How to Statically Compile a Serverless Application to Survive the Biggest Bursty E-Commerce Data Traffic in the World

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Motivations

• Cold startup problem
  • Serverless services require fast scaling up for bursty requests
  • Java applications start up slowly in JVM

• Security problem
  • Java programs are distributed in bytecode and bytecode obfuscation is weak
  • JVM features such as dynamic class loading can be abused by malicious code

• High cost of developing and maintaining projects for multiple programming languages
  • For example, RocketMQ client SDK has various language implementations
Static Compilation of Java Applications

- **Java Application**
- **Java Library**
- **Native Executable**
- **Native Shared Library**

**static compiler (native-image)**

**Benefits:**
- Start up faster
- More secured

**Benefits:**
- Used as foreign language
- More secured
Native Image Generator and Substrate VM

GraalVM Native Image allows you to ahead-of-time compile Java code to a standalone executable, called a native image. This executable includes the application classes, classes from its dependencies, runtime library classes from JDK and statically linked native code from JDK. It does not run on the Java VM, but includes necessary components like memory management and thread scheduling from a different virtual machine, called “Substrate VM”. Substrate VM is the name for the runtime components (like the deoptimizer, garbage collector, thread scheduling etc.). The resulting program has faster startup time and lower runtime memory overhead compared to a Java VM.

```bash
$ native-image -cp .. Main
$ ls
main
```

Use SVM to refer to the static compilation technique in this talk

Simple Demo

Startup Time (ms)

Look perfect for the cold startup problem!
Concerns in Practice

<table>
<thead>
<tr>
<th>Scalability</th>
<th>• Can SVM scale to large real-world applications?</th>
</tr>
</thead>
<tbody>
<tr>
<td>Adaptation Difficulty</td>
<td>• How much effort do we need to run a JVM-based application in SVM?</td>
</tr>
<tr>
<td>Stability</td>
<td>• Will the SVM-based application run as stable as the JVM-based one?</td>
</tr>
</tbody>
</table>
| Performance          | • What startup time can we gain after static compilation? Is it worth the effort?  
                        | • Is it possible to gain fast startup without sacrificing too much peak performance? |
Evaluation

**Hardware**
- Intel(R) Xeon(R) Platinum 8163 CPU @ 2.50GHz
- 512 GB memory
- 1 TB SSD

**Software**
- AliOS 7.2 (Paladin)
- OpenJDK 1.8.0-222
- GraalVM **CE 19.2.0**
Evaluation (cont.)

Subjects
- Three *Sofa-boot Applications* named *Sofa-Small, Sofa-Mid, and Sofa-Large* in this talk
  - Built on the *Sofa-boot framework*, Tomcat, Netty, Hessian and many other Ant Financial’s middleware
  - Big enough for SVM: 33 MB, 56 MB and 123 MB, respectively
  - Each application is packed into a fat JAR, including all libraries

Steps
- Statically compile the application using SVM
- Run and diagnose the binary in testing environment before deploying in production environment

Brief Results of Sofa-Large
- Costed 25 man-months
- Deployed in Alibaba Group’s production environment
- Used in Double 11 (Single’s Day) online shopping festival, 2019
Scalability

• Build time increases significantly

• Why do we care about build time?
  • Quickly verify results and debug at develop time
  • Promptly response to system failures and user actions in production

• Current build time is unacceptable for large applications in Alibaba
Type Flow Analysis is the Most Expensive

- Sofa-Large: a 123 MB fat JAR
- 120 GB memory, 3,724 seconds

...
Native Image Generator — Overview

Input Program

Type Flow Analysis

Reachable Types/Fields/Methods

Type Profile

Initialization/Compilation

Image Objects

Target Code

Image Builder

Relocatable ELF (.o)

Linker (ld)

Native Image (.so or .exe)

Collect reachable methods

Synthesize type profile for later optimizations
Fast Analysis

- Use Class Hierarchy Analysis (CHA) to determine the type profile
Fast Analysis: Results

- 20 GB memory, 721 seconds

Built (Phase) Time (s)

