



# PERFORMANCE CHARACTERIZATION AND OPTIMIZATIONS IN GRAAL AT INTEL

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# Introduction

- **About me**
  - Software Engineer at Intel since 2014
  - Contributed to several compilers and runtime systems
  - Involved in Java\* optimizations since early 2017
- **What we will present**
  - Performance comparison: C2\* vs. Graal\* CE
  - Initial analysis and contributions

## Our vision

**“As Graal moves forward, our goal is to leverage its performance to be at least on par with C2 on Intel platforms.”**

# Performance comparison: Graal CE vs. C2

- **Initial analysis on selected benchmarks**
  - SPECjvm2008\*
  - JDK\* micro-benchmarks suite
- **Workloads of interest moving forward**
  - Java frameworks (Apache Hadoop\*, Apache Kafka\*...)
  - Cloud and Serverless
  - Real-world Java applications

# Setup

Linux* Kernel	4.15.6-300
Sockets	2S Intel® Xeon® Platinum 8180
OpenJDK*	11.0.1
Java Options	<code>-Xmx25G -Xms25G -Xmn15G -XX:+UseParallelGC -XX:+UnlockExperimentalVMOptions</code>
SPECjvm2008	<code>-ict -ivk -wt 60 -i 5 -bt 56</code>
NUMA control	<code>--cpunodebind=1 --localalloc</code>
C2	Default 11.0.1
Graal	Graal CE tip (Mid-December 2018)

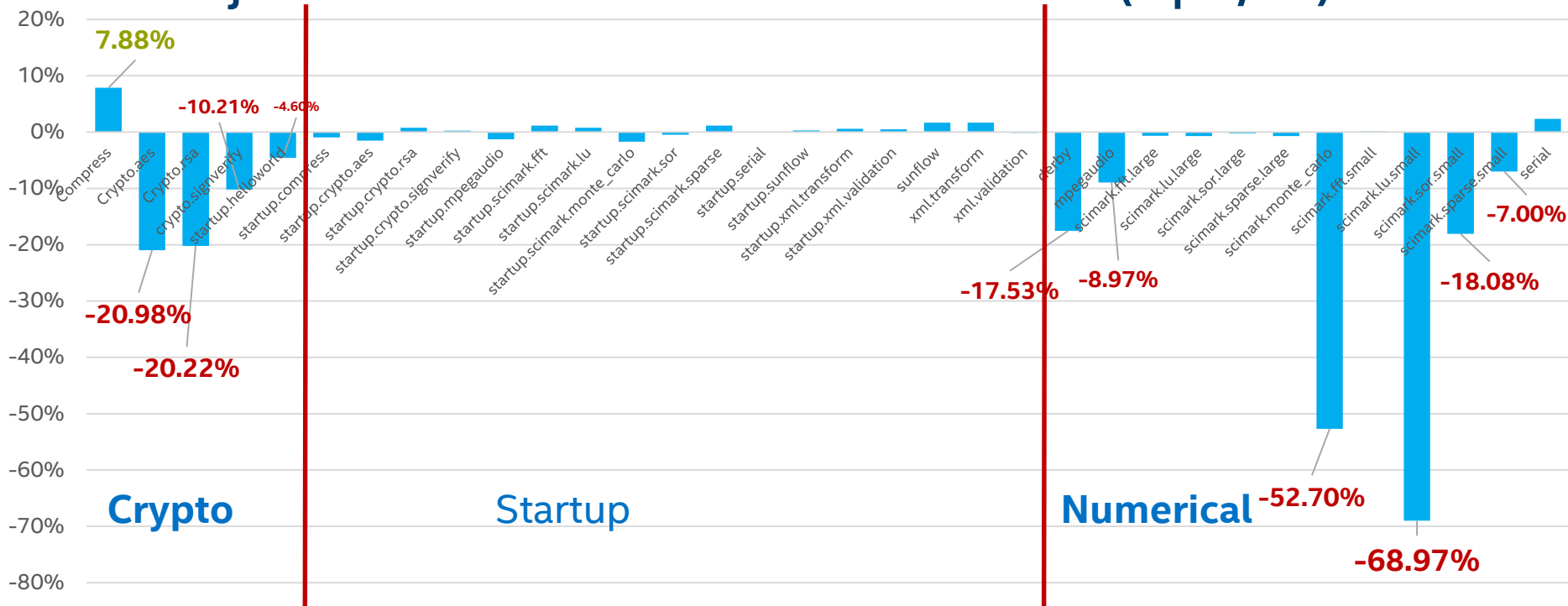
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# SPECjvm2008: Graal CE vs. C2 score (ops/m)



