



Performance Advisory Council (PAC)  
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# Continuous Performance Testing: Challenges and Approaches

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CONTINUOUS PERFORMANCE TESTING: CHALLENGES AND APPROACHES

## Alex Podelko

- Has specialized in performance since 1997
- Senior Performance Engineer at AWS – Amazon Aurora
  - Before worked for MongoDB, Oracle/Hyperion, Intel, and Aetna
- CMG Board Director
- SPEC RG Steering Committee Member



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# Adjusting Performance Engineering to Industry Trends



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CONTINUOUS PERFORMANCE TESTING: CHALLENGES AND APPROACHES

## Industry Trends

- Web
  - Centralization, open / unlimited workload
- Cloud
  - Further centralization, price tag (FinOps)
  - Dynamic configurations / Self-Management
- Agile / iterative development
  - Continuous Integration / Delivery / Deployment
  - DevOps / SRE

[The Past, Present, and Future of Performance Engineering](#)



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## All Interconnected

### Centralization

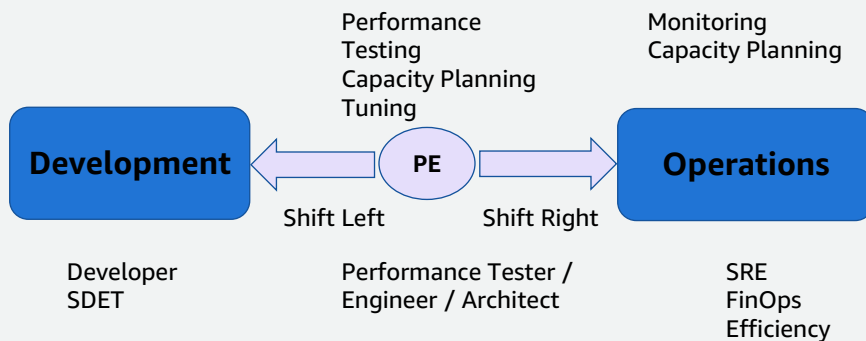
- => Control over deployments
- => Ability to deploy small changes
- => Agile development
- => Fuzzier line between Dev and Ops (DevOps, SRE)
- => Need for continuous performance engineering



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## Integrating Performance Engineering into DevOps



***Expand or be Squeezed Out ?***



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## Adjusting Performance Testing to Agile and CI

- Agile development should be rather a trivial case for performance testing
  - Working system on each iteration by definition
  - You need performance engineer for the whole project
    - Savings come from detecting problems early
- Addressing deficiencies of the traditional performance testing
  - Early Performance Testing
  - Continuous Performance Testing



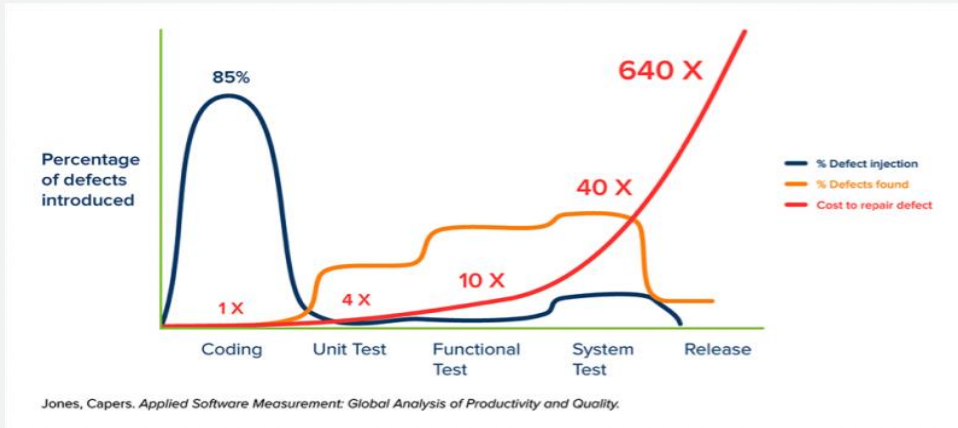
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## Early Performance Testing



