



Lambda: A peek under the hood

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About this talk

- This talk outlines the technical details of how lambda expressions are implemented in Java SE 8 at the bytecode level
 - This will be a highly technical talk!
 - We assume some familiarity with JVM and bytecode
 - Including JSR-292 facilities



Lambda expressions for Java

- A lambda expression is like an "anonymous method"
 - Has an argument list, a return type, and a body

people.forEach((Person e) -> { names.add(e.getName()); });

- Many of these can be inferred by the compiler

```
people.forEach(e -> { names.add(e.getName()); });
```

Lambda expressions can capture values from the enclosing context

people.removeIf(e -> e.getAge() < minAge);</pre>



Why lambdas for Java?

- Provide libraries a path to multicore
 - Parallel-friendly APIs need internal iteration
 - Internal iteration needs a concise code-as-data mechanism
- Empower library developers
 - Enable a higher degree of cooperation between libraries and client code
- It's about time!
 - Java is the lone holdout among mainstream OO languages at this point to not have closures
 - Adding closures to Java is no longer a radical idea
- Inner classes give us some of these benefits, but are too clunky
 - Clunkiness is not entirely syntactic!
- How to represent lambda expressions at runtime is not a trivial question
 - That's what this talk is about



Big question #1: typing

- What is the *type* of a lambda expression?
 - Most languages with lambdas have some notion of a function type
 - "function from int to int"
 - Early proposals included adding *function types* to the type system
 - Seems an obvious idea, but...
 - How would we represent functions in VM type signatures?
 - How would we represent invocation in bytecode?
 - How would we create instances of function-typed variables?
 - How would we deal with variance?



Why not "just" add function types?

- JVM has no native (unerased) representation of function type in VM type signatures
 - Closest tool we have is generics
 - Boxed and erased function types would be no fun
 - Gaps between language and VM representation are always pain points
- Teaching the VM about "real" function types would be a huge effort
 - New type signatures for functions
 - New bytecodes for invocation
 - New verification rules



Functional interfaces

Historically modeled functions using single-method interfaces

- Runnable, Comparator
- Rather than complicate the type system, let's just formalize that
 - Give them a name: "functional interfaces"
 - Always convert lambda expressions to instance of a functional interface

interface Predicate<T> { boolean test(T x); }

people.removeIf(p -> p.getAge() >= 18);

- Compiler identifies Predicate as a functional interface (structurally)
- Compiler infers the lambda is a Predicate<Person>



Functional interfaces

- "Just add function types" was obvious ... and wrong
 - Would have introduced complexity and corner cases
 - Would have bifurcated libraries into "old" and "new" styles
 - Would have created interoperability challenges
- Bonus: existing libraries are now forward-compatible to lambdas
 - Libraries that never imagined lambdas still work with them!
 - Maintains significant investment in existing libraries
 - Fewer new concepts
- Lesson learned: a stodgy old approach is sometimes better than a shiny new one!



Big question #2: representation

- How does the lambda instance get created?
 - Need to convert a function into an instance of a functional interface
 - Need to handle captured variables

Predicate<Person> pred = (Person p) -> p.age < minAge ;</pre>

• The obvious choice is ... inner classes



Why not "just" use inner classes?

We could say that a lambda is "just" an inner class instance

```
class Foo$1 implements Predicate<Person> {
    private final int $minAge;
    Foo$1(int v0) { this.$minAge = v0; }
    public boolean test(Person p) {
        return p.age < $minAge;
    }
}</pre>
```

Then, lambda capture becomes constructor invocation

list.removeIf(p -> p.age < minAge);</pre>

list.removeIf(new Foo\$1(minAge));



Why not "just" use inner classes?

Inner class constructor invocation translates as





Why not "just" use inner classes?

- Translating to inner classes means we inherit most of their problems
 - Performance issues
 - One class per lambda expression
 - Type profile pollution
 - Always allocates a new instance
 - Complicated and error-prone "comb" lookup for names
- Whatever we do becomes a binary representation for lambdas in Java
 - Would be stuck with it forever
 - Would rather not conflate implementation with binary representation
- Another "obvious but wrong" choice

New bytecode tool: MethodHandle

- Java SE 7 adds VM-level method handles
 - Can store references to methods in the constant pool, load with LDC
 - Can obtain a method handle for any method (or field access)
 - VM will happily inline through MH calls
 - API-based combinators for manipulating method handles
 - Add, remove, reorder arguments
 - Adapt (box, unbox, cast) arguments and return types
 - Compose methods
 - Compiler writers swiss-army knife!



Why not "just" use MethodHandle?

- At first, translating lambdas to MethodHandle seems obvious
 - Lambda is language-level method object
 - MethodHandle is VM-level method object
- We could
 - Desugar lambdas expressions to methods
 - Represent lambdas using MethodHandle in bytecode signatures



Why not "just" use MethodHandle?

If we represented lambdas as MethodHandle, we'd translate:

list.removeIf(p -> p.age < minAge);
private static boolean lambda\$1(int minAge, Person p) {
 return p.age < minAge;
}</pre>

```
MethodHandle mh = LDC[lambda$1];
mh = MethodHandles.insertArguments(mh, 0, minAge);
list.removeIf(mh);
```



Why not "just" use MethodHandle?

