



# **Performance Testing Java Applications**

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**What is Performance?**

# Throughput / Bandwidth



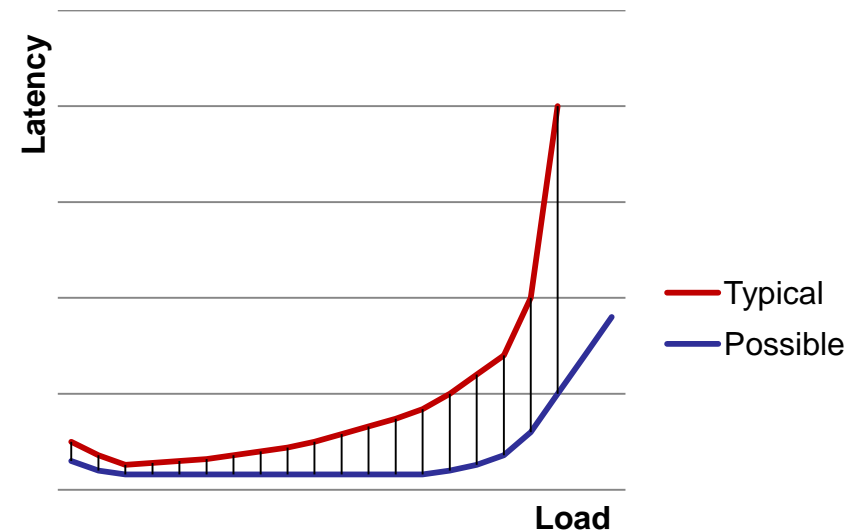
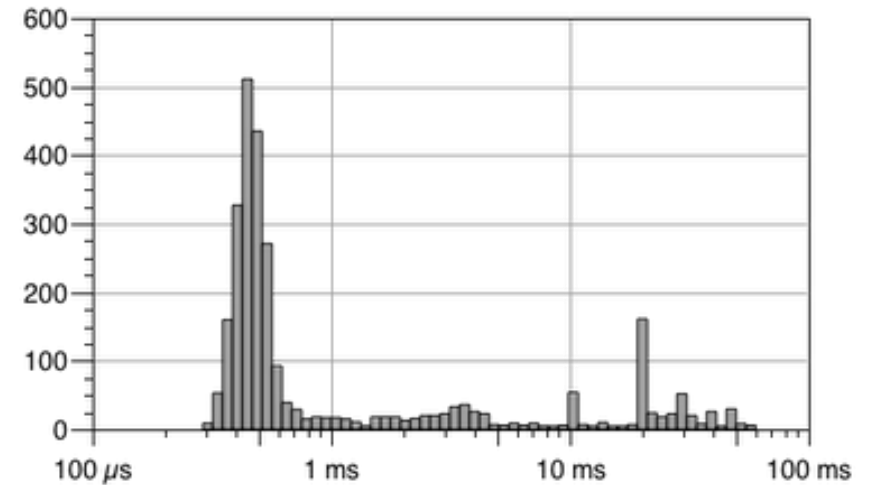


# Latency / Response Time



# Throughput vs. Latency

- How does an application cope under burst conditions?
- Are you able to measure queuing delay?
- Back-off strategies and other effects
- Amortise the expensive operations – Smart Batching



# Performance Requirements

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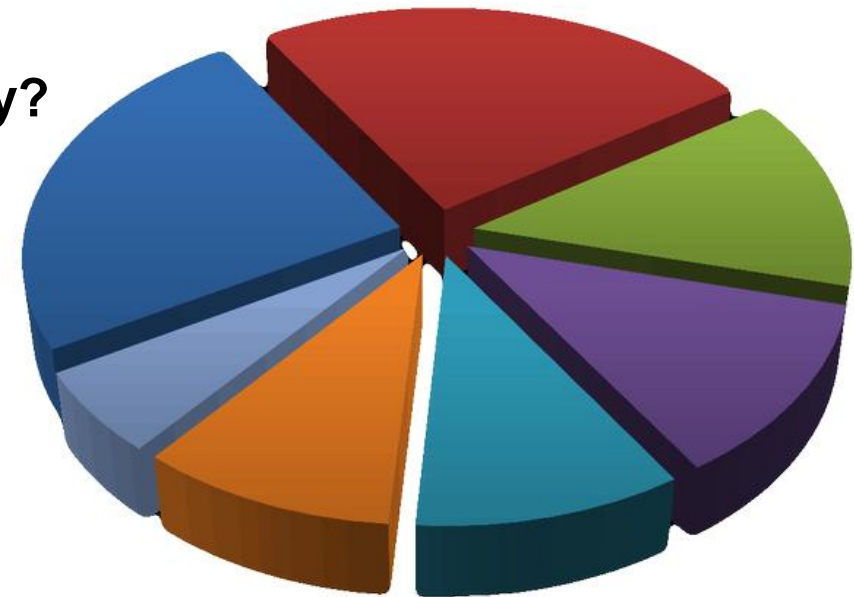
- **What throughput and latency does your system require?**
  - Do you need to care?
  - How will you be competitive?
  - Does performance drive business?
- **Investments start from a business plan**
  - Work with the business folk
  - Set Transaction Budget limits
- **As the business scales does the software scale in an economic fashion?**
  - Don't limit design options