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## Cost of Fixing Defects Earlier Is Significantly Lower



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## Early Testing - Mentality Change

- Making performance everyone's job
- Late record/playback performance testing -> Early Performance Engineering
- System-level requirements -> Component-level requirements
- Record/playback approach -> Programming to generate load/create stubs
- "Black Box" -> "Grey Box"



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# Continuous Performance Testing



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CONTINUOUS PERFORMANCE TESTING: CHALLENGES AND APPROACHES

## Integration into Agile and CI/CD

- Continuous performance testing
  - To catch regressions early
- Collecting all info needed to investigate regressions
  - In the form convenient for further analysis
- Foundation to build further automation on the top of it
  - For further performance optimization
- All context-dependent
  - Don't wait for an exact recipe, figure it out depending on your needs



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## Performance Testing Traditional vs Continuous

- Before releases
- Realistic Mix
  - As close to production as possible
- Checking Service Level Objectives (SLOs)
- Using a load testing tool or harness
- The approach is relatively consistent and well described
- Often (maybe even each build)
- Different tests
  - To maximize coverage
- Checking the difference between builds
- Using an additional layer of automation on the top of load testing tool
- All context-dependent



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## My View / Use of Terminology

### Performance Testing

*Exploratory Testing, Profiling, etc.*

### Automation

*Patch Testing, Optimization, etc.*

### Continuous Performance [Regression] Testing



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## Challenges of Continuous Performance Testing

- Integration
- Coverage Optimization
- Variability / Noise Reduction
- Change Detection
- Advanced Analysis
- Operations / Maintenance



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## The Challenge of Integration



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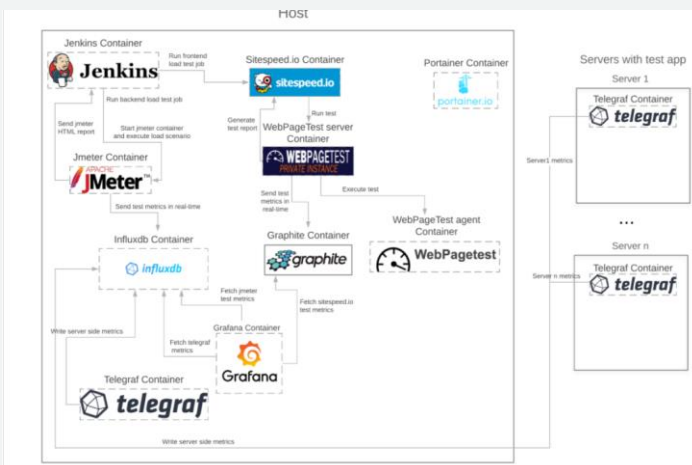
## Continuous Integration: Load Testing Tools

- CI support in load testing tools
  - Integration with CI Servers (Jenkins, Hudson, etc.)
  - Automation support
- CI tools support for performance testing
  - [Jenkins Performance Plugin](#) 
- Performance Testing Frameworks
  - Combining multiple tools



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## A Performance Testing Framework



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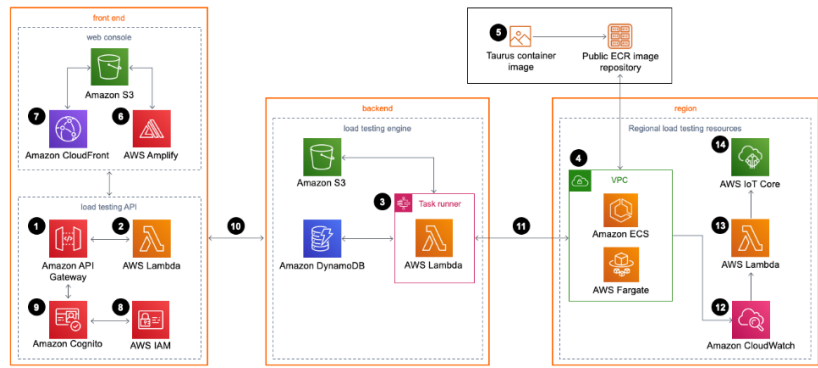
An example:

<https://github.com/serputko/performance-testing-framework>





# Distributed Load Testing on AWS



From AWS Solutions Library

<https://aws.amazon.com/solutions/implementations/distributed-load-testing-on-aws/>



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# Closely Integrated Systems

- Sophisticated, but proprietary closely integrated systems

- [Creating a Virtuous Cycle in Performance Testing at MongoDB](#)
- [Fallout: Distributed Systems Testing as a Service \(DataStax\)](#)
- [Tracking Performance of the Graal Compiler on Public Benchmarks \(Charles University / Oracle Labs\)](#)
- [Introducing Ballast: An Adaptive Load Test Framework \(Uber\)](#)



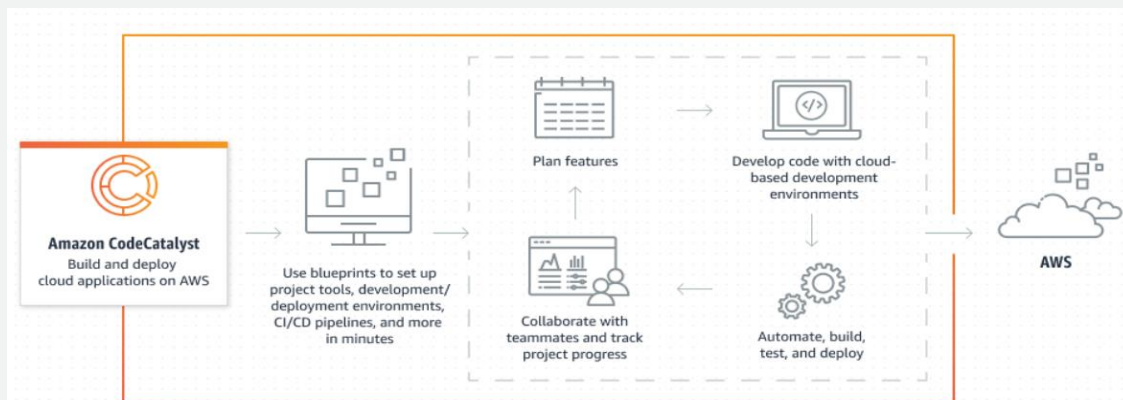
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## Unified Development Services

Such as AWS CodeCatalyst

<https://aws.amazon.com/codecatalyst/>



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# The Challenge of Coverage Optimization

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## Time / Resource Considerations

- Performance tests take time and resources
  - The larger tests, the more
- May be not an option on each commit
- Need of a tiered solution
  - Some performance measurements each commit
  - Daily mid-size performance tests
  - Periodic large-scale / uptime tests *outside CI*




## Coverage Optimization

- A multi-dimensional problem
  - Configuration
  - Workloads / Tests
  - Frequency of runs
- A trade off between coverage and costs
  - Costs of running, analyzing, maintenance, etc.



## The Challenge

- If addressed seriously, the number of workloads / tests / configurations is growing
- No good way to optimize
- One approach is to see if some results are correlated
  - If we find same problems on the same set of tests, we can use just one or few tests from this group
  - [Tracking Performance of the Graal Compiler on Public Benchmarks](#) (Charles University / Oracle Labs) 
- Combinatorial testing approaches (PairWise / Covering Arrays)
  - From functional testing



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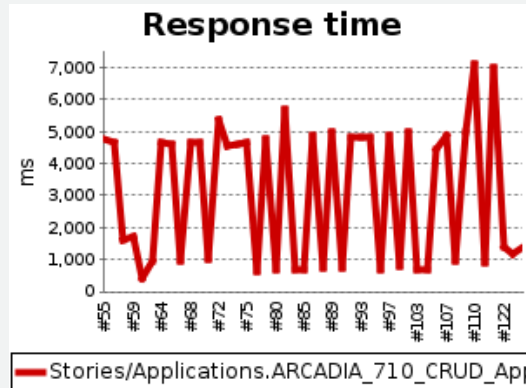
## The Challenge of Variability



