## (YET) ANOTHER ATTEMPT AT ONLINE FAILURE PREDICTION

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Adaptive, Trustworthy, Manageable, Orchestrated, Secure Privacy-assuring Hybrid, Ecosystem for REsilient Cloud Computing

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### **FAILURE PREDICTION**

#### Uses prediction models trained with data of failure events

- Data can be numerical (e.g., free memory) or categorical (e.g., events)
- Models can be built using machine learning, statistics, etc.

- Salfner & Malek's model:
  - Predictors trained using data from  $\Delta t_d$
  - Prediction performed at time t for failures occurring in the interval  $\Delta t_1 \pm \Delta t_p$ 
    - $\Delta t_w$  is the minimal time below which (even) a predicted failure cannot be avoided
  - Output: 0/1, failure probability





Goa, India, 2018 Figure 2.7 – Time relations in Online Failure Prediction

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### **NOT A NEW CONCERN**



HotDep 2009 <u>Marco Vieira<sup>1</sup></u>, Henrique Madeira<sup>1</sup>, Ivano Irrera<sup>1</sup>, Miroslaw Malek<sup>2</sup>

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### **KEY CHALLENGES**

**Problems with failure prediction...** 

- Obtaining training data is hard
  - Fortunately, failures are rare events!
- Identifying the relevant data for training is difficult
- Selecting the most adequate algorithm(s) is complex

#### Furthermore: systems change over time!!!

### Irrera & Vieira KEY CONTRIBUTIONS (1)

## Generating failure-related data using realistic software fault injection + virtualization





#### **Nuno Antunes**

#### Goa, India, 2018

### Irrera & Vieira KEY CONTRIBUTIONS (2)

# Assessment and comparison of failure prediction systems



### **PROBLEMS...**

#### Systems change

- Virtual machines are not the ideal solution
- Hard to implement in complex systems
- Boundaries of the system are unclear

#### **Practical Applicability**

### WHAT ABOUT CONTAINERS?

Containerized applications based on microservices are highly flexible and scalable

- Widely spread, e.g. in cloud envire
- Isolation

This may be what we need to make O.F.P work!

- Stability in the context surrounding the application
- Boundaries
- Easy to replicate and manage

### HOW CAN WE DO IT?

#### Use data that are only about the container

- OS data cannot be considered
- Docker API, cAdvisor



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- OS data cannot be considered
- Docker API, cAdvisor
- Consider each container individually
  - Well defined boundaries!
  - Each may contribute to higher level models
- Automate replication and fault injection to handle the "Online" part
  - Easier to do in containers

### **CHALLENGES**

# Are the container-dependent variables enough to make state of the art approaches work?

- We do no plan to develop new ones
- Are the monitored variables really consistent across containers running the same workloads?
- Fault injection and representativeness thereof

### SUMMARY

We believe that practical applicability is the current key issue

- Containers make a set of assumptions valid that may help us to solve the problem
- We are just starting...

#### Not a Silver Bullet

- Obviously, this cannot be applied to every application
- Application that fit the containerized model are suited
  - e.g. Microservices

### **QUESTIONS?**





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