# Decompose the Transaction Budget

- How much time is each layer in the architecture allowed?
- Do all technology choices pay their way?
  - Think Aircraft or Spacecraft!
- Profile to ensure budget is enforced
- What happens when throughput increases?
  - Queuing delay introduced?
  - Scale out at constant latency?



X  $\mu$ s Total with  
Breakdown

**How can we test  
Performance?**

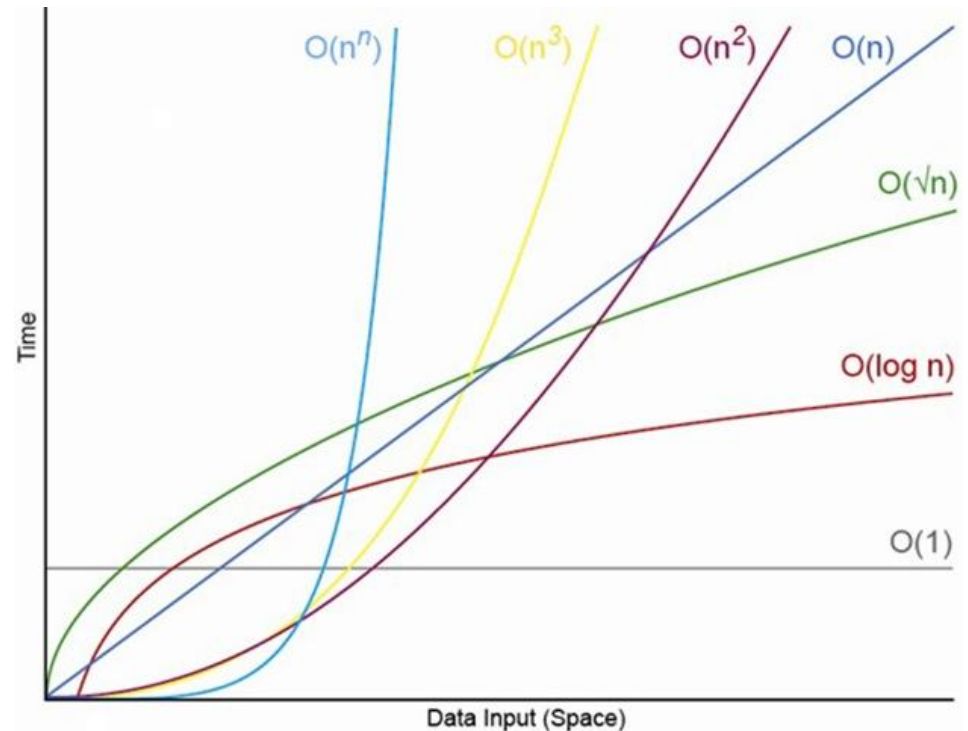
# Types of Performance Testing

1. Throughput / Bandwidth Testing
2. Latency / Response Testing
3. Stress Testing
4. Concurrent / Contention Testing
5. Endurance / Soak Testing
6. Capacity Testing



# Understand Algorithm Behaviour

- Need to model realistic scenarios
  - Read to write ratios
  - Distribution across data sets
  - No single entity / item tests!
- Model based on production
- Are unbounded queries allowed?
  - Deal in manageable chunks