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# Crypto regressions: Signverify as example (-10%)

## C2 hotspots

## Graal CE hotspots

SAMPLE_DIVISOR 1.0	Clks %
Created 12/20/18 14:29:02	
[3]implCompress0((BI)V	41.97
<b>14_sha256_implCompressMB</b>	<b>20.25</b>
[2]implCompress((BI)V	11.53
montgomery_multiply(unsigned long*, unsigned long*, unsigned long*, unsign	8.25
[2]harnessMain((V	3.47
33_byte_disjoint_arraycopy	
[2]b2iBig64((BI)(V	
null	
UnmappedSamples	
[2]b2iLittle64((BI)(V	
SharedRuntime::montgomery_square(int*, int*, int, long, int*)	
[2]implCompress((BI)V	
[6]engineUpdate((BI)V	
[2]oddModPow(Ljava/math/BigInteger;Ljava/math/BigInteger;L	
[4]divideMagnitude(Ljava/math/MutableBigInteger;Ljava/math/M	
32_byte_arraycopy	
[7]divideMagnitude(Ljava/math/MutableBigInteger;Ljava/math/M	
SharedRuntime::montgomery_multiply(int*, int*, int*, int, long,	

SAMPLE_DIVISOR 1.0	Clks %
Created 12/20/18 14:29:29	
[2]implCompress((BI)V	47.14
<b>15_sha256_implCompress</b>	<b>21.39</b>
[2]implCompress((BI)V	9.74
montgomery_multiply(unsigned long*, unsigned long*, unsigned lo	7.52
[3]getTestData(Ljava/lang/String;)B	3.87
copy	2.35
	1.53
	1.19
	1.04
mercy_square(int*, int*, int, long, int*)	0.75
math/MutableBigInteger;Ljava/math/Mutal	0.73
ck0((BI)(	0.61
h/BigInteger;Ljava/math/BigInteger;)Ljava/	0.48
	0.40
mercy_multiply(int*, int*, int*, int, long, int*)	0.20
	0.12
y/MutableBigInteger;Ljava/math/MutableB	0.05
hread*).part.75	0.04

