

#### QCON 全球软件开发大会 【北京站】2016

## OS-caused Long JVM Pauses - Deep Dive and Solutions

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# このり2016.10.20~22上海・宝华万豪酒店

#### 全球软件开发大会2016

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**优惠(截至06月21日)** 现在报名,立省2040元/张

#### Outline

- ☐ Introduction
- Background
- ☐ Scenario 1: startup state
- ☐ Scenario 2: steady state with memory pressure
- ☐ Scenario 3: steady state with heavy IO
- Lessons learned

#### Introduction

- ☐ Java + Linux
  - Java is popular in production deployments
  - Linux features interact with JVM operations
  - Unique challenges caused by concurrent applications
- Long JVM pauses caused by Linux OS
  - Production issues, in three scenarios
  - Root causes
  - Solutions
- ☐ References
  - Ensuring High-performance of Mission-critical Java Applications in Multitenant Cloud Platforms, IEEE Cloud 2014
  - Eliminating Large JVM GC Pauses Caused by Background IO Traffic,
     LinkedIn Engineering Blog, 2016 (Too many tweets bringing down a twitter server! :)

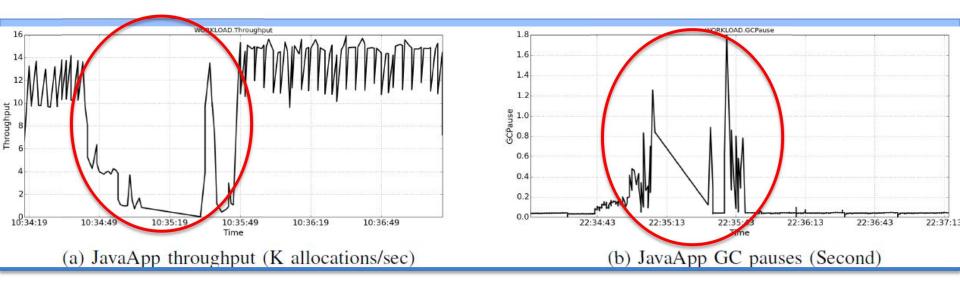
#### Background

- ☐ JVM and Heap
  - Oracle HotSpot JVM
- ☐ Garbage collection
  - Generations
  - Garbage collectors
- Linux OS
  - Paging (Regular page, Huge page)
  - Swapping (Anonymous memory)
  - Page cache writeback (Batched, Periodic)

#### Scenarios

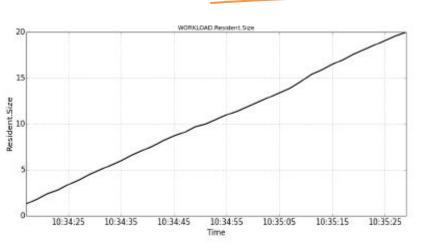
- ☐ Three scenarios
  - Startup state
  - Steady state with memory pressure
  - Steady state with heavy IO
- Workload
  - Java application keeps allocating/de-allocating objects
  - Background applications taking memories or issuing disk IO
- Performance metrics
  - Application throughput (K allocations/sec)
  - Java GC pauses

#### Scenario 1: Startup State (App. Symptoms)

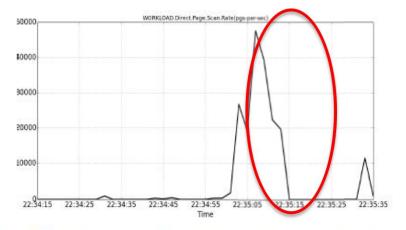


- ☐ When Java applications start
- ☐ Life is good in the beginning
- ☐ Then Java throughput drops sharply
- ☐ Java GC pauses spike during the same period

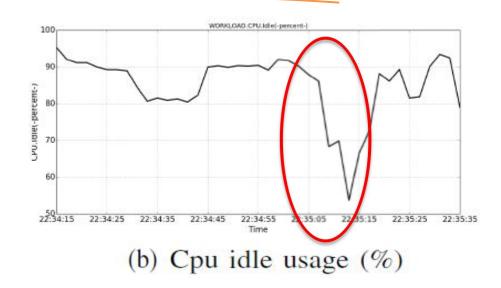
#### Scenario 1: Startup State (Investigations)



