
Functional Programming in Lambda Expressions



Shing-Chi Cheung
Computer Science and Engineering
HKUST

Functional Programming

- Several important features have been added to Java since 8
- A very important one is **Lambdas (expressions)**
- Background:
 - ❑ Rising demands to support functional programming for **big data** and **cloud applications**
 - ❑ Rising demands to leverage the **parallel computation power** supported by GPU cards and multi-core CPUs in servers and mobile devices
 - ❑ Such demands are so high that lambda is recently supported by all major programming languages (Python, C#, Java, JavaScript, Go, Kotlin, C++, PHP)
- https://en.wikipedia.org/wiki/Higher-order_function

Origin of Lambda

- Two important computation models were proposed by two computer scientists in 1936
 - Alan Turing proposed computation using the Turing machine → von Neumann architecture that leads to imperative programming
 - Alonzo Church proposed computation using lambda-definable functions whose values can be obtained by repeated substitution → lambda calculus that leads to functional programming



Alan Turing



Alonzo Church

<https://plato.stanford.edu/entries/church-turing/#CompTuriChurAppr>

Functional programming in lambda expressions

- In Java, a **lambda (expression)** is an **anonymous function** to be performed by an object that implements a **functional interface**. We call the object a **function object**
- Mathematically, lambdas (a.k.a. closures) take the form:
 - $\lambda xy.t$ where x, y are variables and t is a lambda term
 - Example: $\lambda xy.x^2+y^2$
- In Java, a lambda expression takes the form:
 - $(x, y) \rightarrow t$ where x, y are variables and t is a lambda term
 - Example: $(x, y) \rightarrow x*x + y*y;$

Waiving two
paradigms into
one language

Functional Programming

■ Concise syntax

- More readable than anonymous inner classes

A lambda that defines an anonymous function to be performed by an object that implements the functional interface `EventHandler<ActionEvent>`

```
btUp.setAction(  
    new EventHandler<ActionEvent>() {  
        @Override  
        public void handle(ActionEvent e) {  
            text.setY(text.getY() > 10 ? text.getY() - 5 : 10);  
        }  
    }  
);
```

(a) Anonymous inner class event handler

```
btUp.setAction(e -> {  
    text.setY(text.getY() > 10 ? text.getY() - 5 : 10);  
});
```

(b) Lambda expression event handler

Functional Programming

■ Automatic type inference

- ❑ Type of **function object** and its **parameter(s)** are inferred.
- ❑ No need to change the client code that uses a library API (e.g., `EventHandler` and `ActionEvent`) even their names are changed.

```
btUp.setAction(  
    new EventHandler<ActionEvent>() {  
        @Override  
        public void handle(ActionEvent e) {  
            text.setY(text.getY() > 10 ? text.getY() - 5 : 10);  
        }  
    }  
);
```

(a) Anonymous inner class event handler

```
btUp.setAction(e -> {  
    text.setY(text.getY() > 10 ? text.getY() - 5 : 10);  
});
```

The highlighted code defines and creates a function object (or lambda) that implements a functional interface

(b) Lambda expression event handler

Type Inference of Lambda Expression

```
btUp.setOnAction(e -> {text.setY(text.getY() > 10 ? ...);});
```

1. Java compiler infers that the **argument's type** must be **EventHandler<ActionEvent>**
2. Java compiler infers that the concerned lambda expression must define the abstract method, which is **handle(ActionEvent evt)** in the interface

```
interface EventHandler<ActionEvent> {  
    public abstract void handle(ActionEvent evt);  
}
```

3. Java compiler infers that **e** in the lambda expression must corresponds to **evt** in **handle's** method parameter
4. Java compiler infers that the type of **e** in the lambda expression is **ActionEvent**, and **{text.setY(text.getY() > 10 ? ...);}** defines the overriding handle method's body

Functional Programming

- A key programming construct that supports big data and cloud programming
 - ❑ Allow programming of popular higher-order functions such as map, reduce and filter
 - ❑ Facilitates the use of powerful built-in functional interfaces
- Support streams and lazy evaluation
 - ❑ Subject to parallel processing by GPUs and multi-cores
 - ❑ `for (Frame f: video) f.process();` *// requires whole video available*
 - ❑ `video.parallelStream().forEach(f->process());` *// stream-based*

From Anonymous Innerclass to Lambda

```
myName( new Names() { // anonymous inner class  
@Override  
public void sayName(String n) {System.out.println("My Name is " + n);} }, "John");
```

- Omit interface and method names

```
myName( (String n) -> {System.out.println("My Name is " + n);}, "John");
```

- Omit parameter types

```
myName((n) -> {System.out.println("My Name is " + n);}, "John");
```

- Drop parentheses if single parameter or single statement

```
myName(n -> System.out.println("My Name is " + n), "John");
```

From Anonymous Innerclass to Lambda

■ Anonymous innerclass before Java 8

```
new Thread( new Runnable() { // anonymous inner class
```

```
    @Override
```

```
    public void run() {
```

```
        processSomeImage(imageName);
```

```
    }
```

```
});
```

()->processSomeImage(imageName)

is a lambda that creates a Runnable instance. We call the instance a function object because it is an object of a class that implements a functional interface. **A lambda is treated as a function object.**

■ Lambda since Java 8

```
new Thread(() no argument -> processSomeImage(imageName));
```

function object

How is Lambda Used?

```
btUp.setOnAction(e -> {text.setY(text.getY() > 10 ? ...);});
```

- A lambda provides a value for a variable or parameter that expects a function object (i.e., an instance of a class that implements a functional interface)
- Previously, we mainly illustrate the use of lambdas to define event handlers, where lambda variables reference event objects
- We will illustrate examples on how lambdas can be used to define higher-order functions
- We will define methods that take lambdas (i.e., function objects) as arguments (cf. passing function pointers to C++ methods)

Higher-Order Functions



- A higher-order function is a function that takes other functions (i.e., function objects) as arguments

```
interface Func {  
    public double eval(double x);  
}  
  
public class LambdaTest {  
    public double calc(Func f, double x) {  
        return f.eval(x);  
    }  
}
```

