

# FUNCTIONAL REACTIVE PROGRAMMING IN THE NETFLIX API

LambdaJam – July 2013

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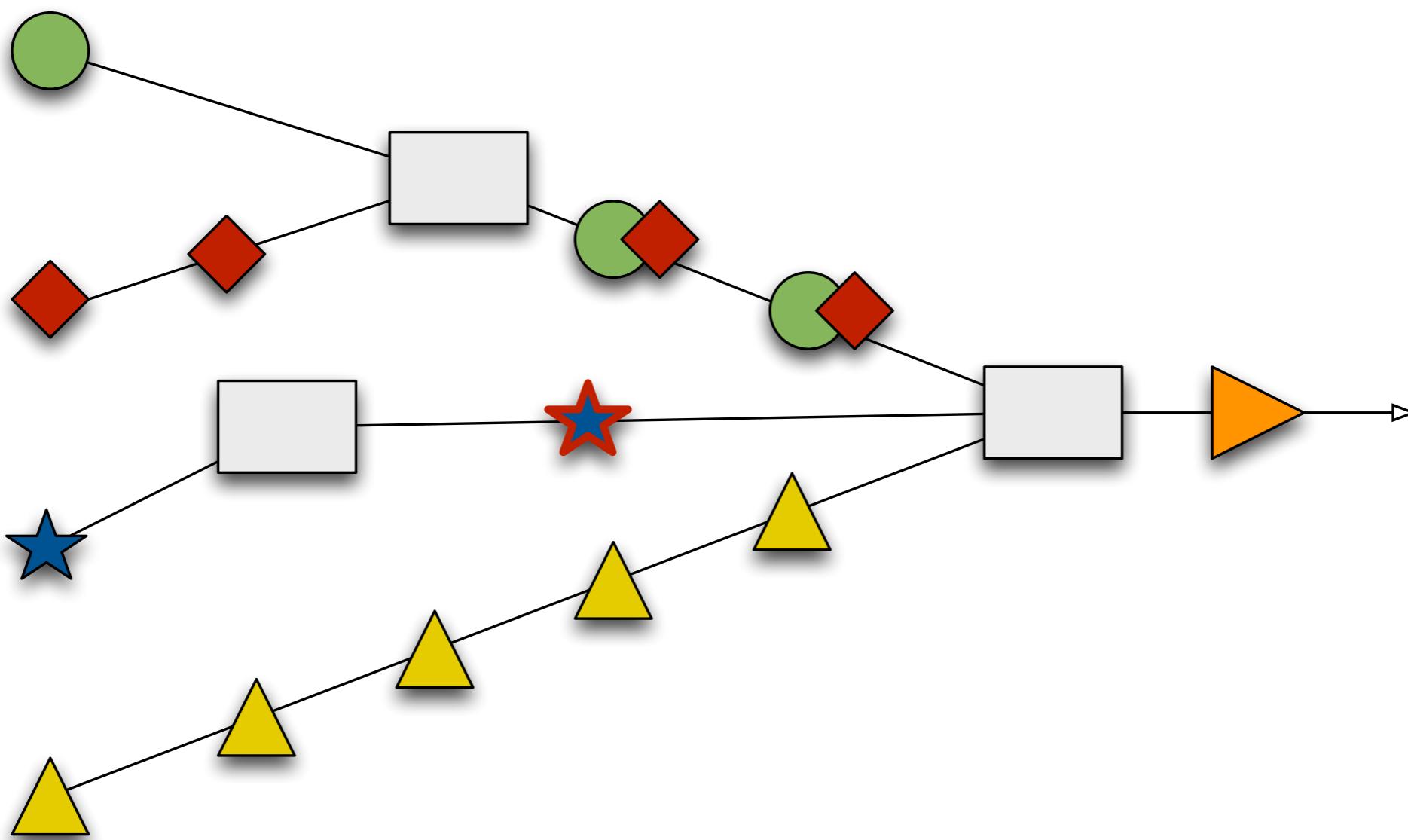
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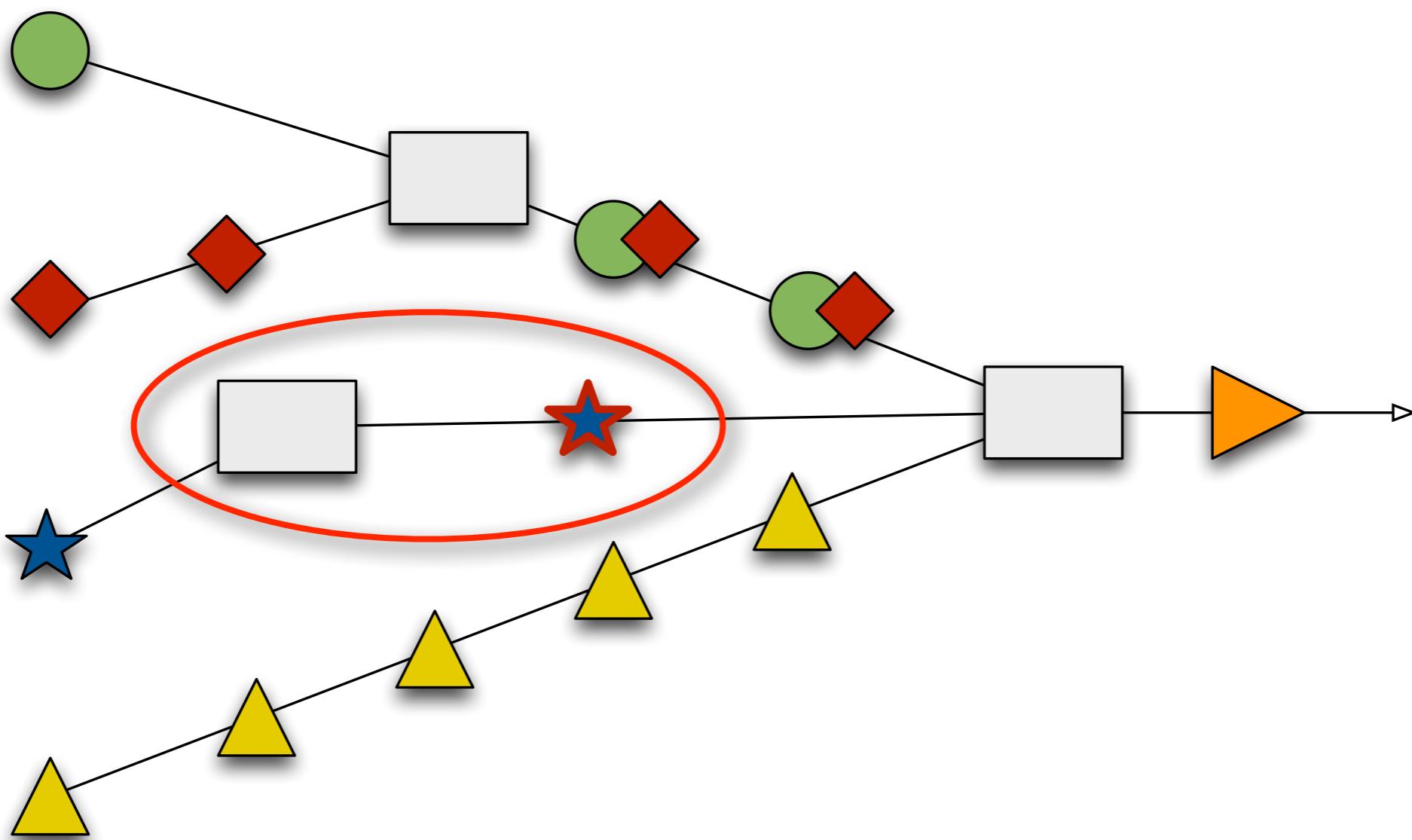
<http://techblog.netflix.com/>

# COMPOSABLE FUNCTIONS



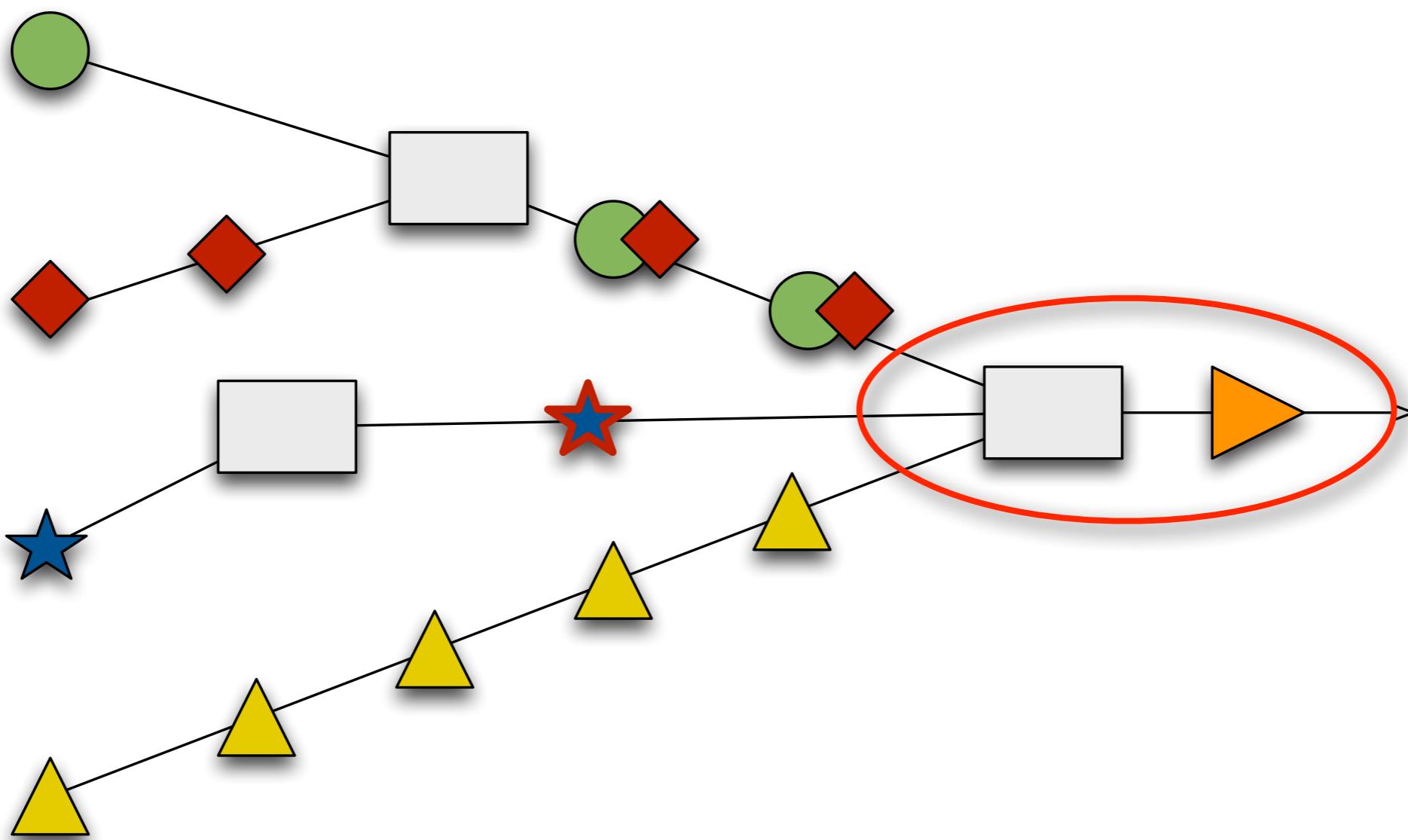
## APPLIED REACTIVELY

# COMPOSABLE FUNCTIONS



APPLIED REACTIVELY

# COMPOSABLE FUNCTIONS



## APPLIED REACTIVELY

... combine and output web service responses.

**ASYNCHRONOUS  
VALUES  
EVENTS  
PUSH**

**FUNCTIONAL REACTIVE**

**LAMBDAS  
CLOSURES  
(MOSTLY) PURE  
COMPOSABLE**

We have been calling this approach “functional reactive” since we use functions (lambdas/closures) in a reactive (asynchronous/push) manner.

ASYNCHRONOUS  
VALUES  
EVENTS  
PUSH

**SEMI-FUNCTIONAL REACTIVE ?**

LAMBDAS  
CLOSURES  
(MOSTLY) PURE  
COMPOSABLE

## Clojure

```
(->
  (Observable/toObservable ["one" "two" "three"])
  (.take 2)
  (.subscribe (fn [arg] (println arg))))
```

## Groovy

```
Observable.toObservable("one", "two", "three")
  .take(2)
  .subscribe{arg -> println(arg)}
```

## Java8

```
Observable.toobservable("one", "two", "three")
  .take(2)
  .subscribe((arg) -> {
    System.out.println(arg);
});
```

## Scala

```
Observable.toObservable("one", "two", "three")
  .take(2)
  .subscribe((arg: String) => {
    println(arg)
})
```

## JRuby

```
Observable.toObservable("one", "two", "three")
  .take(2)
  .subscribe(lambda { |arg| puts arg })
```

## Clojure

```
(->
  (Observable/toObservable ["one" "two" "three"])
  (.take 2)
  (.subscribe (fn [arg] (println arg))))
```

## Groovy

```
Observable.toObservable("one", "two", "three")
  .take(2)
  .subscribe{arg -> println(arg)}
```

## Scala

```
Observable.toObservable("one", "two", "three")
  .take(2)
  .subscribe((arg: String) => {
    println(arg)
  })
```

## JRuby

```
Observable.toobservable("one", "two", "three")
  .take(2)
  .subscribe(lambda { |arg| puts arg })
```

```
Observable.toobservable("one", "two", "three")
  .take(2)
  .subscribe((arg) -> {
    System.out.println(arg);
});
```

# RxJava

<http://github.com/Netflix/RxJava>

**“A LIBRARY FOR COMPOSING  
ASYNCHRONOUS AND EVENT-BASED  
PROGRAMS USING OBSERVABLE  
SEQUENCES FOR THE JAVA VM”**



A Java port of Rx (Reactive Extensions)  
<https://rx.codeplex.com> (.Net and Javascript by Microsoft)

Watch TV shows & movies anytime,  
anywhere.

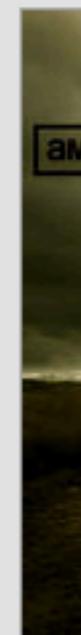
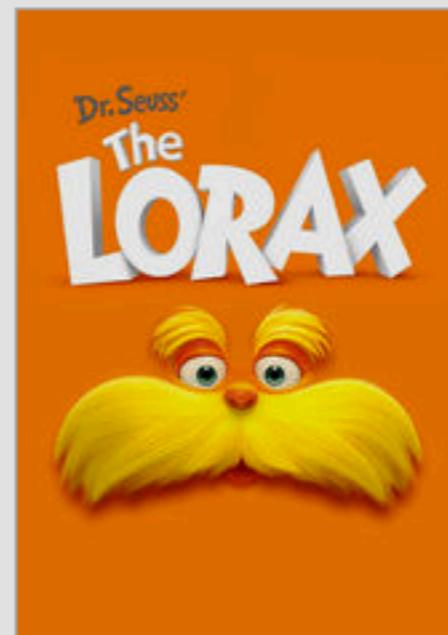
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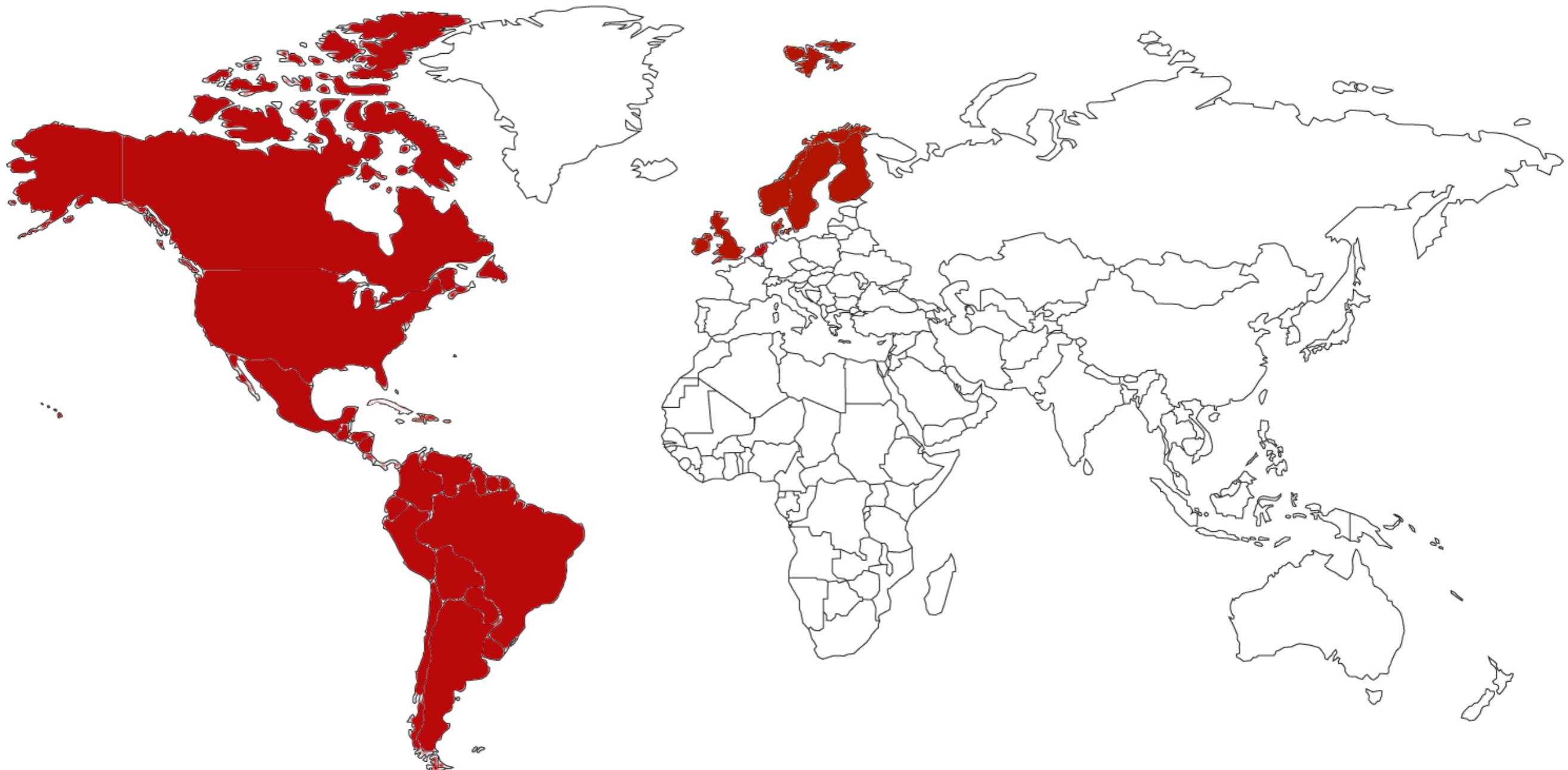
### Popular on Netflix



### Exciting Movies



# MORE THAN 36 MILLION SUBSCRIBERS IN 50+ COUNTRIES AND TERRITORIES



Netflix has over 36 million video streaming customers in 50+ countries and territories across North & South America, United Kingdom, Ireland, Netherlands and the Nordics.

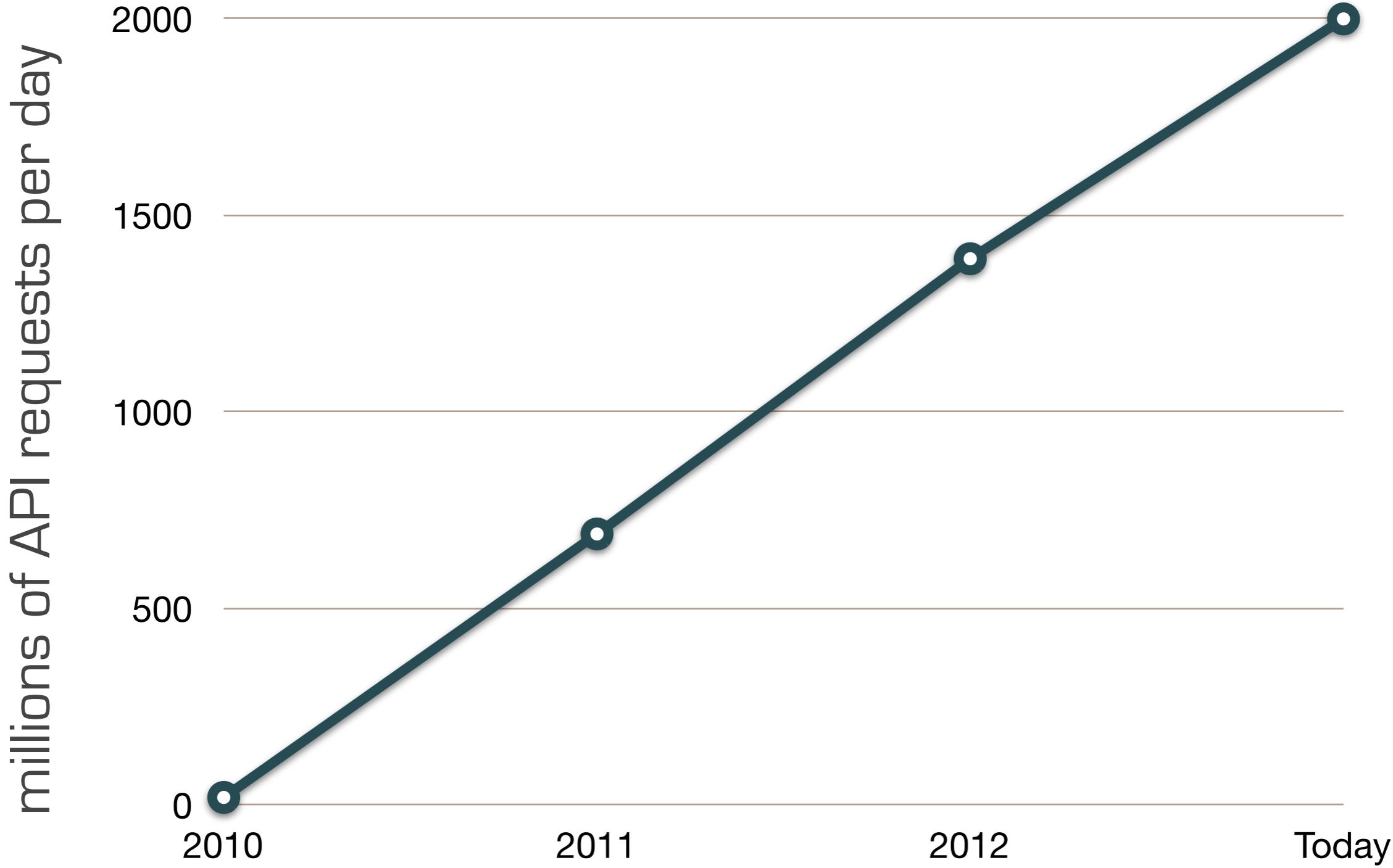
# NETFLIX ACCOUNTS FOR 33% OF PEAK DOWNSTREAM INTERNET TRAFFIC IN NORTH AMERICA

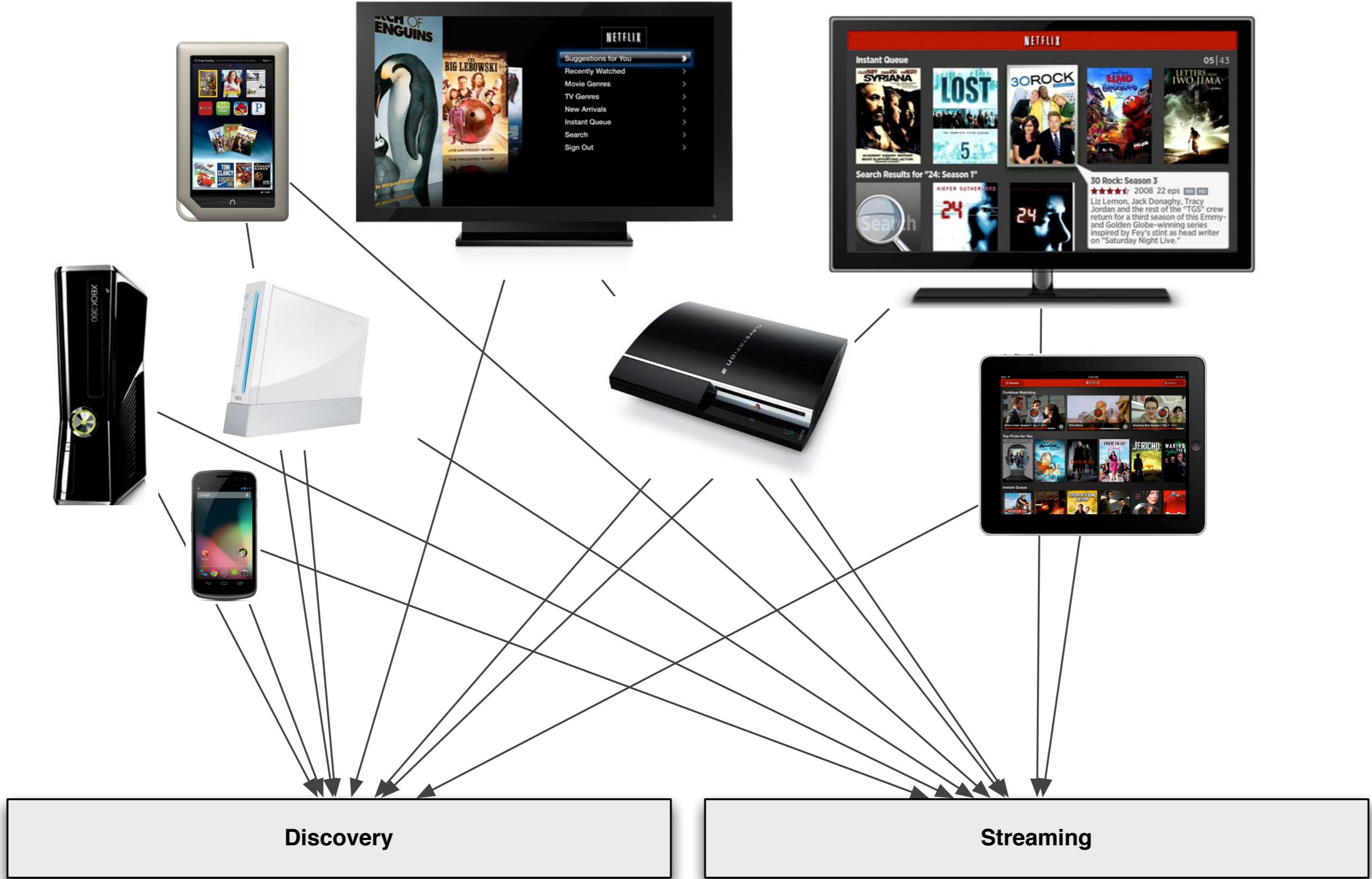
Rank	Upstream		Downstream		Aggregate	
	Application	Share	Application	Share	Application	Share
1	BitTorrent	36.8%	Netflix	33.0%	Netflix	28.8%
2	HTTP	9.83%	YouTube	14.8%	YouTube	13.1%
3	Skype	4.76%	HTTP	12.0%	HTTP	11.7%
4	Netflix	4.51%	BitTorrent	5.89%	BitTorrent	10.3%
5	SSL	3.73%	iTunes	3.92%	iTunes	3.43%
6	YouTube	2.70%	MPEG	2.22%	SSL	2.23%
7	PPStream	1.65%	Flash Video	2.21%	MPEG	2.05%
8	Facebook	1.62%	SSL	1.97%	Flash Video	2.01%
9	Apple PhotoStream	1.46%	Amazon Video	1.75%	Facebook	1.50%
10	Dropbox	1.17%	Facebook	1.48%	RTMP	1.41%
	Top 10	68.24%	Top 10	79.01%	Top 10	76.54%