(a) JVM resident size (GB)



(c) Direct page scanning (pages per second)

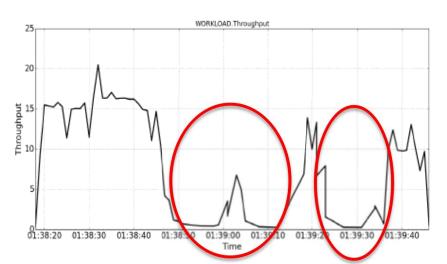


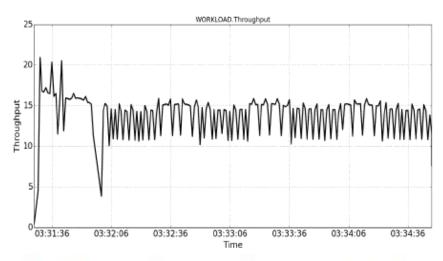
- Java heap is gradually allocated
- Without enough memory, direct page scanning can happen
- Heap is swapped out and in
  - It causes large GC

#### Solutions

- ☐ Pre-allocating JVM heap spaces
  - JVM "-XX:AlwaysPreTouch"
- Protecting JVM heap spaces from being swapped out
  - Swappoff command
  - Swappiness
    - =0 for kernel version before 2.6.32-303
    - =1 for kernel version from 2.6.32-303
  - Cgroup

#### Evaluations (Pre-allocating Heap)



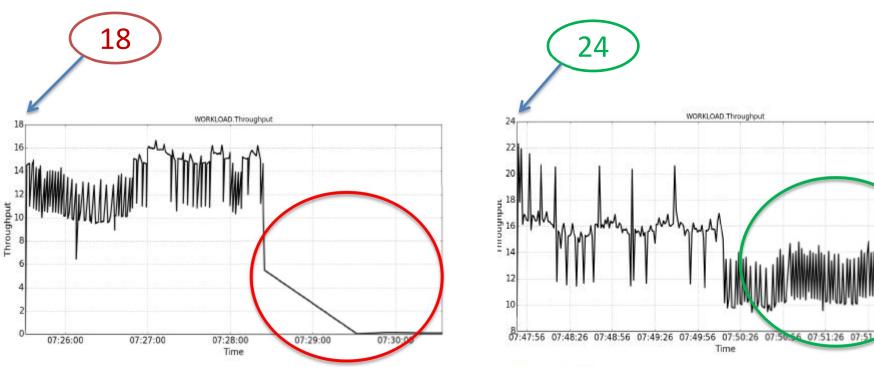


(a) Throughput without AlwaysPreTouch (b) Throughput with AlwaysPreTouch

#### STARTUP DELAY OF PRE-ALLOCATING JVM HEAP SPACE

| Heap size (GB)    | 1   | 2   | 4   | 10  | 20  | 30 | 40 |
|-------------------|-----|-----|-----|-----|-----|----|----|
| Start delay (Sec) | 0.5 | 0.8 | 1.6 | 2.5 | 7.3 | 11 | 15 |