We provide a lambda
that defines f.eval()
each time we call calc()

Examples of using calc():

```
System.out.println(calc(x->x+x, 3));  
System.out.println(calc(x->x*x, 3));  
System.out.println(calc(x->x/x, 3));
```

Output:

6.0
9.0
1.0

[LambdaTest.java](#)

Terminologies

- A function is **0-order** if it does not take any functions as arguments
- A function is **(n+1)-order** if the **highest order** of functions that it takes as arguments is **n** where $n \geq 0$
- A function is **higher-order** if its order is greater than 0
- A **higher-order** function may return a function as output
- Examples:
 - ❑ 0-order: `eval(double x)` // *Func is 0-order*
 - ❑ 1-order: `calc(Func f, double x)`

```
interface Func {  
    public double eval(double x);  
}
```

Example 1: Numerical Integration

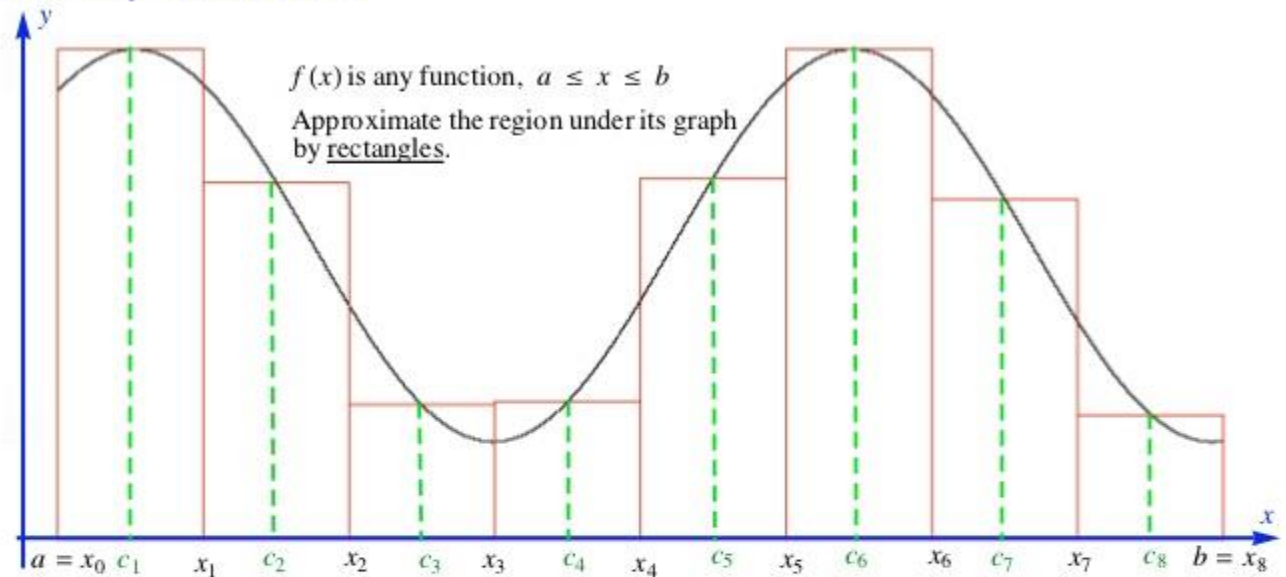
- Define a functional interface with a method

```
interface Integrable {  
    double eval(double x);  
}
```

semantically
the same

```
interface Func {  
    public double eval(double x);  
}
```

The Midpoint Rule



- Divide $[a, b]$ into n subintervals of equal length $\Delta x = \frac{b-a}{n}$
- In each subinterval take the **midpoint**: c_1, c_2, \dots, c_n

- $\int_a^b f(x) dx \approx M_n$ where

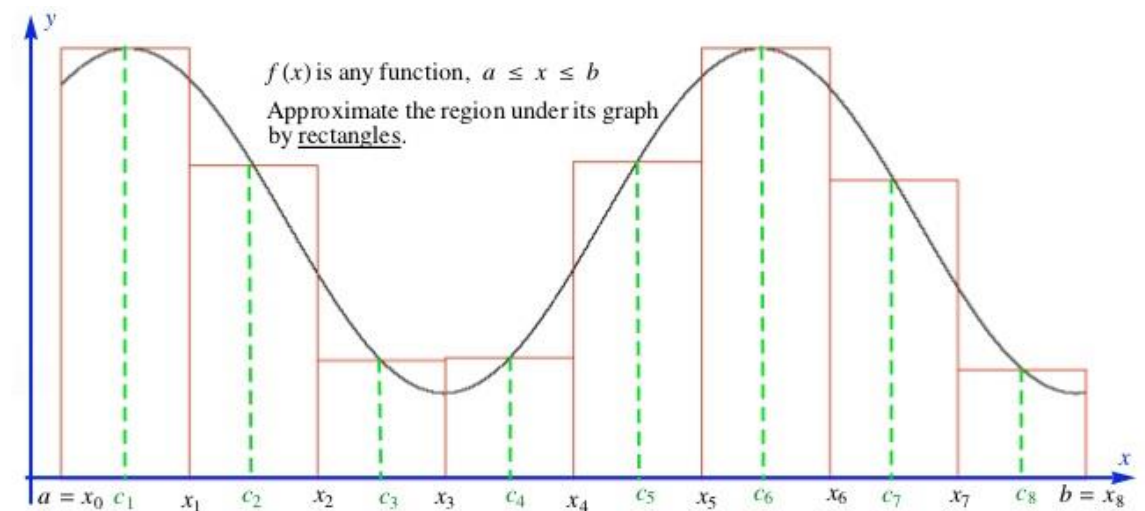
$M_n =$ the sum of the areas of the above rectangles

