## Attributes of dependability

#### **Availability**

- Readiness for use



Continuous correct service

#### **Integrity**

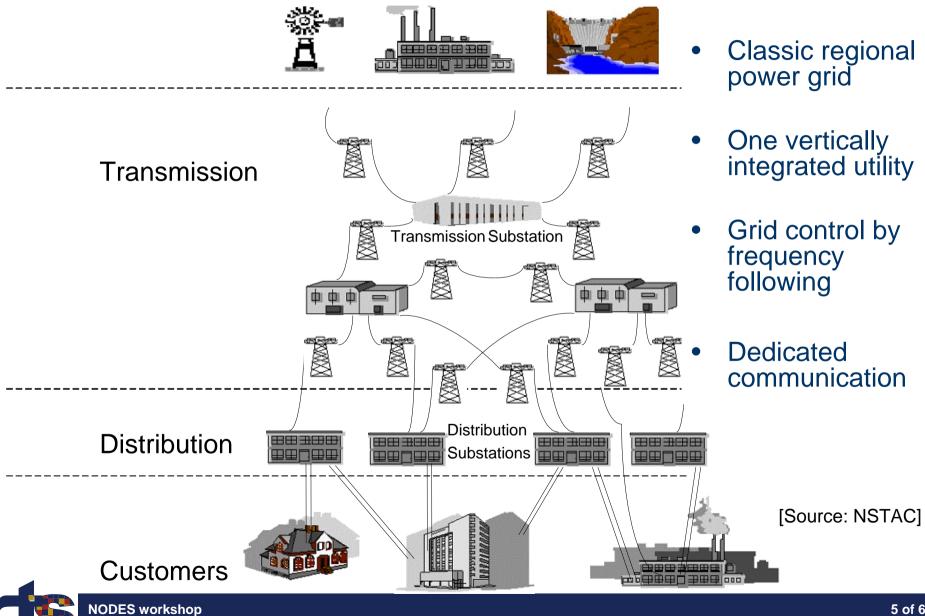
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#### **Challenge 1**

## Complexity and interdependencies

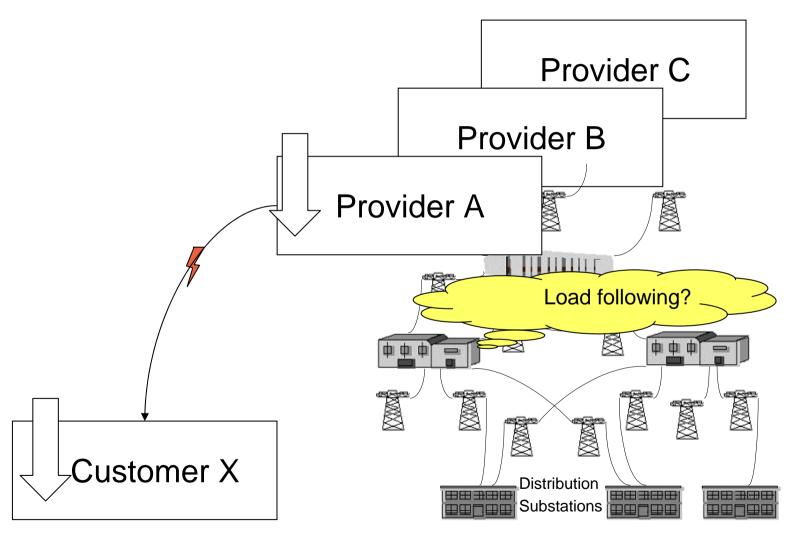
#### Generation



#### Restructuring of the Grid

- Deregulation: organisations can enter into bilateral or multilateral power generation contracts
  - Large scale operation: from centralised to distributed control
  - Difficulty of coordination among independent service operators
- Approaching grid capacity
- New monitoring and control problems

#### **Local impact spreads**





#### **Need for communication & trust**

- Line frequency can no longer be the implicit communication channel
- Ideally contracts and capacities need to be known to everyone for cooperative control



In reality ...



- No operator wants to disclose information unless mandated by authorities
- Line frequency not enough for stablisation: one needs to know the state of equipment, detailed load profiles, pricing,...

#### **26 August 2008**

- 646 flights delayed as a direct result of a failure in a communication link that transmits flight plan data from the Georgia facility to a similar facility in Salt Lake City
- Flights from a wide swath of the United States, from Dallas and to the East Coast delayed
- The FAA: the source of the computer software malfunction was a "packet switch" that "failed due to a database mismatch."

#### **Challenge 2**

Transition from managed to unmanaged

#### **20 August 2007**

- Skype today provided a few more information pieces about the reasons behind its massive network outage last week.
- The network outage was initially caused by a "massive restart of [its] user's computers across the globe within a very short timeframe as they rebooted after receiving a routine software update."
- That high number of reboots was followed by an equally high number of log-in requests, which resulted in what Skype calls a "chain reaction."