# The “Onion”

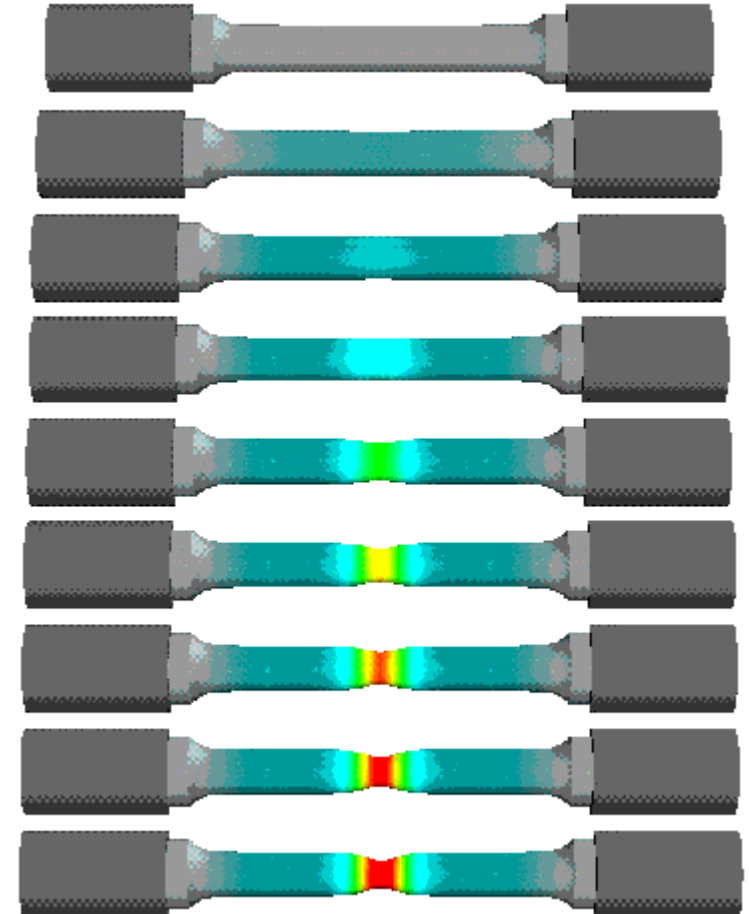
- **Separation of Concerns is key**
  - **Layer your architecture**
- **Test individual components**
- **Test assemblies of components with a focus on interactions**
  - **Beware micro-benchmarking!**
- **Test core infrastructure**
  - **Useful for catching upgrade issues**
- **Same patterns at different levels of scale**





# Know Your Platform/Infrastructure

- **Stress test until breaking point**
  - Do things degrade gracefully?
  - Do things crash?
  - Order of the algorithms?
- **What are the infrastructure capabilities?**
  - Profile to know relative costs of components
  - Operations Per Second
  - Bandwidth
  - Latency
  - Endurance
- **What happens when redundant components take over?**



**When should we test  
Performance?**

# Performance Test & Profile

***“Premature optimization is the root of all evil”***

**– Donald Knuth / Tony Hoare**

- **What does “optimization” mean?**
  - **Specialisation vs. Flexibility?**
  - **Very different from knowing your system capabilities**
  - **Test / profile early and often**
- **Integrate performance testing to CI**
- **Monitor production systems**
- **Change your development practices...**



# Development Practices

- Performance ***“Test First”***
- Red, Green, Debug, Profile, Refactor...
  - A deeper understanding makes you faster
- Use ***“like live”*** pairing stations
- Don't add features you don't need
- Poor performance should fail the build!



# **Performance Testing in Action**



# The Java Pitfalls

- **Runtime Compiler**
  - JIT & On Stack Replacement (OSR)
  - Polymorphism and In-lining
  - Dead code elimination
  - Race conditions in optimisation
- **Garbage Collection**
  - Which collector - Dev vs. Production
  - Skewed results from pauses
  - Beware “Card Marking”
- **Class Loading**



# Micro Benchmarking

- Framework should handle warm up
- Representative Data Sets
  - Vary set size
- Key Measures
  - Ops Per Second (per thread)
  - Allocation rates
- Concurrent Testing
  - Scaling effects with threads
  - Queuing effects

```
public class MyBenchmark
    extends Benchmark
{
    public void timeMyOp(int reps)
    {
        int i = reps + 1;
        while (--i != 0)
        {
            MyClass.myOperation();
        }
    }
}
```