Example 1: Numerical Integration

```
public static double integrate(Integrable f, double a, double b, int numSlices) {  
    if (numSlices < 1) numSlices = 1;  
    var delta = (b-a)/numSlices;  
    var start = a + delta/2;  
    var sum = 0.0;  
    for (var i=0; i<numSlices; i++)  
        sum += delta*f.eval(start+delta*i);  
    return sum;  
}
```

f is a (function) object that implements Integrable, which supports eval(double)

```
interface Integrable {  
    double eval(double x);  
}
```



■ Divide $[a, b]$ into n subintervals of equal length $\Delta x = \frac{b-a}{n}$

LambdaIntegration

Example 1: Numerical Integration

```
public static void integrationTest(Integrable f, double a, double b) {  
    for (var i=1; i<7; i++) {  
        var numSlices = (int)Math.pow(10, i);  
        var result = integrate(f, a, b, numSlices);  
        System.out.printf(" For numSlices =%,10d result = %,.8f%n",numSlices, result);  
    }  
}  
  
public static void main(String args[]) {  
    System.out.println("Estimate integral of x^2 from 10 to 100");  
    integrationTest(x->x*x, 10, 100);  
    System.out.println("Estimate integral of sin(x) from 0 to PI");  
    integrationTest(x->Math.sin(x), 0, Math.PI);  
}
```

LambdaIntegration.java

Example 2: Measure Runtime Utilization of a Calculation



- Cannot implement the method *measure* as:
 - ❑ `measure(someCalculation())`;
 - ❑ *someCalculation* is computed before *measure*'s body is executed.
- Implement the method with a function parameter so that it can be used as:
 - ❑ `measure(()->someCalculation());`
 - ❑ `measure()` runs *someCalculation* inside its body and thereby measures the runtime overhead.

Example 2: Measure Runtime Utilization of a Calculation

```
private static final double ONE_BILLION = 1_000_000_000;
public static void measure(Op operation) {
    long startTime = System.nanoTime();
    operation.runOp();
    long endTime = System.nanoTime();
    double elapsedSeconds = (endTime-startTime)/ONE_BILLION;
    System.out.printf("    Elapsed time: %.3f seconds.\n", elapsedSeconds);
}

public static void main(String[] args) {
    measure(()->LambdaIntegration.integrationTest(x->x*x,10,100));
    measure(()->LambdaIntegration.integrationTest(x->Math.sin(x),0,Math.PI));
    measure(()->LambdaIntegration.main(null));
}
```

```
interface Op {
    void runOp();
}
```

LambdaTimeOp.java


@FunctionalInterface Annotation


```
@FunctionalInterface  
interface Op {  
    void runOp();  
}
```

- Tell compiler that it is a functional interface
- Tell other developers that this is a functional interface to be implemented by lambdas
- They should not declare additional abstract methods to this interface

:: Method References (Since Java 8)

- Can we simplify an lambda expression if its functionality is mapped to a method or constructor?
 - Yes – static/instance method references and constructor references
- Java supports a notation for static method references ::
 - (args) -> ClassName.staticMethod(args) *// must refer to the set of arguments*
 - ClassName::staticMethod *// treat as a static method reference*
- Examples:

✓ `integrationTest(x->Math.sin(x), 0, Math.PI);`  `integrationTest(Math::sin, 0, Math.PI);`

✗ `measure(()->LambdaIntegration.main(null));`  `measure(LambdaIntegration::main);`
// un-matching args

no arg *one arg*

:: Method References (Since Java 8)

■ Java supports a notation for instance method references ::

- (args) -> obj.instanceMethod(args)
- obj::instanceMethod *// treat as a instance method reference*

■ Examples

- `public double square(double x) { return x*x; }`
- `integrationTest(x->o.square(x)), 10, 100);`
- `integrationTest(o::square, 10, 100); // ok`

LambdaMethodReference.java

Ambiguities Arising from Method References?

Suppose two overloading methods are defined:

- **public double** square(**double** x) { **return** x*x; }
- **public double** square(**double** r, **double** i) { **return** r*r + i*i; } *// complex num*

Which method will be referenced?

- **integrationTest(o::square, 10, 100);** *// no arguments specified in o::square*
- Compiler resolves it by the abstract method in the functional interface type for the Lambda argument.
- **public static void** integrationTest(**Integrable** f, **double** a, **double** b) {...}
- **interface Integrable** { **double** eval(**double** x); } *// matches the first square*

Advantages of Method References?

- Concise and more natural

- - `integrationTest(o::square, 10, 100);` // *drops arguments*
 - `integrationTest(x->o.square(x), 10, 100);`

- Maintenance friendly – we can keep the reference (e.g., `o::square`) even we have changed the functional interface

- Suppose we want to define an integration for complex numbers:

- `interface Integrable { double eval(double r, double i); }`
- `public static void integrationTest(Integrable f, double a, double b) {...}`
 - `integrationTest(o::square, 10, 100);` becomes `integrationTest((r, i)->o.square(r, i), 10, 100);`
No need to change

```
interface Integrable {  
    double eval(double x);  
}  
  
↓  
  
interface Integrable {  
    double eval(double r, double i);  
}
```

Scope of Lambdas

Is the following code in a method body legal?

...

```
double x = 0;
```

```
f(x->x+x);
```

...

Illegal: x already defined in the scope

Scope of Lambdas

Is the following code legal?

```
void foo () {  
    double x = 0;  
    f(y->{ double x = 3.4; ... });  
    ...  
}
```

Illegal: repeated variable declaration in lambda and its embedding method

Scope of Lambdas

Is the following code legal?

```
void foo () {  
    double x = 0;  
    f(y -> x = 3.4);  
  
    ...  
}
```

Illegal: Variables used in lambda should be final or effectively final

Scope of Lambdas

Is the following code legal?