 sandvine®

NETFLIX SUBSCRIBERS ARE WATCHING  
MORE THAN 1 BILLION HOURS A MONTH

# API TRAFFIC HAS GROWN FROM ~20 MILLION/DAY IN 2010 TO >2 BILLION/DAY

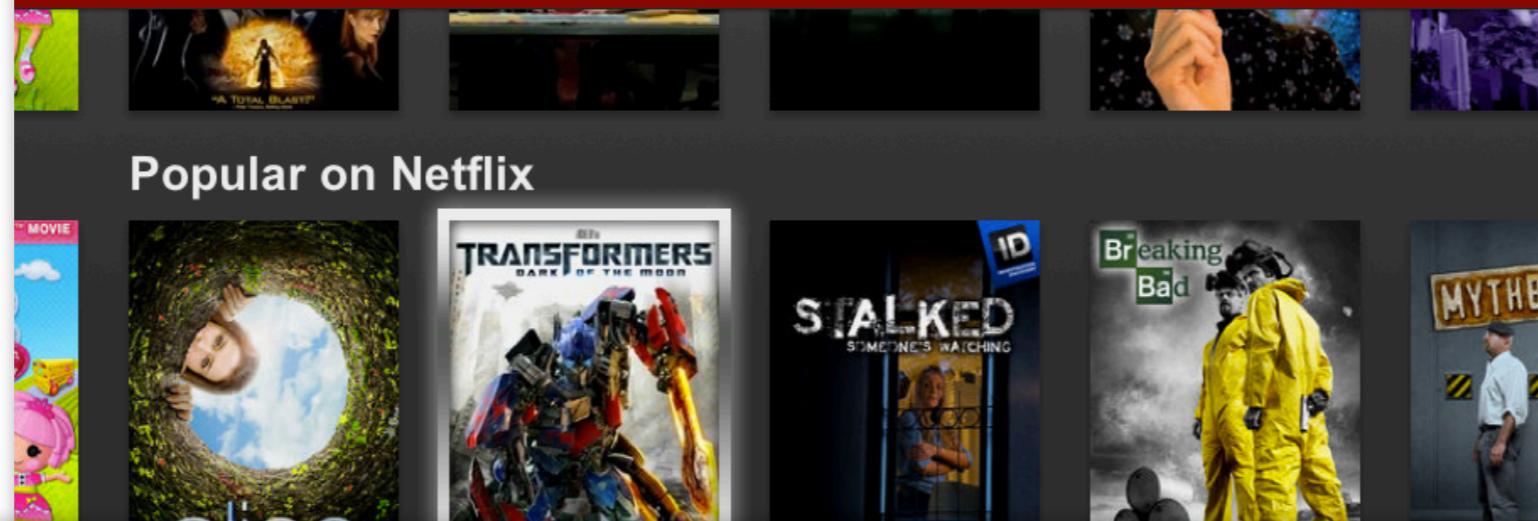




Streaming devices talk to 2 major edge services: the first is the Netflix API that provides functionality related to discovering and browsing content while the second handles the playback of video streams.



This presentation focuses on architectural choices made for the “Discovery” portion of traffic that the Netflix API handles.



Transformers: Dark of the Moon

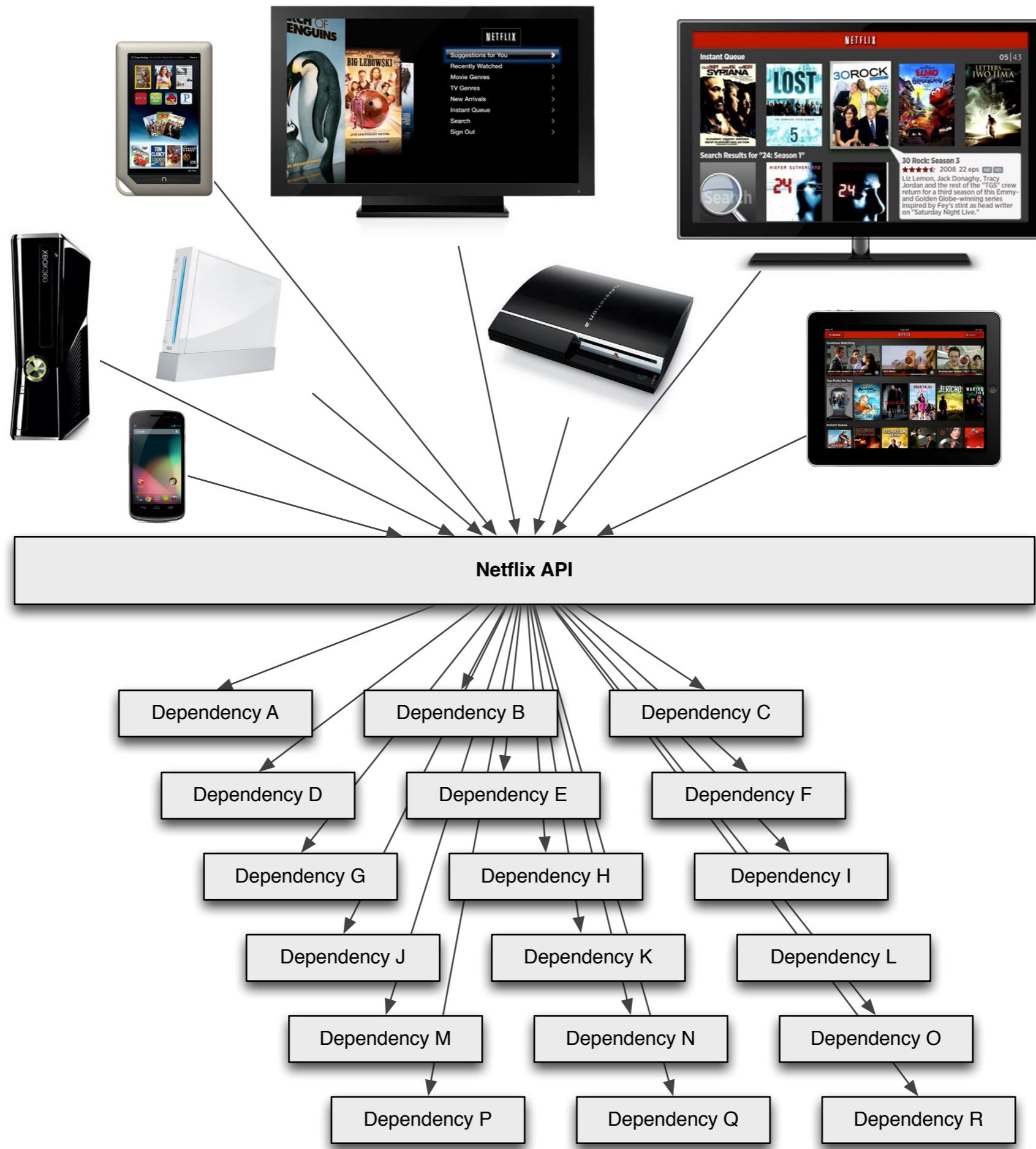
2011 PG-13 2h 34m

★★★★★ [HD]

The third installment in Michael Bay's trilogy travels back to 1969's moon landing, when Apollo 11 touched down in the Sea of Tranquility.

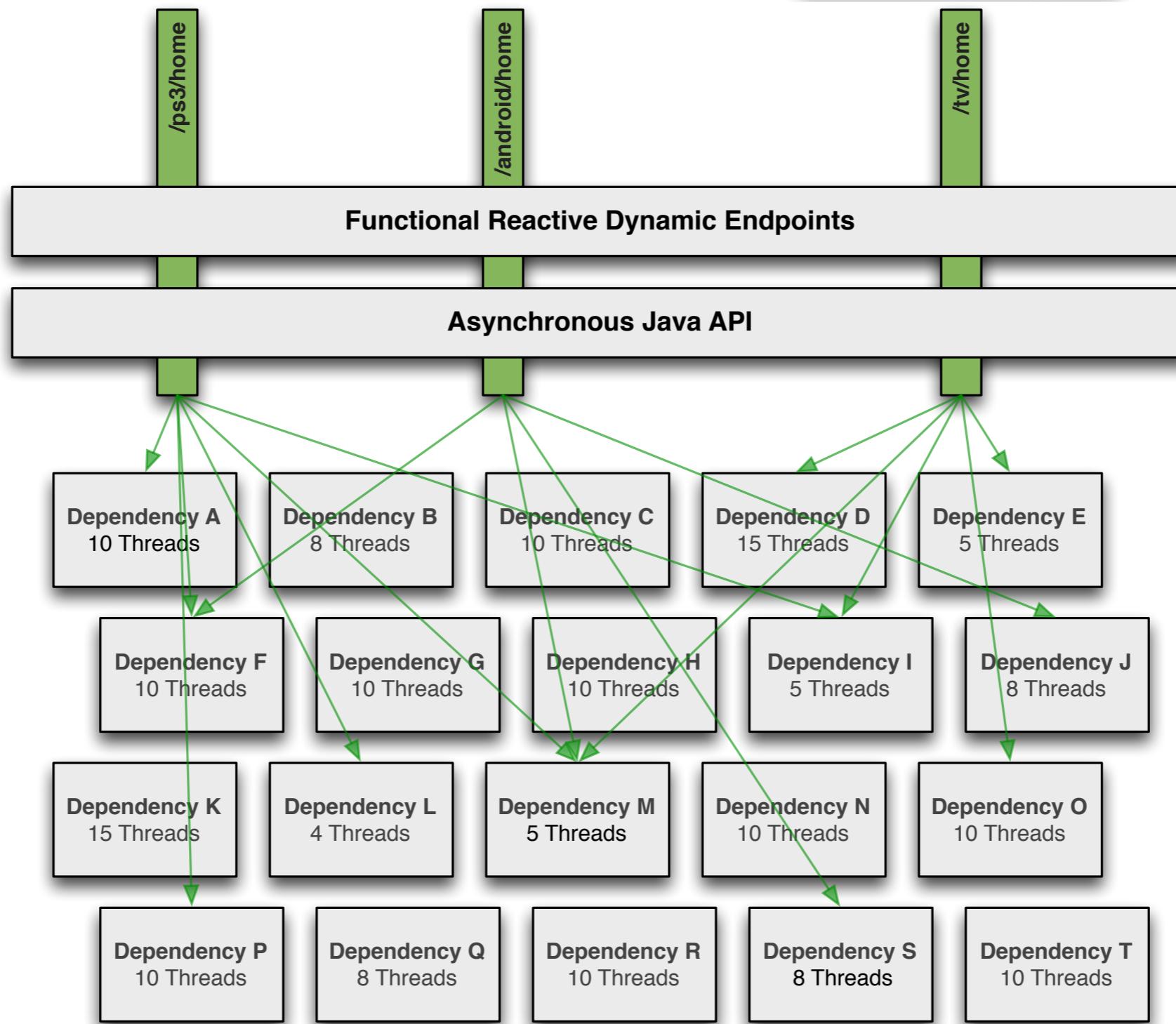
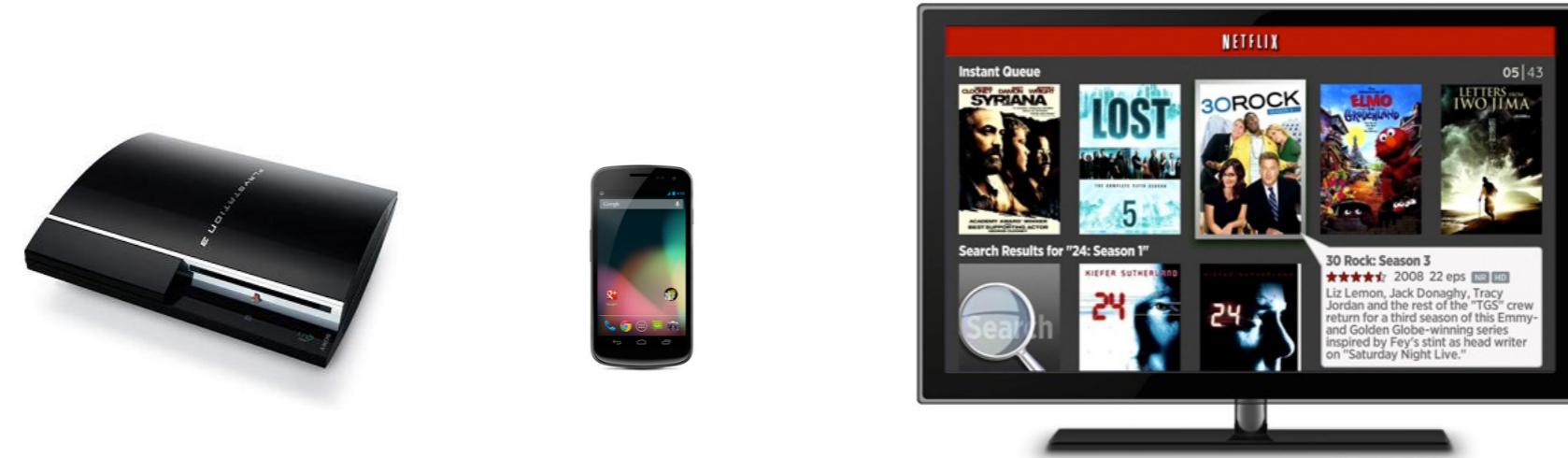
☰ Browse
Just for Kids
NETFLIX
Search
Rosie Huntington-

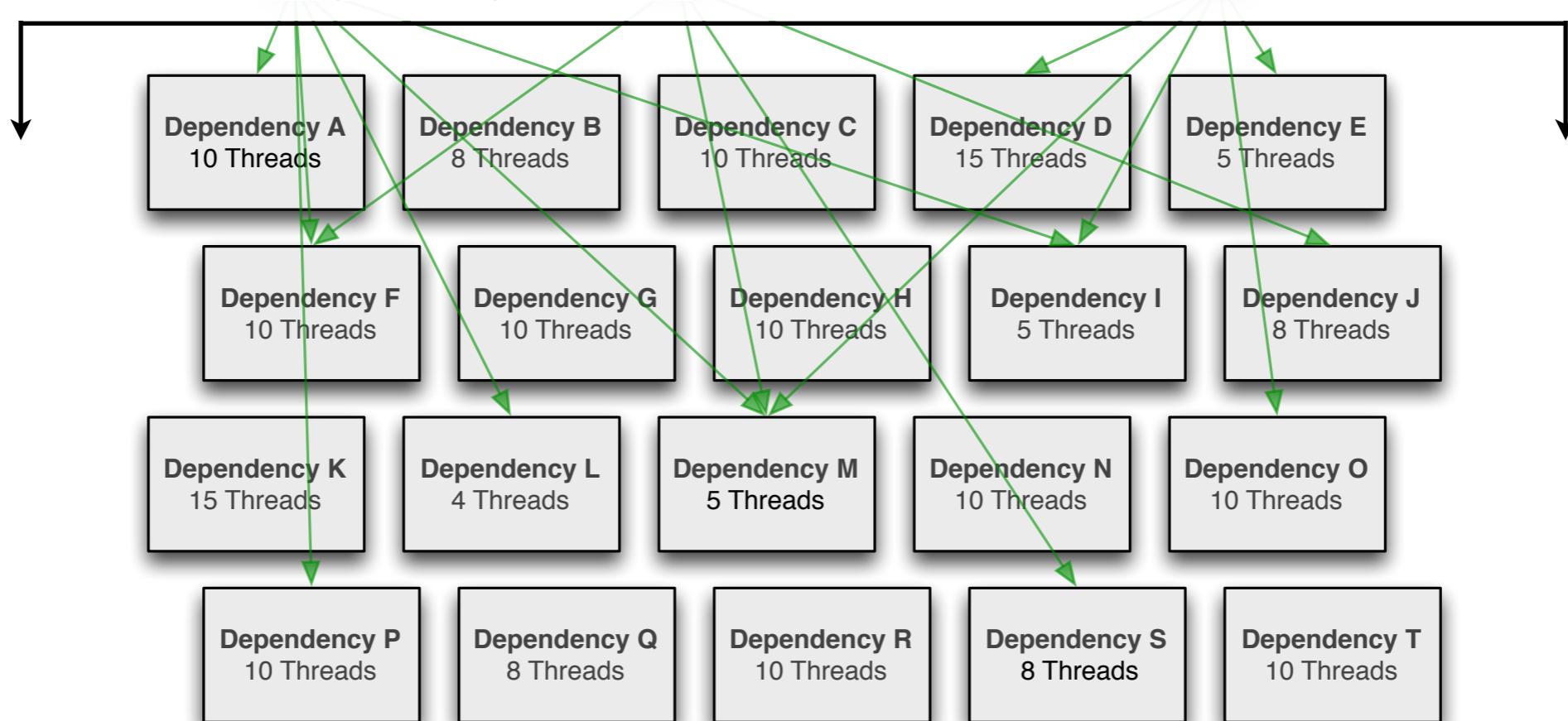
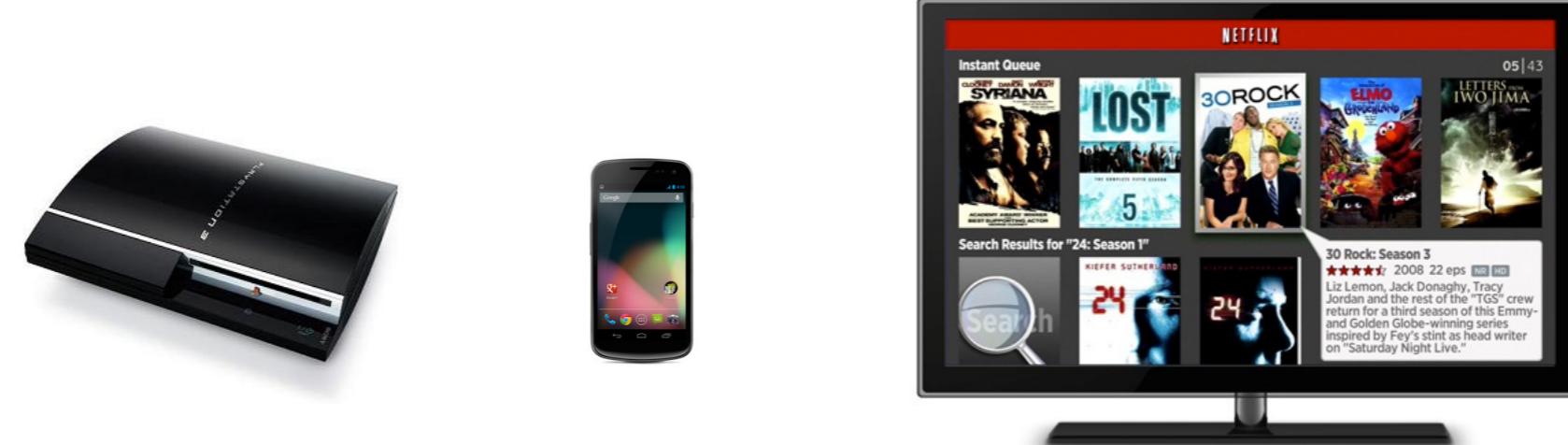
### TV Action & Adventure

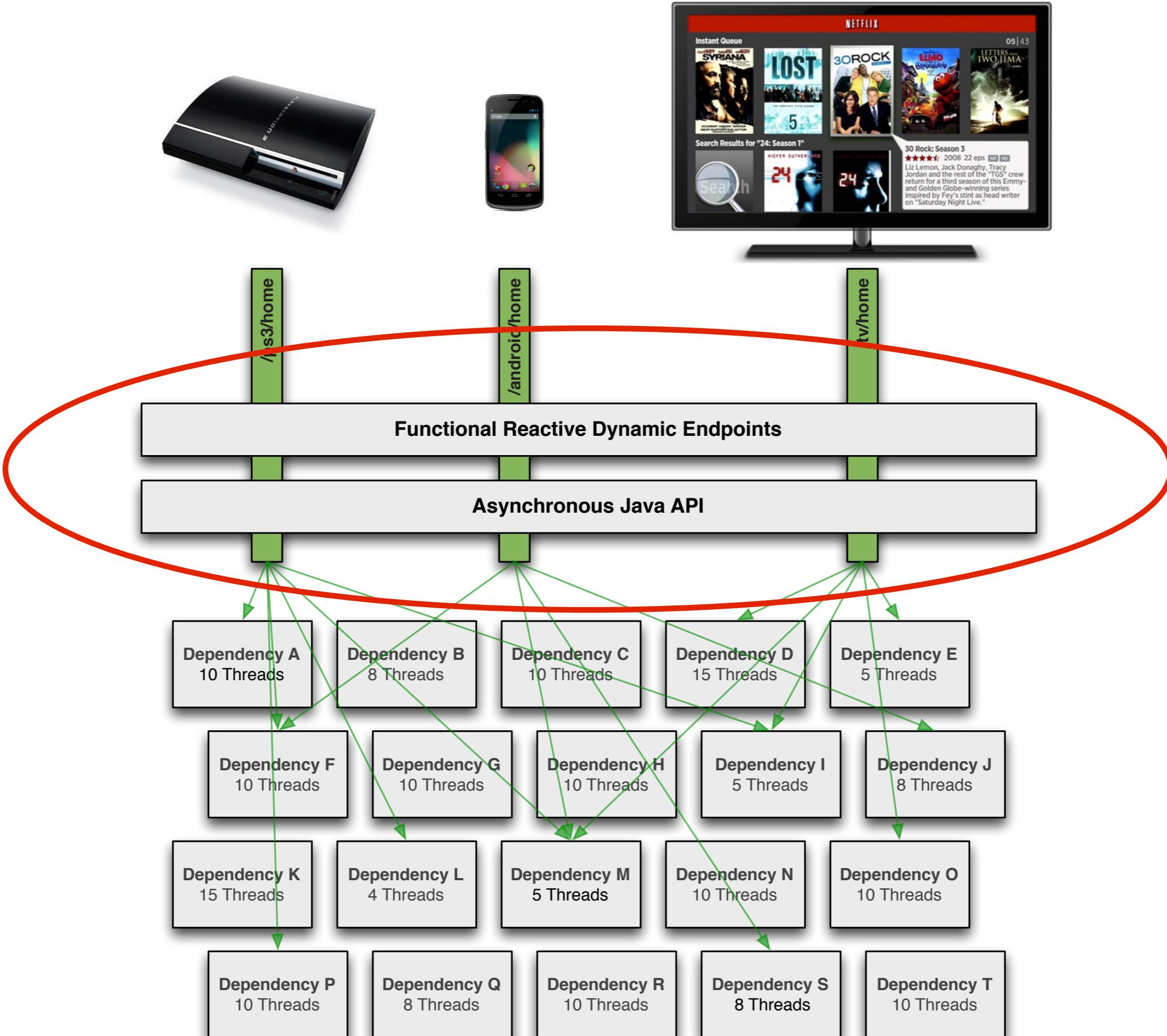


The Netflix API serves all streaming devices and acts as the broker between backend Netflix systems and the user interfaces running on the 800+ devices that support Netflix streaming.