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## Variability - Environment

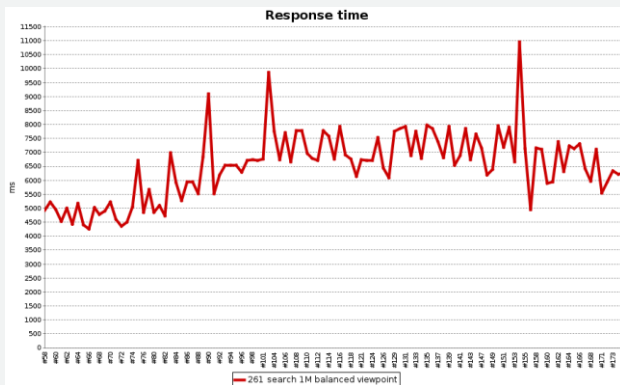
- Due to difference in environments



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## Variability - System

- Inherent to the test setup



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## Addressing Variability

- [Methodological principles for reproducible performance evaluation in cloud computing. 2019 \(SPEC RG – Cloud\)](#)
- [Reducing variability in performance tests on EC2: Setup and Key Results \(MongoDB\)](#)
- [Tracking Performance of the Graal Compiler on Public Benchmarks](#)



## Addressing Variability

- Same environment / starting config
  - For example, AWS cluster placement groups
- No other load
- Multiple iterations
- Reproducible multi-user tests
  - Restarts between tests
  - Clearing caches / Warming up caches
  - Staggering / Sync points



# The Challenge of Change Detection



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CONTINUOUS PERFORMANCE TESTING: CHALLENGES AND APPROACHES

## Complex Results

- No easy pass/fail
  - Individual responses, monitoring results, errors, etc.
- No easy comparison
  - Against SLA
  - Between builds
- Variability



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# Simple Comparison

## Jenkins Performance Plugin

URI	Samples	Samples diff	Average (ms)	Average diff (ms)
001 home	1	0	347	-22
005 login	1	0	2438	-66
157 views	1	0	117	-33
173 open volume view	1	0	84792	3945
261 search 1M balanced viewpoint	1	0	10964	4295
262 navigate 1M balanced viewpoint	1	0	208	-47
268 open 1M flat viewpoint	1	0	17462	-1562
272 open 1M grid	1	0	5040	572
282 search 1M grid	1	0	2247	8
283 navigate 1M grid	1	0	8343	-181
286 open 200k balanced viewpoint	1	0	16890	-3703
289 search 200k balanced viewpoint	1	0	1261	-1027
290 navigate 200k balanced viewpoint	1	0	148	10
296 validate 200k viewpoint	1	0	81126	723



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# keptn.sh



```

1  ----
2  spec_version: "1.0"
3  comparison:
4    aggregate_function: "avg"
5    compare_with: "single_result"
6    include_result_with_score: "pass"
7    number_of_comparison_results: 1
8  filter:
9  objectives:
10 - sli: "response_time_p95"
11   key_sli: false
12   pass: # pass if (relative change <= 10% AND absolute value is < 600ms)
13     - criteria:
14       - "<=+10%" # relative values require a prefixed sign (plus or minus)
15       - "<600" # absolute values only require a logical operator
16   warning: # if the response time is below 800ms, the result should be a warning
17     - criteria:
18       - "<=800"
19   weight: 1
20 total_score:
21   pass: "90%"
22   warning: "75%"

```

## Quality Gates SLIs / SLOs as code



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## Change Point Detection

- Statistical methods taking noise in consideration
- E-Divisive means algorithm
  - ICPE Paper: [Change Point Detection in Software Performance Testing](#)
  - [Fixing Performance Regressions Before they Happen](#), Netflix Technology Blog
  - <https://github.com/mongodb/signal-processing-algorithms>
    - Open sourced, generic
  - Need several data points. May miss a gradual degradation.