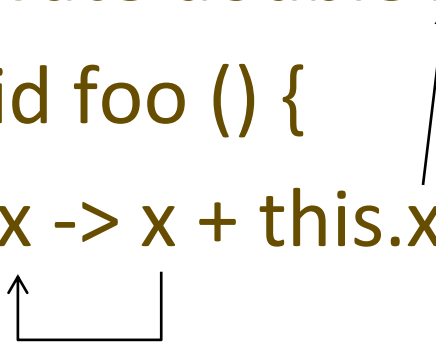
```
class MyClass {  
    private double x = 0;  
    void foo () {  
        f(y -> x = 3.4);  
    }  
}
```

Legal: modifying instance variable x

Scope of Lambdas

Is the following code legal? What does this refer to?

```
class MyClass {  
    private double x = 0;  
    void foo () {  
        f(x -> x + this.x);  
    }  
}
```



Summary:

- The scope of lambda variables is their embedding method (e.g. foo() in the example).
- A lambda can access local variables and all variables/methods defined in its outer class
- Local variables used by lambda must be effectively final.
- “this” in a lambda (function object) refers to the instance of its embedding method. No separate .class files are generated for lambdas.

Legal: lambda variable name matches instance variable name

Generic Programming using Lambdas (Since Java 8)

- We will see how functional interfaces provide a power facility for **generic and parallel programming**
- To facilitate that, Java supports a set of **built-in functional interfaces**
 - `Predicate<T>: T -> boolean`
 - `Function<T, R>: T -> R`
 - `Consumer<T>: T -> void`
 - `Supplier<T>: () -> T`
 - ...

Built-in Functional Interfaces: Predicate<T>



■ java.util.function.Predicate<T>

```
public interface Predicate<T> {  
    boolean test(T t);  
}
```



- For creating a function object to **test if a condition holds**
- Commonly used to filter from a list (or stream) those elements that satisfy a condition. The condition test can be provided on-the-fly by a function object of type Predicate

Built-in Functional Interfaces: Predicate<T>

- `java.util.function.Predicate<T>`

```
public interface Predicate<T> {  
    boolean test(T t);  
}
```



If a functional interface has only one type parameter, it tends to describe the lambda variable type and the lambda returns either void or a primitive type

- For creating a function object to **test if a condition holds**
- Commonly used to filter from a list (or stream) those elements that satisfy a condition. The condition test can be provided on-the-fly by a function object of type Predicate

Using Predicate<T> functional interface

- If we want to support a few queries on an USTEmployee list.
 - findEmployeeByFirstName
 - findEmployeeByAge
 - findEmployeeBySalary
 - ...
- Prior to Java 8, we need to write a separate method for each query.

findEmployeebyFirstName and findEmployeebyAge

```
public static USTEmployee findEmployeebyFirstName  
(List<USTEmployee> employees, String firstName) {  
    for (USTEmployee e: employees) {  
        if (e.getFirstName().equals(firstName)) { return e; }  
    }  
    return null;  
}
```

Differences are highlighted in **red**. **List** is a commonly used Java interface in Lambdas. Classes implementing **List** include ArrayList, LinkedList, Stack, ...

What do you think?

```
public static USTEmployee findEmployeebyAge  
(List<USTEmployee> employees, int ageCutoff) {  
    for (USTEmployee e: employees) {  
        if (e.getAge() >= ageCutoff) { return e; }  
    }  
    return null;  
}
```

LambdaEmployee.java

findEmployeebyFirstName and findEmployeebyAge

```
public static USTEmployee findEmployeebyFirstName
(List<USTEmployee> employees, String firstName) {
    for (USTEmployee e: employees) {
        if (e.getFirstName().equals(firstName)) { return e; }
    }
    return null;
}
```

Suppose our application has 3 data lists (or tables), each has 10 attributes. To support various queries on these attributes, we will need to write **3,069** ($=3 \times (2^{10} - 1)$) find methods, which need to be consistently maintained in future.



I hate it!
Tedious and
difficult to
maintain!!

```
public static USTEmployee findEmployeebyAge
(List<USTEmployee> employees, int ageCutoff) {
    for (USTEmployee e: employees) {
        if (e.getAge() >= ageCutoff) { return e; }
    }
    return null;
}
```

LambdaEmployee.java
findWithoutLambda()

Using Predicate<T> functional interface

- We can write a **generic function** that finds an element for **any criteria** in **any type of list** using Predicate.

This generic function can be written independently from the LambdaEmployee program

```
public static <T> T find(List<T> dataset, Predicate<T> predicate) {  
    for (var e: dataset)  
        if (predicate.test(e))  
            return e;  
    return null;  
}
```

LambdaEmployee.java
[findWithLambda\(\)](#)

Exempt the need to write separate find methods:

- *FindEmployeeByFirstName:*
find(employees, e->e.getFirstName().equals("David"))
- *FindEmployeeByAge:*
find(employees, e->e.getAge() >= 42)
- *FindEmployeeByGender:*
find(employees, e->e.getGender() == "F")
- *FindCarByMileage:*
find(cars, c->c.getMileage() < 1000)

Exercise 1

- Can you modify the generic method find(...) to findAll(...) so that it finds all elements in a dataset?

```
public static <T> List<T> findAll(List<T> dataset, Predicate<T> predicate) {  
    List<T> matches = new ArrayList<>(); // diamond operator  
    for (T e : dataset)  
        if (predicate.test(e))  
            matches.add(e);  
    return matches;  
}
```

LamdaEmployee.java
findAllWithLambda()

Built-in Functional Interface: Function<T,R>



- Helps apply the function `apply(T t)` iteratively on each element of type **T** in a list with a result of type **R**

```
public interface Function<T,R> {  
    R apply(T t);  
}
```



If a functional interface has more than one type parameter, the last one tends to describe the output type and the remaining describes the lambda variable(s) type(s)

- Example: We apply a function to raise each employee's salary. The function takes an instance of **UStEmployee (T)** and returns an instance of **Double (R)**

```
Function<UStEmployee, Double> raise = e -> e.getSalary()*1.1;
```

```
for (var e: employees)  
    e.setSalary(raise.apply(e));
```

*raise references a function object that implements
apply(T t) using the lambda expression*