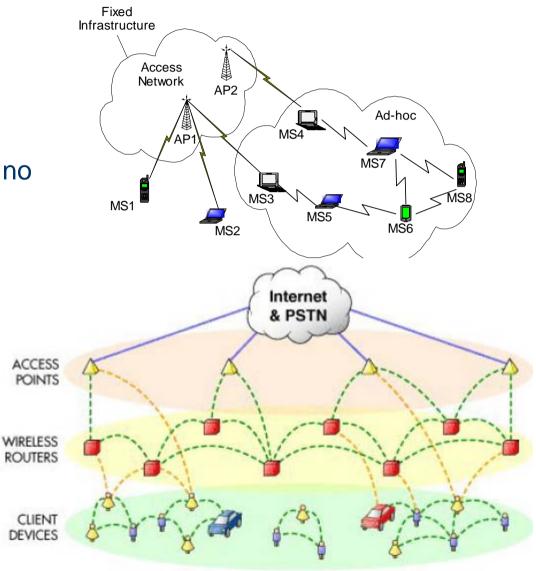
## **Challenge 3**

## Heterogeneity

## **Converging networks**

- From cellular ...
- ... to adhoc networks with no infrastructure

• ... to multi-region Intermittentlyconnected networks





#### Reliance on novel technologies

- Wireless Communication
  - Almost taken for granted as part of the infrastructure today
  - GPRS, HSDPA, WiMAX, Wi-Fi, ...
- Distributed cell networks
  - Local (per customer) generation of electricity
  - Dynamic energy market trading at customer level

#### **Challenge 4**

## Organised threats with economic motives or adversary disruptions

#### **Symantec Threat Report - Dec 07**

- An average of 61,940 active bot-infected computers per day in the second half of 2007, an increase of 17% from the previous period.
- 499,811 new malicious code threats were reported to Symantec, a 136% increase over the first half of 2007.

#### Georgian govt. web attacks

 Gadi Evron, a prominent Internet security researcher and the founder of Israel's Computer Emergency Response Team, posited that the attackers are more likely nationalistic "enthusiasts" than organized criminals or Russian government operatives.

## Summary

Challenge	Emerging solutions
Complexity and interdependencies	Modelling, Risk analysis, Provisioning
Transition from managed to unmanaged	P2P technologies, self-managing systems
Heterogeneity	Standardised protocols, Overlay networks, Software defined radio
Organised threat, fraud and disruptions	Hardening, Intrusion tolerance, diversity, partial rejuvenation

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#### What happens in the worst case?

 Existing infrastructure collapses



Chaotic & surprising

Network: lack of

resources

Time is running out...

- Actors are spread out and mobile
- Communication culture clashes



#### Our hypothesis

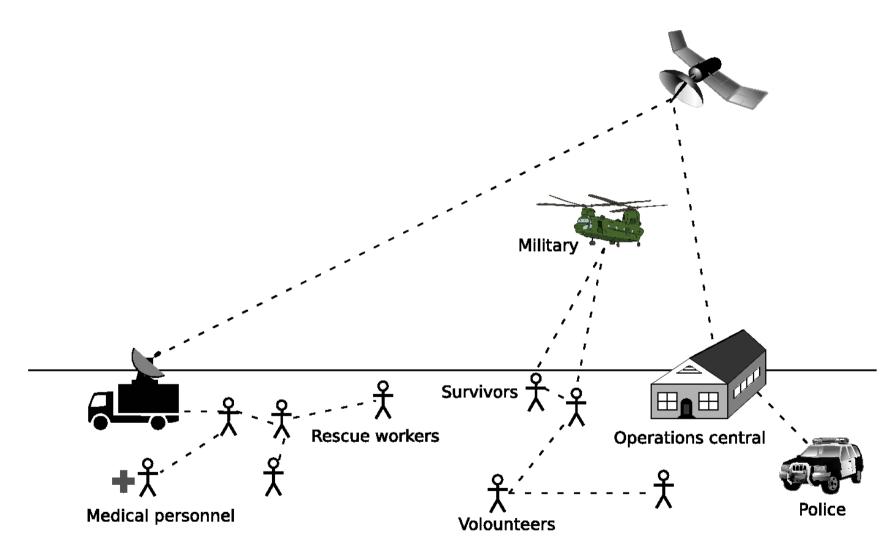
Hastily formed networks can have a role to play

Use commodity hardware and massively distributed software

- Have built-in mechanisms for
  - When batteries are in short supply
  - Mobility changes connectivity
  - Dealing with overload and urgency
  - Detect and respond to abuse



#### Multiple information owners/users





## **Hastily formed networks**

Challenge	<b>Emerging solutions</b>
Disconnectivity as a norm	Store-and-forward techniques, delay-tolerant networks (DTN)
Resource constraints	QoS optimisation techniques, prioritisation
Infeasibility to centrally manage	Gossip-style distributed protocols
Heterogeneity	Overlay networks, DTN bundles
Less organised opportunistic threats, adversary disruptions	Reputation-based systems, Selfish-resistance protocols, Decentralisation

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#### **Project Safeguard**

- Goal: to enhance survivability of Large Complex Critical Infrastructures (LCCIs)
- Electricity and telecommunications networks as practical examples
- Granted pre 9/11!
- Ended in 2004