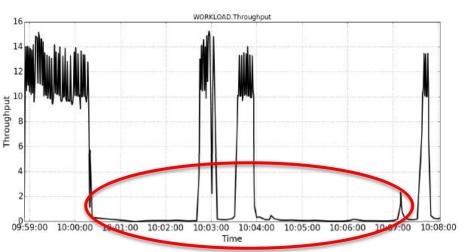
#### **Evaluations (Protecting Heap)**



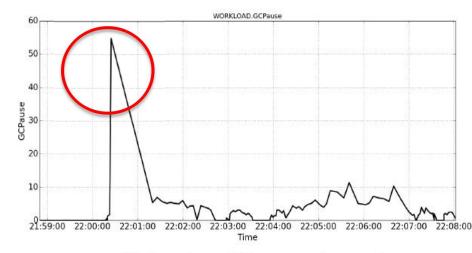
(a) Throughput when swappiness=100

(b) Throughput when swappiness=0

#### Scenario 2: Steady State (App. Symptoms)



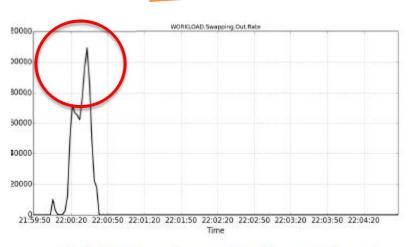
(a) JavaApp throughput (K allocations/sec)

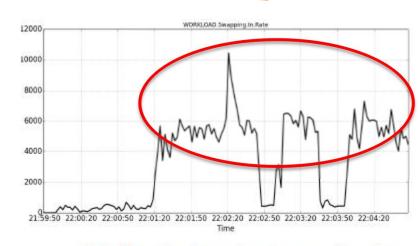


(b) JavaApp GC pauses (second)

- During steady state of a Java application, system memory stresses due to other applications
- Java throughput drops sharply and performs badly
- ☐ Java GC pauses spike

#### Scenario 2: Steady State (Level-1 Investigations)





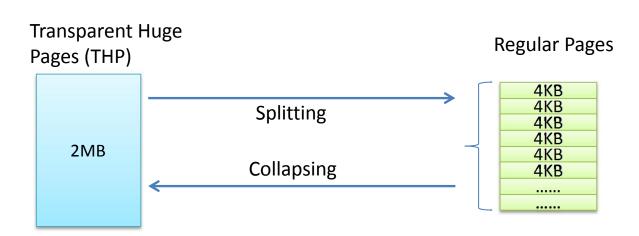
(a) Swapping out (pages/sec)

- (b) Swapping in (pages/sec)
- ☐ During GC pauses, swapping activities persist
- ☐ Swapping in JVM pages causes GC pauses
- ☐ However, swapping is not enough

[Times: user=0.12 sys=54.67, real=54.83 secs]

- Excessive GC pauses (i.e., 55 seconds)
- High sys-cpu usage (swapping is not sys-cpu intensive)

#### Scenario 2: Steady State (Level-2 Investigations)



- ☐ THP (Transparent Huge Pages)
  - Improved TLB cache-hits
- ☐ Bi-directional operations
  - THPs are allocated first, but split during memory pressure
  - Regular pages are collapsed to make THPs
  - CPU heavy, and thrashing!

#### Solutions

- Dynamically adjusting THP
  - Enable THP when no memory pressure
  - Disable THP during memory pressure period
  - Fine tuning of THP parameters

#### **Evaluations (Dynamic THP)**

☐ Without memory pressure

Dynamic THP delivers similar performance as THP is on

| Mechanism                      | THP Off | THP On | Dynamic THP |
|--------------------------------|---------|--------|-------------|
| Throughput (K allocations/sec) | 12      | 15     | 15          |

- ☐ With memory pressure
  - Dynamic THP has some performance overhead
  - Performance is less than THP-off
  - But better than THP-on

| Mechanism                      | THP Off | THP On | Dynamic THP |
|--------------------------------|---------|--------|-------------|
| Throughput (K allocations/sec) | 13      | 11     | 12          |

#### Scenario 3: Steady State (Heavy IO)

```
2016-01-14T22:08:28.028+0000: 312052.604: [GC (Allocation Failure) 312064.042: [ParNew Desired survivor size 1998848 bytes, new threshold 15 (max 15)
- age 1: 1678056 bytes, 1678056 total
: 508096K->3782K(508096K), 0.0142796 secs] 1336653K->835675K(4190400K), 11.4521443 secs]

[Times: USEI=0.18 SyS=0.01, IEal=11.45 secs]
2016-01-14T22:08:39.481+0000: 312064.058: Total time for which application threads were stopped: 11.4566012 seconds
```