Built-in Functional Interface: Function<T,R>



- We can build on top of Function<T,R> and write a generic function that calculates the sum of all elements in a list of any type

```
public static <T> double mapSum(List<T> list, Function<T, Double> mapper) {  
    var sum = 0.0;  
    for (var entry : list) {  
        sum += mapper.apply(entry);  
    }  
    return sum;  
}
```

$$\text{mapsum}(\mathcal{L}, \text{mapper}) = \sum_{e \in \mathcal{L}} \text{mapper}(e)$$

Built-in Functional Interface: Function<T,R>

- We can now use **mapSum** to sum up a numeric property of each element in a given list.
- To sum up the total salary from a list of *employees*
`mapSum(employees, e -> e.getSalary());`
- To sum up the total balance from a list of purchased *items*
`mapSum(items, Item::getPrice);`

LambdaEmployee.java
mapSumTest()

Built-in Functional Interface: Consumer<T>



- `Function<T,R>` assumes a function that returns a value of type `R`.
- What if a functions that returns nothing but introduces side effect to the input object `t`?
- `Consumer<T>`: Let us make a “function” that takes an object of type `T` and does some side effect to it (with no return value)

```
public interface Consumer<T> {  
    public void accept(T t); // makes side effect to t  
}
```


Built-in Functional Interface: Consumer<T>

```
public void accept(Employee e) { e.setSalary(e.getSalary()*1.1); }
```

```
Consumer<USTEmployee> raise = e -> e.setSalary(e.getSalary()*1.1);  
for (var e: employees) raise.accept(e);
```

- Create a function object implementing an accept method that raises an input employee's salary by 10%.
 - *Note: "e.setSalary(e.getSalary()*1.1)" returns nothing*
- Apply the method to each employee in employees using a for-loop.

```
LambdaEmployee.java  
raiseSalaryUsingConsumerWithoutForEach()
```

Built-in Functional Interface: Consumer<T>

```
Consumer<USTEmployee> raise = e -> e.setSalary(e.getSalary()*1.1);  
for (var e: employees) raise.accept(e);
```

The above for-statement can be replaced by:

```
Consumer<USTEmployee> raise = e -> e.setSalary(e.getSalary()*1.1);  
employees.forEach(raise);
```

What are the advantages of the replacement?

It removes the need to specify the “accept(e)” method in the for-loop.

Built-in Functional Interface: Consumer<T>

```
Consumer<USTEmployee> raise = e -> e.setSalary(e.getSalary()*1.1);  
employees.forEach(raise);
```

- **forEach(*Consumer*<? super E>) returns void** ← We may cast raise to a supertype and then iterate it.
 - An **important** default method defined by interfaces **Iterable<E>** and **Stream<E>**
 - employees is an instance of List<USTEmployee>
 - List<E> extends Collection<E>, which extends Iterable<E>
 - **forEach** takes a **Consumer** function object and returns **nothing**
 - **forEach** allows lists to be processed as **unbounded streams** if needed:
 - employees.**stream()**.forEach(raise); // stream is a method of Collection that returns a Stream
 - **forEach** method is applied to stream elements once they are available
 - **Stream<E>** is a class introduced in Java 8 for (parallel) processing of big data
- forEach() is optimized to these two data structures*

Built-in Functional Interface: Consumer<T>

```
Consumer<USTEmployee> raise = e -> e.setSalary(e.getSalary()*1.1);  
employees.forEach(raise);
```

- A more common way to code this example by Java practitioners:

```
employees.forEach(e -> e.setSalary(e.getSalary()*1.1));
```

1. *compiler automatically infers that it is a Consumer function object.*
2. *The generic type T of Consumer<T> binds to the type of lambda variable e (which is USTEmployee in the example).*

LambdaEmployee.java
raiseSalaryUsingConsumerWithForEach()

Built-in Functional Interface: Consumer<T>

```
employees.forEach(e -> e.setSalary(e.getSalary()*1.1));
```

- Turn a list into a sequential stream processing:

```
employees.stream().forEach(e -> e.setSalary(e.getSalary()*1.1));
```

- Turn a list into a parallel stream processing:

```
employees.parallelStream().forEach(e -> e.setSalary(e.getSalary()*1.1));
```

To learn more on stream operations: <https://www.youtube.com/watch?v=bzO5GSujdql>

Type Casting of Functional Interfaces



■ functional interfaces

My Consumer interface

```
interface Consumer<T> {void accept(T t);}
interface MyInterface {void processEmployee(USTEmployee e);} ←
```

■ incompatible types cannot be automatically converted

```
Consumer<USTEmployee> raise = e -> e.setSalary(e.getSalary()*1.1);
MyInterface mi = e -> e.setSalary(e.getSalary()*1.1);
mi = raise; // error: types are not compatible ← Same lambda
```

```
mi = (MyInterface) raise; // Can we cast Consumer<USTEmployee> to MyInterface?
```

Type Casting of Functional Interfaces



[LambdaEmployee.java](#)

[TypeCasting.testTypeCasting\(\)](#)

■ functional interfaces

```
interface Consumer<T> {void accept(T t);}
interface MyInterface {void processEmployee(USTEmployee e);}
```

■ Cannot resolve setSalary and getSalary. Why?

```
var o = e -> e.setSalary(e.getSalary()*1.1); // error
```



Tell java compiler the lambda's type

```
var o = (MyInterface) e -> e.setSalary(e.getSalary()*1.1);
```

```
var o = (Consumer<USTEmployee>) e -> e.setSalary(e.getSalary()*1.1);
```

Useful built-in functional interfaces for future references (optional)

- Lookup the online Java tutorial or other web resources on the use of other built-in functional interfaces:
 - ❑ `BinaryOperator<T>: (T, T) -> T`
 - ❑ `Block<T>: T -> void`
 - ❑ `Combiner<T, U, V>: (T, U) -> V`
 - ❑ `Factory<T>: () -> T`
 - ❑ `Mapper<T, U>: T -> U`
 - ❑ `Supplier<T>: () -> T`
 - ❑ `UnaryOperator<T>: T -> T`
 - ❑ ...