#### **Challenges**

#### General:

Increase information quality for administrator

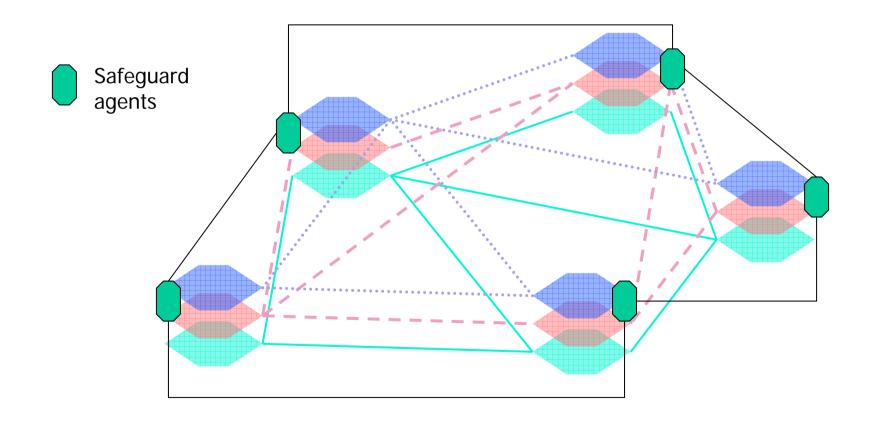


- Recognise unknown attacks
- Predict future overloads

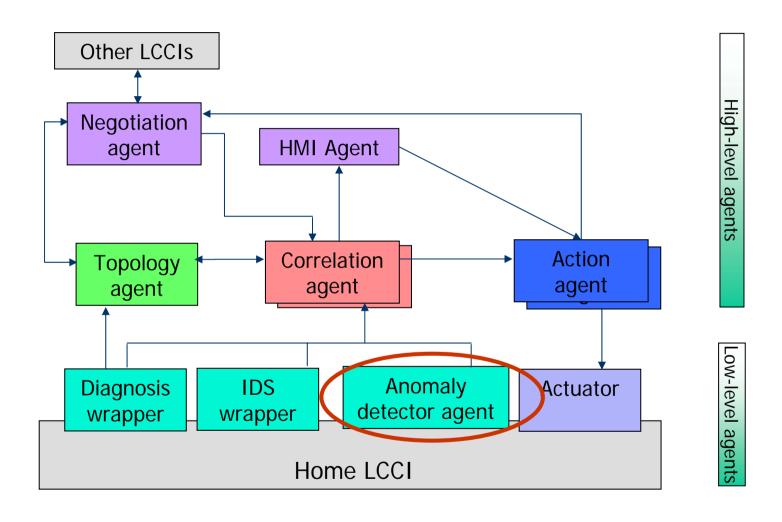
#### Telecom specific:

- Decrease no. of alarms
- Decrease false positives (higher availability)

## The Safeguard approach



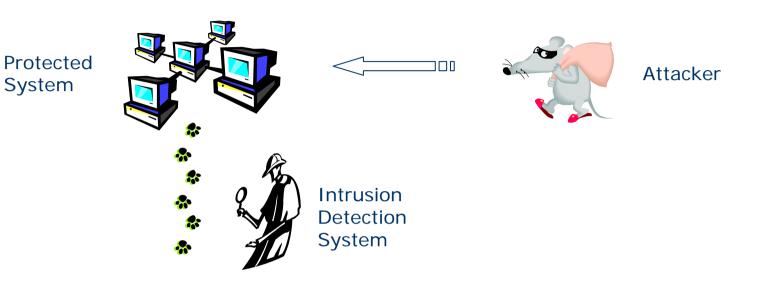
## Safeguard architecture



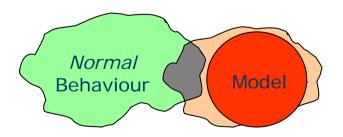
#### **Anomaly Detection**

- ADWICE: Anomaly Detection With fast Incremental ClustEring
- Joint work with Kalle Burbeck
- Not a silver bullet: part of the larger Safeguard context

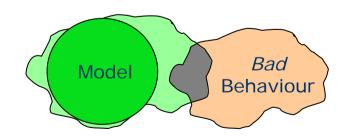
#### Intrusion detection



#### Misuse Detection

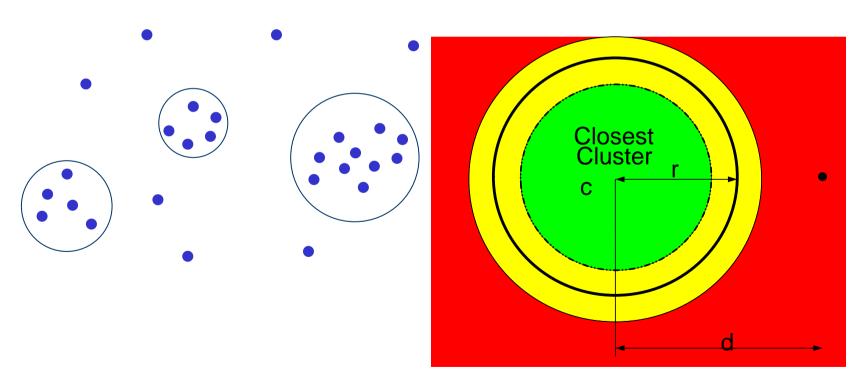


#### Anomaly Detection



#### Clustering

- ADWICE uses clusters to represent normality
- Adaptation of an existing data mining algorithm (BIRCH)

