





## **Automated Generation of Tailored Load Tests for Continuous Software** Engineering

Henning Schulz | Nov. 12, 2020





https://www.theverge.com/2018/7/16/17577654/amazon-prime-day-website-down-deals-service-disruption

## "The main objective in selecting a workload should always be representativeness" (Ferrari, 1972)



## Modern software engineering is continuous



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## **Existing load test generation process**



## **Our contribution (I): automation**



## **Our contribution (2): service-tailoring**



## Our contribution (III): context-tailoring



## We generated and executed 44 load tests



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## **Clustering and context improve accuracy**



## **Issue #1: the user behavior changes**



## Issue #2: forecasting has sharp jumps



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# We can generate tailored load tests automatically...



### ... but the existing workload characterization & forecasting methodologies are not (fully) ready for this

- 1. think times not integrated into clustering
- 2. missing prediction of curve shape

## **References (I)**

### A Survey on Load Testing of Large-scale Software Systems

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### How is performance addressed in DevOps?

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S. Eismann, C.-P. Bezemer, W. Shang, D. Okanović, and A. van Hoorn Proceedings of the 11th ACM/SPEC International Conference on Performance Engineering (ICPE 2020)

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## **Publications**

### Towards Automating Representative Load Testing in Continuous Software Engineering

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### Reducing the Maintenance Effort for Parameterization of Representative Load Tests Using Annotations

Henning Schulz, André van Hoorn, and Alexander Wert

Journal of Software Testing, Verification and Reliability, Special Issue on Testing Extra-functional Properties, 2019

## Microservice-tailored Generation of Session-based Workload Models for Representative Load Testing

Henning Schulz, Tobias Angerstein, Dušan Okanović, André van Hoorn Proceedings of the 27th IEEE International Symposium on Modeling, Analysis, and Simulation of Computer and Telecommunication Systems (MASCOTS 2019)

### **Behavior-driven Load Testing Using Contextual Knowledge – Approach and Experiences** Henning Schulz, Dušan Okanović, André van Hoorn, Vincenzo Ferme, Cesare Pautasso Proceedings of the 10th ACM/SPEC International Conference on Performance Engineering (ICPE 2019)