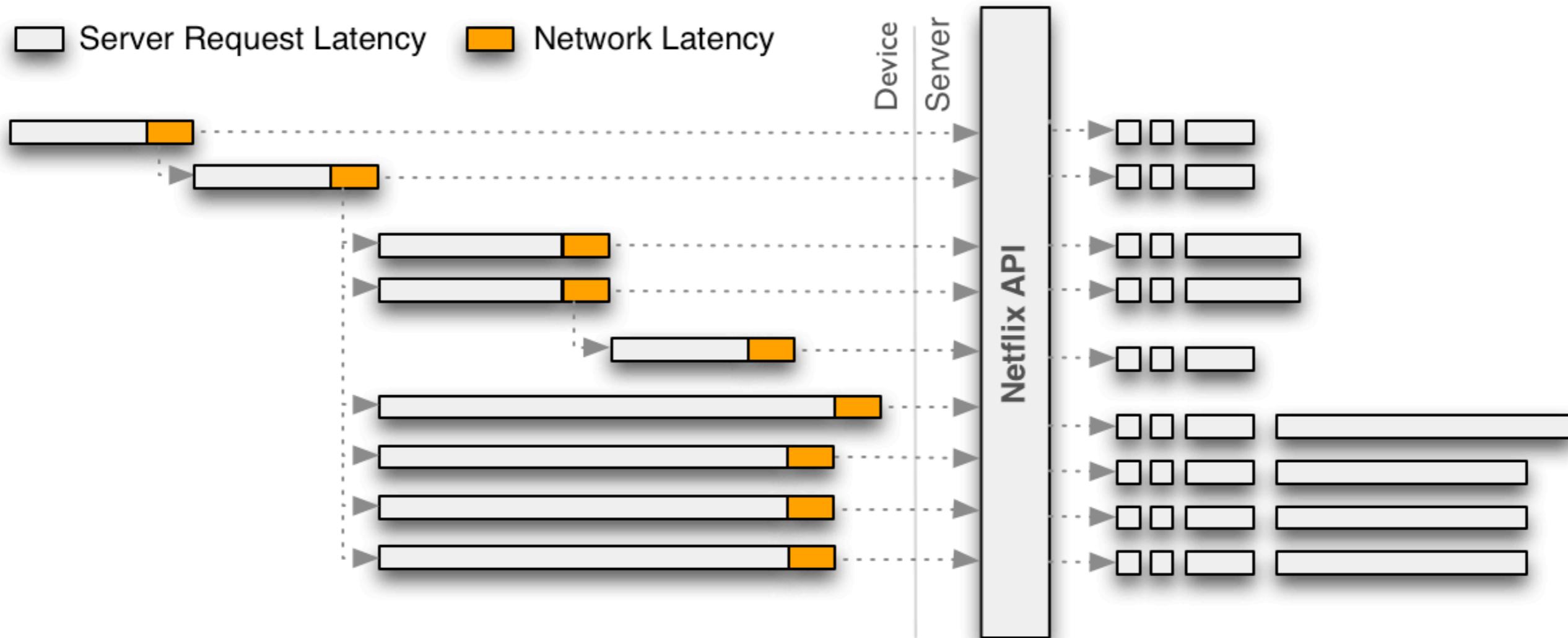
2+ billion incoming calls per day are received which in turn fans out to several billion outgoing calls (averaging a ratio of 1:6) to dozens of underlying subsystems.





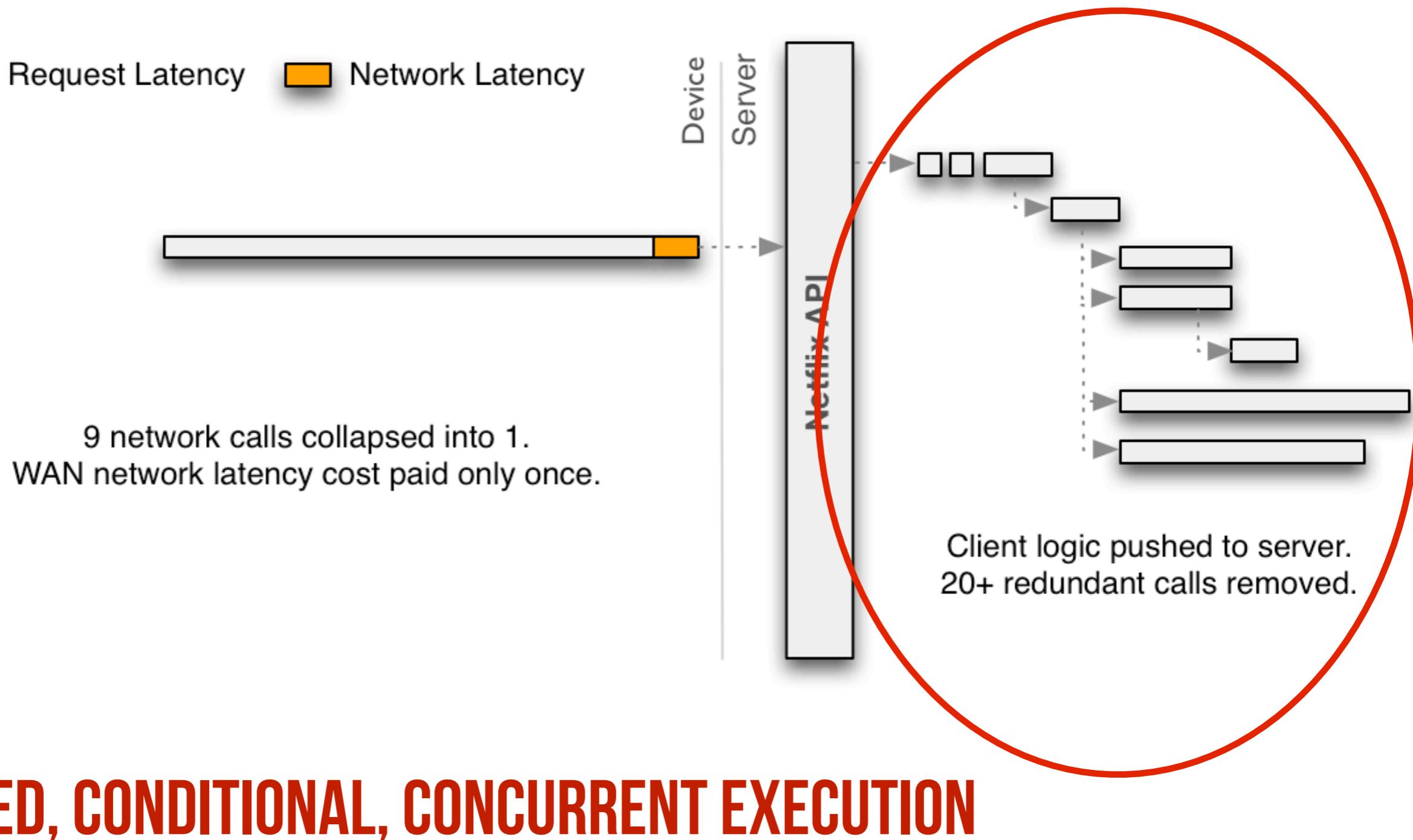


# Discovery of Rx began with a re-architecture ...



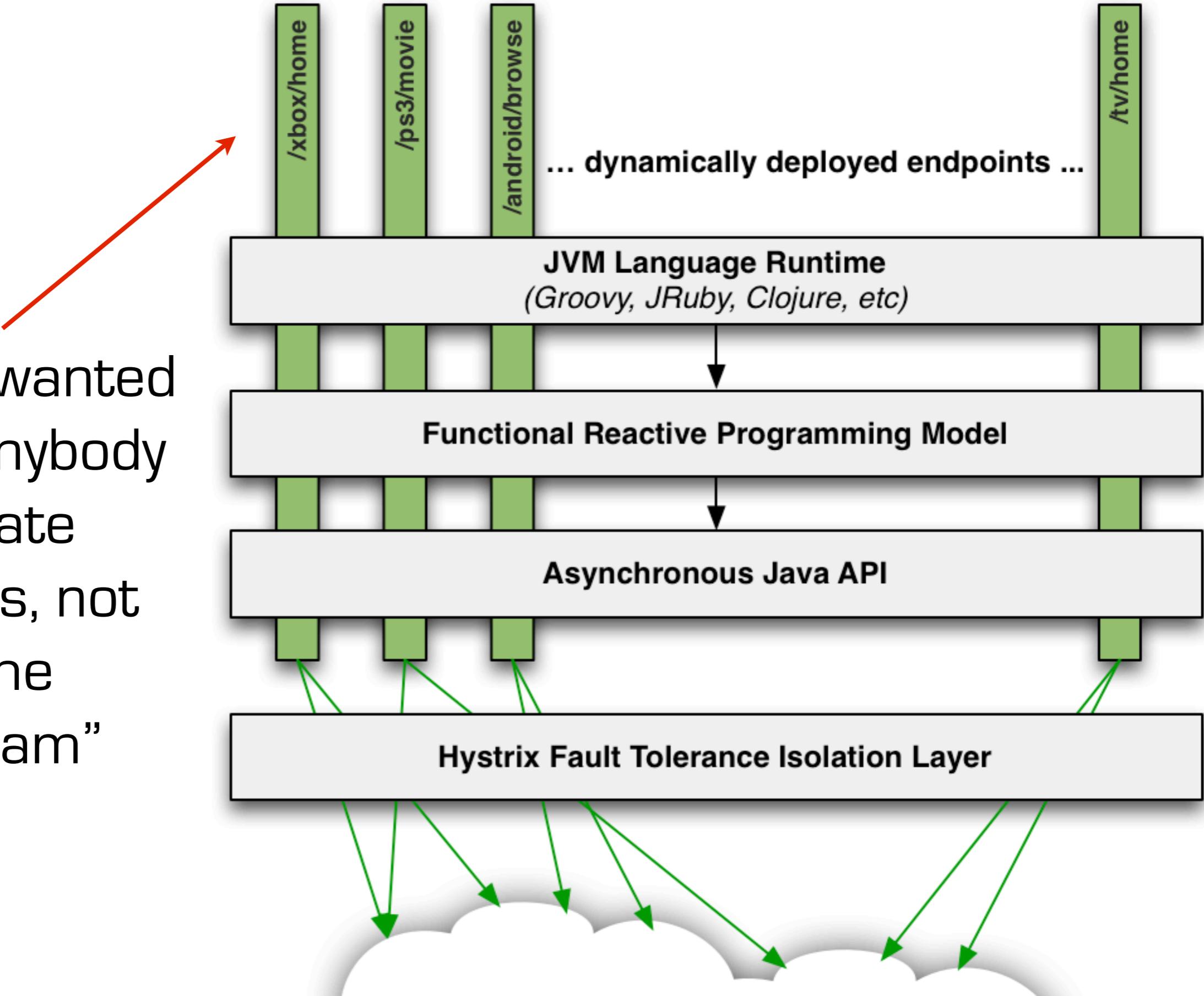
# ... that collapsed network traffic into coarse API calls ...

■ Server Request Latency ■ Network Latency



## NESTED, CONDITIONAL, CONCURRENT EXECUTION

... and we wanted  
to allow anybody  
to create  
endpoints, not  
just the  
“API Team”



User interface client teams now build and deploy their own webservice endpoints on top of the API Platform instead of the “API Team” being the only ones who create endpoints.



Java™



Clojure

Scala



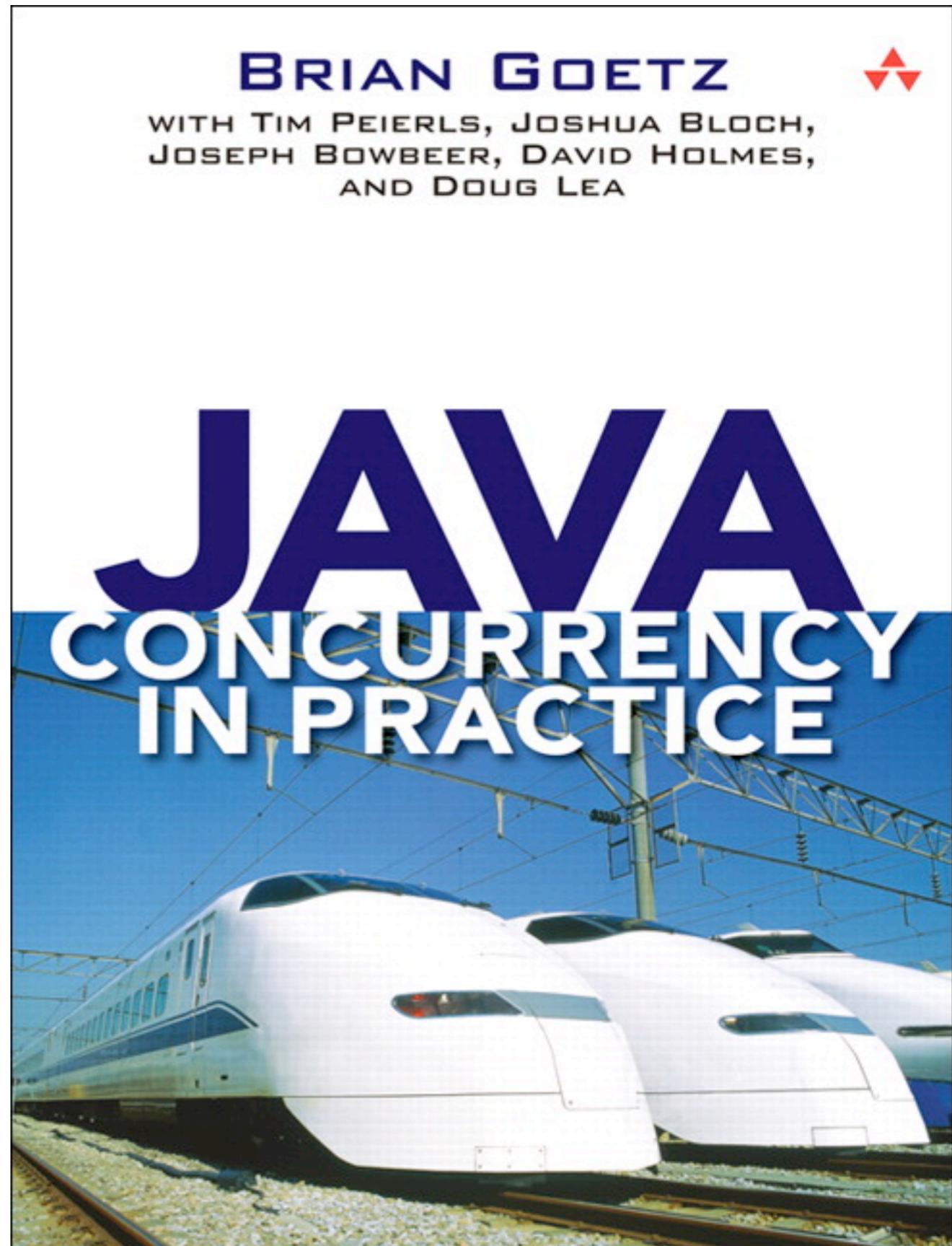
jRuby

We wanted to retain flexibility to use whatever JVM language we wanted as well as cater to the differing skills and backgrounds of engineers on different teams.

Groovy was the first alternate language we deployed in production on top of Java.

Concurrency without  
each engineer reading  
and re-reading this ->

(awesome book ... everybody isn't  
going to - or should have to - read it  
though, that's the point)



**OWNER OF API SHOULD RETAIN CONTROL  
OF CONCURRENCY BEHAVIOR.**

# **OWNER OF API SHOULD RETAIN CONTROL OF CONCURRENCY BEHAVIOR.**

`public Data getData();`

**WHAT IF THE IMPLEMENTATION NEEDS TO CHANGE  
FROM SYNCHRONOUS TO ASYNCHRONOUS?**

**HOW SHOULD THE CLIENT EXECUTE THAT METHOD  
WITHOUT BLOCKING? SPAWN A THREAD?**

```
public Data getData();
```

```
public void getData(Callback<T> c);
```

```
public Future<T> getData();
```

```
public Future<List<Future<T>>> getData();
```

What about ... ?

<b>Iterable</b>	<b>Observable</b>
pull	push
T next()	onNext(T)
throws Exception	onError(Exception)
returns;	onCompleted()

<b>Iterable</b>	<b>Observable</b>
pull	push
T next()	onNext(T)
throws Exception	onError(Exception)
returns;	onCompleted()

```
// Iterable<String>
// that contains 75 Strings
getDataFromLocalMemory()
    .skip(10)
    .take(5)
    .map({ s ->
        return s + "_transformed"})
    .forEach(
        { println "next => " + it})
```

```
// Observable<String>
// that emits 75 Strings
getDataFromNetwork()
    .skip(10)
    .take(5)
    .map({ s ->
        return s + "_transformed"})
    .subscribe(
        { println "onNext => " + it})
```

<b>Iterable</b>	<b>Observable</b>
pull	push
T next()	onNext(T)
throws Exception	onError(Exception)
returns;	onCompleted()

```
// Iterable<String> ← // Observable<String>
// that contains 75 Strings // that emits 75 Strings
getDataFromLocalMemory() getDataFromNetwork()
    .skip(10) .skip(10)
    .take(5) .take(5)
    .map({ s -> .map({ s ->
        return s + "_transformed"}) return s + "_transformed"})
    .forEach( ← .subscribe(
        { println "onNext => " + it}) { println "onNext => " + it})
```

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```

String s = getData(args);
if (s.equals(x)) {
    // do something
} else {
    // do something else
}

```

Typical synchronous scalar response with subsequent conditional logic.

	Single	Multiple
Sync	<code>T getData()</code>	<code>Iterable&lt;T&gt; getData()</code>
Async	<code>Future&lt;T&gt; getData()</code>	<code>Observable&lt;T&gt; getData()</code>

```
Iterable<String> values = getData(args);
for (String s : values) {
    if (s.equals(x)) {
        // do something
    } else {
        // do something else
    }
}
```

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Future<String> s = getData(args);
if (s.get().equals(x)) {
    // do something
} else {
    // do something else
}
```

As we move to async a normal Java Future is asynchronous but to apply conditional logic requires dereferencing the value via 'get()'.

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Future<String> s = getData(args);
if (s.get().equals(x)) {
    // do something
} else {
    // do something else
}
```

And this leads to the typical issue in nested, conditional asynchronous code with Java Futures where asynchronous quickly becomes synchronous and blocking again.

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```

Future<String> s = getData(args);
Futures.addCallback(s,
    new FutureCallback<String> {
        public void onSuccess(String s) {
            if (s.get().equals(x)) {
                // do something
            } else {
                // do something else
            }
        }

        public void onFailure(Throwable t) {
            // handle error
        }
    }, executor);

```

There are better Futures though, one of them is from Guava ...

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```

Future<String> s = getData(args);
Futures.addCallback(s,
    new FutureCallback<String> {
        public void onSuccess(String s) {
            if (s.get().equals(x)) {
                // do something
            } else {
                // do something else
            }
        }

        public void onFailure(Throwable t) {
            // handle error
        }
    }, executor);

```

... and it allows callbacks ...

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```

Future<String> s = getData(args);
Futures.addCallback(s,
    new FutureCallback<String> {
        public void onSuccess(String s) {
            if (s.get().equals(x)) {
                // do something
            } else {
                // do something else
            }
        }

        public void onFailure(Throwable t) {
            // handle error
        }
    }, executor);

```

... with onSuccess ...

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Future<String> s = getData(args);
Futures.addCallback(s,
    new FutureCallback<String> {
        public void onSuccess(String s) {
            if (s.get().equals(x)) {
                // do something
            } else {
                // do something else
            }
        }
        public void onFailure(Throwable t) {
            // handle error
        }
    }, executor);
```

... and onFailure handlers so the conditional logic can be put inside a callback and prevent us from blocking and we can chain calls together in these callbacks.

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Future<String> s = getData(args);
s.map({ s ->
    if (s.get().equals(x)) {
        // do something
    } else {
        // do something else
    });
}
```

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Future<String> s = getData(args);
s.map({ s ->
    if (s.get().equals(x)) {
        // do something
    } else {
        // do something else
    });

```

... that get us to where we want to be so that we can now compose conditional, nested data flows while remaining asynchronous.

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```

Future<String> s = getData(args);
s.map({ s >
    if (s.get().equals(x)) {
        // do something
    } else {
        // do something else
    });

```

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Observable<String> s = getData(args);
s.map({ s ->
    if (s.get().equals(x)) {
        // do something
    } else {
        // do something else
    });

```

... is very similar to the Rx Observable except that an Rx Observable supports multiple values which means it can handle a single value, a sequence of values or an infinite stream.

	Single	Multiple
Sync	<b>T</b> getData()	<b>Iterable&lt;T&gt;</b> getData()
Async	<b>Future&lt;T&gt;</b> getData()	<b>Observable&lt;T&gt;</b> getData()

```
Observable<String> s = getData(args);
s.map({ s ->
    if (s.get().equals(x)) {
        // do something
    } else {
        // do something else
    });
}
```

We wanted to be asynchronous to abstract away the underlying concurrency decisions and composable Futures or Rx Observables are good solutions.

	Single	Multiple
Sync	<code>T getData()</code>	<code>Iterable&lt;T&gt; getData()</code>
Async	<code>Future&lt;T&gt; getData()</code>	<code>Observable&lt;T&gt; getData()</code>

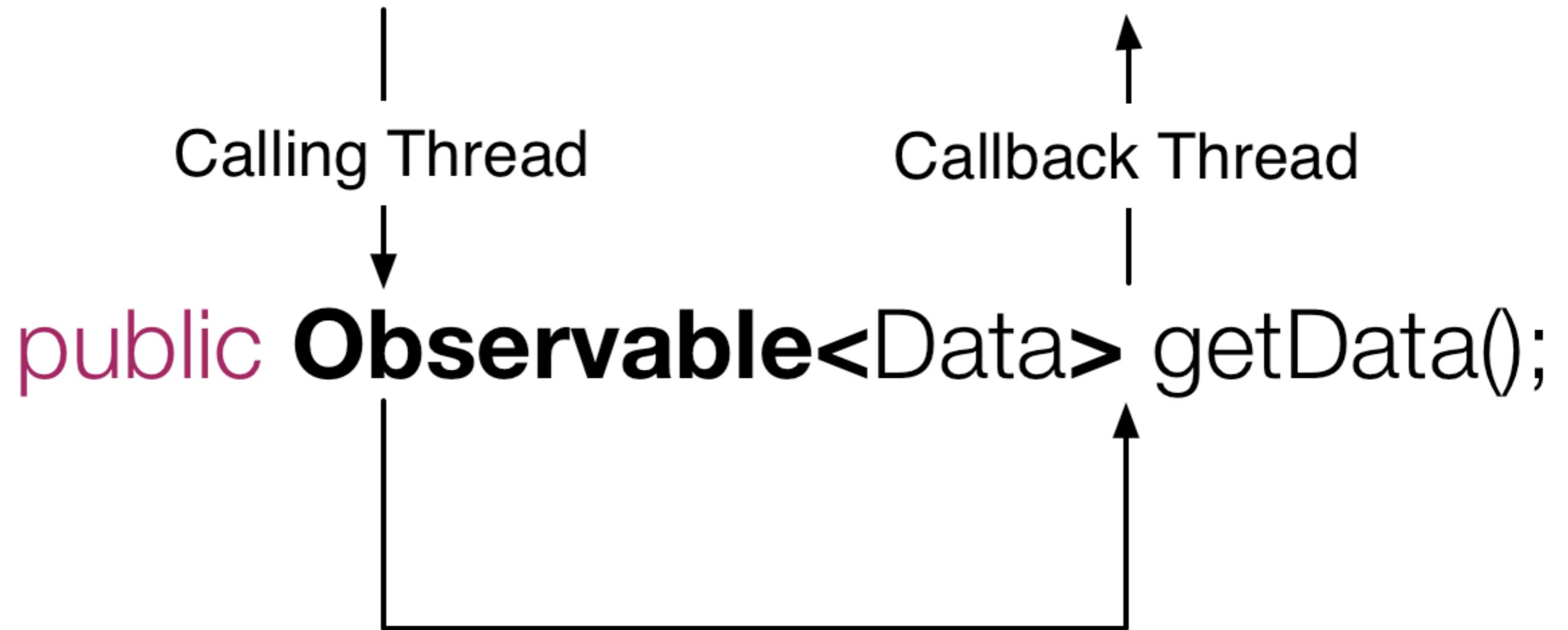
```
Observable<String> s = getData(args);
s.map({ s ->
    if (s.get().equals(x)) {
        // do something
    } else {
        // do something else
    });
}
```

# INSTEAD OF A BLOCKING API ...

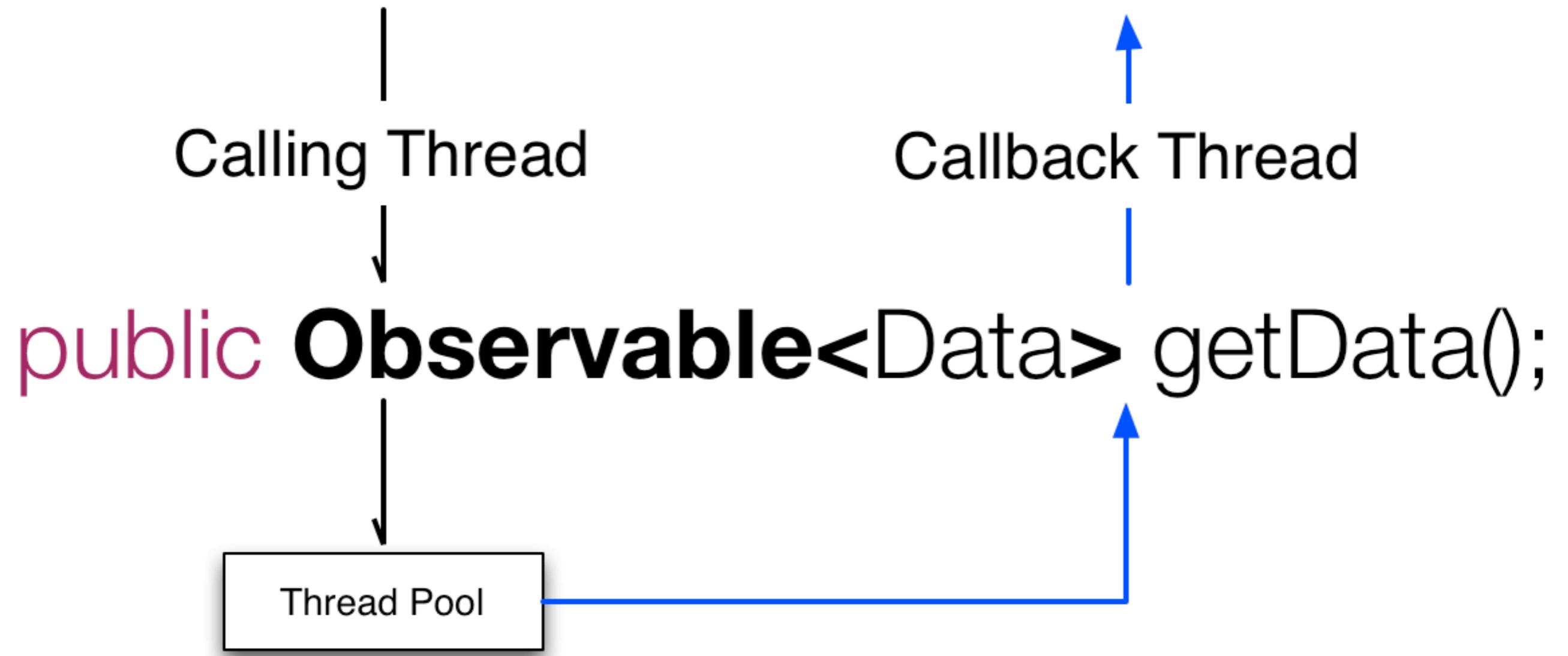
```
class VideoService {  
    def VideoList getPersonalizedListOfMovies(userId);  
    def VideoBookmark getBookmark(userId, videoId);  
    def VideoRating getRating(userId, videoId);  
    def VideoMetadata getMetadata(videoId);  
}
```

# ... CREATE AN OBSERVABLE API:

```
class VideoService {  
    def Observable<VideoList> getPersonalizedListOfMovies(userId);  
    def Observable<VideoBookmark> getBookmark(userId, videoId);  
    def Observable<VideoRating> getRating(userId, videoId);  
    def Observable<VideoMetadata> getMetadata(videoId);  
}
```

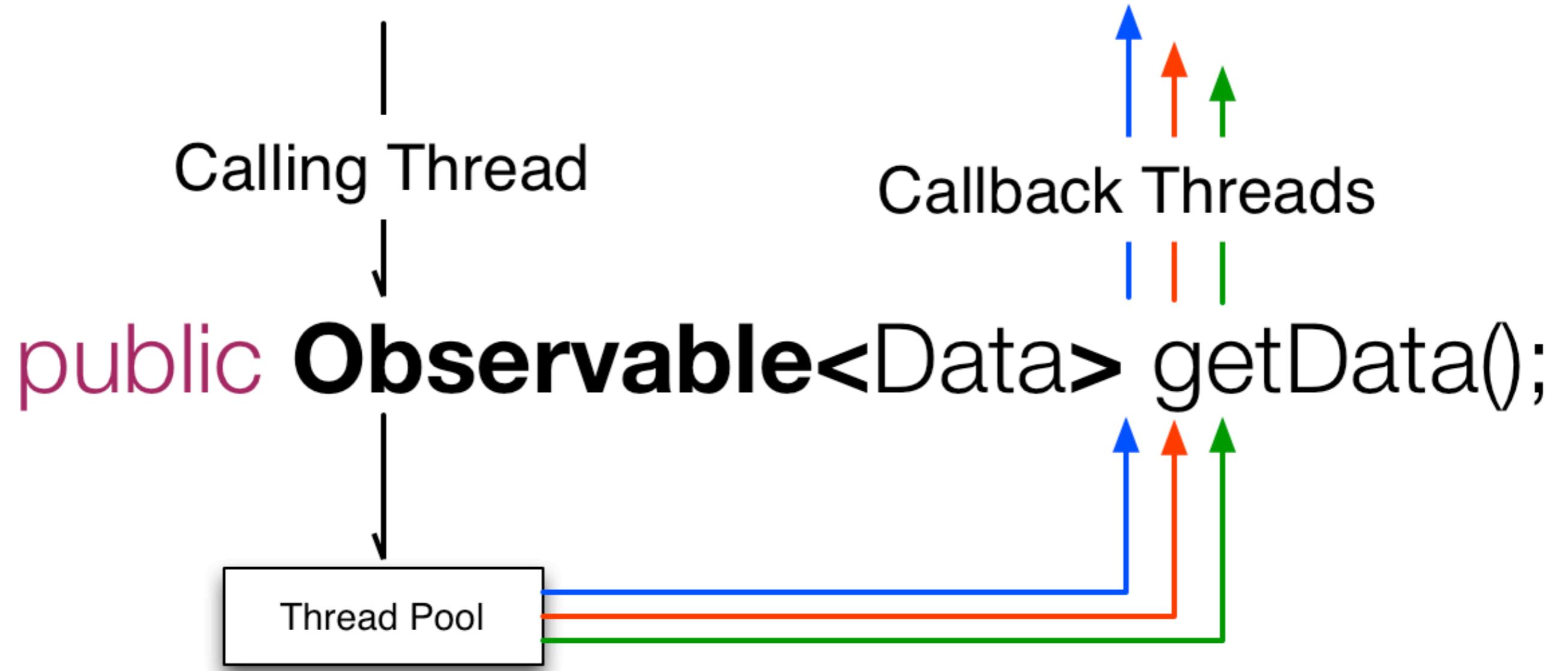


Do work synchronously on calling thread.



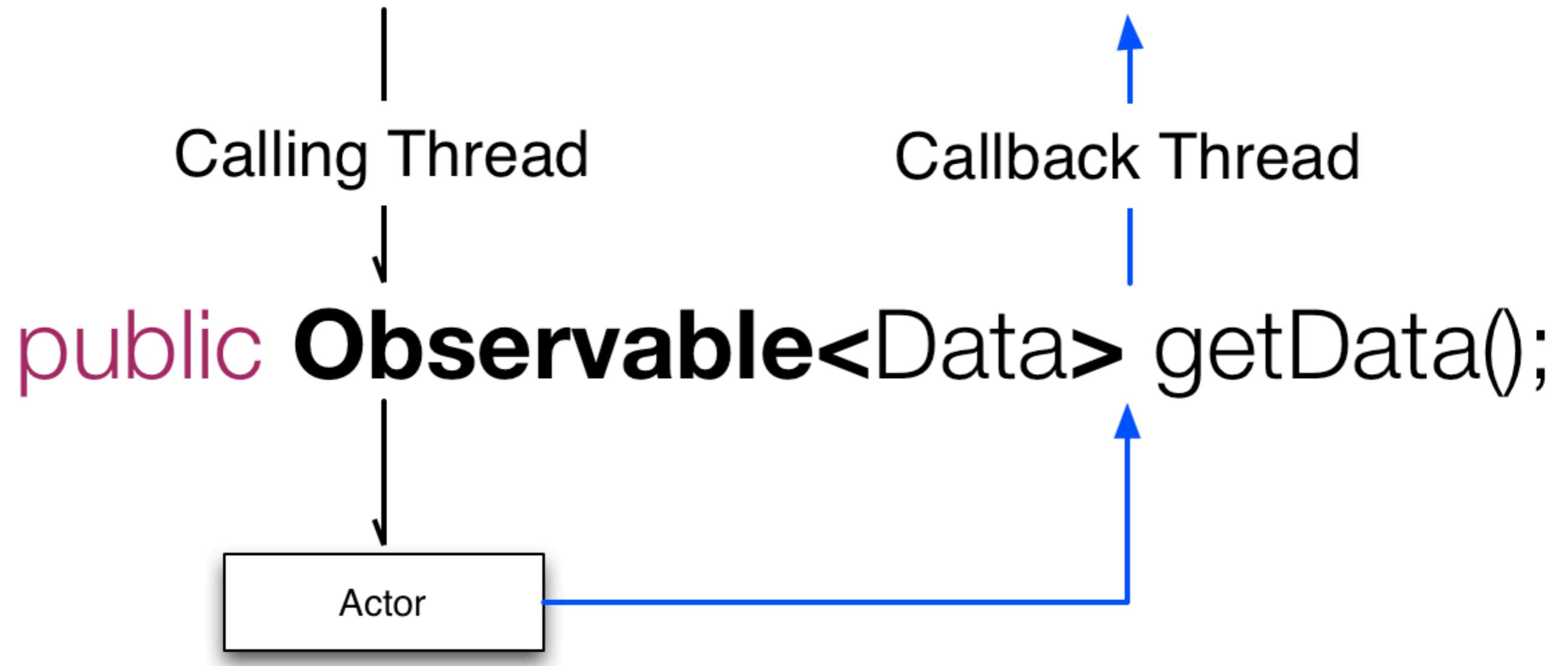
Do work asynchronously on a separate thread.

Or it could use a thread-pool to do the work asynchronously and callback with that thread.

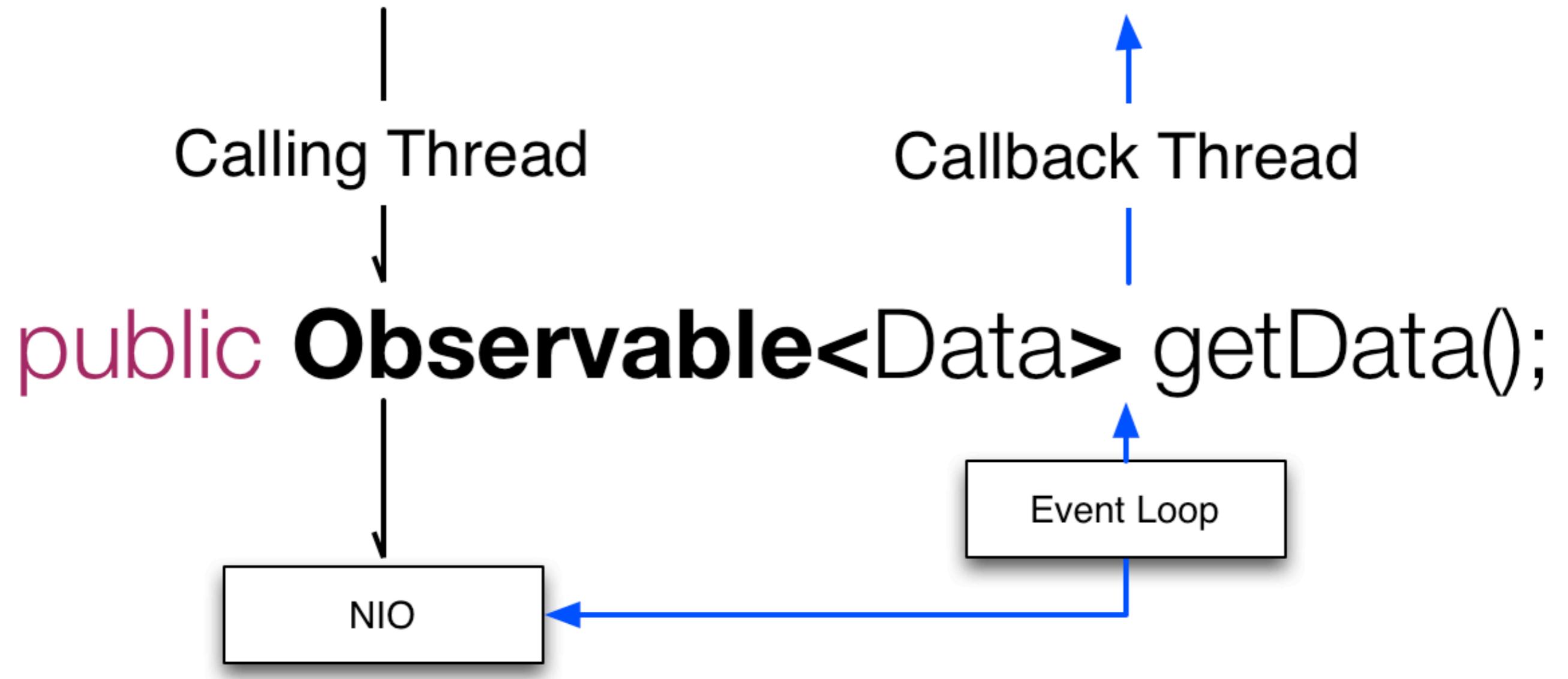


Do work asynchronously on a multiple threads.

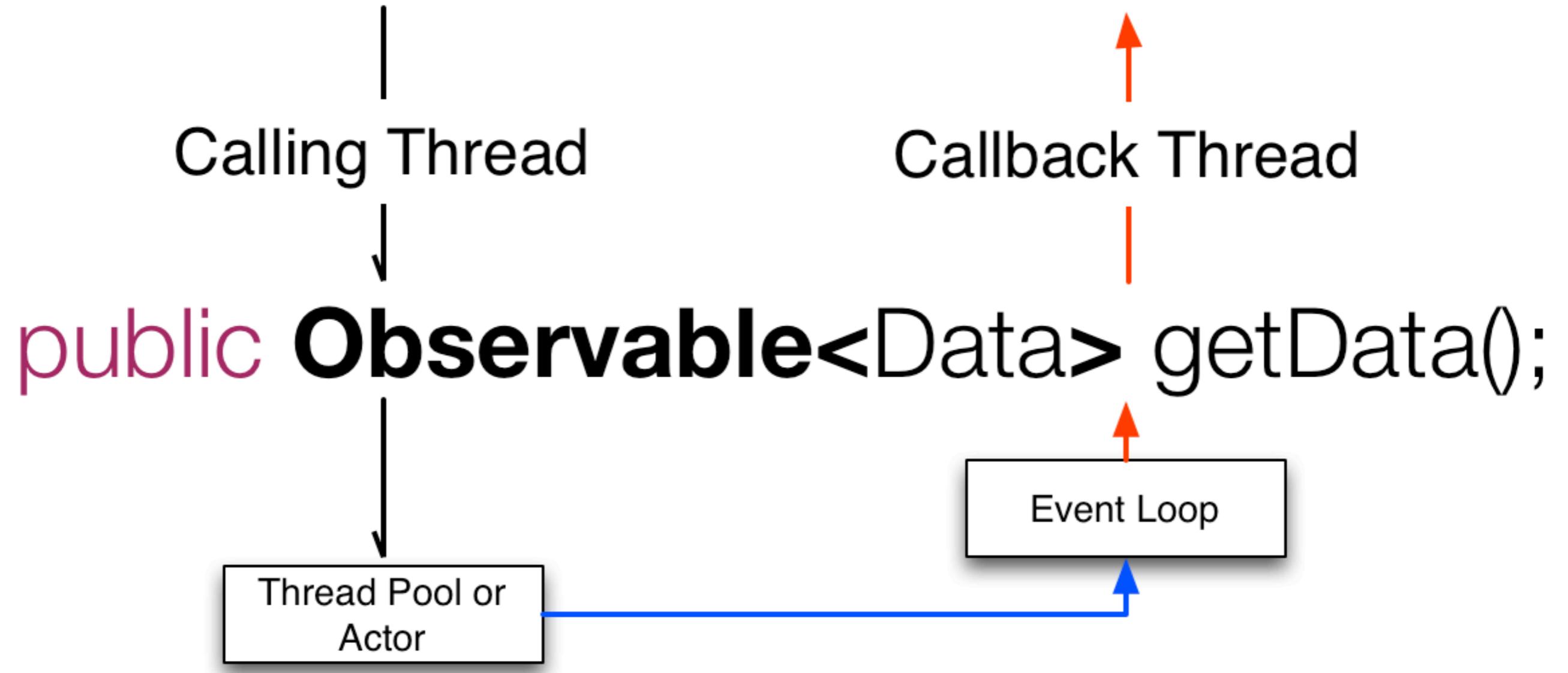
Or it could use multiple threads, each thread calling back via `onNext(T)` when the value is ready.



Do work asynchronously on an actor  
(or multiple actors).



Do network access asynchronously using NIO  
and perform callback on Event Loop



Do work asynchronously and perform callback via a single or multi-threaded event loop.

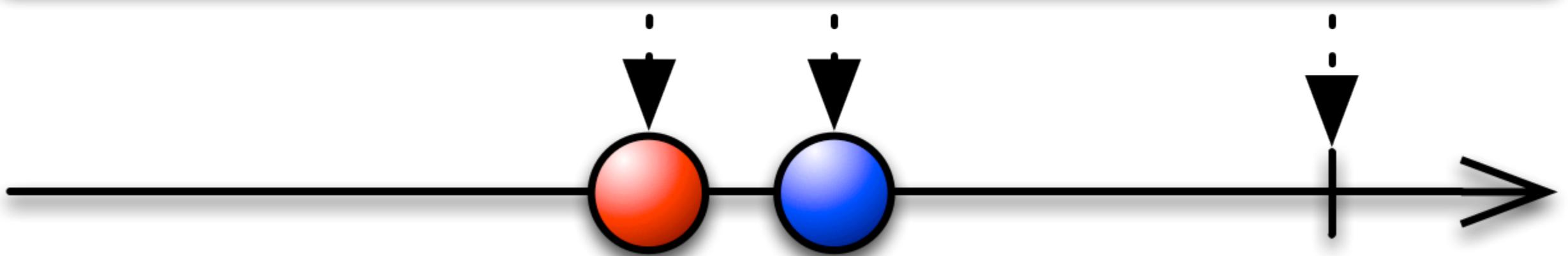
Or a thread-pool/actor that does the work but then performs the callback via an event-loop so the thread-pool/actor is tuned for IO and event-loop for CPU.

All of these different implementation choices are possible without changing the signature of the method and without the calling code changing their behavior or how they interact with or compose responses.

**CLIENT CODE TREATS ALL INTERACTIONS  
WITH THE API AS ASYNCHRONOUS**

**THE API IMPLEMENTATION CHOOSES  
WHETHER SOMETHING IS  
BLOCKING OR NON-BLOCKING  
AND  
WHAT RESOURCES IT USES.**

**create { onNext ; onNext ; onComplete }**



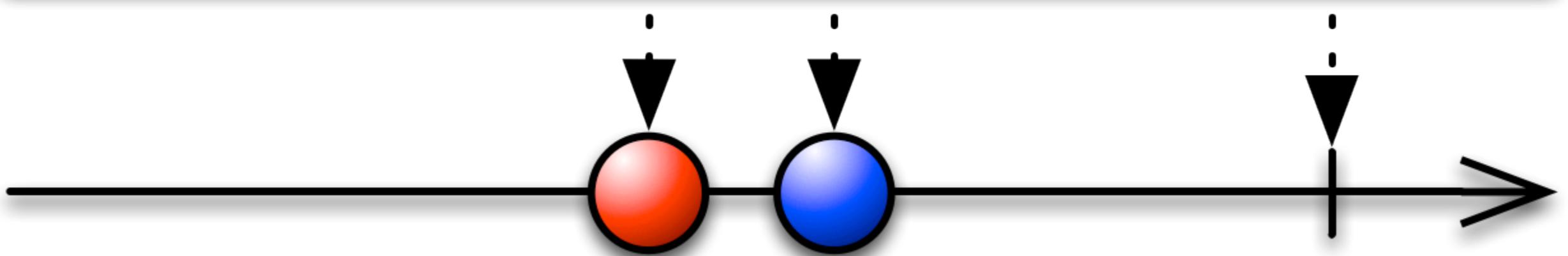
**Observable<T> create(Func1<Observer<T>, Subscription> func)**

```
Observable.create({ observer ->
    try {
        observer.onNext(new Video(id))
        observer.onCompleted();
    } catch(Exception e) {
        observer.onError(e);
    }
})
```

Let's look at how to create an Observable and what its contract is. An Observable receives an Observer and calls onNext 1 or more times and terminates by either calling onError or onComplete once.

More information is available at <https://github.com/Netflix/RxJava/wiki/Observable>

**create { onNext ; onNext ; onComplete }**

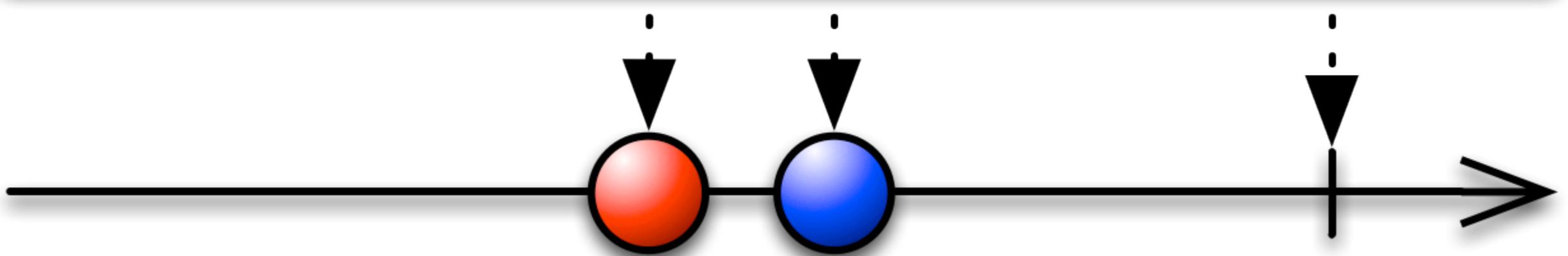


Observable<T> **create**(Func1<Observer<T>, Subscription> func)

Observable.create({ observer ->  
try {  
 observer.onNext(new Video(id))  
 observer.onCompleted();  
} catch(Exception e) {  
 observer.onError(e);  
}  
})

An Observable is created by passing a Func1 implementation...

**create { onNext ; onNext ; onComplete }**

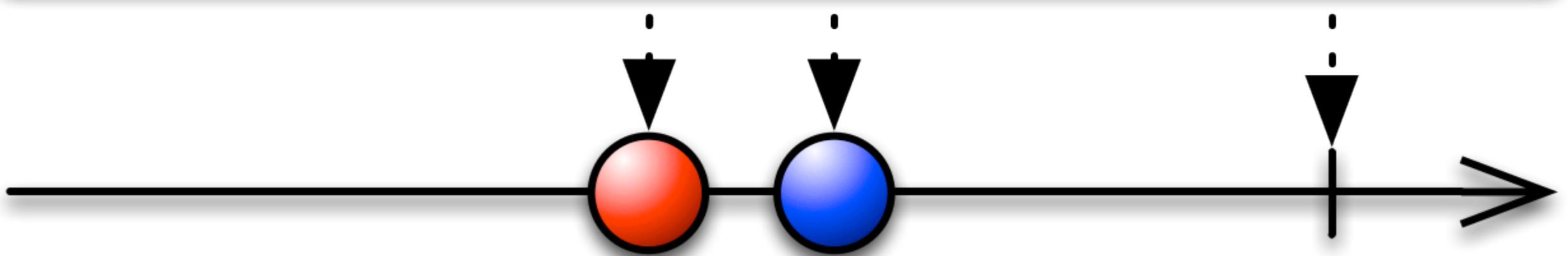


**Observable<T> create(Func1<Observer<T>, Subscription> func)**

```
Observable.create({ observer ->
    try {
        observer.onNext(new Video(id))
        observer.onCompleted();
    } catch(Exception e) {
        observer.onError(e);
    }
})
```

... that accepts an Observer ...

**create { onNext ; onNext ; onComplete }**

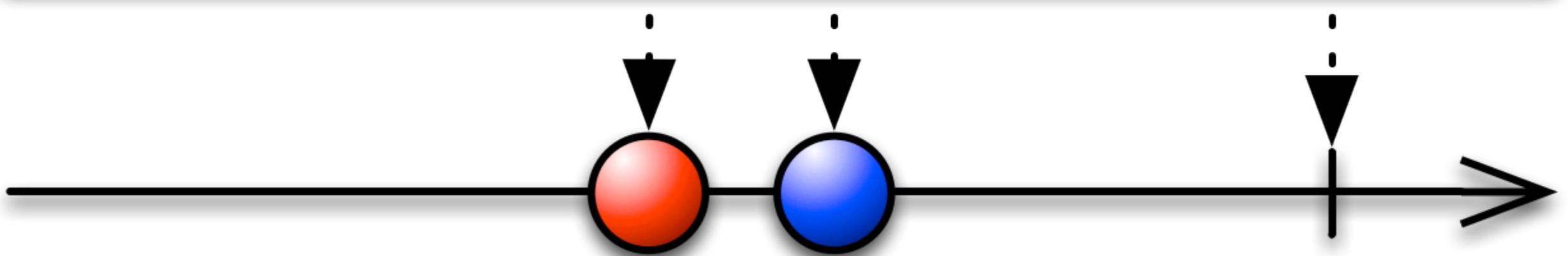


**Observable<T> create(Func1<Observer<T>, Subscription> func)**

```
Observable.create({ observer ->
    try {
        observer.onNext(new Video(id))
        observer.onCompleted();
    } catch(Exception e) {
        observer.onError(e);
    }
})
```

... and when executed (subscribed to) it emits data via 'onNext' ...

**create { onNext ; onNext ; onComplete }**

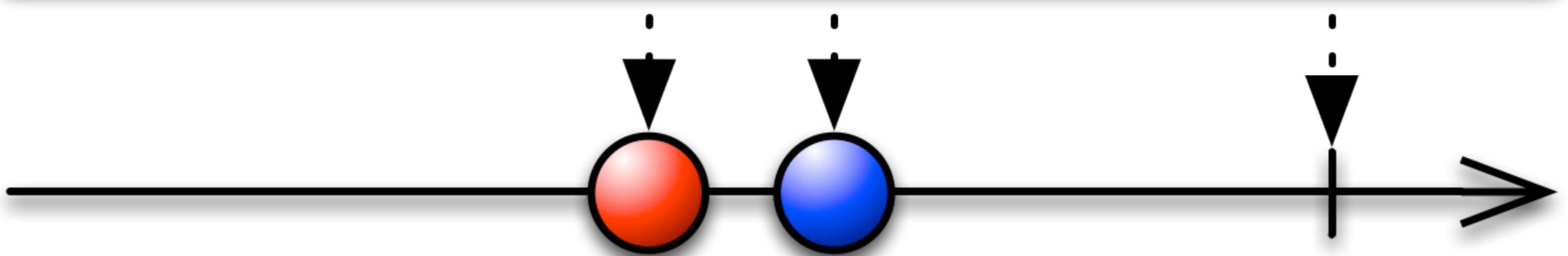


**Observable**<T> **create**(**Func1**<**Observer**<T>, **Subscription**> func)