<table>
<thead>
<tr>
<th>Component</th>
<th>Default Time (ms)</th>
<th>Fast Time (ms)</th>
</tr>
</thead>
<tbody>
<tr>
<td>typeflow</td>
<td>36,519.58</td>
<td></td>
</tr>
<tr>
<td>objects</td>
<td>245,250.18</td>
<td></td>
</tr>
<tr>
<td>features</td>
<td>123,698.35</td>
<td></td>
</tr>
<tr>
<td>analysis</td>
<td>429,472.53</td>
<td></td>
</tr>
<tr>
<td>clinit</td>
<td>19,532.98</td>
<td></td>
</tr>
<tr>
<td>universe</td>
<td>33,784.94</td>
<td></td>
</tr>
<tr>
<td>parse</td>
<td>10,232.66</td>
<td></td>
</tr>
<tr>
<td>inline</td>
<td>23,287.25</td>
<td></td>
</tr>
<tr>
<td>compile</td>
<td>60,698.25</td>
<td></td>
</tr>
<tr>
<td>compile</td>
<td>132,254.05</td>
<td></td>
</tr>
<tr>
<td>image</td>
<td>59,906.82</td>
<td></td>
</tr>
<tr>
<td>write</td>
<td>6,222.89</td>
<td></td>
</tr>
<tr>
<td>[total]</td>
<td>720,884.32</td>
<td></td>
</tr>
</tbody>
</table>

[sofabootapplication:86573]
Fast Analysis: Summary

• Pros:
  • Fast for debugging large applications

• Cons:
  • Not fast for small programs because more methods are included
  • Unavoidable runtime performance degradation due to imprecise analysis results

• The correctness is still under validation
  • So far so good
  • Still only deployed in testing environment
Adaptation Difficulty

- Build-time adaptation issues
  - Configure RDR*
  - Determine build-time initialized classes
  - Wrap API
  - Develop new programming model to aid configuration at coding time
  - Find out the proper class initialization timing

- Run-time adaptation issues
  - Debug
  - .exe
  - .so
  - Very difficult. Use logs to trace.
  - Add new solutions for original unsupported features, e.g. serialization/deserialization

- Fix
  - Add features in SVM
  - Work around in application

- JAR

*RDR: Reflection/Dynamic proxy/Resources

Light: easy medium: medium heavy: difficult

Find out the proper class initialization timing

Add new solutions for original unsupported features, e.g. serialization/deserialization

- Spring scans package for Bean registering
- Obtain containing jar from resource file
- ...
Configuring RDR

• native-image-agent* can run the program and generate configurations
  • convenient but has the coverage problem
• Define new annotations in Alibaba Dragonwell JDK to aid coding time configurations of RDR
  • Annotations must be added where a reflection call is made
  • Every reflection target must be specified in annotations
  • The `javac` compiler issues compilation errors for missing annotations
    • Help find missing configurations at coding time

```java
@ContainReflection(method="subString",paramTypes={"int"})
Method m = String.class.getDeclaredMethod(name, int.class);
```

* [https://github.com/oracle/graal/blob/master/substratevm/CONFIGURE.md](https://github.com/oracle/graal/blob/master/substratevm/CONFIGURE.md)
Build-Time Class Initialization

Input Program

Type Flow Analysis

Reachable Types/Fields/Methods

Type Profile

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Relocatable ELF (.o)

Linker (ld)

Native Image (.so or .exe)

Build-time class initialization

Saved into native image heap
Build-Time Class Initialization (cont.)

Build time Initialization
- Fast startup
- No overheads of class initialization check
- Reduce binary size
- May be unsafe and very difficult to debug

Runtime Initialization
- Slow startup
- Overheads of class initialization checks
- More reachable methods
- Safe
Build-Time Class Initialization (cont.)