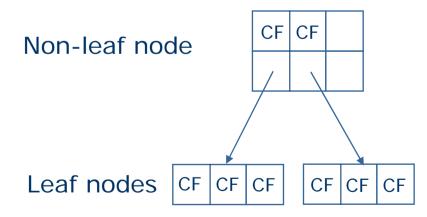


#### What is a data point?

- General: A set of numeric values
  - E.g. measurements from sensors
- What about IP packets?
  - A vector of alphanumeric values in header of an IP packet
  - Transformed into vector of numeric values
  - In our tests: 41 dimensions
- Need efficient storage and search among summaries of collections of data points

#### **Basic ADWICE concepts**

- CF (Cluster Feature)
  - Summary of cluster
  - [No, Sum, Sum of sq]
- Index: CF Tree



- Maximal number of clusters (M)
- Threshold requirement (TR)
- Branching factor (B)

#### **Efficient operations**

- We have:  $CF = \langle n, \sum v_i, \sum v_i^2 \rangle$
- Can compute the Centroid  $v_0$ :

$$\sum v_i / n$$

Can compute the Radius:

$$\sqrt{\sum (v_0 - v_i)^2 / n}$$

## **ADWICE training**

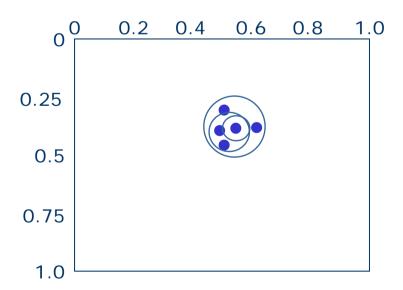
**Threshold:** 



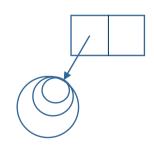
**Max Number of Clusters: 3** 

**Branching factor: 2** 

**Data Space** 



**CF Tree** 



## **ADWICE training**

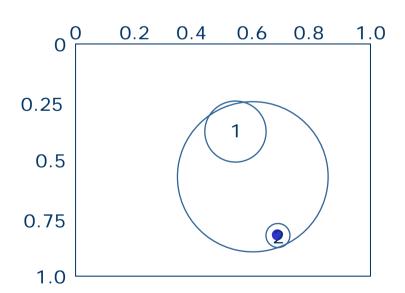
**Threshold:** 



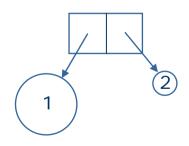
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**Data Space** 



**CF Tree** 



# **ADWICE training**

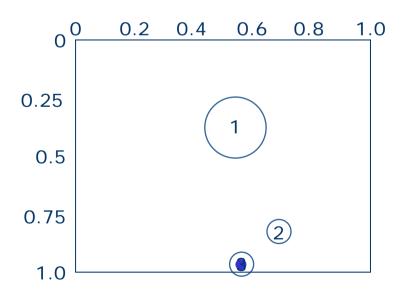
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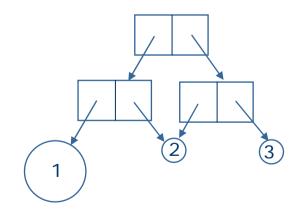


**Max Number of Clusters: 3** 

**Branching factor: 2** 

**Data Space** 





# **ADWICE training**

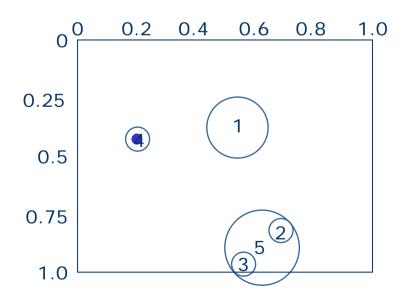
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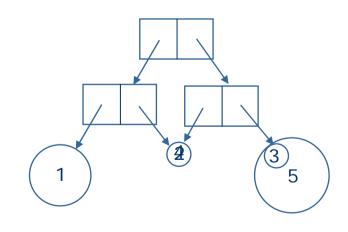