```
Observable.create({ observer ->
    try {
        observer.onNext(new Video(id))
        observer.onCompleted();
    } catch(Exception e) {
        observer.onError(e);
    }
})
```

... and marks its terminal state by calling 'onCompleted' ...

**create { onNext ; onNext ; onComplete }**



**Observable<T> create(Func1<Observer<T>, Subscription> func)**

```
Observable.create({ observer ->
    try {
        observer.onNext(new Video(id))
        observer.onCompleted();
    } catch(Exception e) {
        observer.onError(e);
    }
})
```

# ASYNCHRONOUS OBSERVABLE WITH SINGLE VALUE

```
def Observable<VideoRating> getRating(userId, videoId) {  
    // fetch the VideoRating for this user asynchronously  
    return Observable.create({ observer ->  
        executor.execute(new Runnable() {  
            def void run() {  
                try {  
                    VideoRating rating = ... do network call ...  
                    observer.onNext(rating)  
                    observer.onCompleted();  
                } catch(Exception e) {  
                    observer.onError(e);  
                }  
            }  
        })  
    })  
}
```

Example Observable implementation that executes asynchronously on a thread-pool and emits a single value. This explicitly shows an 'executor' being used to run this on a separate thread to illustrate how it is up to the Observable implementation to do as it wishes, but Rx always has Schedulers for typical scenarios of scheduling an Observable in a thread-pool or whatever a Scheduler implementation dictates.

# SYNCHRONOUS OBSERVABLE WITH MULTIPLE VALUES

```
def Observable<Video> getVideos() {  
    return Observable.create({ observer ->  
        try {  
            for(v in videos) {  
                observer.onNext(v)  
            }  
            observer.onCompleted();  
        } catch(Exception e) {  
            observer.onError(e);  
        }  
    })  
}
```

**Caution:** This is eager and will always emit all values regardless of subsequent operators such as `take(10)`

Example Observable implementation that executes synchronously and emits multiple values.

Note that the for-loop as implemented here will always complete so should not have any IO in it and be of limited length otherwise it should be done with a lazy iterator implementation or performed asynchronously so it can be unsubscribed from.

# ASYNCHRONOUS OBSERVABLE WITH MULTIPLE VALUES

```
def Observable<Video> getVideos() {  
    return Observable.create({ observer ->  
        executor.execute(new Runnable() {  
            def void run() {  
                try {  
                    for(id in videoIds) {  
                        Video v = ... do network call ...  
                        observer.onNext(v)  
                    }  
                    observer.onCompleted();  
                } catch(Exception e) {  
                    observer.onError(e);  
                }  
            }  
        })  
    })  
}
```

Example Observable implementation that executes asynchronously on a thread-pool and emits multiple values.

Note that for brevity this code does not handle the subscription so will not unsubscribe even if asked.

See the 'getListOfLists' method in the following for an implementation with unsubscribe handled: <https://github.com/Netflix/RxJava/blob/master/language-adaptors/rxjava-groovy/src/examples/groovy/rx/lang/groovy/examples/VideoExample.groovy#L125>

# ASYNCHRONOUS OBSERVER

```
getVideos().subscribe(new Observer<Video>() {  
  
    def void onNext(Video video) {  
        println("Video: " + video.videoId)  
    }  
  
    def void onError(Exception e) {  
        println("Error")  
        e.printStackTrace()  
    }  
  
    def void onCompleted() {  
        println("Completed")  
    }  
})
```

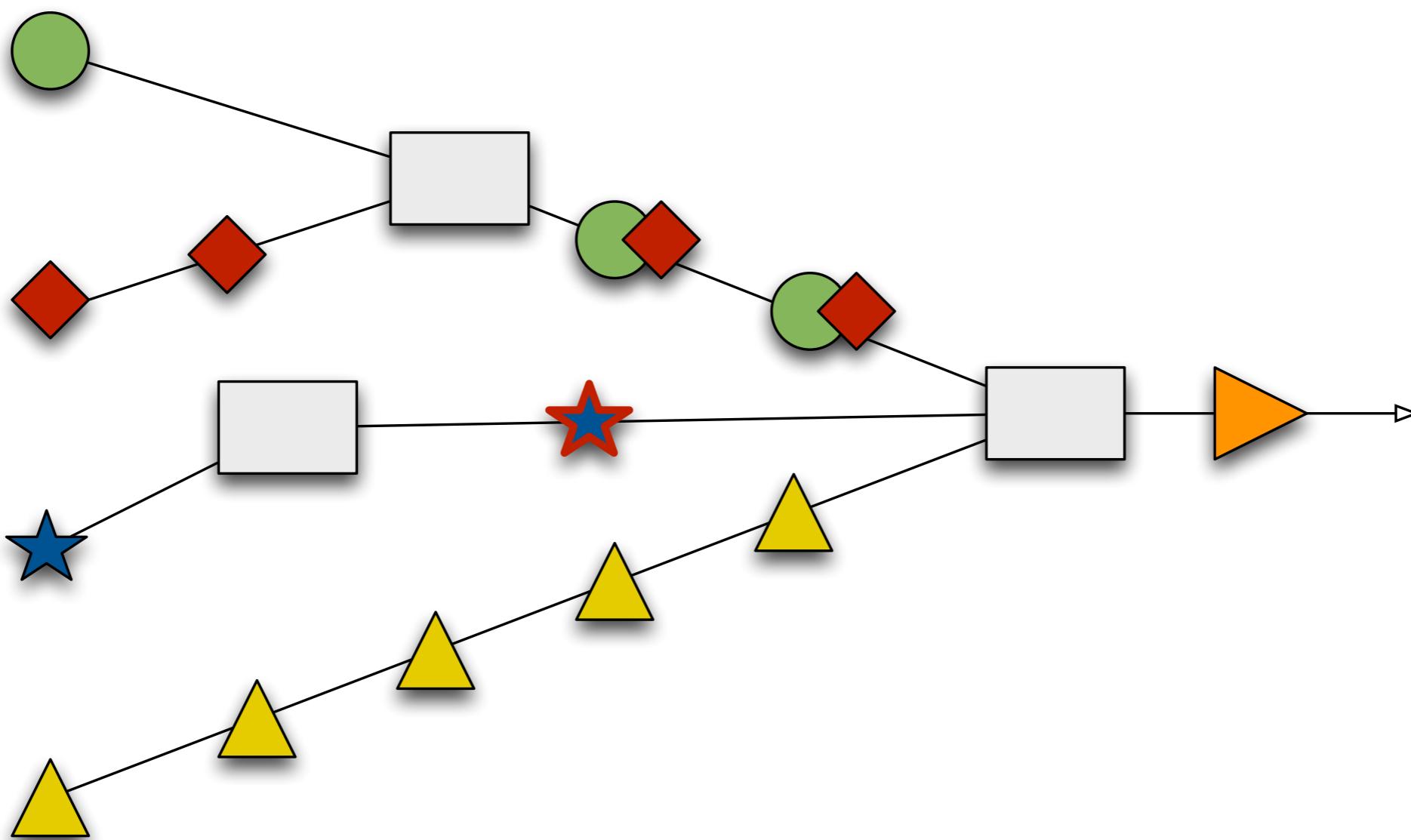
# ASYNCHRONOUS OBSERVER

```
getVideos().subscribe(  
    { video ->  
        println("Video: " + video.videoId)  
    }, { exception ->  
        println("Error")  
        e.printStackTrace()  
    }, {  
        println("Completed")  
    }  
)
```

# ASYNCHRONOUS OBSERVER

```
getVideos().subscribe(  
    { video ->  
        println("Video: " + video.videoId)  
    }, { exception ->  
        println("Error")  
        e.printStackTrace()  
    }  
)
```

# COMPOSABLE FUNCTIONS



The real power though is when we start composing Observables together.

# COMPOSABLE FUNCTIONS

**TRANSFORM:** MAP, FLATMAP, REDUCE, SCAN ...

**FILTER:** TAKE, SKIP, SAMPLE, TAKEWHILE, FILTER ...

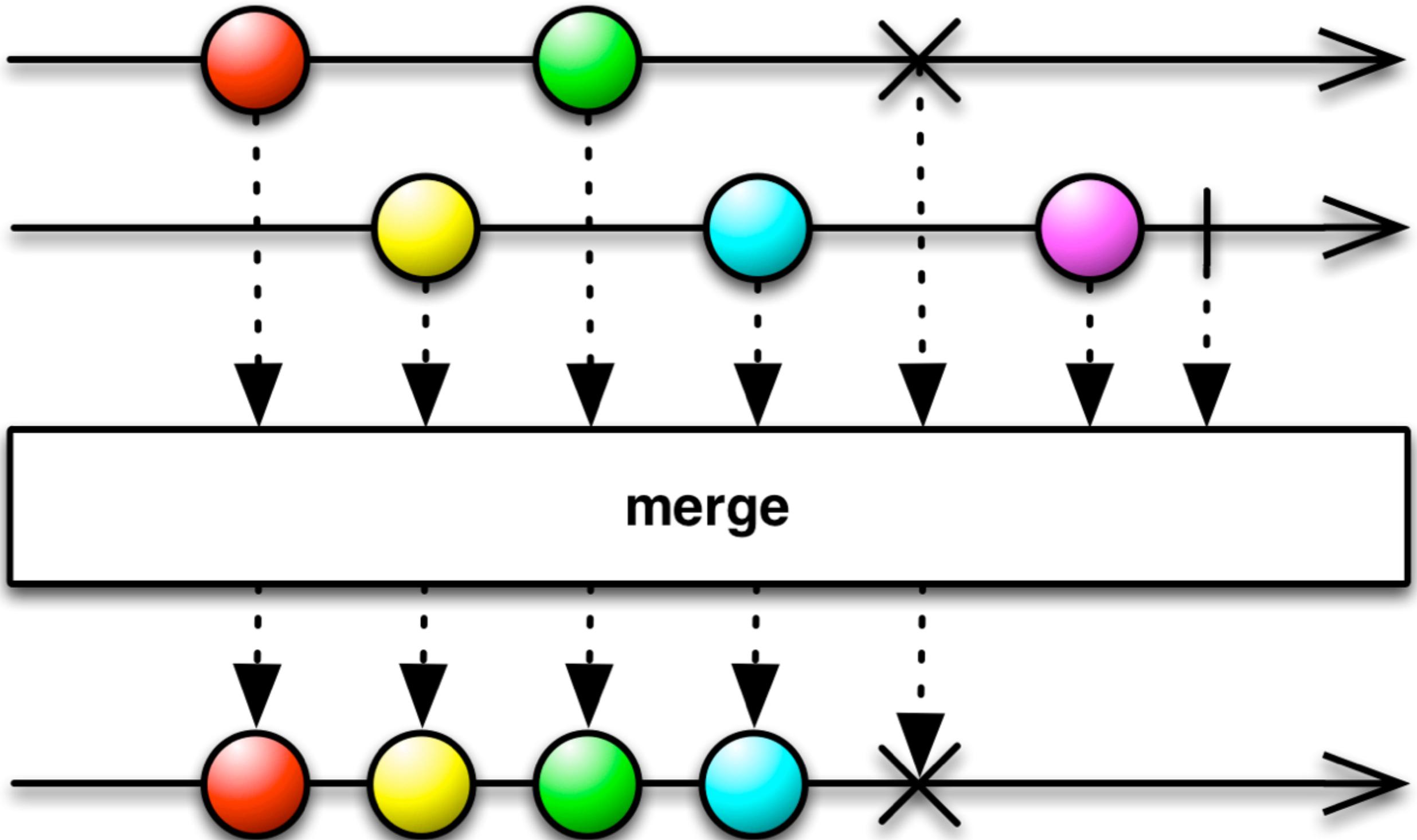
**COMBINE:** CONCAT, MERGE, ZIP, COMBINELATEST,

MULTICAST, PUBLISH, CACHE, REFCOUNT ...

**CONCURRENCY:** OBSERVEON, SUBSCRIBEON

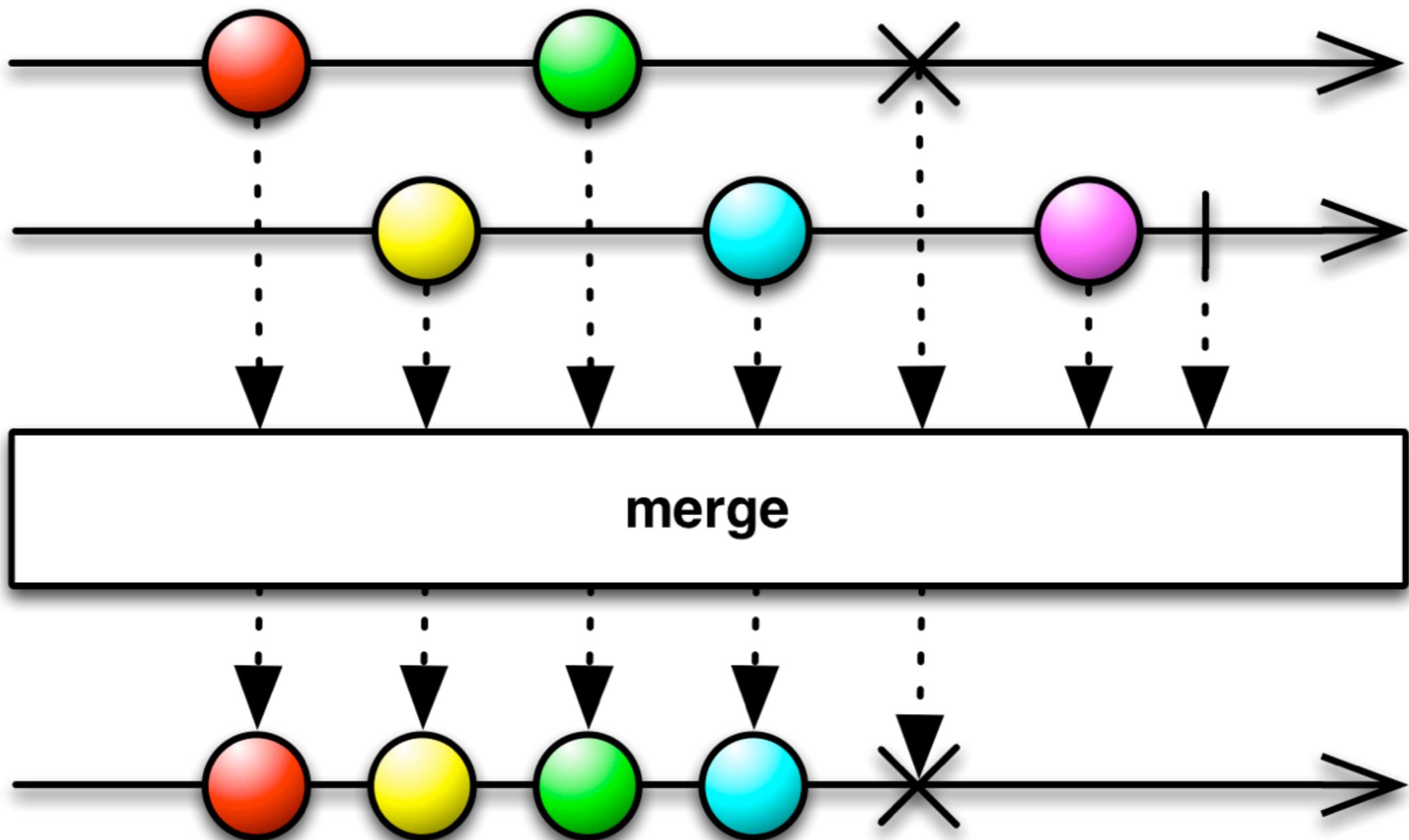
**ERROR HANDLING:** ONERRORRETURN, ONERRORRESUME ...

# COMBINING VIA MERGE



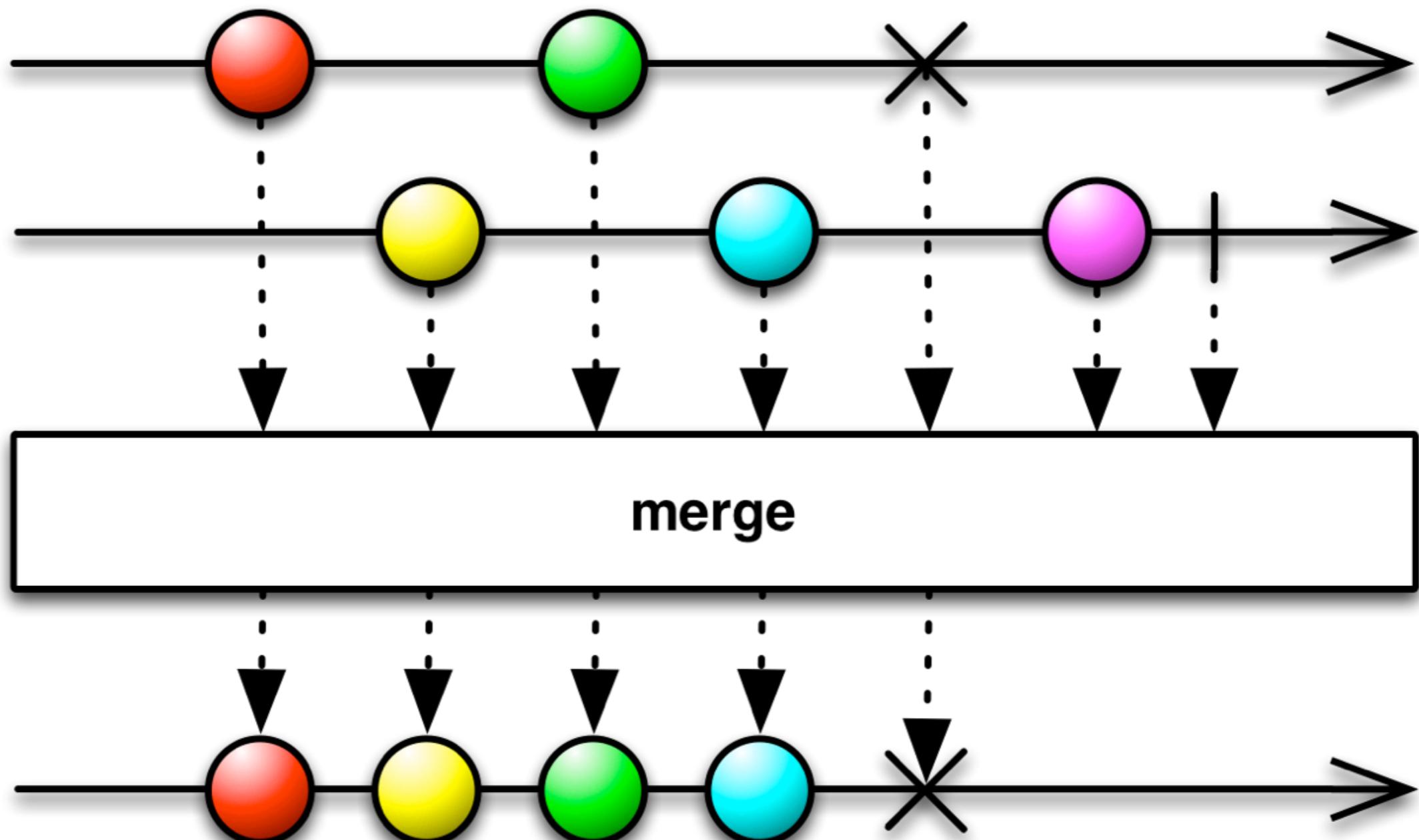
The 'merge' operator is used to combine multiple Observable sequences of the same type into a single Observable sequence with all data.

The X represents an onError call that would terminate the sequence so once it occurs the merged Observable also ends. The 'mergeDelayError' operator allows delaying the error until after all other values are successfully merged.



```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

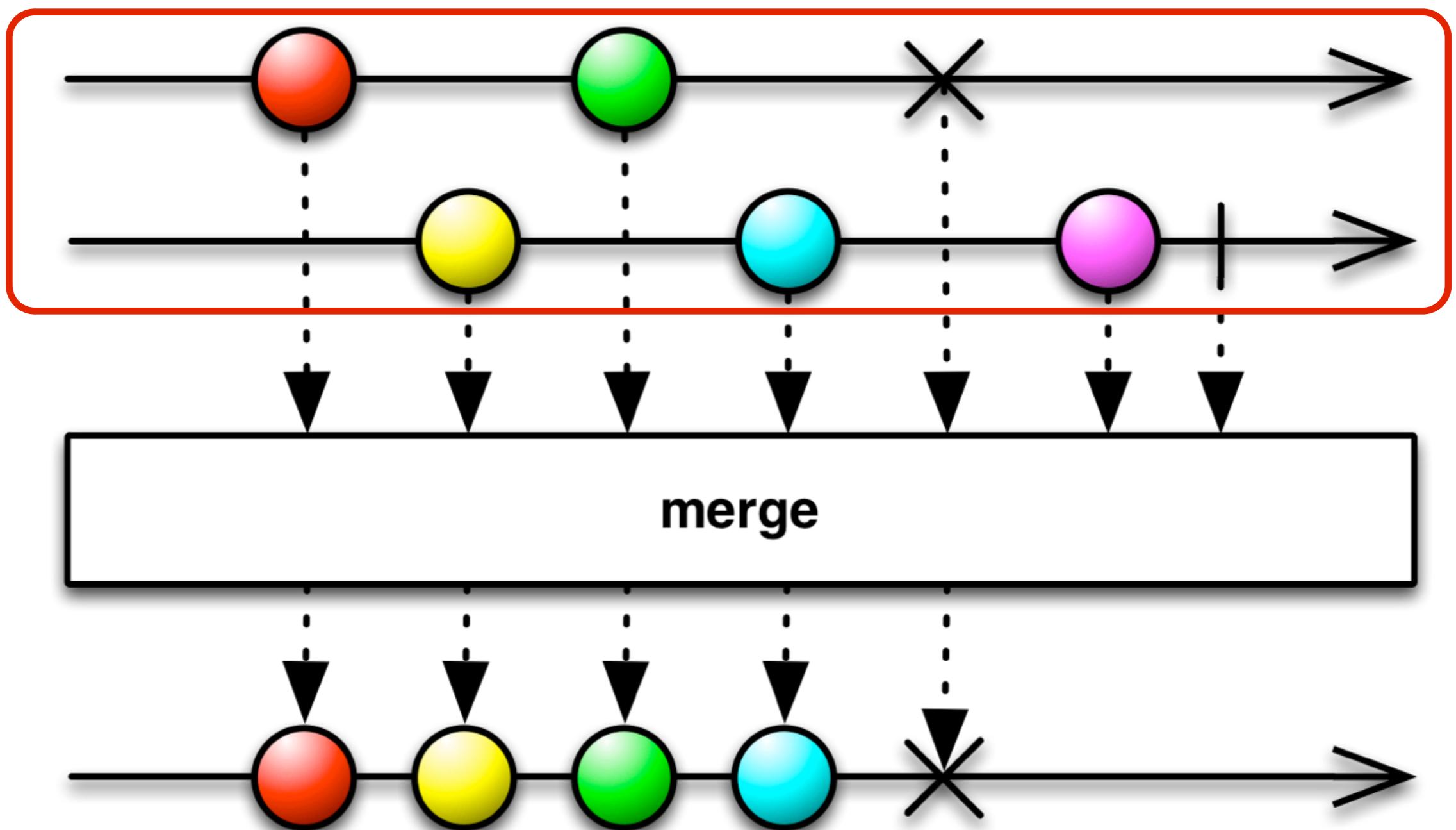
```
Observable.merge(a, b)
    .subscribe(
        { element -> println("data: " + element)})
```



```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

```
Observable.merge(a, b)
    .subscribe(
        { element -> println("data: " + element)})
```

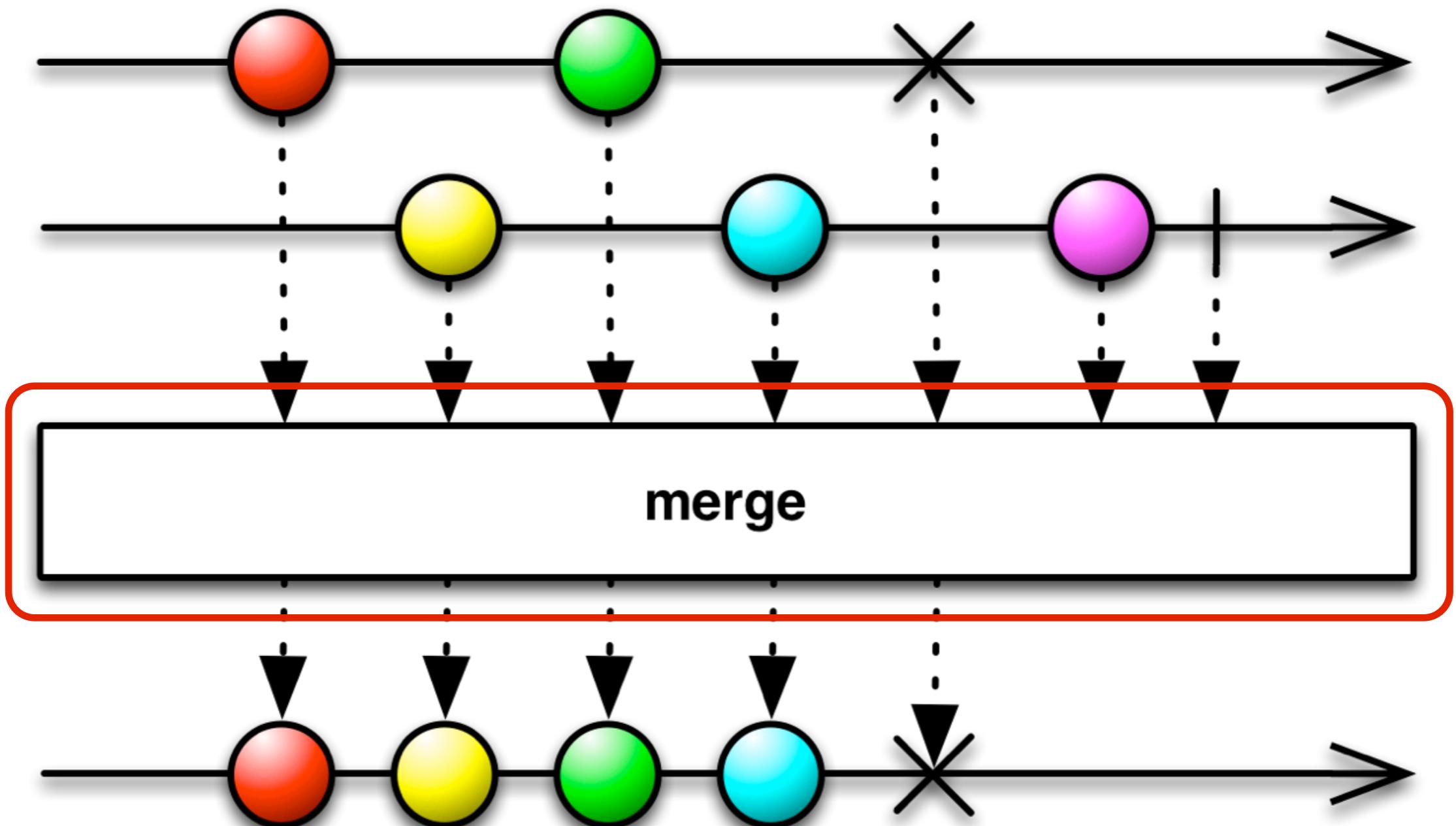
Each of these Observables are of the same type...