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## The Challenge of Advanced Analysis



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## Keep All Artifacts for Further Analysis

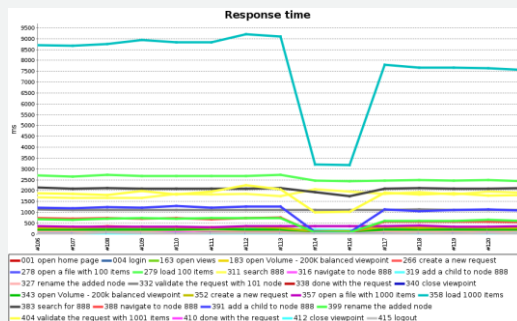
- Get all metrics
  - Throughputs, latencies, resource utilizations, etc.
- Save all related artifacts
  - Exact code / configuration
  - Logs, etc.
- Ability to re-run the test in the exactly same configuration is helpful



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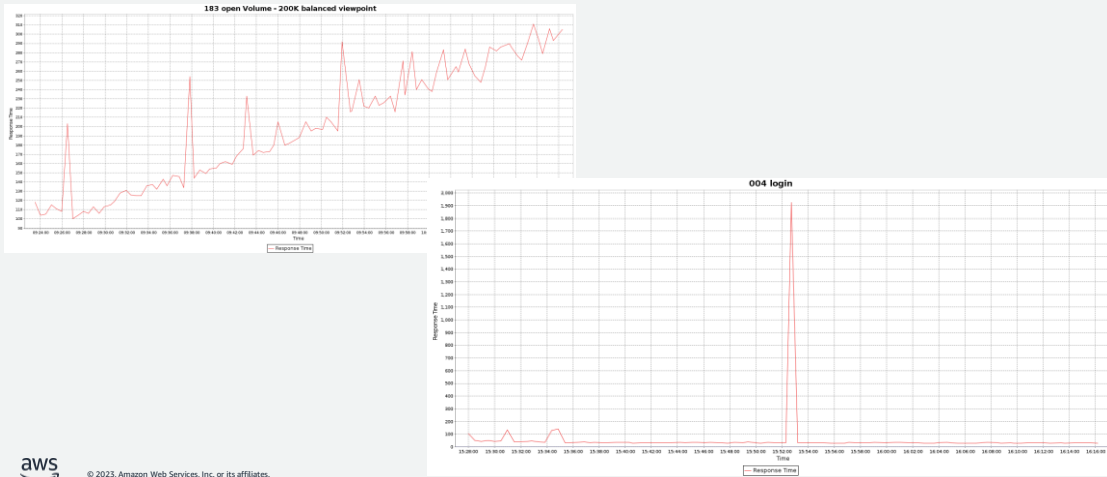
## Visualization

- [Visualizing systems and software performance - Report on the GI-Dagstuhl](#)
- Sometimes helps to catch an issue



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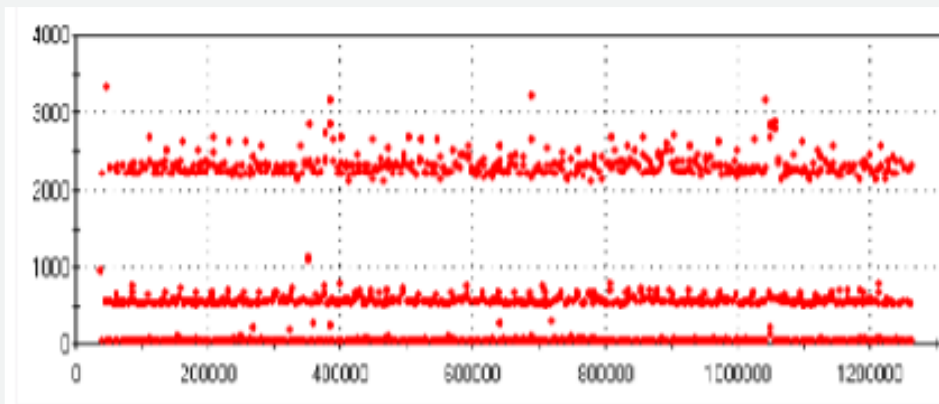
# Looking Beyond Aggregate Info