<https://docs.oracle.com/javase/tutorial/>

Function Composition (by Predicate default methods)

- So far, we pass non-function objects (e.g., USTEmployee) to the method defined in the built-in functional interfaces



```
public interface Predicate<T> {  
    boolean test(T t)  
}
```

```
// anonymous innerclass  
Predicate<USTEmployee> isYoung = new Predicate() {  
    boolean test(USTEmployee e) {  
        return e.getAge() < 30;  
    }  
}
```

- Predicate<USTEmployee> isYoung = e -> e.getAge()<30;
- Predicate<USTEmployee> isRich = e -> e.getSalary()>=30000;
- In both cases, we pass a USTEmployee object e to the test() method

Function Composition (by Predicate default methods)

```
Predicate<USTEmployee> isYoung = e -> e.getAge()<30;  
Predicate<USTEmployee> isRich = e -> e.getSalary()>20000;
```

- Can we use the Predicate<T> to logically compose these two lambdas?
 - E.g., Find employees who are both young and rich.
- Yes, we can compose these two lambdas using default methods.

- Example:

- query = find(employees, isRich.**and**(isYoung));

take a function object as parameter

LambdaEmployee.java
composeFunctions()

*compose two lambdas using the **and**() default method in the Predicate interface*

Function Composition by Predicate default methods

- `and: Predicate<? super T> -> Predicate<T> // isYoung -> isRich&isYoung`
 - a *default method* that accept a predicate p and returns a composed predicate whose test method is true if both the current predicate and p is true.
- `or: Predicate<? super T> -> Predicate<T>`
 - a *default method* that accepts a predicate p and returns a composed predicate whose test method is true if either the current predicate or p is true.
- `negate: () -> Predicate<T>`
 - a *default method* that returns a predicate negating the current one.
- `isEqual: Object -> Predicate<T>`
 - a *static method* that accepts an object and returns a predicate whose test method is true if the current predicate's argument equals to the object.

Predicate default Methods

- and, or, negate, isEqual are default methods defined by the built-in Predicate interface to facilitate predicate composition.
- They cannot be abstract methods because otherwise:
 - ❑ Predicate functional interface contains more than one abstract method, violating the language rule.
 - ❑ Developers need to implement these methods for each Predicate function object, which is tedious.
 - ❑ Java 8 provides default implementation of these methods.
 - ❑ and, or, negate can be overridden by Predicate function objects.

Examples of and, or, negate, isEqual

- `Predicate<USTEmployee> isYoung = e -> e.getAge() < 30;`
- `Predicate<USTEmployee> isRich = e -> e.getSalary() > 20000;`
- `findAll(employees, isRich.and(isYoung))`
- `findAll(employees, isRich.or(isYoung))`
- `findAll(employees, isRich.negate())`

- `Predicate<USTEmployee> sameAsFirst =
 Predicate.isEqual(employees.get(0));`
- `findAll(employees, sameAsFirst)`

Exercise 2:

- Write a generic function *conjunct* that accepts variable Predicate arguments and return a predicate that conjunct all arguments?

E.g., `conjunct(w->w.contains("h"), w->w.contains("l"), w->w.length()<=4)`
is evaluated to: `w->true.and(w->w.contains("h").and(w->w.length()<=4))`

```
public static <T> Predicate<T> conjunct(Predicate<T>... predicates) {  
    Predicate<T> result = e->true; // a trivial tautology if no input arguments  
    for (var e: predicates)  
        result = result.and(e);  
    return result;  
}
```

Exercise 3:

- Write a generic function *findAll* that accepts a list and variable Predicate arguments, and returns all elements that satisfy all the predicate arguments from the list? Assume the *findAll* in Exercise 1 and *conjunction* in Exercise 2.

E.g., `findAll(words, w->w.contains("h"), w->w.contains("l"), w->w.length()<=4)`

```
public static <T> List<T> findAll(List<T> dataset, Predicate<T>... predicates) {  
    Predicate<T> compositePredicate = conjunction(predicates);  
    return findAll(dataset, compositePredicate);  
}
```

Exercise 4: Using the findAll with multiple predicates

```
private static List<String> words = Arrays.asList("hi", "hello", "hola",  
"bye", "goodbye", "adios");  
public static void findAllExample() {  
    List<String> hWords = Util.findAll(words, w->w.contains("h"));  
    System.out.println("Words with h: "+hWords);  
    List<String> hlWords = Util.findAll(words, w->w.contains("h"),  
        w->w.contains("l"));  
    System.out.println("Words with h and l: "+hlWords);  
    List<String> hlShortWords = Util.findAll(words, w->w.contains("h"),  
        w->w.contains("l"), w->w.length()<=4);  
    System.out.println("Words with h and l and length <= 4: "+hlShortWords);  
}
```

LambdaEmployee.java
Word.findAllExample()

Function Default Methods

- `Function<T, R>` provides two useful default methods to compose functions.

```
public interface Function<T,R> {  
    R apply(T t);  
}
```

- `compose: Function -> Function`

- a *default method* where `f1.compose(f2)` means to pass the argument to `f2.apply` and then the result to `f1.apply`.
Mathematically, $f1(f2(x))$ or $f1 \circ f2$.

- `identity: () -> Function`

- a *static method* returning a function that always echoes its input argument (i.e., $e \rightarrow e$).