```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

```
Observable.merge(a, b)
    .subscribe(
        { element -> println("data: " + element)})
```

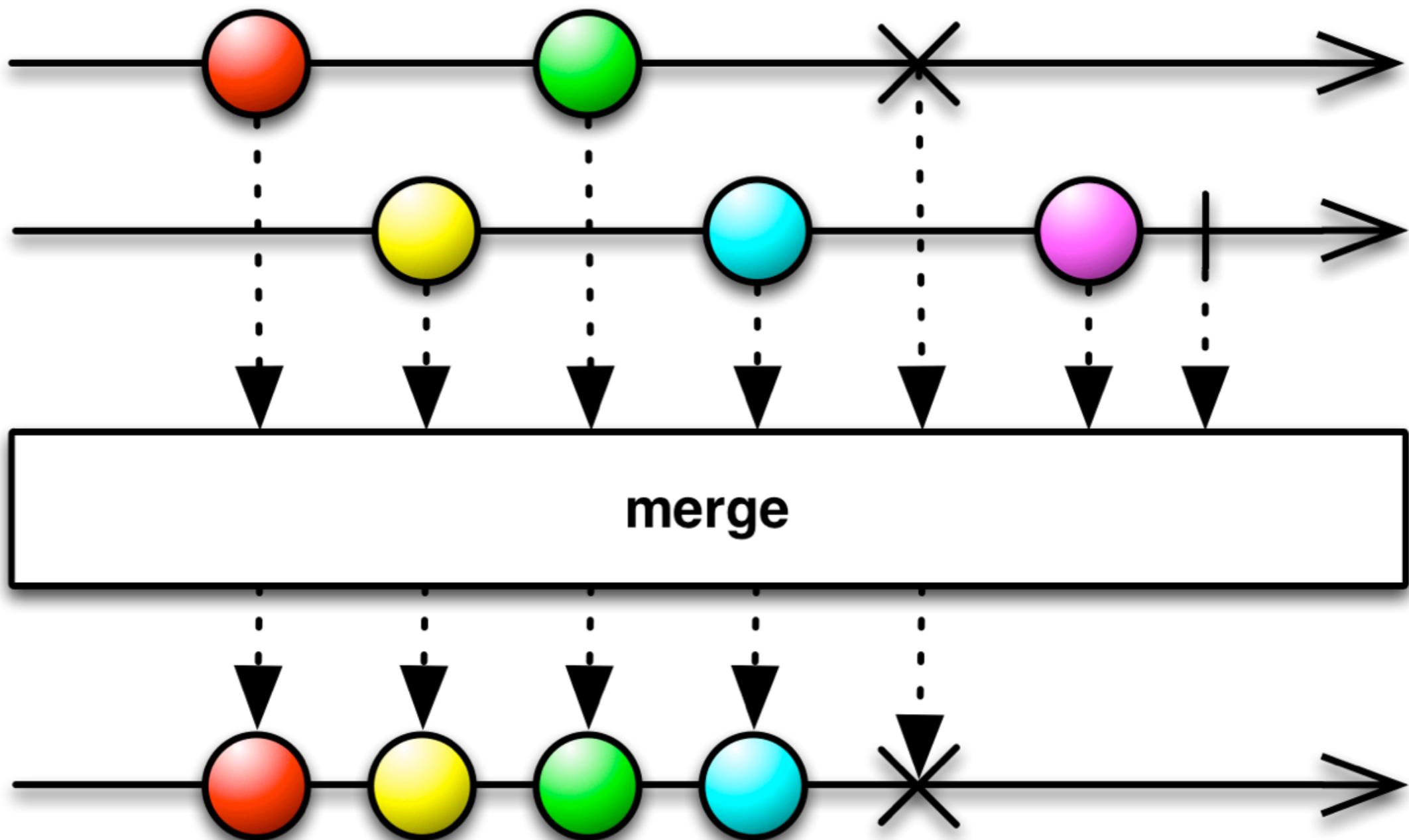
... and can be represented by these timelines ...



```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

```
Observable.merge(a, b)
    .subscribe(
        { element -> println("data: " + element)})
```

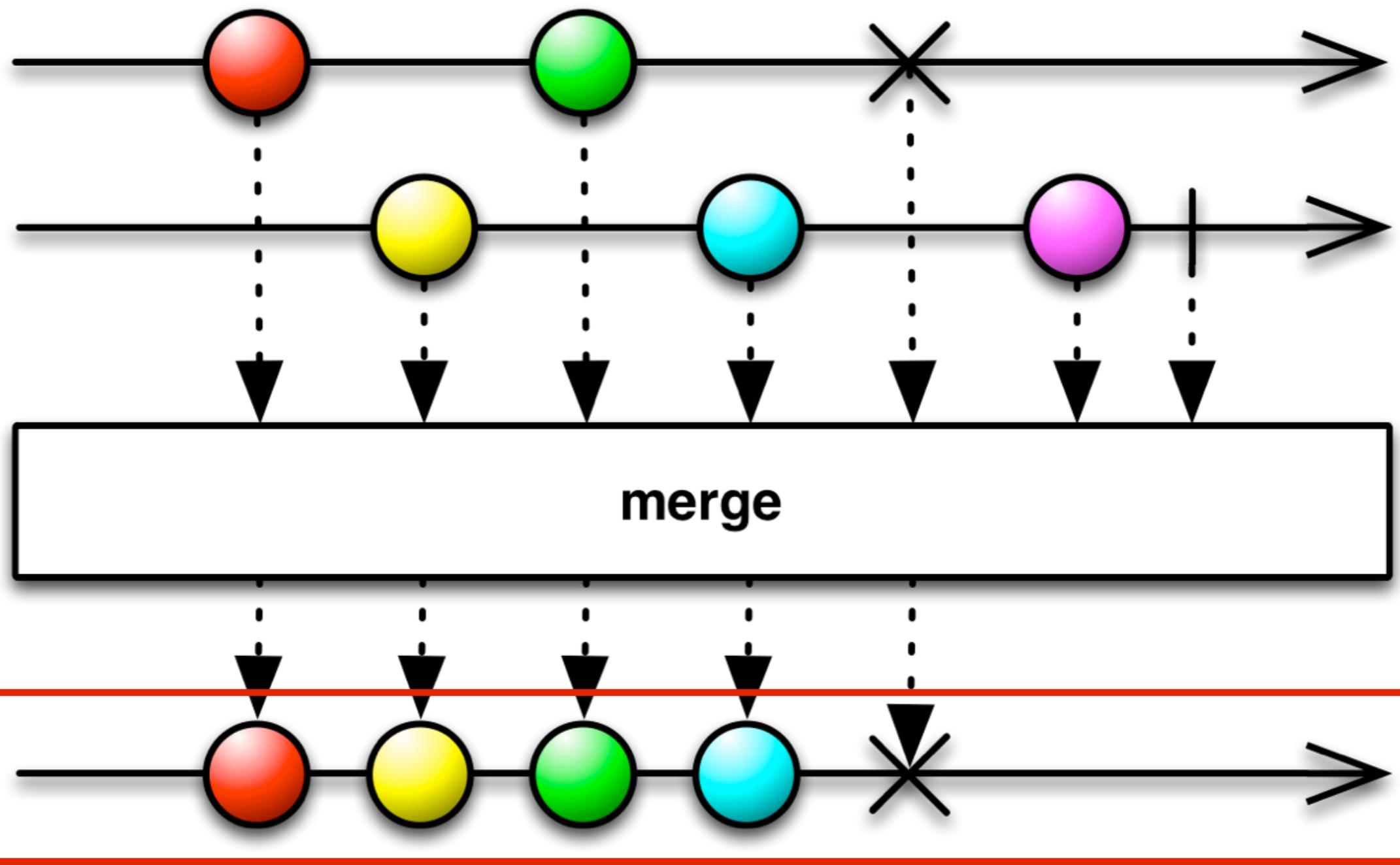
... that we pass through the 'merge' operator ...



```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

```
Observable.merge(a, b)
    .subscribe(
        { element -> println("data: " + element)})
```

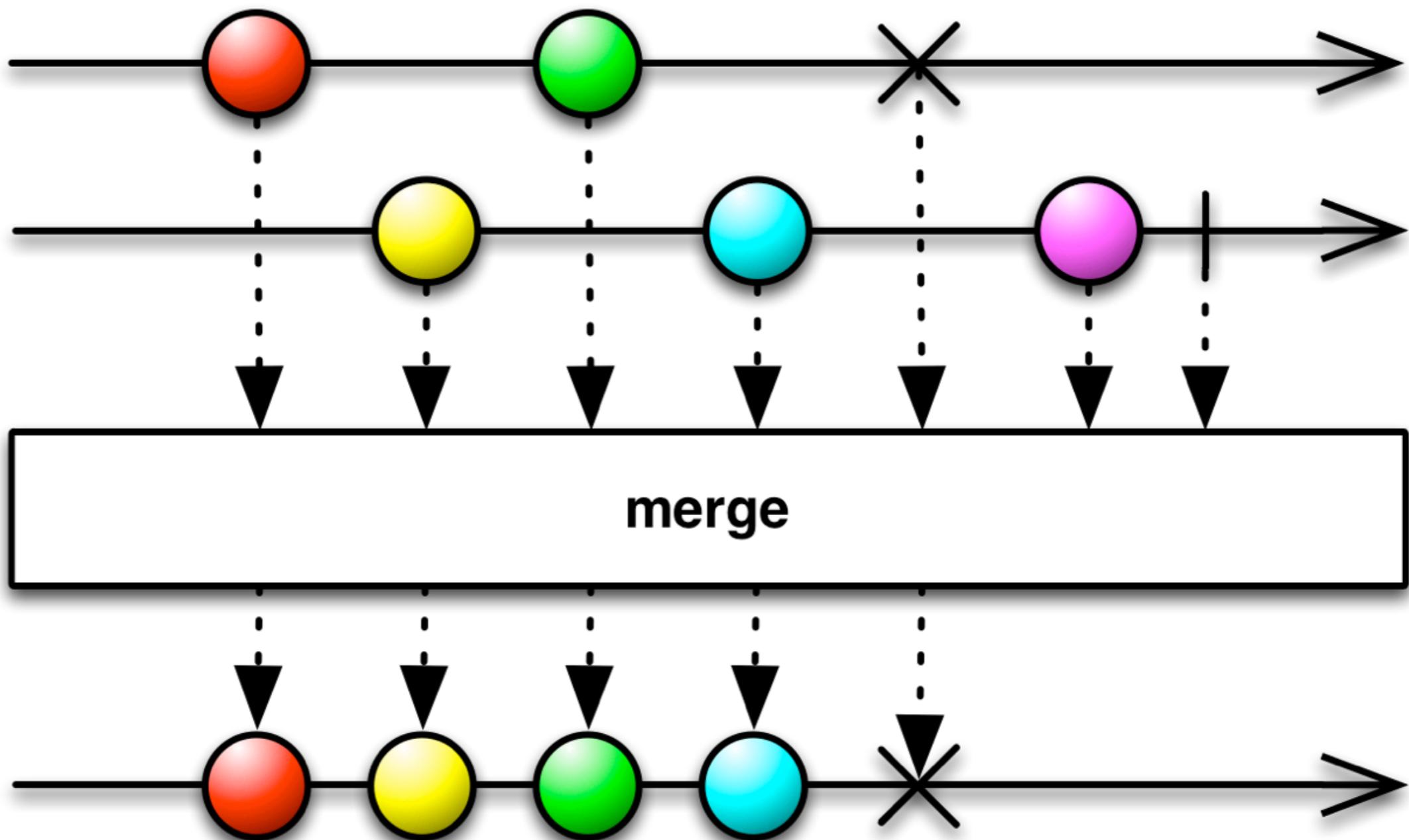
... which looks like this in code ...



```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

```
Observable.merge(a, b)
    .subscribe(
        { element -> println("data: " + element)})
```

... and emits a single Observable containing all of the onNext events plus the first terminal event (onError/onCompleted) from the source Observables ...



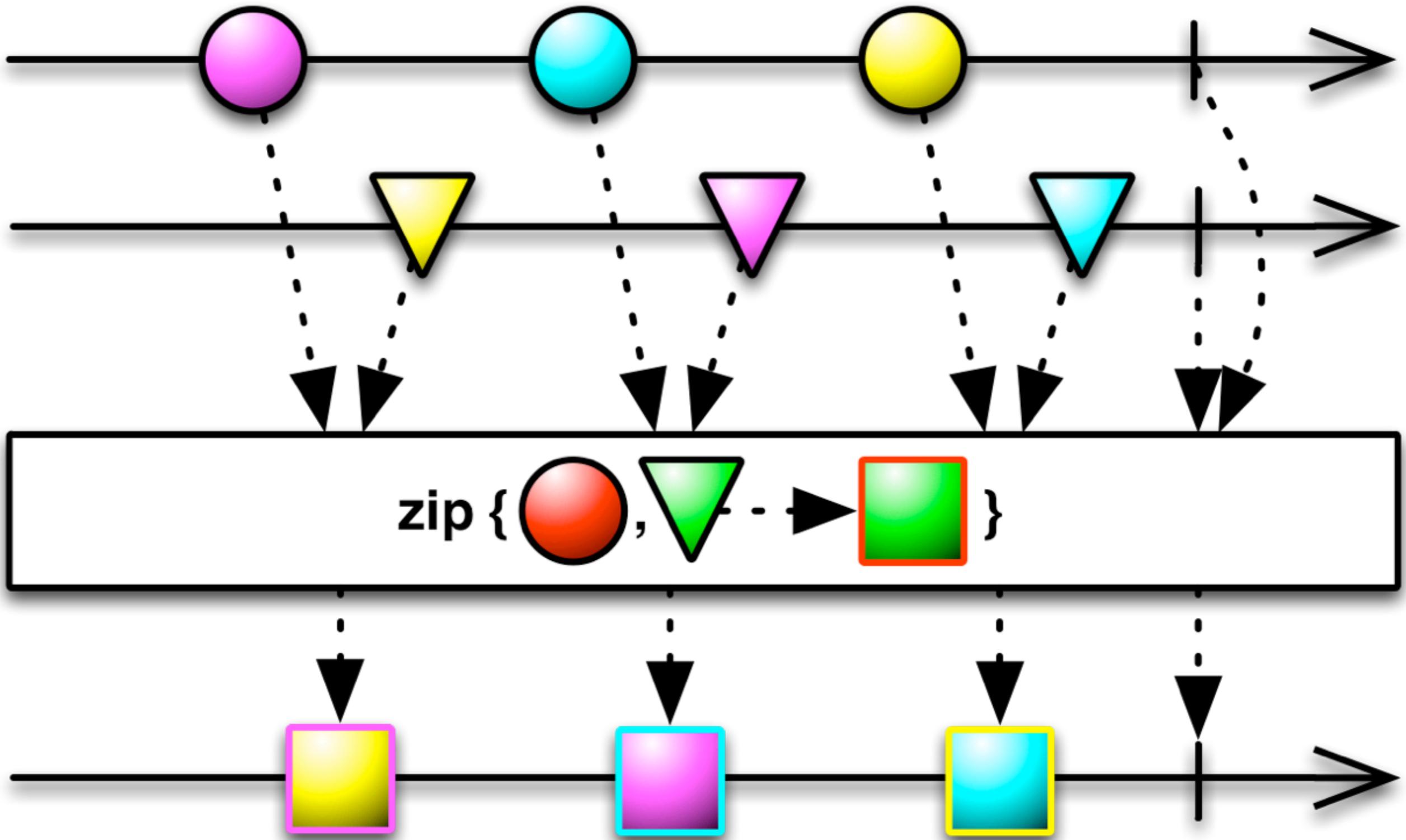
```
Observable<SomeData> a = getDataA();
Observable<SomeData> b = getDataB();
```

**Observable.merge(a, b)**

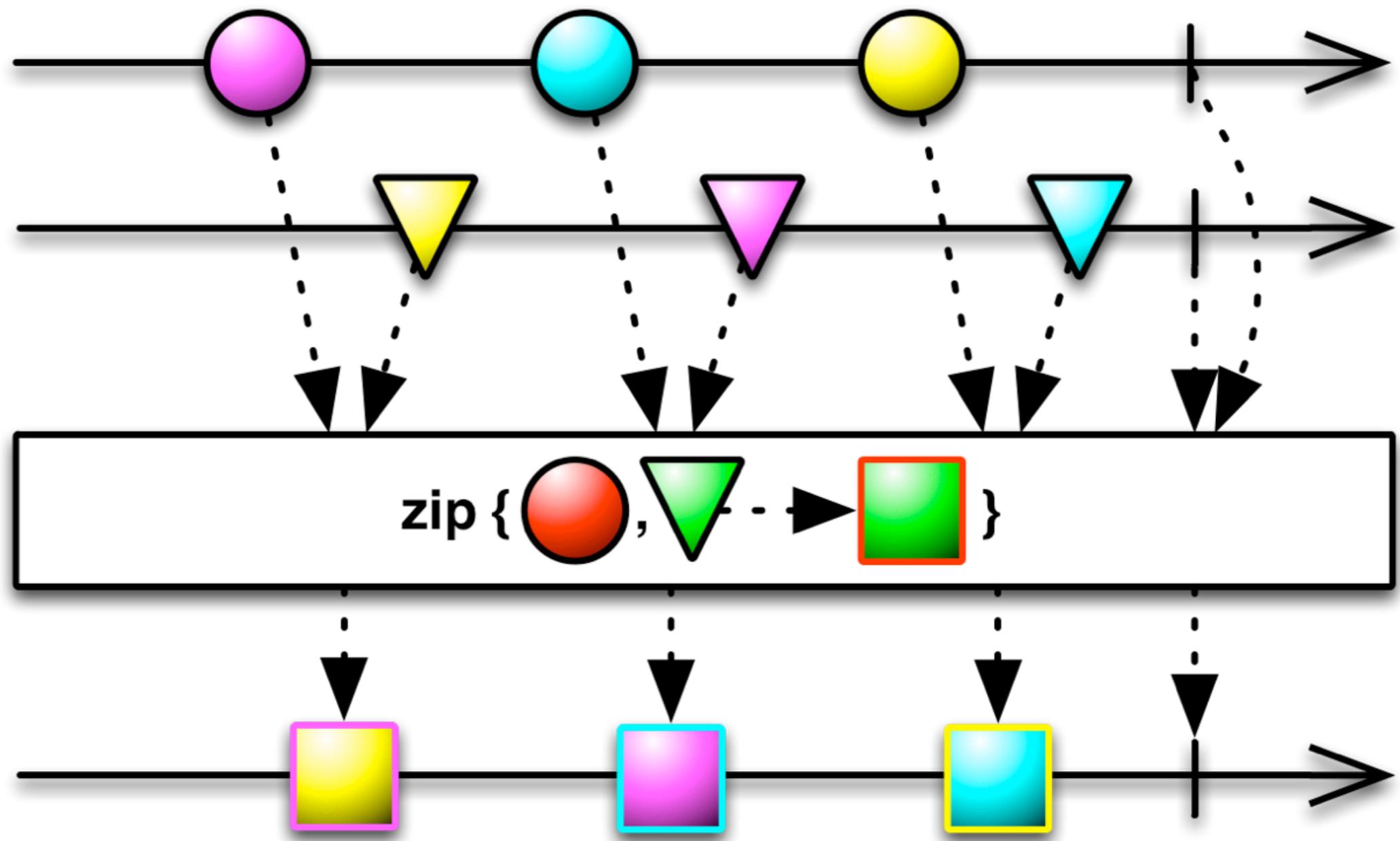
```
.subscribe(
    { element -> println("data: " + element)})
```

... and these are then subscribed to as a single Observable.

# COMBINING VIA ZIP

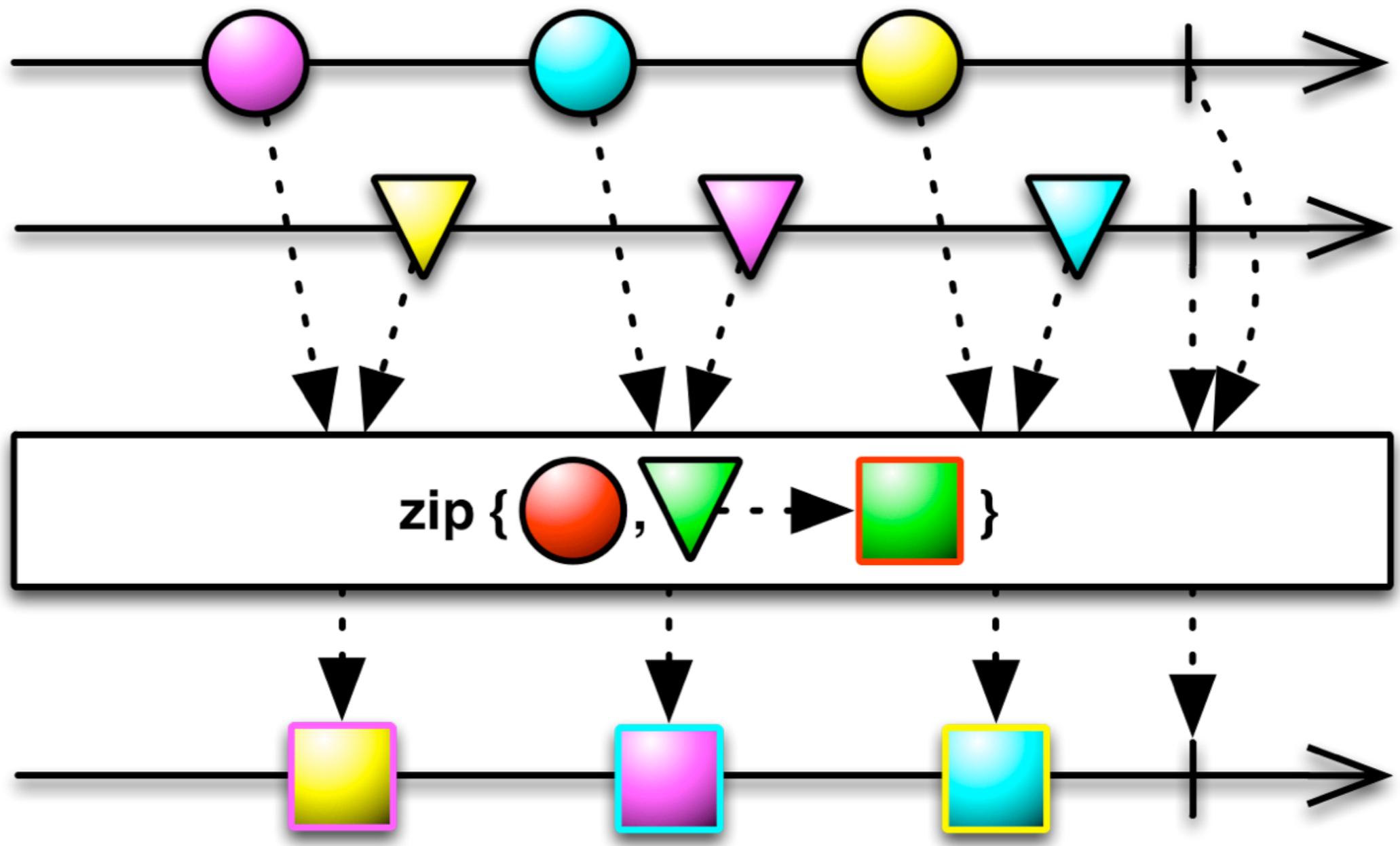


The 'zip' operator is used to combine Observable sequences of different types.



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

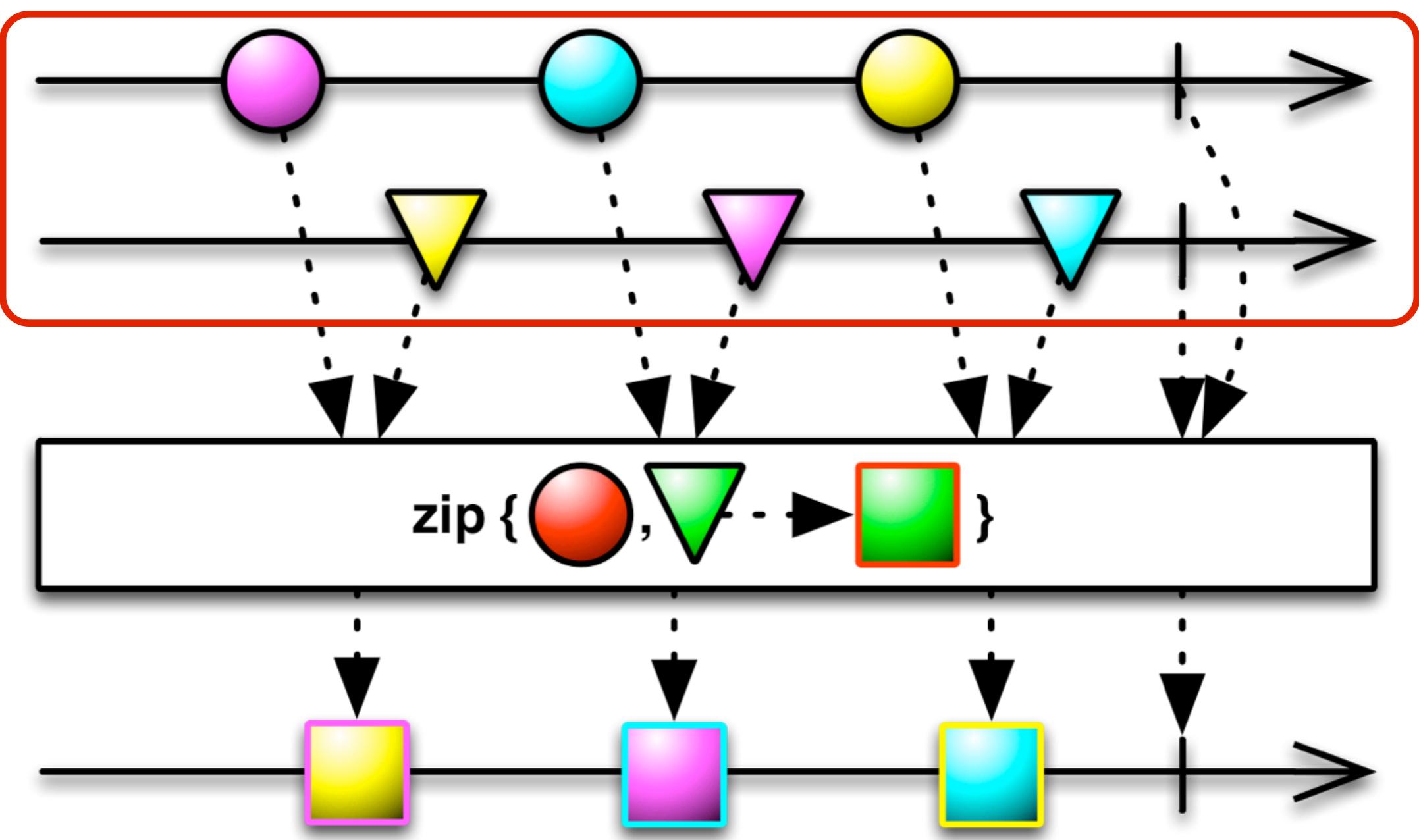
```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])})
```



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})  
.subscribe(  
{ pair -> println("a: " + pair[0]  
+ " b: " + pair[1])})
```