# Looking at Individual Results Patterns

Scatter charts – a “banding” pattern from

<http://www.perftestplus.com/resources/BPT6.pdf>



# The Challenge of Operations and Maintenance



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## Operations

- Scheduling / execution tests
- Results analysis
- Triaging and escalating issues
- Maintenance



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## Coverage / Maintenance Trade-Off



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## Catching / Troubleshooting Errors

- Catching errors is not trivial
  - Building in checks
  - Depends on interfaces used
    - Protocol-level [recording]
    - GUI
    - API/Programming
    - Production Workloads
- Keeping logs / all info needed to investigate issues

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## Changing Interfaces

- If using protocol-level or GUI scripts, minor changes may break them
  - It may be not evident
  - If recording used, a change in interfaces may require to recreate the whole script
- API / Programming is usually more stable / easier to fix
- AI to catch the changes / self-healing scripts



## Who Is Doing Maintenance?

- Who is responsible for what?
- Infrastructure Code
  - Tools, plumbing code, integration
- Specific tests
- Integrated workloads
  - Covered multiple functional areas



# Performance Skills Trends



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CONTINUOUS PERFORMANCE TESTING: CHALLENGES AND APPROACHES

## Skills in Demand

- All old good performance knowledge / skills
  - Not as much around load testing tools anymore
- Development / Scripting / Automation
  - Needed for early / continuous testing
- Performance understanding becoming a must in the industry
  - Need to go one level deeper



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## Algorithmic Complexity

- Time Complexity
- Space Complexity
- Big-O notation

***Almost in every interview around the globe !***

- Connect it with practical performance engineering?

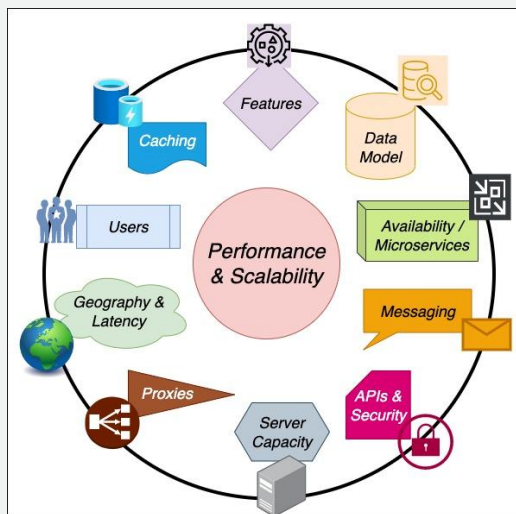


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## System Design Interview Cheat Sheet by Vahid Dejwakh



Just ***an example*** of the changing attitude



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## AWS Well-Architected Framework

### [The 6 Pillars of the AWS Well-Architected Framework](#)

- Operational Excellence
- Security
- **Reliability**
- **Performance Efficiency**
- **Cost Optimization**
- Sustainability

## Less Attention to Load Testing Tools

- Performance engineering shifted to
  - Other ways to mitigate performance risk
  - More closely integrated continuous performance testing
- Proliferation of APIs / simple open-source tools

## SUMMARY

- Adjusting Performance Testing to Agile and CI is the main trend
- Specific challenges should be addressed:
  - Integration
  - Coverage Optimization
  - Variability / Noise Reduction
  - Change Detection
  - Advanced Analysis
  - Operations / Maintenance
- Performance engineering gets more integrated, context-dependent
  - Integrated into both **Development** and **Operations**



# Thank you!

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