# Anatomy Of A Micro Benchmark

```
public class MapBenchmark
    extends Benchmark
{
    private int size;
    private Map<Long, String> map = new MySpecialMap<Long, String>();

    private long[] keys;
    private String[] values;

    // setup method to init keys and values

    public void timePutOperation(int reps)
    {
        for (int i = 0; i < reps; i++)
        {
            map.put(keys[i], values[i]);
        }
    }
}
```

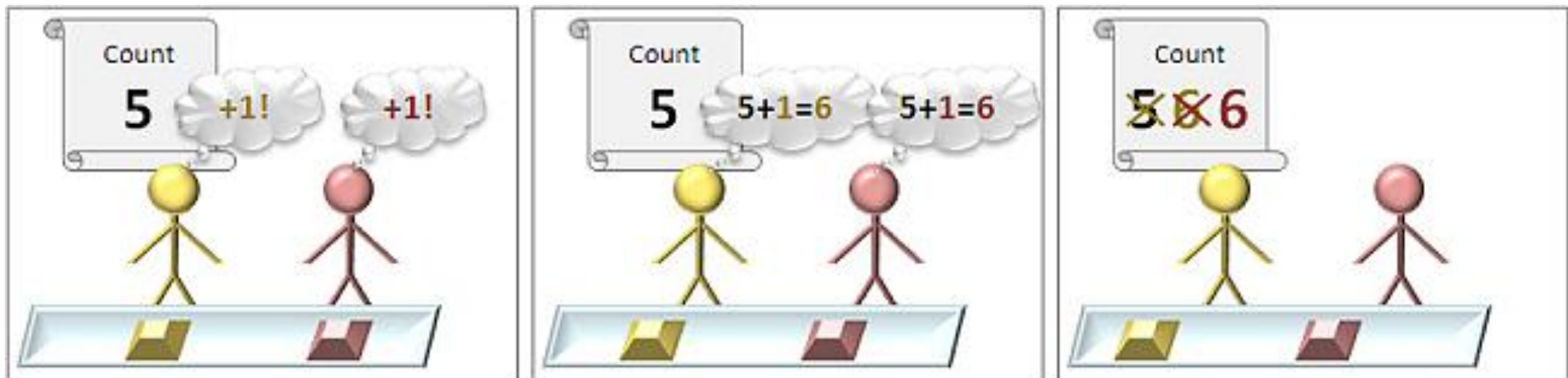
# Performance Testing Concurrent Components

- **Straight Performance Tests**

- Ramp number of threads for plotting scaling characteristics
- Measure Ops / Sec throughput – Averages vs. Intervals
- Measure latency for queuing effects