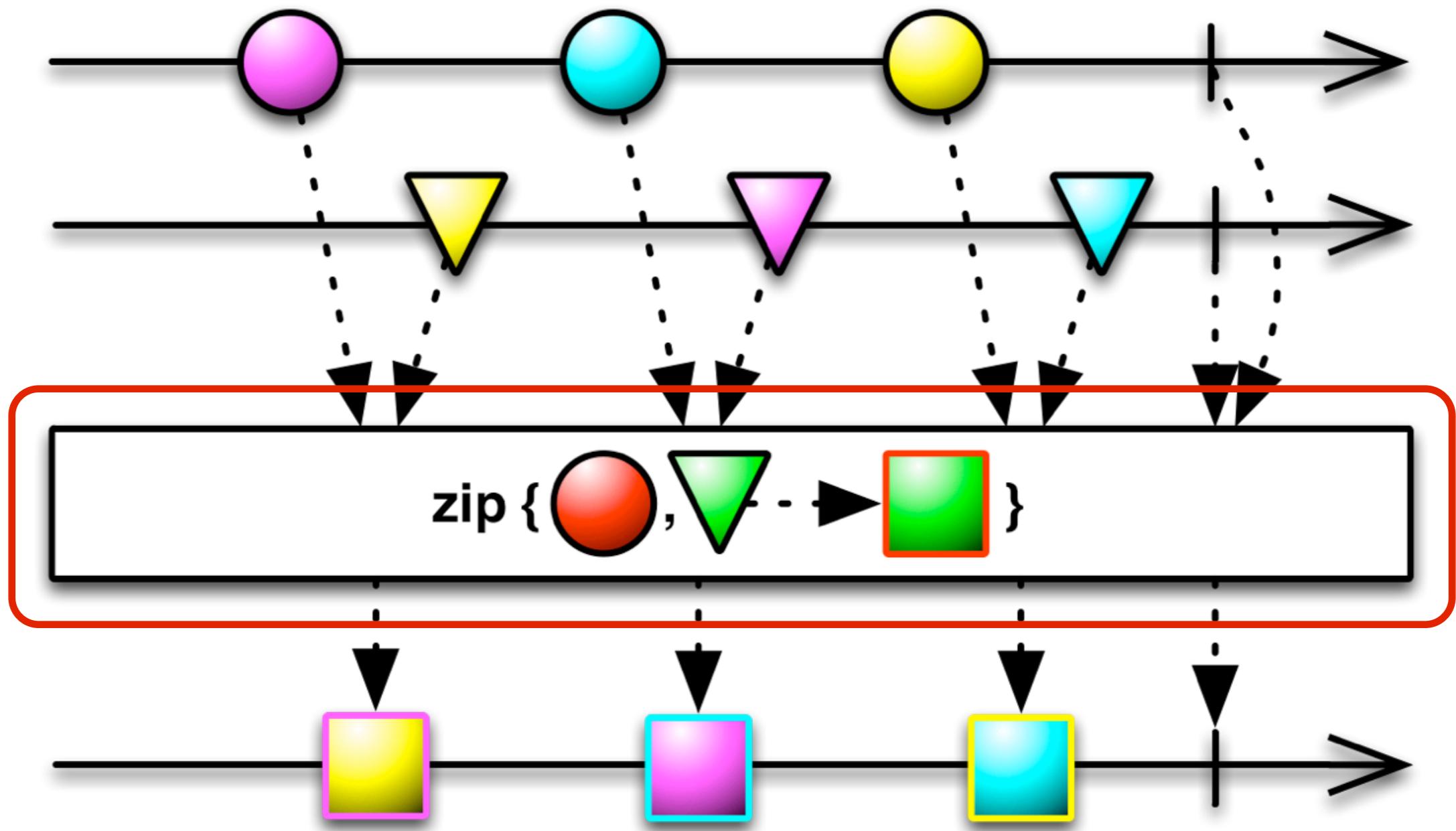
Here are 2 Observable sequences with different types ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])})
```

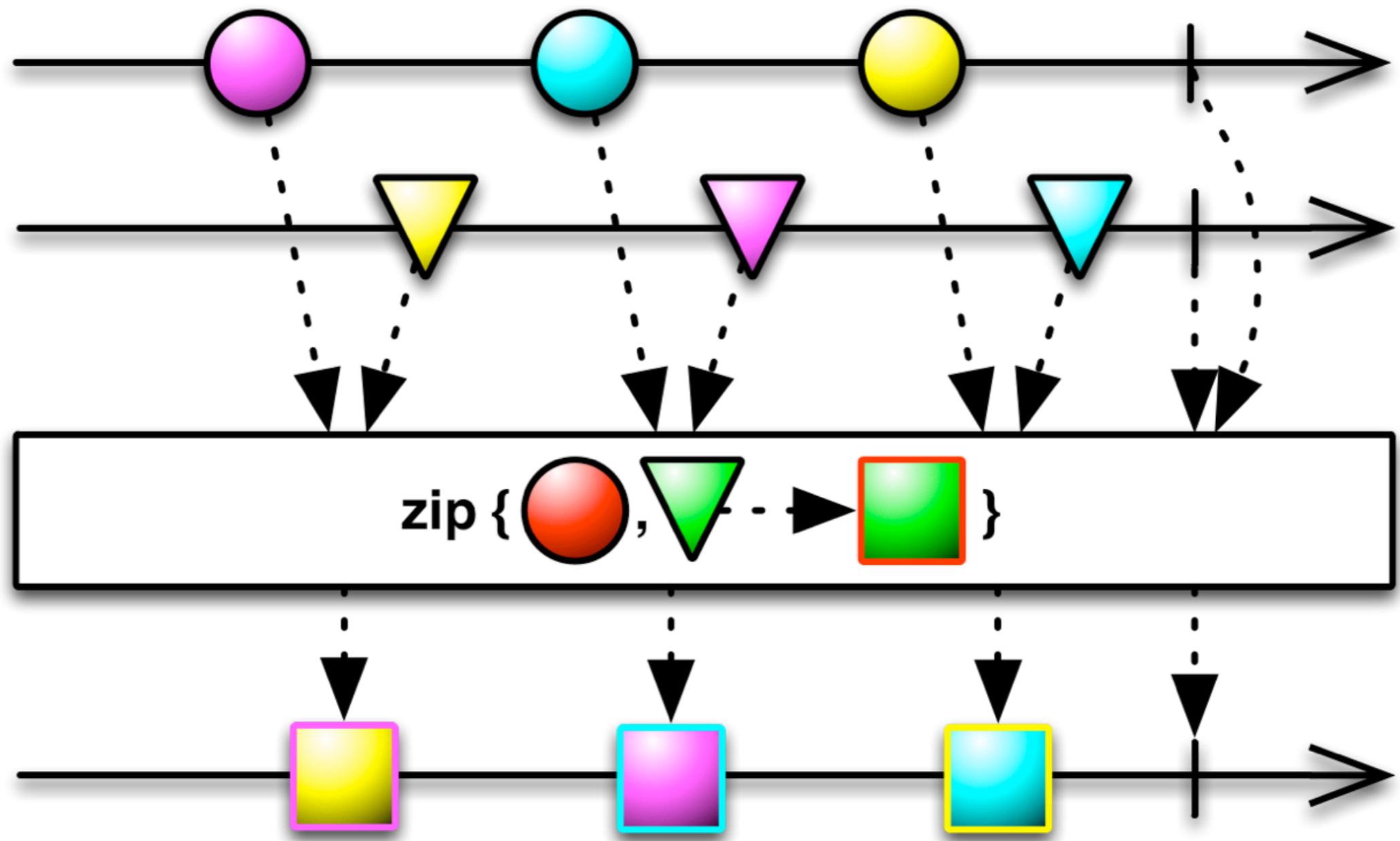
... represented by 2 timelines with different shapes ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])})
```

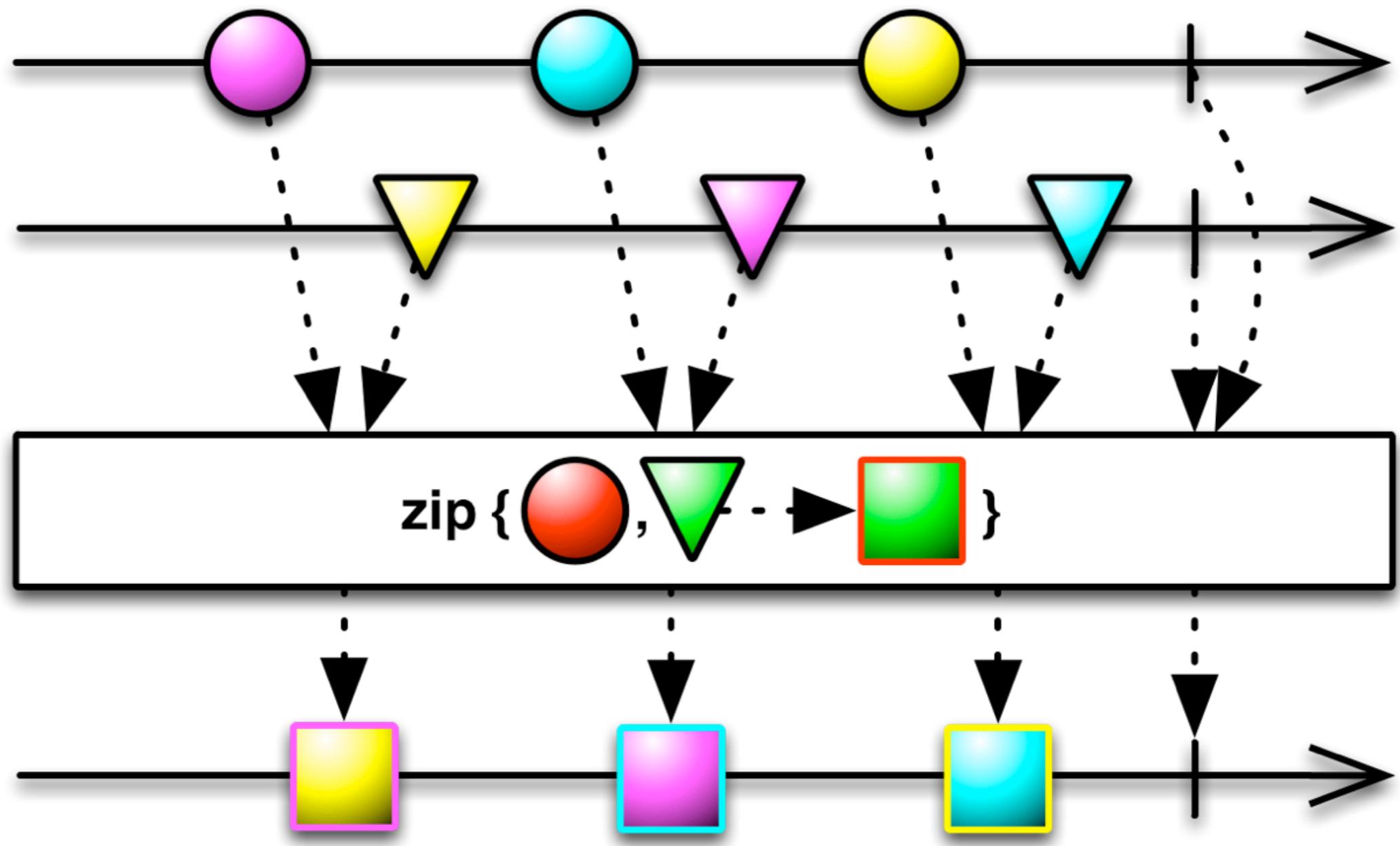
... that we pass through the zip operator that contains a provided function to apply to each set of values received.



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])})
```

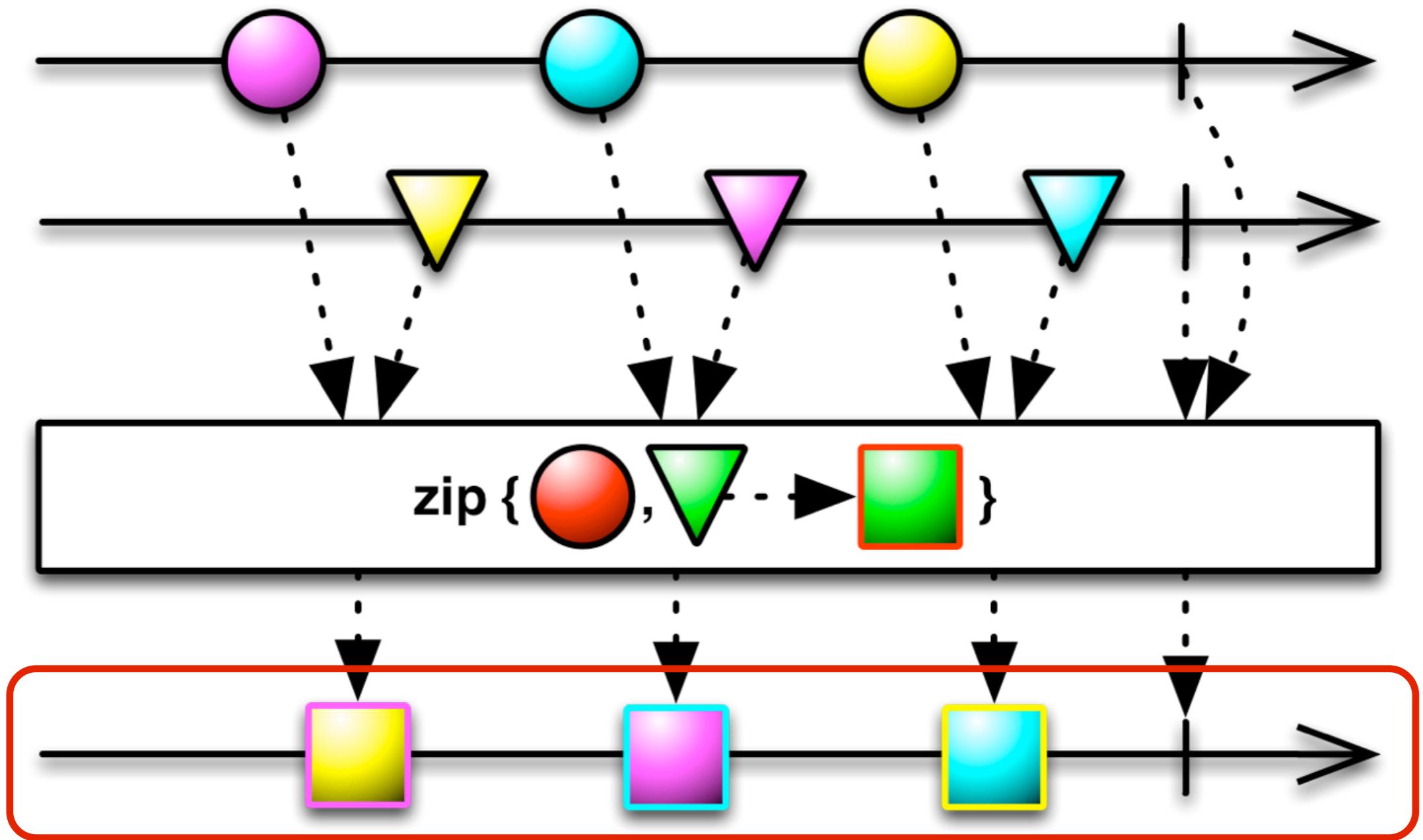
The transformation function is passed into the `zip` operator ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})  
.subscribe(  
    { pair -> println("a: " + pair[0]  
        + " b: " + pair[1])})
```

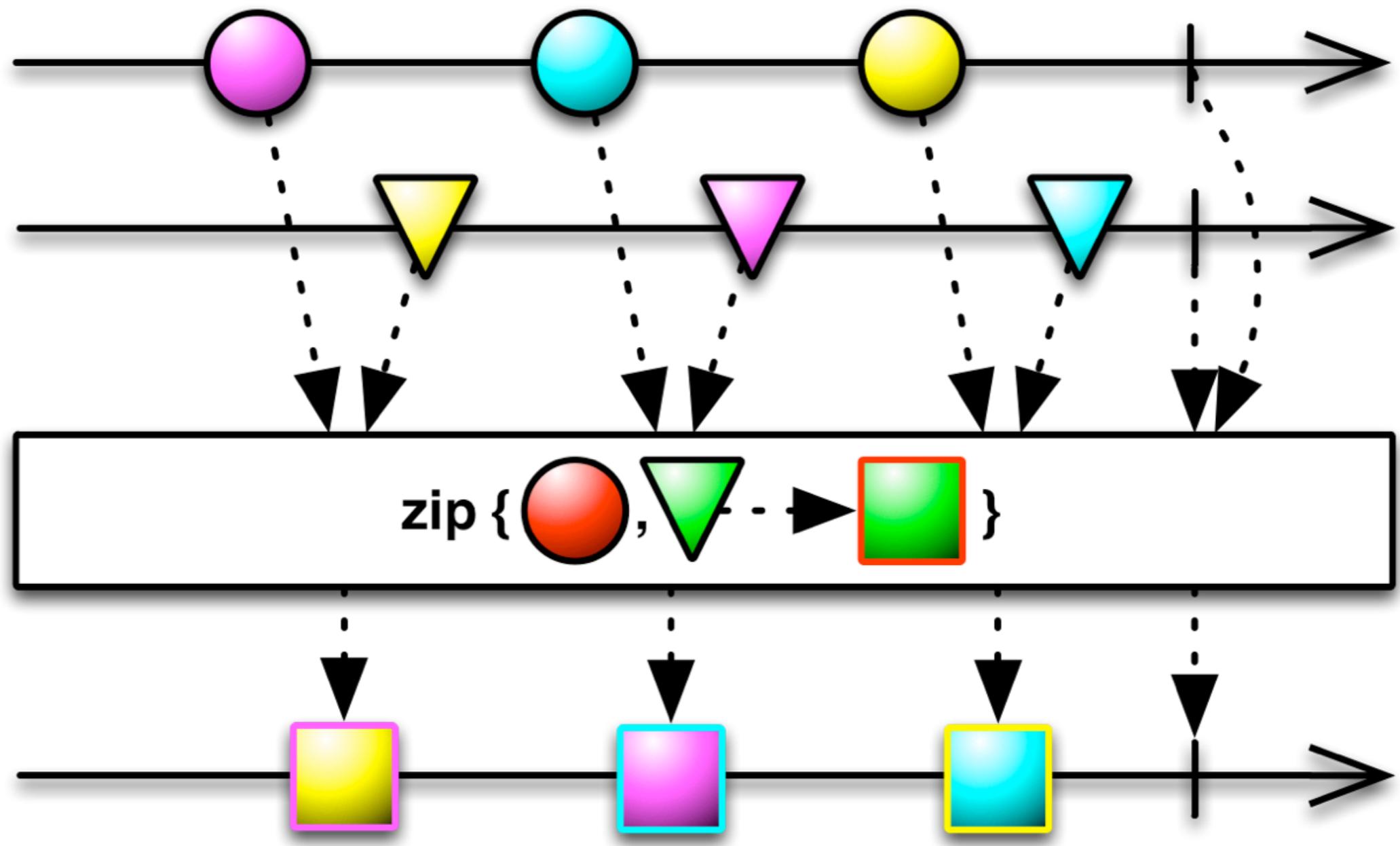
... and in this case it is simply taking x & y and combining them into a tuple or pair and then returning it.



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])})
```

The output of the transformation function given to the zip operator is emitted in a single Observable sequence ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})  
.subscribe(  
{ pair -> println("a: " + pair[0]  
+ " b: " + pair[1])})
```

... that gives us our pairs when we subscribe to it.

# ERROR HANDLING

```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]}).subscribe(
    { pair -> println("a: " + pair[0]
                        + " b: " + pair[1])},
    { exception -> println("error occurred: "
                            + exception.getMessage())},
    { println("completed") })
```

If an error occurs then the 'onError' handler passed into the 'subscribe' will be invoked...