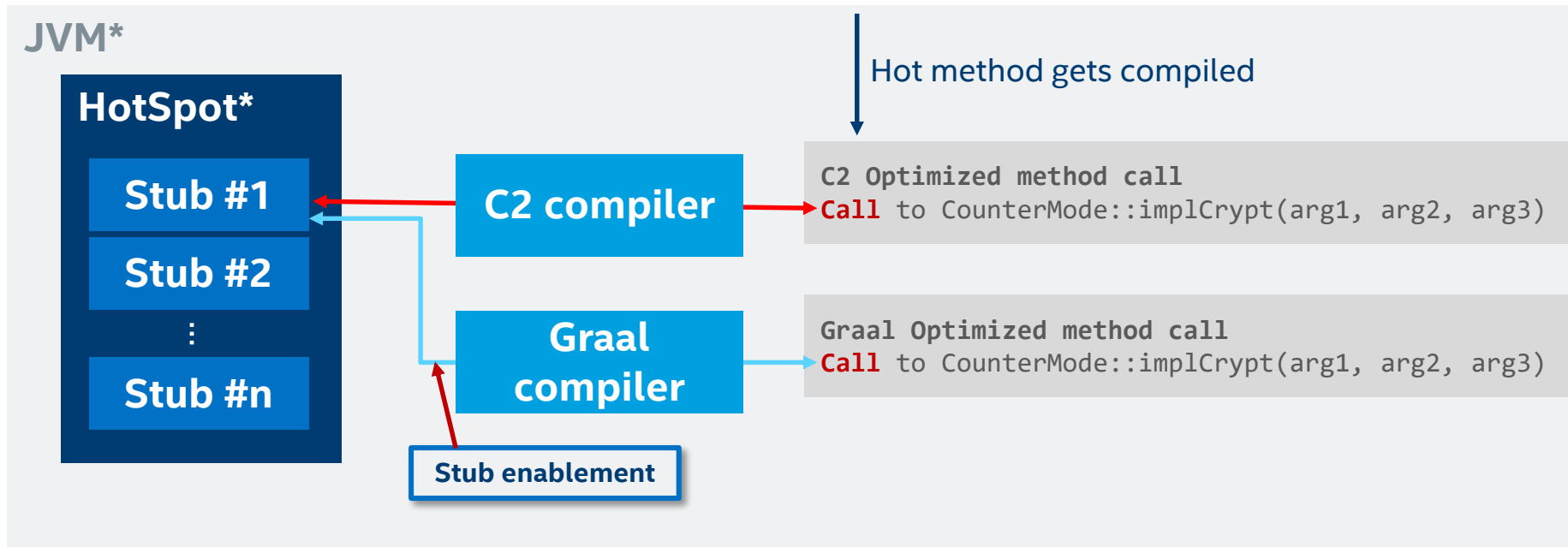
**C2 uses Multi-block call**  
**Graal uses "regular" call**  
**Lack "glue" in Graal to call appropriate stub!**

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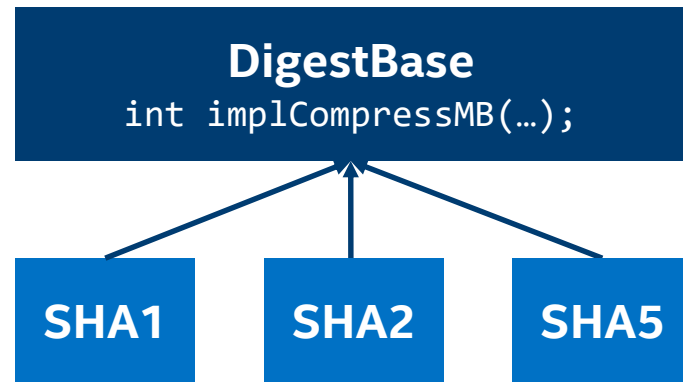
# Stub enablement

- Stubs are highly optimized routines often written in assembly that replace regular compiled method calls.



# Crypto regressions: Signverify as example

- **PR #924 enables DigestBase::implCompressMB for crypto.signverify**
  - Intrinsicifies base class method
  - Retrieves run-time derived class
  - Converts implCompressMB arguments types to the corresponding Hotspot stubs
  - Returns the appropriate value
    - **163 lines** of code
    - Currently being debugged...