- **Validating Performance Tests**

- Check invariants and sequences



# System Performance Tests

**Distributed Load  
Generation Agents**

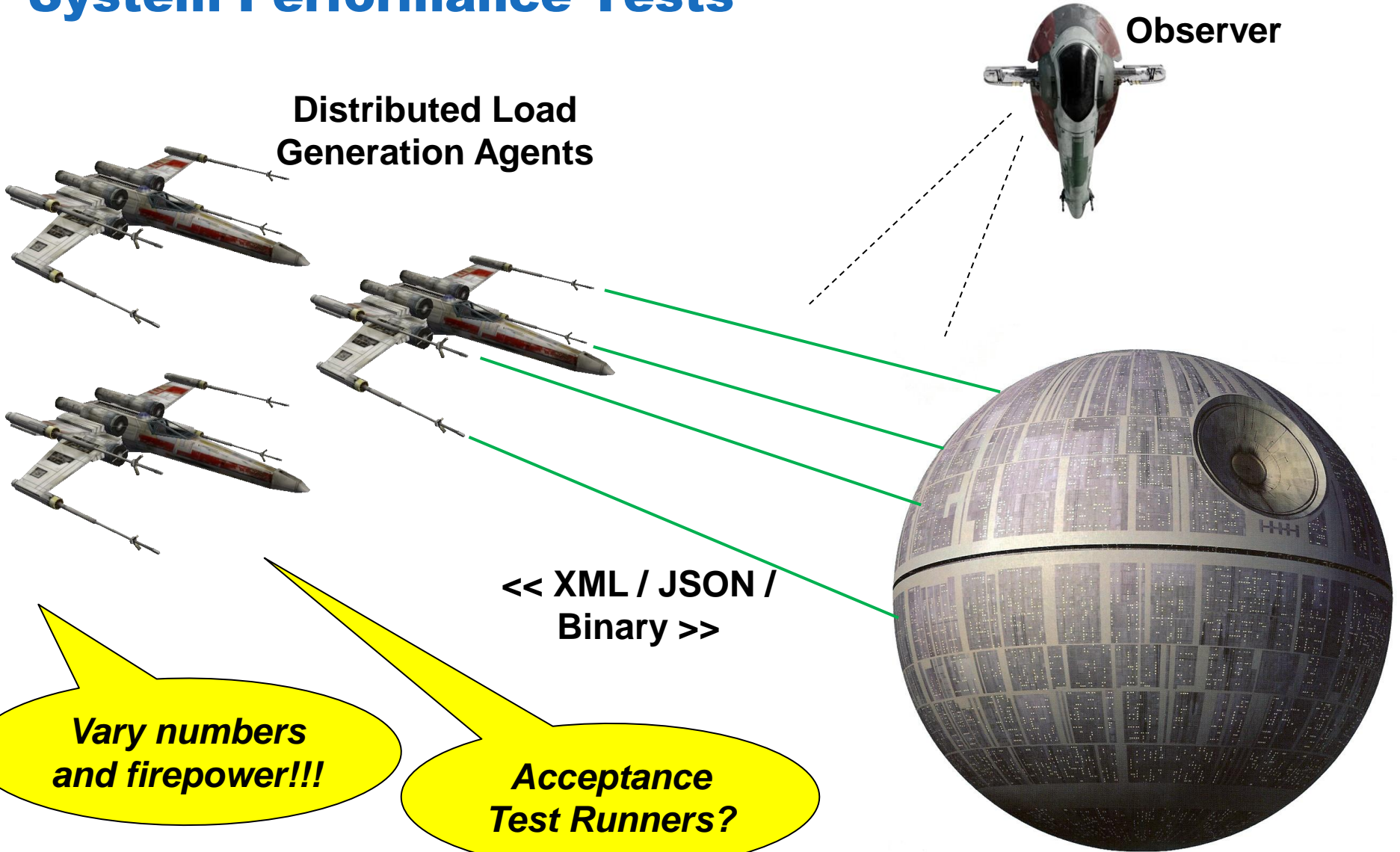
**Observer**

**<< XML / JSON /  
Binary >>**

***Vary numbers  
and firepower!!!***

***Acceptance  
Test Runners?***

**System Under Test**





# System Performance Testing Analysis

- **Build a latency histogram for given throughput**
  - **Disruptor Histogram, HdrHistogram**
  - **Investigate the outliers!**
- **Gather metrics from the system under test**
  - **Design system to be instrumented**
  - **Don't forget the Operating System**
  - **Plot metrics against latency and throughput**
  - **Capacity planning from this is possible**
- **Generate micro-bursts**
  - **They show up queuing effects at contention points**
  - **Uncover throughput bottlenecks**



**Got a Performance Issue?**

# Performance Profiling

- **Java Applications**
  - JVisualVM, YourKit, Solaris Studio, etc
  - What is the GC doing?
  - Learn bytecode profiling
- **Operating System**
  - htop, iostat, vmstat, pidstat, netstat, etc.
- **Hardware**
  - Perf Counters – perf, likwid, VTune
- **Follow Theory of Constraints for what to tackle!**



# Performance Testing Lessons

# Mechanical Sympathy

- **Java Virtual Machines**
  - Garbage Collection
  - Optimization
  - Locks
- **Operating Systems**
  - Schedulers
  - Virtual Memory
  - File Systems & IO
- **Hardware**
  - Hardware capabilities and interactions
  - Profile the counters for greater understanding