**Max Number of Clusters: 3** 

**Branching factor: 2** 

#### **Data Space**





#### **ADWICE** detection

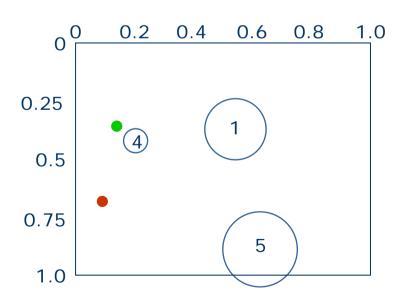
**Threshold:** 

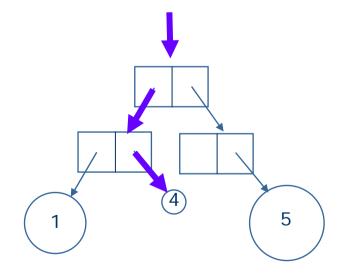


**Max Number of Clusters: 3** 

**Branching factor: 2** 

**Data Space** 



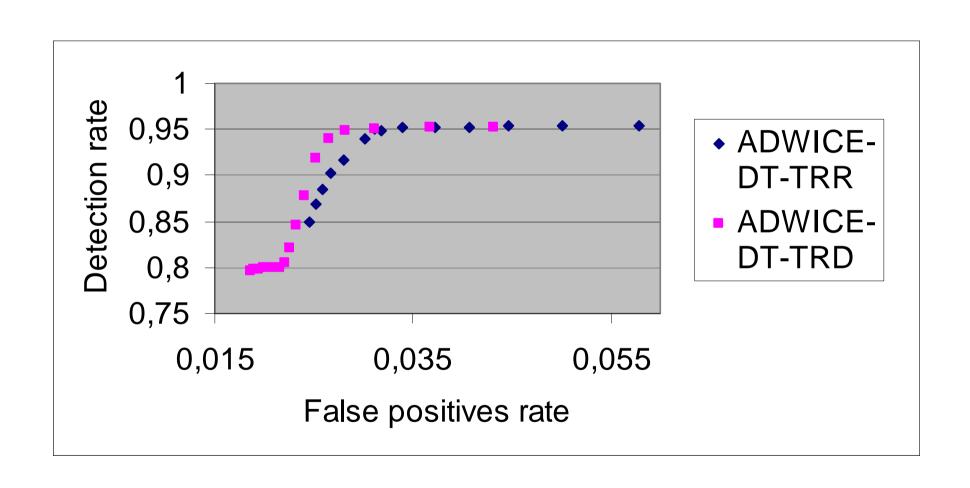


#### **Evaluation**

- KDD99 Data
- General properties
  - Session records (TCP/UDP summaries)
  - 41 features (flags, service, traffic stats ...)
- Training data
  - 4 898 431 session records
  - 972 781 normal, the rest (attacks) not used
- Testing data
  - 311029 session records
  - normal data and 37 different attack types

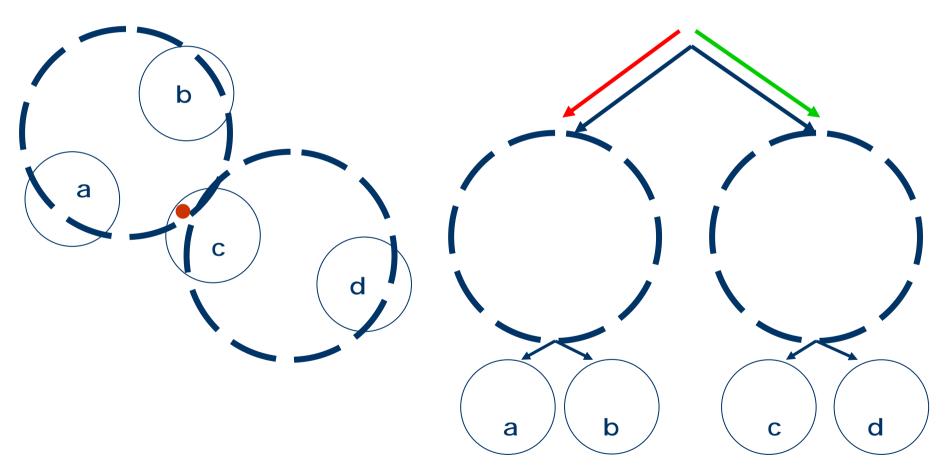


#### Detection rate vs. false positives



#### **Index errors**

Some false positives are due to index errors



#### **ADWICE-Grid**

 A new version of the algorithm: separates cluster formation and index updates

How does ADWICE- Grid work?

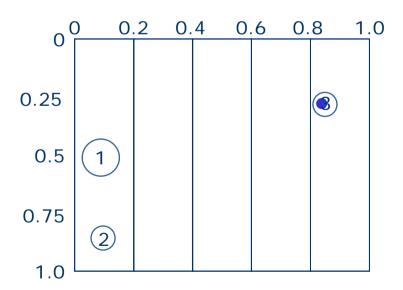
### **ADWICE-Grid: Training**

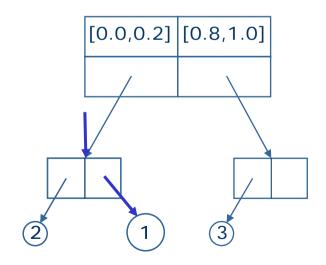
**Threshold:** 



**Max clusters in Leaf: 2** 

#### **Data Space**





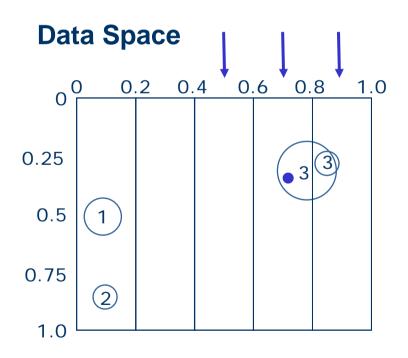
#### **ADWICE-Grid: Training**

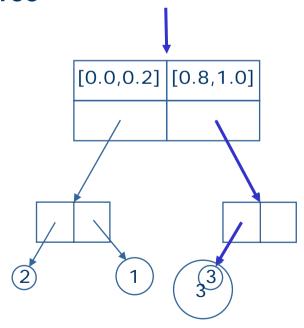
Threshold:



**Max clusters in Leaf: 2** 

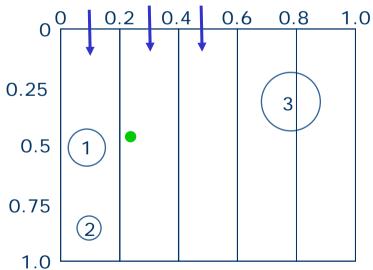
(Search width)



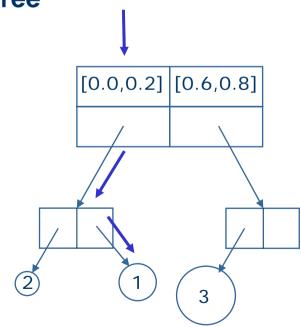


## **ADWICE-Grid: Detection (1)**

# Data Space

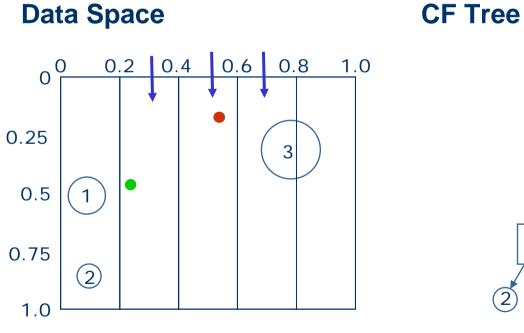


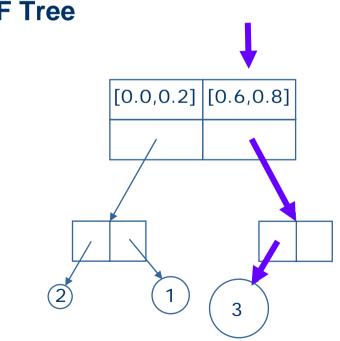






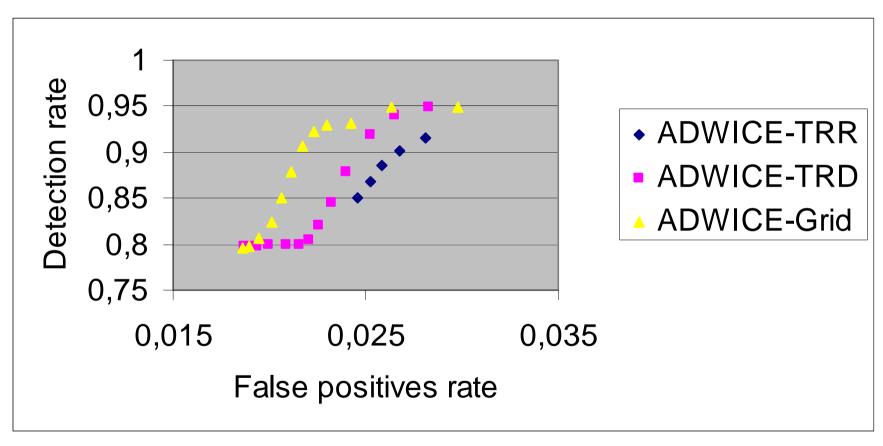
## **ADWICE-Grid: Detection (2)**







#### Detection rate vs. false positives

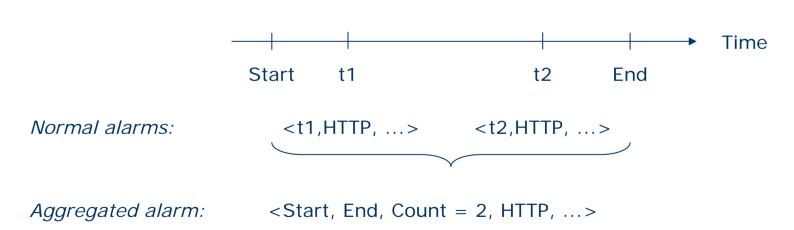


Source: [Burbeck & Nadjm-Tehrani 04,07]