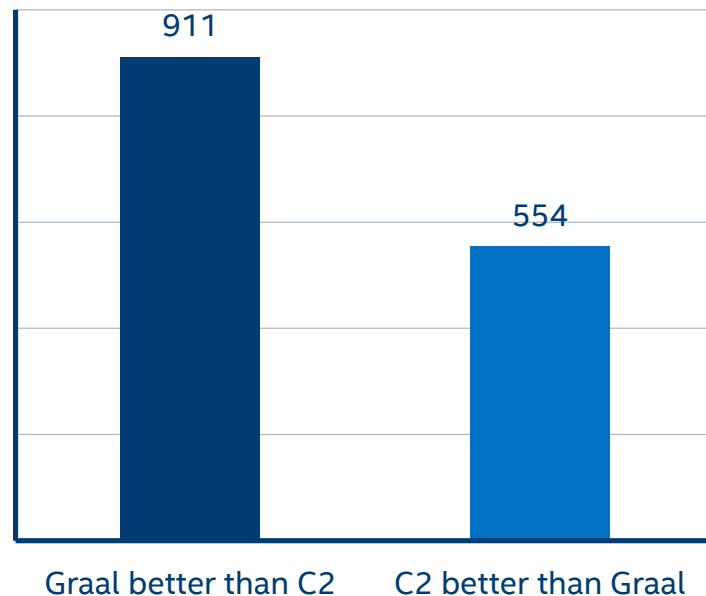


<https://github.com/oracle/graal/pull/924>

# JDK micro-benchmarks suite

- Measures performance of specific features of the Java VM
- ~1500 tests (as of November 2018)
- **C2 vs. Graal reveals regressions in several benchmark categories**
  - Crypto operations
  - XML parsing
  - Stream operations

<http://hg.openjdk.java.net/code-tools/jmh-jdk-microbenchmarks>



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# AESGCMBench.decrypt micro-benchmark

- 95% regression over C2 (JDK-8213264)
- **Two stubs** are not applied in Graal
  - GHASH::processBlocks(...) (PR #857), CounterMode::implCrypt(...) (PR#887)

## C2 profile

```
....[Hottest Regions].....  
39.95% runtime stub StubRoutines::ghash_processBlocks  
18.89% runtime stub StubRoutines::counterMode_AESCrypt  
4.23% [kernel.kallsyms] [unknown]  
4.08% runtime stub StubRoutines::jbyte_disjoint_arr...  
3.32% runtime stub StubRoutines::jlong_disjoint_arr...  
2.72% c2, level 4  
com.sun.crypto.provider.GaloisCounterMode::decryptFinal  
1.82% c2, level 4  
com.sun.crypto.provider.GaloisCounterMode::decryptFinal  
1.22% runtime stub  
StubRoutines::aesencryptBlock (181 bytes)
```

## Graal profile

```
....[Hottest Regions].....  
25.03% jvmci, level 4 ...crypto.provider.GHASH::blockMult  
4.65% [kernel.kallsyms] [unknown]  
2.20% [kernel.kallsyms] [unknown]  
1.79% jvmci, level 4  
com.sun.crypto.provider.GaloisCounterMode::doLastBlock  
1.59% runtime stub StubRoutines::aesencrypt_encryptBlock  
1.54% [kernel.kallsyms] [unknown]  
1.34% jvmci, level 4 ...crypto.provider.GHASH::processBlocks  
1.32% [kernel.kallsyms] [unknown]  
1.26% [kernel.kallsyms] [unknown]  
1.03% libjvm.so  
ZN14ElfSymbolTable6lookupEPhPiS1_S1_P16ElfFuncDescTable
```

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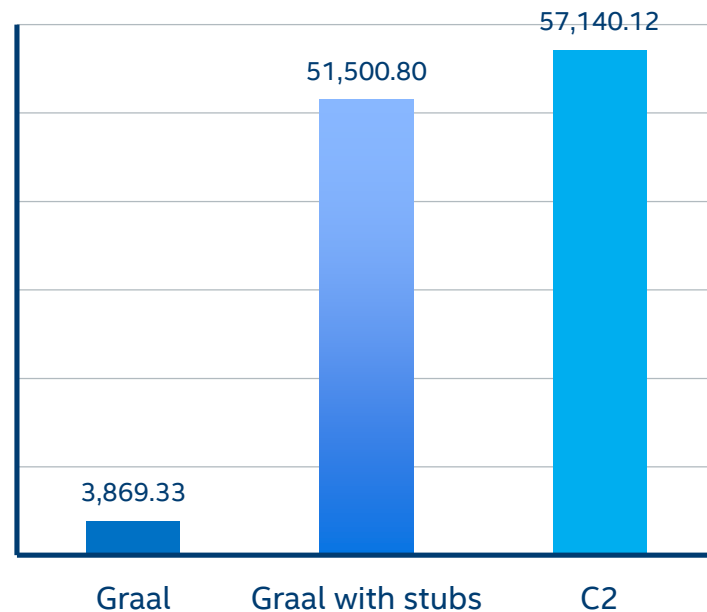