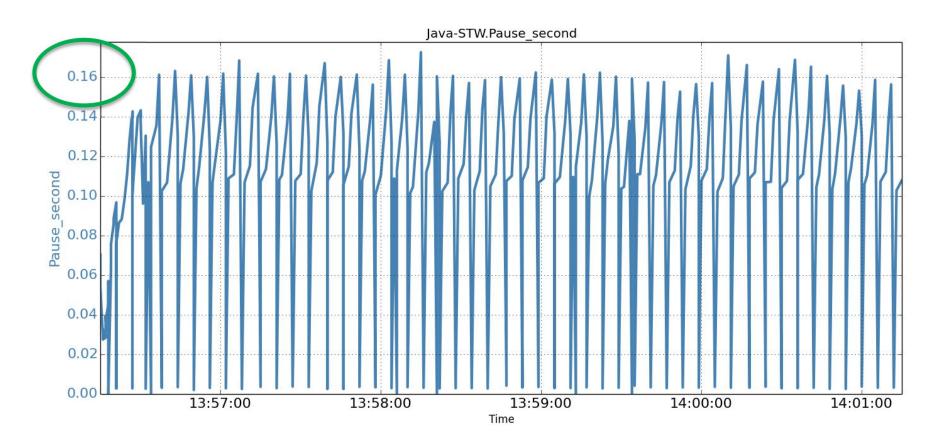
- Production issue
  - Online products
  - Applications have light workload
  - Both CMS and G1 garbage collectors
- Preliminary investigations
  - Examined many layers/metrics
  - The only suspect: disk IO occasionally is heavy
  - But all application IO are asynchronous

#### Reproducing the problem

- Workload
  - Simplified to avoid complex business logic
  - https://github.com/zhenyun/JavaGCworkload
- Background IO
  - Saturating HDD

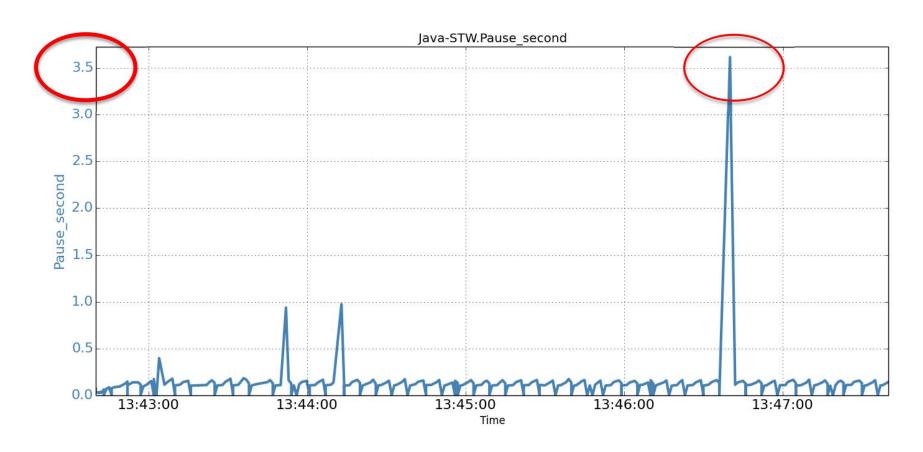
| Setup   | Values   |  |  |  |
|---|--|--|--|--|
| Platform  | HP Z620 Workstation with 1 socket of 12 Intel(R) Xeon(R) CPU E5-2620 2GHz hardware cpus. |  |  |  |
| os  | RHEL Linux 2.6.32-504.el6.x86_64   |  |  |  |
| Hard Drives   | Mirrored setup consisting of two SEAGATE ST3450857SS disks, SAS-connected.               |  |  |  |
| File system   | EXT4, with default mounting options.   |  |  |  |
| JDK   | Oracle HotSpot JDK-1_8_0_5   |  |  |  |
| -Xmx10g -Xms10g -XX:+UseG1GC -Xloggc:gc.log -XX:+PrintGCDateStar<br>-XX:+PrintGCTimeStamps -XX:+PrintGCApplicationStoppedTime |  |  |  |  |