- If we did this, the signature of List.removelf would be:
 void removelf(MethodHandle predicate)
- This is erasure on steroids!
 - Can't overload two methods that take differently "shaped" lambdas
 - Still would need to encode the erased type information somewhere
- Also: is MH invocation performance yet competitive with bytecode invocation?
- Again: conflates binary representation with implementation
 - Obvious but wrong ... again



Stepping back...

- We would like a binary interface not tied to a specific implementation
 - Inner classes have too much baggage
 - MethodHandle is too low-level, is erased
 - Can't force users to recompile, ever, so have to pick now
- What we need is ... another level of indirection
 - Let the static compiler emit a declarative *recipe*, rather than *imperative code*, for creating a lambda
 - Let the runtime execute that recipe however it deems best
 - And make it darned fast
 - This sounds like a job for invokedynamic!



Bytecode invocation modes

- Prior to Java SE 7, the JVM had four bytecodes for method invocation
 - invokestatic: for static methods
 - invokevirtual: for class methods
 - invokeinterface: for interface methods
 - invokespecial: for constructors, private methods, and super-calls
- Each specifies a class name, method name, and method signature

aload_1	// list
new #2	// class Foo\$1
dup	
iload_2	// minAge
invokespecial #3	// Method Foo\$1." <init>":(I)V</init>
invokeinterface #4	<pre>// java/util/List.removeIf:(Ljava/util/functions/Predicate;)Z</pre>

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- Java SE 7 adds a fifth invocation mode: invokedynamic (indy)
- Behavior of invoke{virtual,static,interface} are fixed and Java-like
 - Other languages need custom method linkage
- Basic idea: let some "language logic" determine call target
 - But then get out of the way
 - Language and VM become partners in flexible and efficient method dispatch



- Invokedynamic started out as a tool for dynamic languages
 - A typical application would be invoking a method like def add(a, b) { a+b }
- Here, the types of a and b are not known at compile time
 - And can change from call to call ... *but probably don't*
 - Good chance that, if called with two ints, next call will be with two ints
 - We win by not having to re-link the call site for every invocation



- The first time the JVM executes an invokedynamic
 - Consults the *bootstrap method* for the call site (the "language logic")
 - Bootstrap returns a linked call site
 - Call site can embed conditions under which it needs relinking (if any)
 - Such as the argument types changing
 - Otherwise, JVM does not have to consult bootstrap again
- After linkage, JVM can treat the call site as fully linked
 - Can inline through linked indy callsites like any other



- An indy callsite has three groups of operands
 - A bootstrap method (the "language logic")
 - Called by the VM for linking the callsite on first invocation
 - Not called again after that
 - A static argument list, embedded in the constant pool
 - Available to the bootstrap method
 - A dynamic argument list, like any other method invocation
 - Not available to the bootstrap, but their static types and arity are
 - Passed to whatever target the callsite is linked to



Its not just for dynamic languages anymore

- So, if indy is for dynamic languages, why is the Java compiler using it?
 - All the types involved are static
 - What is dynamic here is the code generation strategy
 - Generate inner classes?
 - Use method handles?
 - Use dynamic proxies?
 - Use VM-private APIs for constructing objects?
- Indy lets us turn this choice into a pure implementation detail
 - Separate from the binary representation



Its not just for dynamic languages anymore

- We use indy to embed a *recipe* for constructing a lambda, including
 - The desugared implementation method (static)
 - The functional interface we are converting to (static)
 - Additional metadata, such as serialization information (static)
 - Values captured from the lexical scope (dynamic)
- The capture site is called the *lambda factory*
 - Invoked with indy, returns an instance of the desired functional interface
 - Subsequent captures bypass the (slow) linkage path



Desugaring lambdas to methods

- First, we desugar the lambda to a method, as before
 - Signature matches functional interface method
 - Plus captured arguments prepended
 - Simplest lambdas desugar to static methods
 - But some need access to receiver, and so are instance methods

```
Predicate<Person> pred = p -> p.age < minAge;
private static boolean lambda$1(int minAge, Person p) {
    return p.age < minAge;
}</pre>
```

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Factories and metafactories

- We generate an indy call site which, when called, returns the lambda
 - This is the lambda factory
 - Bootstrap for the lambda factory selects the translation strategy
 - Bootstrap is called the *lambda metafactory*
 - Part of Java runtime
 - Captured args passed to lambda factory

list.removeIf(p -> p.age < minAge);</pre>

private static boolean lambda\$1(int minAge, Person p) {
 return p.getAge() >= minAge;



Translation strategies

- The metafactory could spin inner classes dynamically
 - Generate the same class the compiler would, just at runtime
 - Link factory call site to constructor of generated class
 - Conveniently, dynamic args and ctor args will line up
 - Our initial strategy until we can prove that there's a better one
- Alternately could spin one wrapper class per interface
 - Constructor would take a method handle
 - Methods would invoke that method handle
- Could also use dynamic proxies or MethodHandleProxy
- Or VM-private APIs to build object from scratch, or...