# AESGCMBench.decrypt micro-benchmark

- Implemented and merged two patch enabling the stubs
  - Improved performance by >13x
  - ~ [50 – 150] lines
  - Still ~11% regression remaining over C2

<https://github.com/oracle/graal/pull/857>

<https://github.com/oracle/graal/pull/887>



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# Stubs analysis: C2 vs. Graal

This stub is not the only example of missed optimized stubs in Graal.

- **Support missing for several methods in following classes**
  - CRC32, SHA, Adler (Crypto)
  - Math, Array, StringBuffer
  - Unsafe, MethodHandle, Reference

**“Stub enablement is the easiest way to achieve impactful performance improvements in Graal.”**

# Numerical regressions: -68% scimark.lu.small

## C2 LU.factor (79.8% ticks)

```
vmulpd    ymm1, ymm4, ymmword ptr [rbx+r11] 51.64
vmovdqdu  ymm2, ymmword ptr [r9+r11*8+0x10]
vsubpd    ymm1, ymm2, ymm1
vmovdqdu  ymmword ptr [r9+r11*8+0x10], ymm1
movsxd    r10, r11d
vmulpd    ymm1, ymm4, ymmword ptr [rbx+r10*8+0x30]
vmovdqdu  ymm2, ymmword ptr [r9+r10*8+0x30]
vsubpd    ymm1, ymm2, ymm1
vmovdqdu  ymmword ptr [r9+r10*8+0x30], ymm1
vmulpd    ymm1, ymm4, ymmword ptr [rbx+r10*8+0x50]
vmovdqdu  ymm2, ymmword ptr [r9+r10*8+0x50]
vsubpd    ymm1, ymm2, ymm1
vmovdqdu  ymmword ptr [r9+r10*8+0x50], ymm1
vmulpd    ymm1, ymm4, ymmword ptr [rbx+r10*8+0x70]
vmovdqdu  ymm2, ymmword ptr [r9+r10*8+0x70]
vsubpd    ymm1, ymm2, ymm1
vmovdqdu  ymmword ptr [r9+r10*8+0x70], ymm1
add       r11d, 0x10
cmp       r11d, dword ptr [rsp+0x30]
jl        0x7f0ea381bf60 <[7]spec/benchmarks/scimark/
```

## Graal CE LU.factor (91.7% ticks)

```
vmovsd    xmm0, qword ptr [r8+r10*8+0x10] 80.18
vmovsd    xmm1, qword ptr [rcx+r10*8+0x10]
vmulsd    xmm0, xmm0, xmm2
vsubsd    xmm0, xmm1, xmm0
vmovsd    qword ptr [rcx+r10*8+0x10], xmm0
inc       r10d
cmp       edi, r10d 0.28
jnle     0x7fd33260b1d0 <[4]spec/benchmarks/scimark/
```

- No Vectorizer (Graal CE)
- No Unrolling (in this case)

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# Initial analysis summary

- **Graal CE shows significant regressions over C2**
  - Some stubs are not present
    - We already merged 2, implCompressMB in progress (PR #924)
  - Core compiler optimizations are missing in CE
    - Vectorizer is #1

# Next few steps

- **Contribution effort**
  - Pursue stub enablement contributions
- **Analysis**
  - Identify next optimization opportunities
  - AOT performance, startup time
  - Diversify workload portfolio

# Call to action

- **We are looking for community support**
  - Participate to port stubs and intrinsics from C2 to Graal
  - Analysis effort
  - Collaborate on real-world Java applications