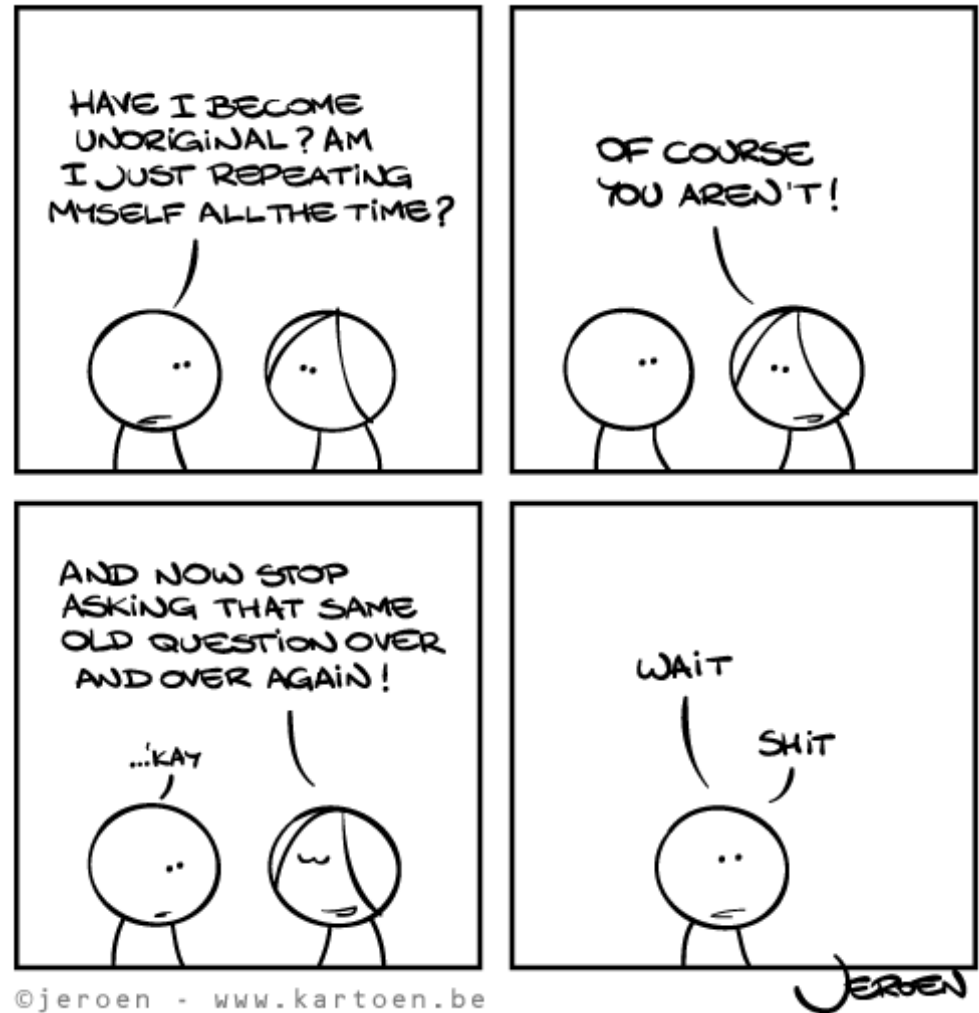
# The Issues With “Time”

- **NTP is prone to time correction**
  - Careful of `System.currentTimeMillis()`
- **Monotonic time not synchronised across sockets**
  - `System.nanoTime()` is monotonic
  - RDTSC is not an ordered instruction
- **Not all servers and OSes are equal**
  - Pre Nehalem TSC was not invariant
  - Older OSes and VT can be expensive
  - Resolution is highly variable by OS/JVM



# Beware Being Too Predictable

- CPU Branch Prediction
  - Fake Orders
  - Taking same path in code
- Cache hits
  - Disk loaded into memory
  - Memory loaded into CPU cache
  - Application level caching



## Beware YAGNI



# The “Performance Team” Anti-Pattern

- They struggle to keep up with rate of change
- Performance testing is everyone's responsibility
- Better to think of a “Performance Team” as a rotating R&D exercise
- Performance specialists should pair on key components and spread knowledge



# Lame Excuses - “It’s only ...”

- It is only start-up code...
  - MTTF + MTTR
- It is only test code...
  - Feedback cycles!
- It is only UI code...
  - Read “High Performance Web Sites” by Steve Souders



# Questions?

Blog: <http://mechanical-sympathy.blogspot.com/>

Twitter: @mjpt777

Links:

<https://github.com/giltene/HdrHistogram>

<https://github.com/LMAX-Exchange/disruptor/blob/master/src/main/java/com/lmax/disruptor/collectors/Histogram.java>

<https://code.google.com/p/caliper/>

<http://grinder.sourceforge.net/>

<http://www.javaworld.com/javaworld/jw-08-2012/120821-jvm-performance-optimization-overview.html>