Indy: the ultimate procrastination aid

- By deferring the code generation choice to runtime, it becomes a pure implementation detail
 - Can be changed dynamically
 - We can settle on a binary protocol now (metafactory API) while delaying the choice of code generation strategy
 - Moving more work from static compiler to runtime
 - Can change code generation strategy across VM versions, or even days of the week



Indy: the ultimate lazy initialization

- For stateless (non-capturing) lambdas, we can create one single instance of the lambda object and always return that
 - Very common case many lambdas capture nothing
 - Sometimes we do this by hand in source code e.g., pulling a Comparator into a static final variable
- Indy functions as a lazily initialized cache
 - Defers initialization cost to first use
 - No heap overhead if lambda is never used
 - No extra field or static initializer
 - All stateless lambdas get lazy initialization and caching for free



Indy: the ultimate indirection aid

- Just because we defer code generation strategy to runtime, we don't have to pay the price on every call
 - Metafactory only invoked once per call site
 - For non-capturing case, subsequent captures are FREE
 - VM optimizes to constant load
 - For capturing case, subsequent capture cost on order of a constructor call / method handle manipulation
 - MF links to constructor for generated class



Performance costs

- Any translation scheme imposes costs at several levels:
 - Linkage cost one-time cost of setting up lambda capture
 - Capture cost cost of creating a lambda instance
 - Invocation cost cost of invoking the lambda method
- For inner class instances, these correspond to:
 - Linkage: loading the class
 - Capture: invoking the constructor
 - Invocation: invokeinterface



Performance example – linkage cost

- Oracle Performance Team measured linkage costs
 - Time in ms for 32K distinct inner classes / lambdas
 - Fastest possible disk (to negate IO component of anon class loading)

	Anonymous	Lambda	Difference
-Capturing -Tiered	7473ms	6891ms	8.4%
-Capturing +Tiered	7038	5743	14.4%
+Capturing -Tiered	7885	6550	20.3%
+Capturing +Tiered	7638	5727	24%

Performance example – capture cost

- Oracle Performance Team measured capture costs (ops / uSec)
 - 4 socket x 10 core x 2 thread Nehalem EX server
- Worst-case lambda numbers equal to inner classes
 - Best-case numbers much better
 - And this is just our V1 strategy...

	Single-threaded	Saturated	Scalability
Inner class	150	750	5x
Non-capturing lambda	230	15500	67x
Capturing lambda	150	740	5x

Not just for the Java Language!

- The lambda conversion metafactories will be part of java.lang.invoke
 - Semantics tailored to Java language needs
 - But, other languages may find it useful too!
- Java APIs will be full of functional interfaces
 - Collection.forEach(Consumer)
- Other languages probably will want to call these APIs
 - Maybe using their own closures
 - Will want a similar conversion
- Since metafactories are likely to receive future VM optimization attention, using platform runtime is likely to be faster than spinning your own inner classes



Future VM support (?)

- With VM help, we can optimize even further
- VM could intrinsify lambda capture sites
 - Capture semantics are straightforward properties of method handles
 - Capture operation is pure, therefore freely reorderable
 - Can use code motion to delay/eliminate captures
- Lambda capture is essentially a "boxing" operation
 - Boxing a method handle into a lambda object
 - Invocation is the corresponding "unbox"
 - Can use box elimination techniques to eliminate capture overhead
 - Intrinsification of capture + inline + escape analysis



Serialization

- No language feature is complete without some interaction with serialization S
 - Users will expect this code to work

```
interface Foo extends Serializable {
    public boolean eval();
}
Foo f = () -> false;
// now serialize f
```

- We can't just serialize the lambda object
 - Implementing class won't exist at deserialization time
 - Deserializing VM may use a different translation strategy
 - Need a dynamic serialization strategy too!
 - Without exposing security holes...



Serialization

- Just as our classfile representation for a lambda is a recipe, our serialized representation needs to be too
 - We can use readResolve / writeReplace
 - Instead of serializing lambda directly, serialize the recipe (to a java.lang.invoke.SerializedLambda)
 - This means that for serializable lambdas, MF must provide a way of getting at the recipe
 - We provide an alternate MF bootstrap for that
- On deserialization, reconstitute from recipe
 - Using then-current translation strategy, which might be different from the one that originally created the lambda
 - Without opening new security holes





- The evolutionary path is often full of obvious-but-wrong ideas
- We use invokedynamic to capture lambda expressions
 - Gives us flexibility and performance
 - Free to change translation strategy at runtime
- Even using the "dumb" translation strategy...
 - No worse than inner classes in the worst case
 - 5-20x better than inner classes in a common case



For more information

- Project Lambda: <u>http://openjdk.java.net/projects/lambda/</u>
 - Lambda spec EDR #3: <u>http://jcp.org/aboutJava/communityprocess/edr/jsr335/index3.html</u>
 - Lambda Overview: <u>http://cr.openjdk.java.net/~briangoetz/lambda/lambda-state-final.html</u>
 - Binary builds: https://jdk8.java.net/download.html