#### Case I: Without background IO



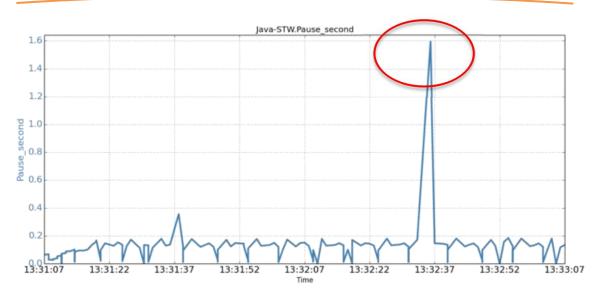
No single longer-than-200ms pause

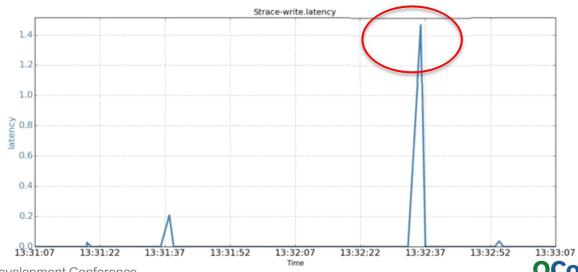
#### Case II: With background IO



Huge pause!

#### Investigations





#### Time lines

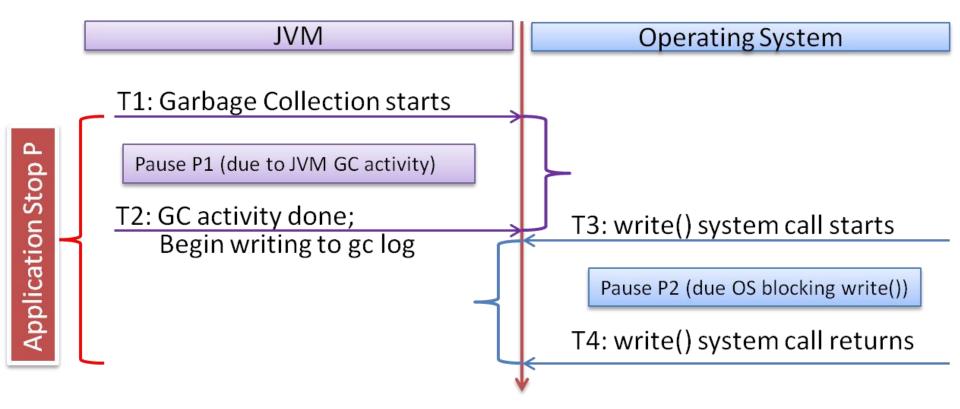
# Line 1> 2015-12-21T13:32:33.736-0800: 86.268: Total time for which application threads were stopped: 0.1714770 seconds Line 2> 2015-12-21T13:32 35.04)-0800: 87.578: [GC pause (G1 Evacuation Pause) (young) 7814M-> 4114M(10G), 0.1227713 secs] Line 3> 2015-12-21T13/32 36.64)-0800: 89.172: Total time for which application threads were stopped: 1.5946271 seconds strace output: Line 4> [pid 11797] 13:32 35.169022 write(3 "2015-12-21T13:32:33.736-0800: 86"..., 224 <unfinished ...> Line 5> [pid 11797] 13:32 36.640856 <... write resumed> ) = 224 <1.470906>

□ At time 35.04 (line 2), a young GC starts and takes 0.12 seconds to complete.
 □ The young GC finishes at time 35.16 and JVM tries to output the young GC statistics

to gc log file by issuing a write() system call (line 4)

- ☐ The write() call finishes at time 36.64 after being blocked for 1.47 seconds (line 5)
- When write() call returns to JVM, JVM records at time 36.64 this STW pause of 1.59 seconds (i.e., 0.12 + 1.47) (line 3).