• Manual configuration
  • Specify a **whitelist** of build-time initialized classes
  • Specify a **blacklist** of build-time initialized classes
    • A **whitelist** of run-time initialized classes

• More classes are transitively initialized at build-time
  • All super classes
  • All accessed classes during executing the class initializer at build-time
A 100% CPU Occupied Issue

sun.nio.ch.EPollArrayWrapper.epollWait(long pollAddress, int numfds, long timeout, int epfd)

io.netty.util.concurrent.ScheduledFutureTask.delayNanos:
```java
public long delayNanos(long currentTimeNanos) {
    return Math.max(0, deadlineNanos() - (currentTimeNanos - START TIME));
}
```

An incorrect value can result 0

Should be initialized at runtime but is mistakenly initialized at build time

Transitively initialized at build time

`io.netty.util.concurrent.GlobalEventExecutor` was configured to be initialized at build time in `spring-boot-graal-feature` (https://github.com/aclement/spring-boot-graal-feature) which is now moved to `spring-graal-native` (https://github.com/spring-projects-experimental/spring-graal-native)
Trace Transitive Initializations

• SVM has provided `-H:+TraceClassInitialization`
  • Allows to trace the class initialization via bytecode instrumentation
  • Unable to instrument all classes, e.g., some dynamically generated classes

• We further modified Hotspot VM to trace all initializations
  • Observe the process of class initializations
    • i.e., the creation and initialization of `InstanceKlass` instances by the HotSpot VM
  • Print the stack trace of class initializations
  • Locate the root class of the chain of class initializations
Runtime Performance

• Peak performance of SVM is only half of Hotspot VM on Sofa-Small
• Improve performance by two approaches:
  • Improve GC
  • Reduce safepoint checks
GC Problems

• We observed that
  • The full GC occurred more frequently than the HotSpot VM
  • Some GC operations were unexpected long
    • Releasing unaligned chunks
    • Full native image heap scanning

<table>
<thead>
<tr>
<th></th>
<th>HotSpot VM</th>
<th>SVM</th>
</tr>
</thead>
<tbody>
<tr>
<td>#GC</td>
<td>794</td>
<td>3,617</td>
</tr>
<tr>
<td>#Full GC</td>
<td>0</td>
<td>367</td>
</tr>
</tbody>
</table>

Data were collected by sending 60,000 curl requests to drive Sofa-Small
GC Improvements

• Add multi-survivor to reduce the frequency of full GC.
• Asynchronously release unaligned chunks
• Card table based incremental scanning of the native image heap
Results of GC Improvements

<table>
<thead>
<tr>
<th></th>
<th>Original SVM GC</th>
<th>Improved SVM GC</th>
</tr>
</thead>
<tbody>
<tr>
<td>#Full GC</td>
<td>29</td>
<td>1</td>
</tr>
<tr>
<td>Average Pause (s)</td>
<td>0.798</td>
<td>0.112</td>
</tr>
</tbody>
</table>

Data were collected by running Sofa-Mid
Reduce Safepoint Checks

• SVM adds more safepoint checks than HotSpot VM
• Try to add safepoint checks using the same strategy as JIT in the HotSpot VM
• About 15% performance improvement

```java
public void demo() {
    for (int i = 0; i < 1000; i++) {
        sum = A[i] + B[i];
    }
}
```
Summary

• Can SVM scale to large real-world applications?
  • Not really.
  • For Sofa-Large, SVM compiles 327,372 methods from 65,834 types. The input fat jar is 123 MB, and the output binary executable is 500 MB. It takes on average 4,436 seconds on a server with Intel(R) Xeon(R) Platinum 8163 CPU @ 2.50GHz with 120 GB memory to complete the compilation. It consumes too much time and resources for compilation.
  • Fast analysis can significantly reduce compiling costs, but its correctness and performance have not been evaluated thoroughly
Summary (cont.)

• How much effort do we need to run a JVM-based application in SVM?
  • 25 man-months for Sofa-Large

• Will the SVM-based application run as stable as the JVM-based one?
  • Yes. Sofa-Large has survived the traffic of double 11 online shopping festival
Summary (cont.)

• What startup time can we gain after static compilation? Is it worth the effort?
  • The startup time of Sofa-Large has been reduced from 60 seconds to 3 seconds.

• Is it possible to gain fast startup without sacrificing too much peak performance?
  • Yes. With improvements on GC and safepoint checks, the peak performance of Sofa-Small is nearly the same as Hotspot VM.
Future Work

• Ensure stability
  • Issues caused by unsupported JVM features such as RDR, build-time class initializations and dynamic class loading

• Reduce output binary size
  • The output of Sofa-Large is 500 MB.
    • Larger than the total size of the JAR of Sofa-Large and the JDK

• Reduce adaption efforts
  • More automated tools aiding adaptation
Thanks

Q&A

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