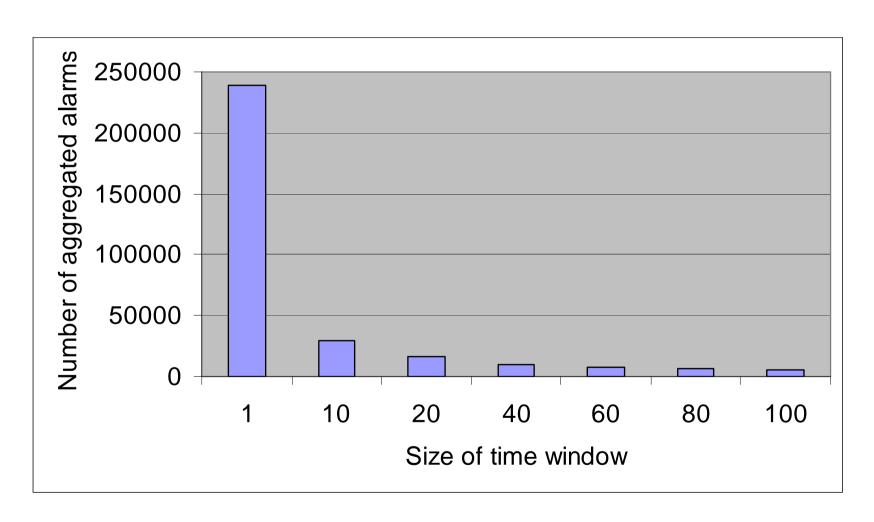


#### **Alarm aggregation**

- Anomaly detection may produce many similar alarms (e.g. DoS, Probes, False positives)
- Similar alarms can be aggregated without losing accuracy