#### Interaction between JVM and OS



#### Non-blocking IO can be blocked

- ☐ Stable page write
  - For file-backed writing, OS writes to page cache first
  - OS has write-back mechanism to persist dirty pages
  - If a page is under write-back, the page is locked
- ☐ Journal committing
  - Journals are generated for journaling file system
  - When appending GC log files needs new blocks, journals need to be committed
  - Commitment might need to wait

#### Background IO activities

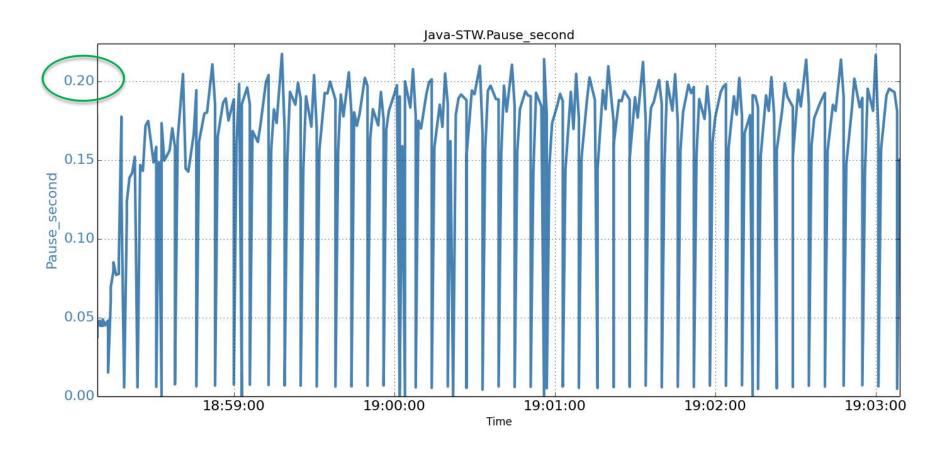
- OS activity such as swapping
  - Data writing to underlying disks
- Administration and housekeeping software
  - System-level software such as CFEngine also perform disk IO
- ☐ Other co-located applications
  - Co-located applications that share the disk drives, then other applications contend on IO
- ☐ IO of the same JVM instance
  - The particular JVM instance may use disk IO in ways other than GC logging

#### Solutions

- Enhancing JVM
  - Another thread
  - Exposing JVM flags
- ☐ Reducing IO activities
  - OS, other apps, same app
- ☐ Latency sensitive applications
  - Separate disk
  - High performing disks such as SSD
  - Tmpfs

#### **Evaluation**

#### ☐ SSD as the disk



#### The good, the bad, and the ugly

```
2016-01-14T22:08:28.028+0000: 312052.604: [GC (Allocation Failure) 312064.042: [ParNew Desired survivor size 1998848 bytes, new threshold 15 (max 15)
- age 1: 1678056 bytes, 1678056 total
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```

- ☐ The good: low real time
  - Low user time and low sys time
  - [user=0.18 sys=0.01, real=0.04 secs]
- ☐ The bad: non-low (but not high) real time
  - High user time and low sys time
  - [user=8.00 sys=0.02, real=0.50 secs]
- ☐ The ugly: high real time
  - High sys time [user=0.02 sys=1.20, real=1.20 secs]
  - Low sys time, low user time [Example?]

#### Lessons Learned (I)

- □ Be cautious about Linux's (and other OS) new features
  - Constantly incorporating new features to optimize performance
  - Some features incur performance tradeoff
  - They may backfire in certain scenarios

#### Lessons Learned (II)

- □ Root causes can come from seemingly insignificant information
  - Linux emits significant amount of performance information
  - Most of us most of the time mostly only examine a small subset of them
  - Don't ignore others understand the interactions of sub-components

#### Lessons Learned (III)

- ☐ Pay attention to multi-layer interaction
  - Application protocol, JVM, OS, storage/networking
  - Most people are familiar with a few layers
  - Optimizations done at one layer may adversely affect other layers
  - Many performance problems are caused by the cross-layer interactions





### THANKS!

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