Exercise 5: Composing Multiple Functions

- Write a generic function to compose all the functions in its arguments.

```
public static<T> Function<T,T> composeAll(Function<T,T>... functions) {  
    Function<T,T> result = Function.identity(); // a base fn for compositi  
    for (var f: functions)  
        result = result.compose(f);  
    return result;  
}
```

```
Function<Double,Double> f = Util.composeAll(Math::rint, Math::sqrt);
```

Stream Operations and Their Composition

```
List<Integer> numbers = Arrays.asList(1,2,3,4,5,6,7,8,9,10);  
numbers.stream()  
    .map(v -> v*2)  
    .forEach(System.out::println);
```

- Stream<T> operations are composed into a pipeline
- They are **lazily evaluated**
- Seven popular default methods supported by Stream objects:
 - ❑ filter(Predicate), map(Function), reduce(BinaryOperator)
 - ❑ forEach(), anyMatch(), allMatch(), count()

<R> map: (Function<? super T, ? extends R>) -> Stream<R>



```
public static void main(String[] args) {  
    var numbers = Arrays.asList(1,2,3,4,5,6,7,8,9,10);  
    applyMap(numbers, v->v*2);  
}
```

```
public static <T, R> void applyMap(List<T> list, Function<T, R> f) {  
    list.stream()  
        .map(f)  
        .forEach(System.out::println);  
}
```

StreamOperation.java
applyMap

filter: Predicate<? super T> -> Stream<T>



```
List<Integer> numbers = Arrays.asList(1,2,3,4,5,6,7,8,9,10);  
numbers.stream()
```

```
.filter(v -> v%2==0)
```

```
.forEach(System.out::println);
```

StreamOperation.java
applyFilter

```
List<String> names = Arrays.asList("Bob", "Tom", "Jeff", "Jennifer", "Steve");  
final Function<String, Predicate<String>> startsWithLetter =
```

```
    letter->name->name.startsWith(letter); // lambda with 2 function objs
```

```
names.stream()
```

```
.filter(startsWithLetter.apply("J"))
```

```
.forEach(System.out::println);
```

```
public interface Function<T,R> {  
    R apply(T t);  
}
```

<T> reduce(**base**, (T,T) -> T)



base value to be returned for an empty stream

StreamOperation.java
applyReduce



```
List<Integer> numbers = Arrays.asList(1,2,3,4,5,6,7,8,9,10);  
int sum = numbers.stream().reduce(0, (i, j)->i+j);  
System.out.println(sum);
```

```
List<String> names = Arrays.asList("Bob", "Tom", "Jeff", "Jennifer", "Steve");  
String longestName = names.stream().reduce("", (name1, name2) ->  
    name1.length()>=name2.length()?name1:name2);  
System.out.println(longestName);
```

```
double totalSalary = employees.stream().map(e->e.getSalary()).reduce(0.0, (s1, s2)->s1+s2);  
System.out.println("Total salary = " + totalSalary);
```

<T> reduce(**base**, (T,T) -> T)



base value to be returned for an empty stream



```
double totalSalary = employees.stream().map(e->e.getSalary()).reduce(0.0, (s1, s2)->s1+s2);  
System.out.println("Total salary = " + totalSalary);
```

```
double totalSalary =  
    employees.stream()  
        .map(e->e.getSalary())  
        .reduce(0.0, (s1, s2)->s1+s2);  
System.out.println("Total salary = " + totalSalary);
```

anyMatch(), allMatch(), count()



```
boolean anyMatch = employees.stream().anyMatch(e -> e.getAge()>42);  
System.out.println("Is there an employee older than 42? "+anyMatch);
```

```
boolean allMatch = employees.stream().allMatch(e -> e.getAge()>42);  
System.out.println("Are all employees older than 42? "+allMatch);
```

```
long n = employees.stream().filter(e -> e.getAge()>42).count();  
System.out.printf("There are %d employees older than 42.\n", n);
```

StreamOperation.java

Making Streams

■ From List

- `aList.stream()`

```
employees.stream()
```

■ From object array

- `Stream.of(anArray)`

```
Employee[] workers = ...;  
Stream.of(workers)
```

■ From individual values

- `Stream.of(val1, val2, ...)`

```
Employee e1 = ...;  
Employee e2 = ...;  
Stream.of(e1, e2, ...)
```

Converting Streams back to Data Structures

■ To List

- ❑ `aStream.collect(Collectors.toList())`
- ❑ `employees = employeeStream.collect(Collectors.toList());`

■ To object array

- ❑ `aStream.toArray(EntryType[]::new)`
- ❑ `employeeArray =
employeeStream.toArray(USTEmployee[]::new);`

Computing lambdas with multi-cores and GPUs

```
static void tryParallelStreamOperation() {
```

```
List<Integer> numbers = Arrays.asList(1,2,3,4,5,6,7,8,9,10);  
numbers.parallelStream().forEach(System.out::println);
```

```
employees.parallelStream()  
    .filter(e->e.getAge() >= 42)  
    .map(e->e.getFirstName()+"")  
    .forEach(System.out::println);
```

replace stream() with parallelStream()

```
}
```

LambdaEmployee.java
tryParallelStreamOperation

Computing lambdas with multi-cores and GPUs

- The idea is to define computation in lambdas as parallel streams and let the JVM run it on multi-cores and GPUs.
 - ❑ <http://semiaccurate.com/2013/11/11/amd-charts-path-java-gpu/>
 - ❑ <https://dzone.com/articles/whats-wrong-java-8-part-iii> ← *Possible implementation limitation*
- Java 8 is supported since Android Studio 2.1 and Android N.
 - ❑ Allow Android apps to leverage the multi-cores and GPU on mobile devices.
 - ❑ <http://www.androidpolice.com/2016/04/26/android-studio-v2-1-released-to-stable-channel-with-support-for-android-n-java-8-language-features-and-more/>

Further Notes on Default Methods

Motivation:

- *Default methods* add new functionality to an existing interface without breaking its implementing classes.

Why default methods in Java 8?

- With the introduction of stream processing, any **Iterable** objects (e.g., lists, sets, ...) can be processed as a stream using `forEach`:

```
forEach( E e: list ) { ... }
```

Further Notes on Default Methods

- Iterable<E> is an interface, which is a super-type of List<E>.

```
public interface Iterator<T> {  
    ... // abstract methods defined in Java 7  
    public default void forEach(Consumer<? super T> action) { ... }  
    ... // other default methods in Java 8  
}
```

- Default methods **add stream processing functionality** to Iterable without breaking all existing classes that have implemented Iterable<T> or its descendants (e.g., List<T>) for the sake of backward compatibility.
- Default methods add functional composition to Predicate<T> using logical operations
- Default methods add functional composition to Function<T,R>
- ...