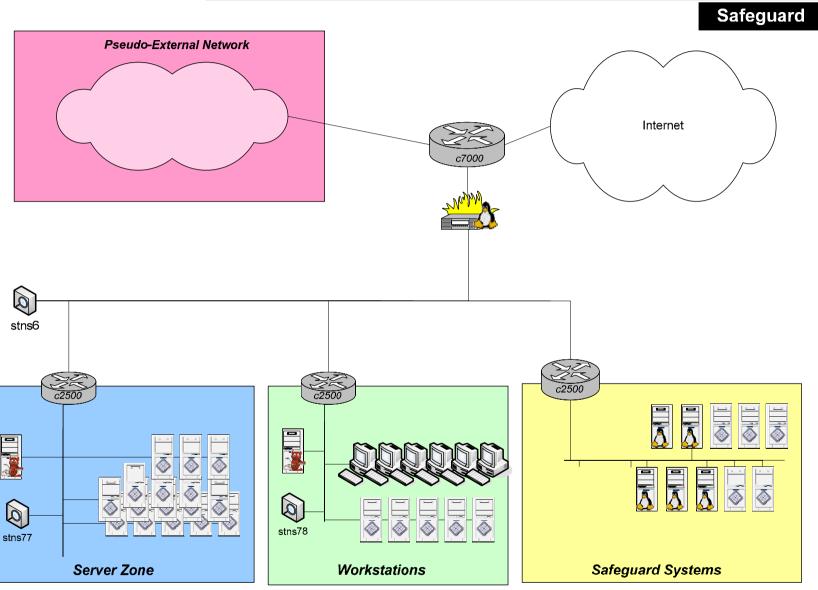


### **Alarm aggregation results**

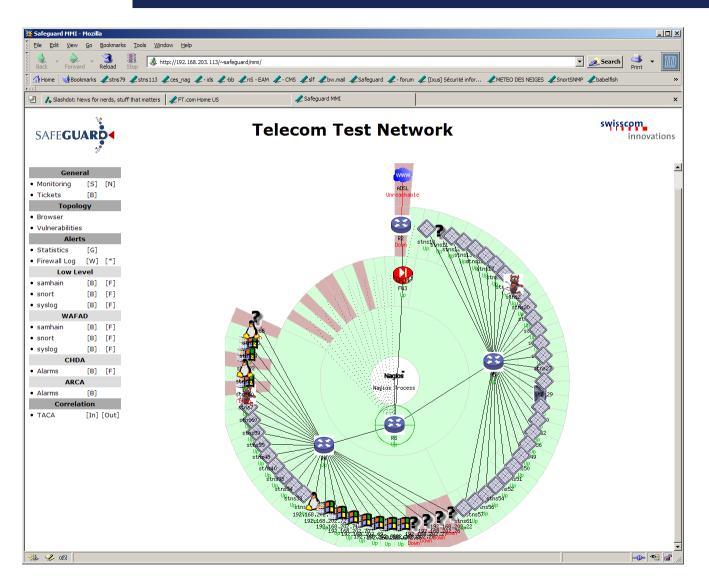




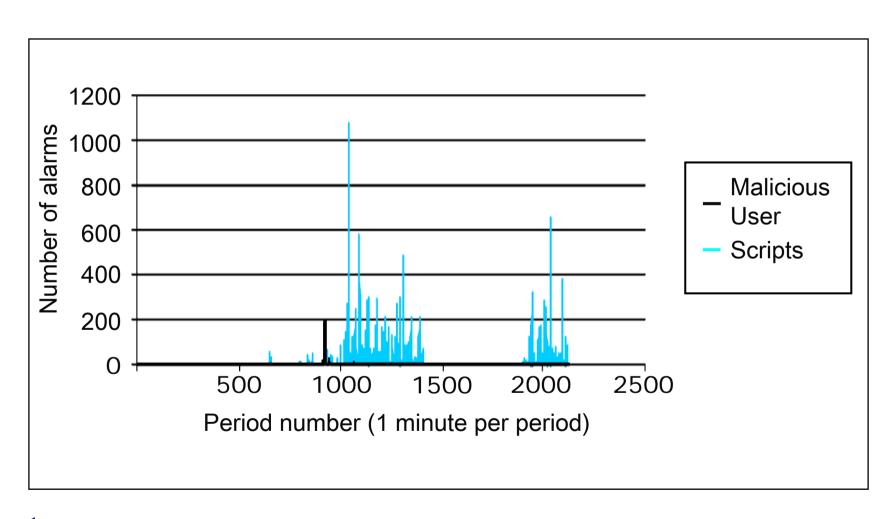
### Safeguard 100+ test network



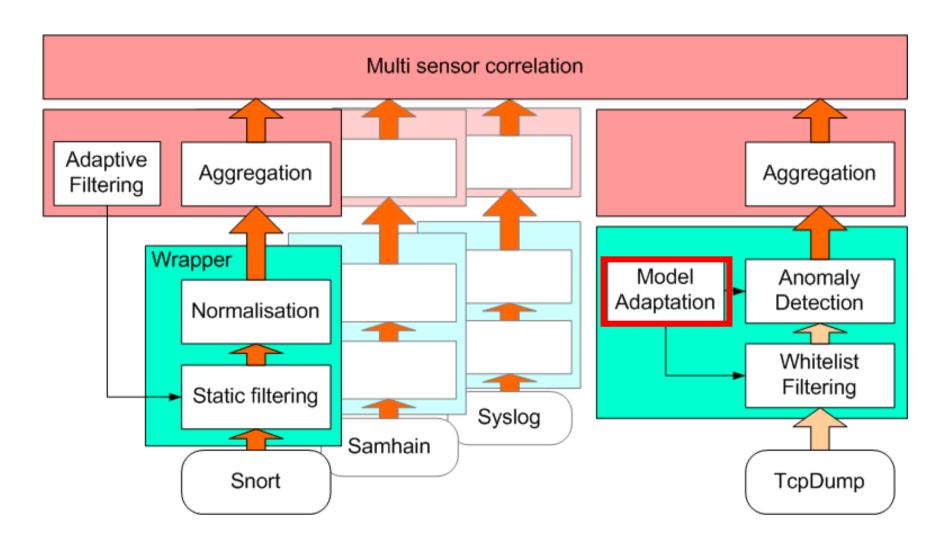
# One HMI agent interface



### A Safeguard scenario

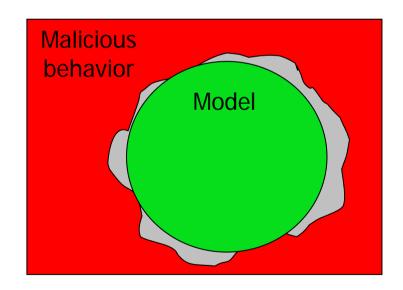


### **Correlating alarms**



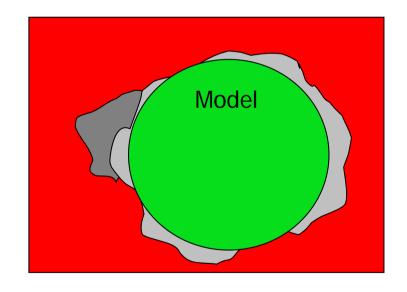
# **Need for normality adaptation**

Normality is not static!



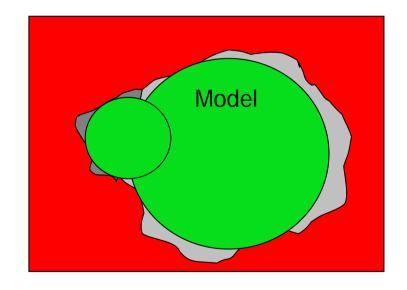
### **New cases of normality**

- Normality changes
  - New type of normal behaviour
- Old model incomplete
  - Evaluation using
     KDD data gives ~300
     false positives for new normality

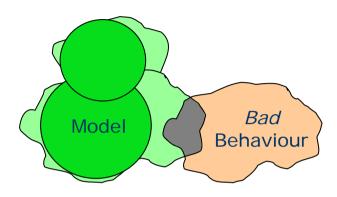


#### **Evaluation of normality adaptation**

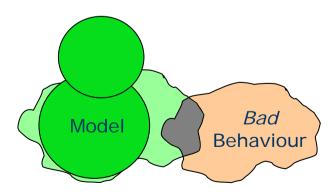
- Admin or system reacts
  - Recognize new false positives
  - Tells ADWICE to learn this behaviour
- Normality model adapted
  - From 300 to 3 false positives!



#### **Forgetting**



- System keeps track of model usage
  - If time since last usage is very long for subset of clusters
  - Decrease size (influence) of those clusters and finally remove them if not used



#### **Lessons Learnt**

#### Safeguarding critical infrastructures needs:

- Adaptive elements
- Incremental and scalable algorithms
- High performance for large volume of data
- Demonstration on realistic test beds
  - Research on open data sets :-)
- Understanding and mitigating interdependencies

#### **Current track**

- Application of ADWICE in anomaly detection for water management systems
  - Cooperation with Environment Protection Agency (EPA), USA
  - Time series data from simulated water system over an interval of one week
- Talk to me if interested to join!