Further Notes on Default Methods



```
interface Vehicle {  
    default void print() {  
        System.out.println("I am a vehicle.");  
    }  
}
```

```
class Car implements Vehicle {  
    void foo() {  
        print();  
    }  
}
```

- Default methods **must** be public.
- Default methods **cannot** be final.

Further Notes on Default Methods



```
interface Vehicle {  
    default void print() {  
        System.out.println("I am a vehicle.");  
    }  
}
```

```
class Car1 implements Vehicle {  
    public void print() {  
        System.out.print("I am a car and ");  
        Vehicle.super.print();  
    }  
}
```

- Default methods can be overridden.
- Default method can be called using **InterfaceName.super**.

Ambiguous Default Methods – Resolve by Overriding



```
interface Vehicle {  
    default void print() {  
        System.out.println("I am a vehicle.");  
    }  
}
```

```
interface FourWheeler {  
    default void print() {  
        System.out.println("I am a four wheeler.");  
    }  
}
```

```
class Car3 implements Vehicle, FourWheeler {  
    public void print() {  
        Vehicle.super.print();  
    }  
}
```

- Multiple inheritance of default methods can cause ambiguity, which needs to resolve.

Ambiguous Default Methods – Resolve by Overriding



```
interface Vehicle {  
    default void print() {  
        System.out.println("I am a vehicle.");  
    }  
}
```

```
interface FourWheeler {  
    default void print() { helperFunction(); }  
    private void helperFunction() {  
        System.out.println("I am a four wheeler.");  
    }  
}
```

```
class Car2 implements Vehicle, FourWheeler {  
    public void print() {  
        System.out.print("I am a four wheeler car vehicle.\n");  
    }  
}
```

private
interface
method

- Java interface supports private methods to provide helper functions for other interface methods

Static Interface Methods

```
interface Vehicle {  
    default void print() {  
        System.out.println("I am a vehicle.");  
    }  
    static void blowHorn() {  
        System.out.println("Blowing horn!");  
    }  
}
```

```
...  
Vehicle.blowHorn();  
...
```

- Non-abstract interface methods can be static
- They can be called like regular static methods in classes

LambdaDefaultMethod

Static Interface Methods

```
interface Vehicle {  
    default void print() {  
        System.out.println("I am a vehicle.");  
    }  
    static void blowHorn() {  
        System.out.println("Blowing horn!");  
    }  
}
```

```
...  
Vehicle.blowHorn();  
...
```

- Interface static methods cannot be inherited
- Why?



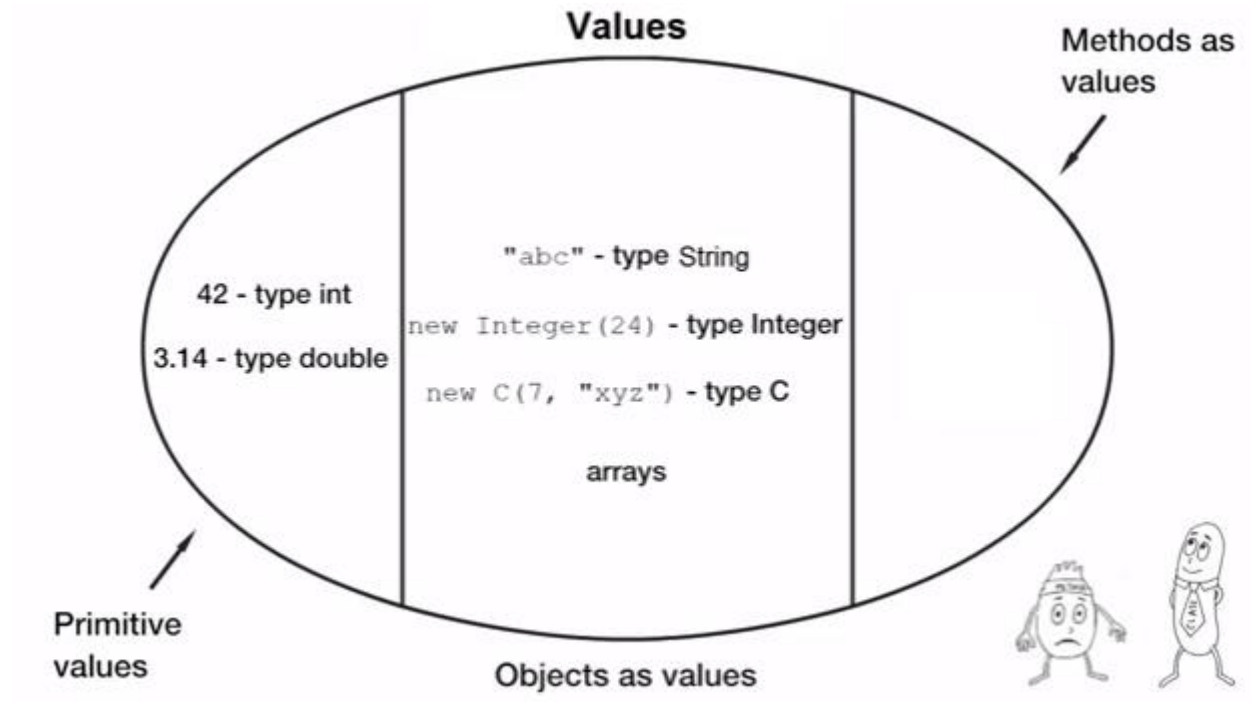
Summary

```
employees.forEach(e -> e.setSalary(e.getSalary()*1.1));
```

- Functional programming: Define function object in lambda
- Built-in functional interfaces in Java 8
- Generic programming using lambdas
- Higher order functions: composing lambdas using default methods in built-in functional interfaces

<http://docs.oracle.com/javase/tutorial/java/javaOO/lambdaexpressions.html>

Video: First-class functions in Java



<https://www.youtube.com/watch?v=Rd-sqHjmfB0>

THE END OF JAVA LECTURES