# ERROR HANDLING

```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]})  
.subscribe(  
    {<pair -> println("a: " + pair[0]  
        + " b: " + pair[1])},  
    {<exception -> println("error occurred: "  
        + exception.getMessage())},  
    {<println("completed")}>})
```

The diagram illustrates the mapping of the code snippets to the RxJava methods. Three arrows originate from the code and point to the right, each labeled with a method name:

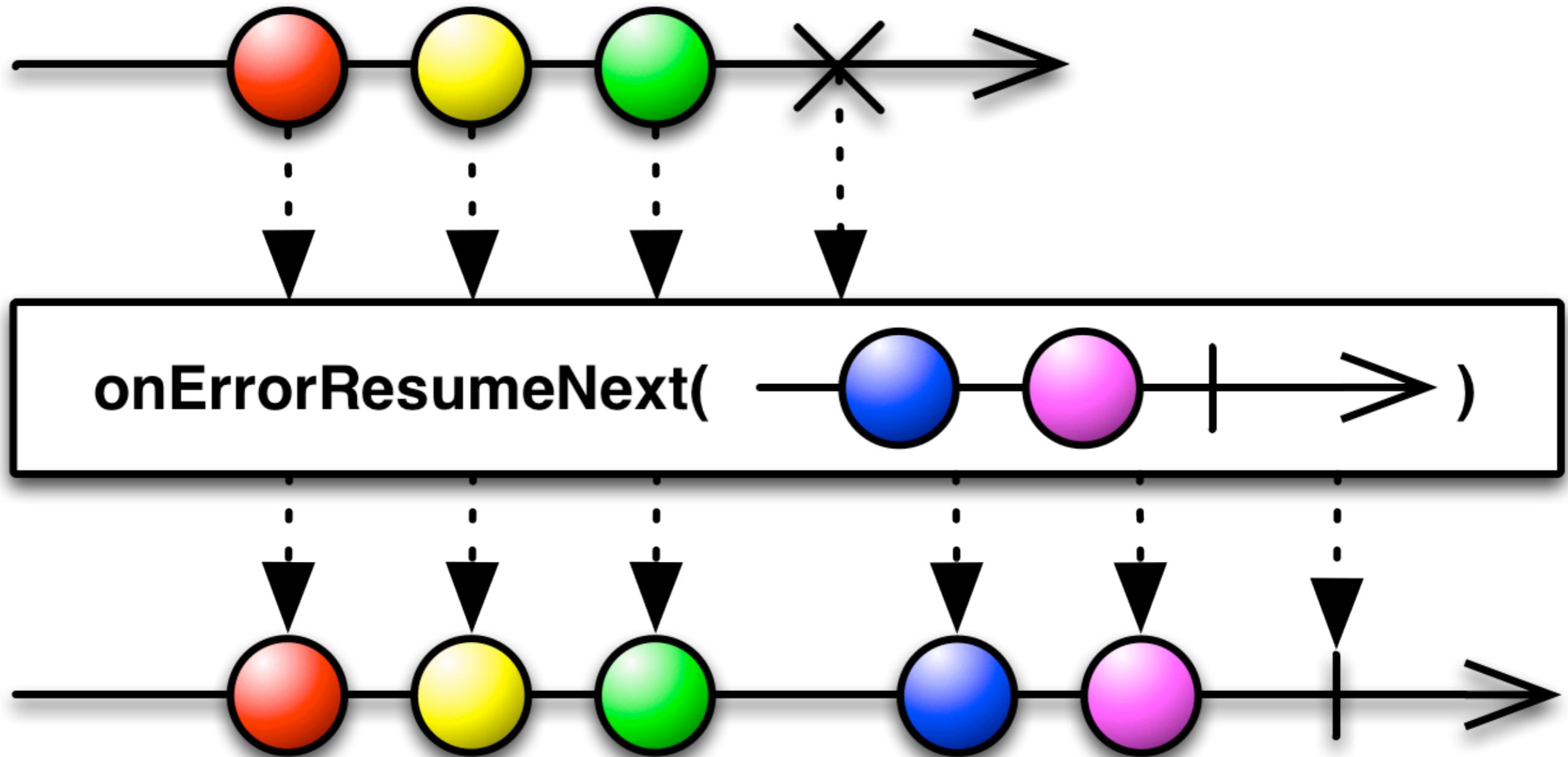
- A black arrow points from the first snippet (pair processing) to the `onNext(T)` method.
- A red arrow points from the second snippet (exception handling) to the `onError(Exception)` method.
- A black arrow points from the third snippet (completion message) to the `onCompleted()` method.

# ERROR HANDLING

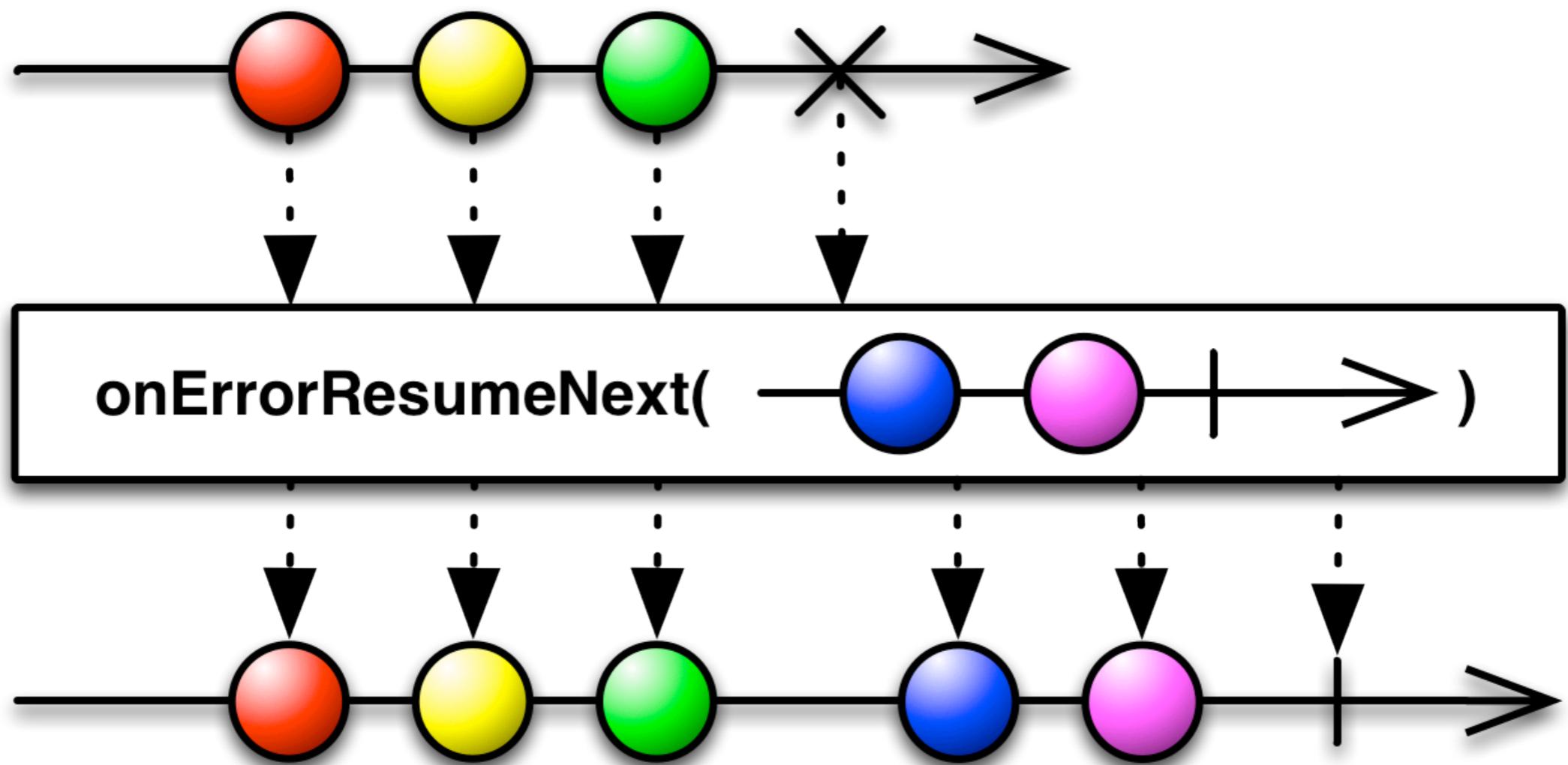
```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB();
```

```
Observable.zip(a, b, {x, y -> [x, y]}).subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1]),
    { exception -> println("error occurred: "
        + exception.getMessage())),
    { println("completed") }}
```

# ERROR HANDLING

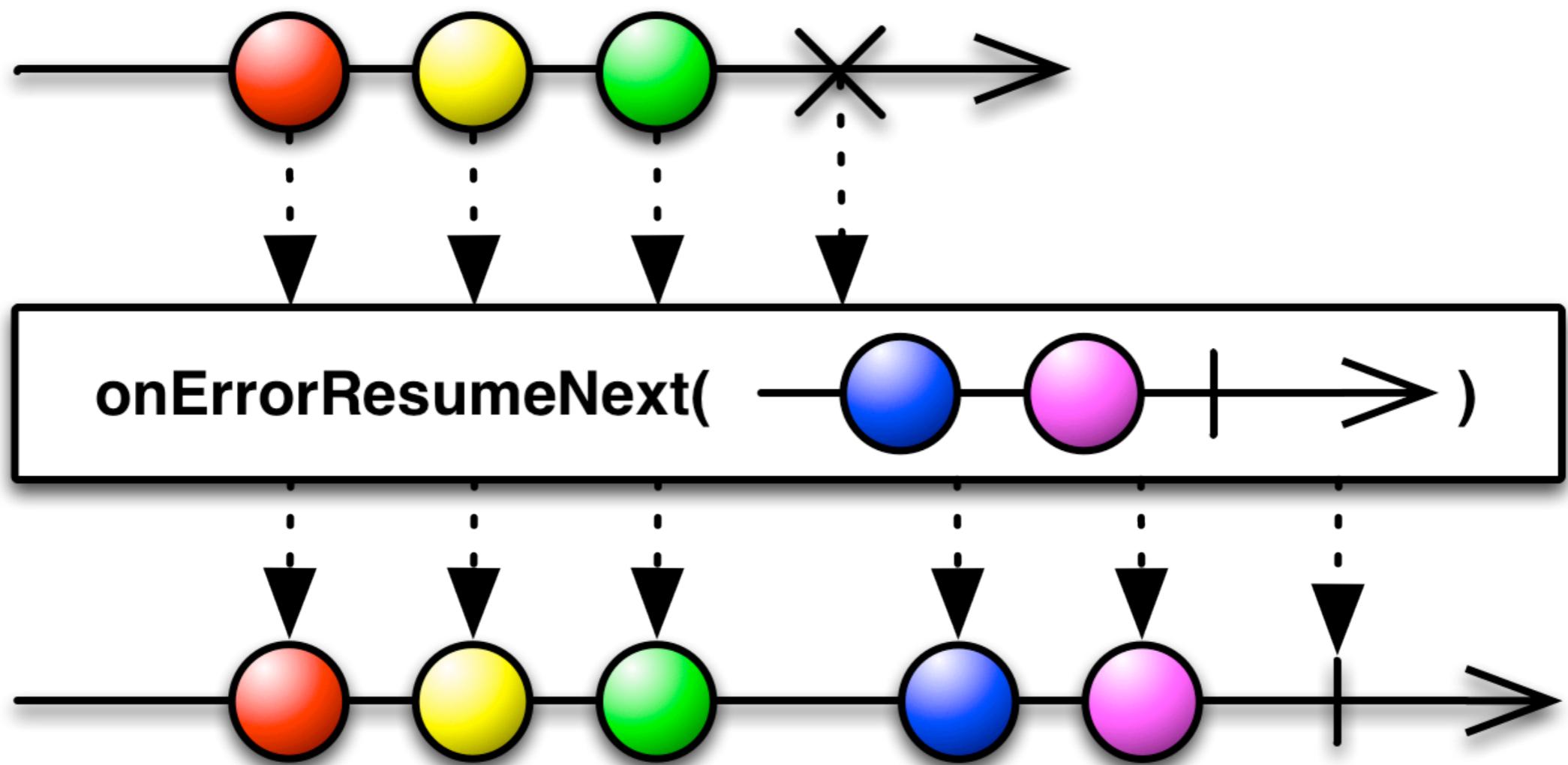


The 'onErrorResumeNext' operator allows intercepting an 'onError' and providing a new Observable to continue with.



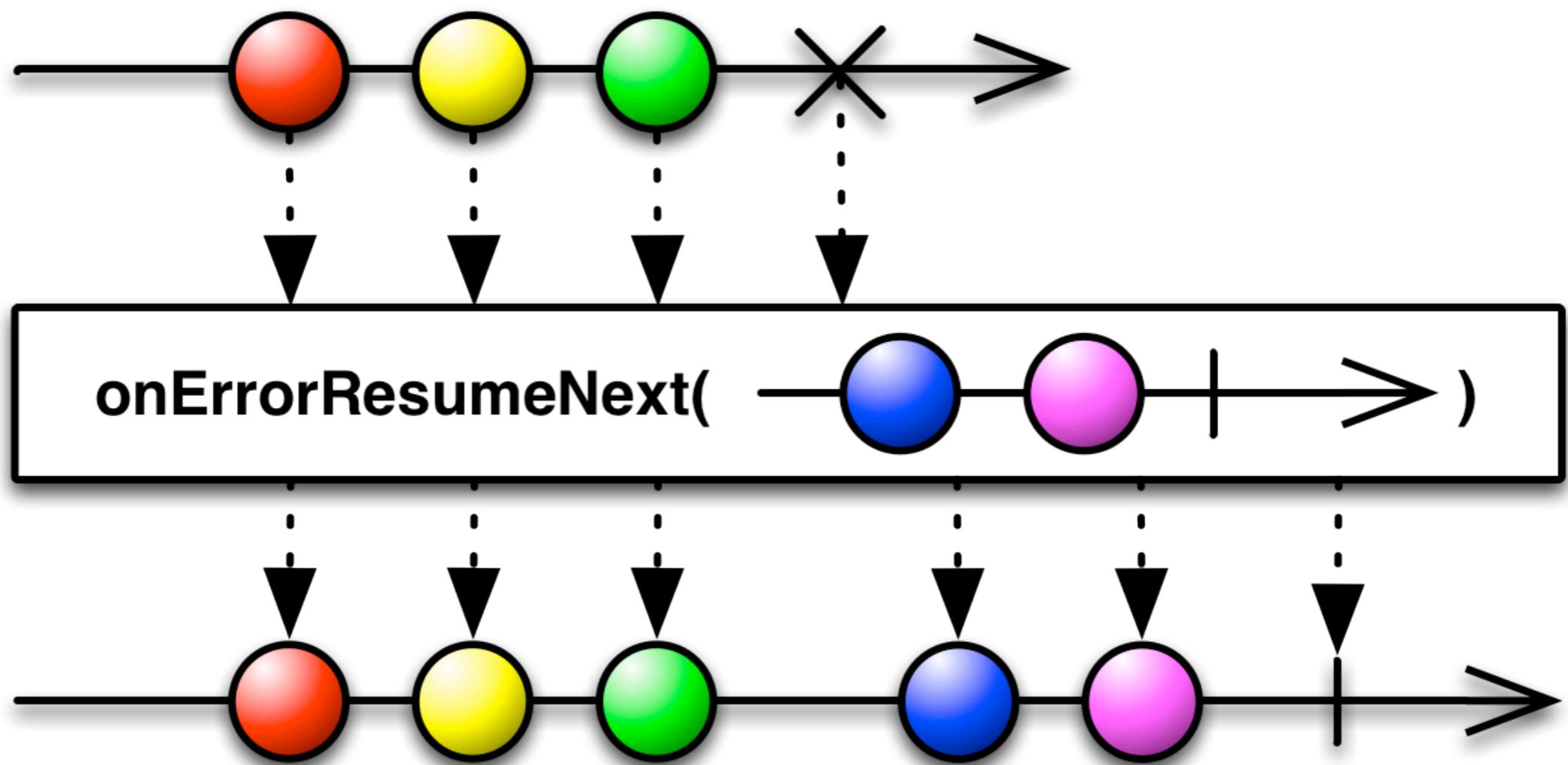
```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
```

```
Observable.zip(a, b, {x, y -> [x, y]})
    .subscribe(
        { pair -> println("a: " + pair[0]
                            + " b: " + pair[1])},
        { exception -> println("error occurred: "
                                + exception.getMessage())})
```



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage()))})
```



```

Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());

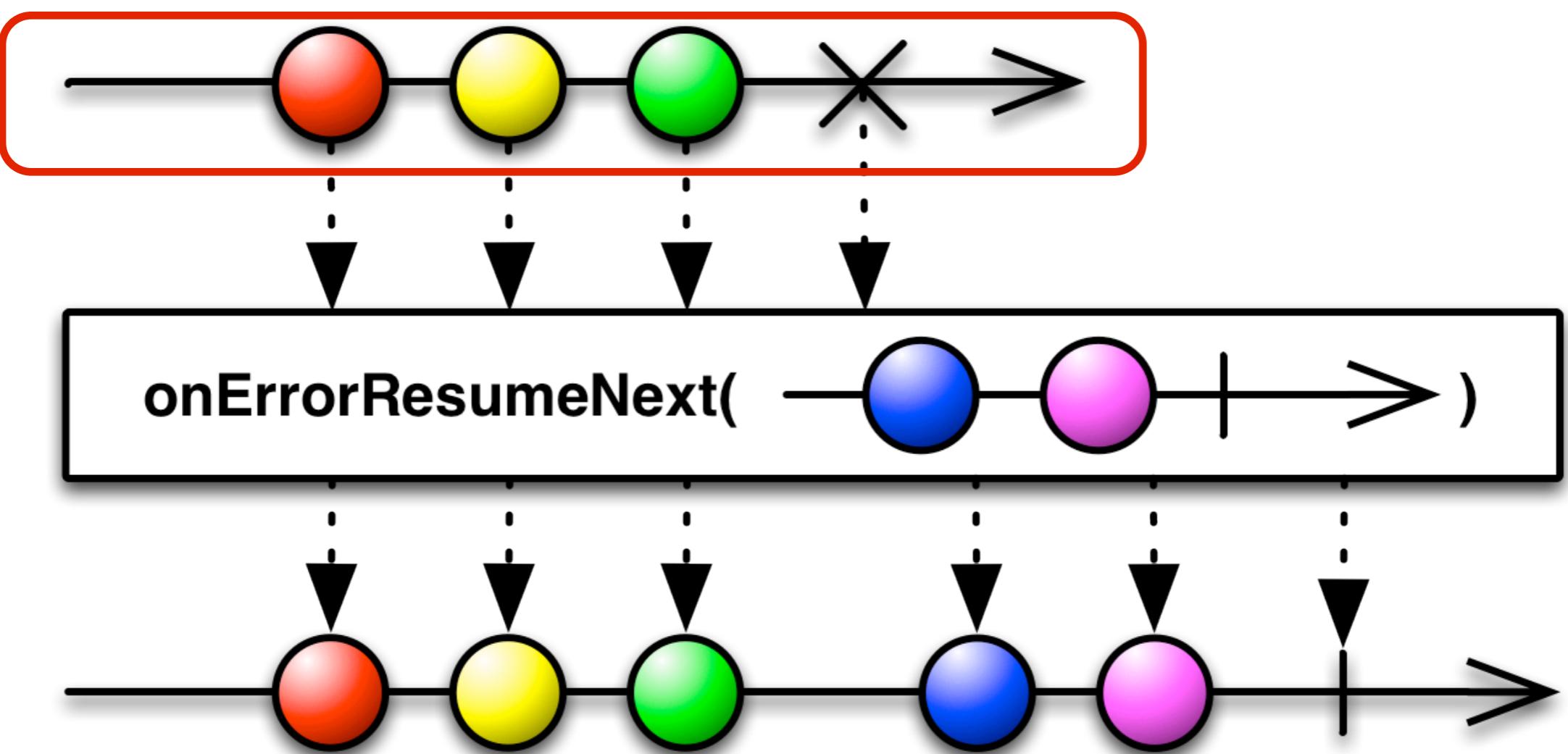
```

```

Observable.zip(a, b, {x, y -> [x, y]})
    .subscribe(
        { pair -> println("a: " + pair[0]
                            + " b: " + pair[1])},
        { exception -> println("error occurred: "
                                + exception.getMessage())})

```

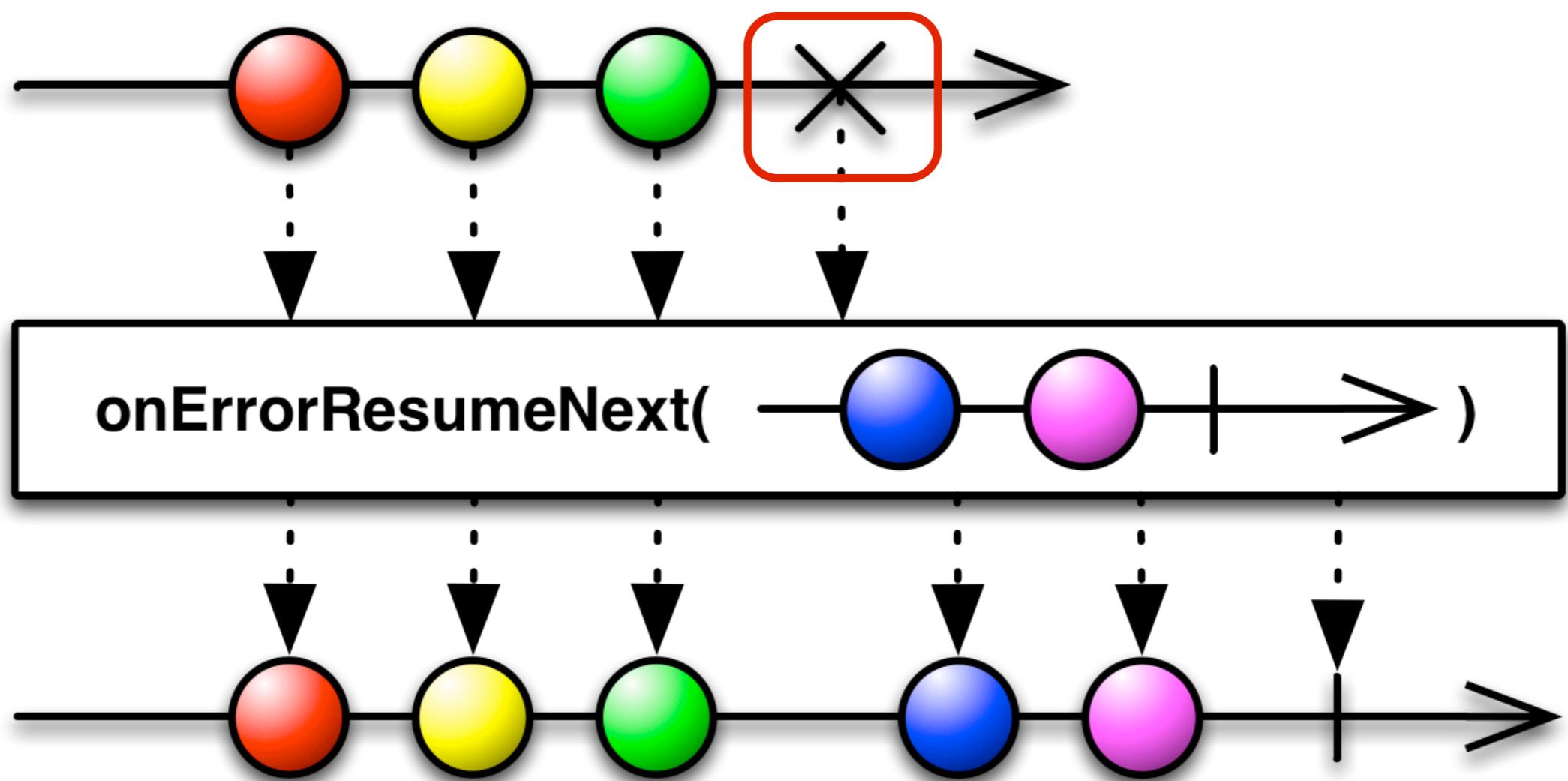
So 'b' represents an Observable sequence ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage()))})
```

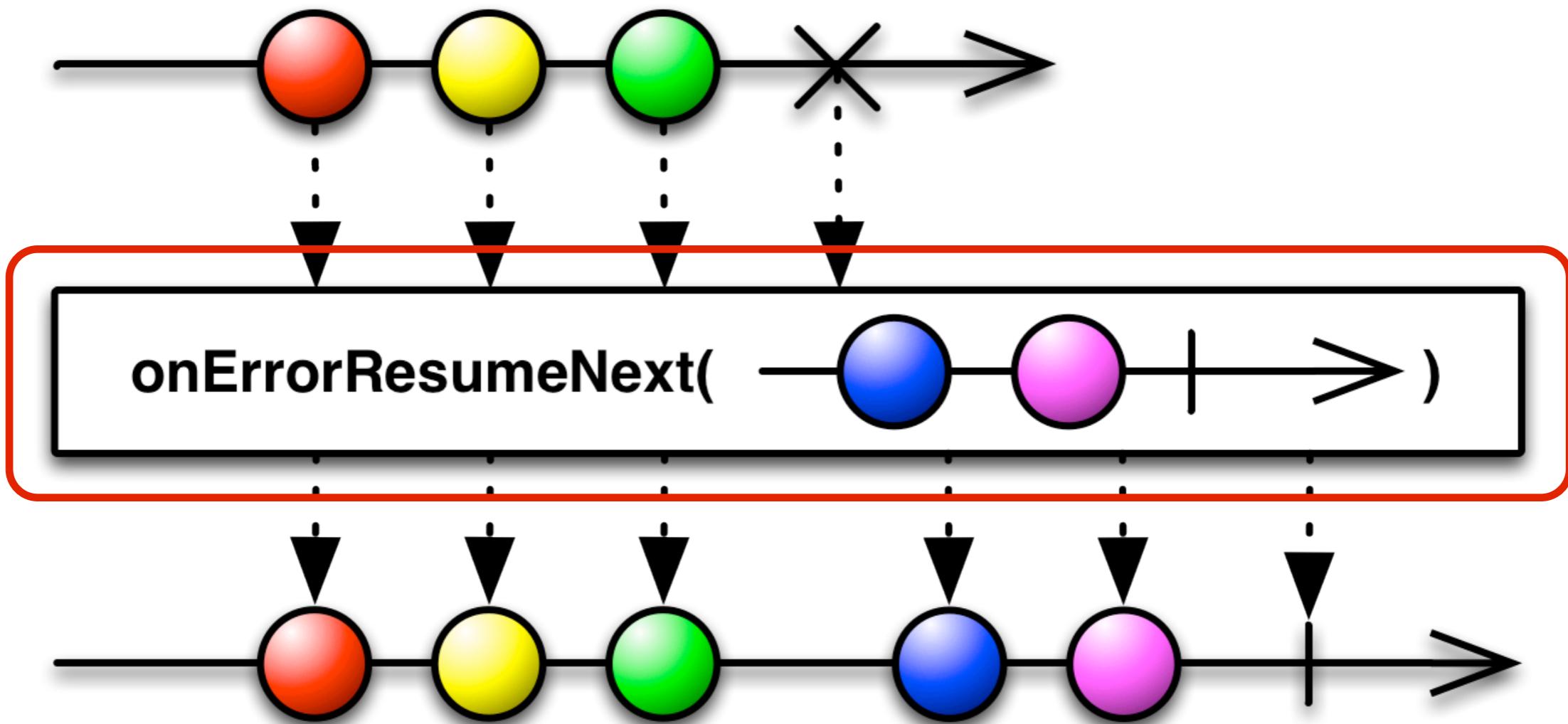
... that emits 3 values ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage()))})
```

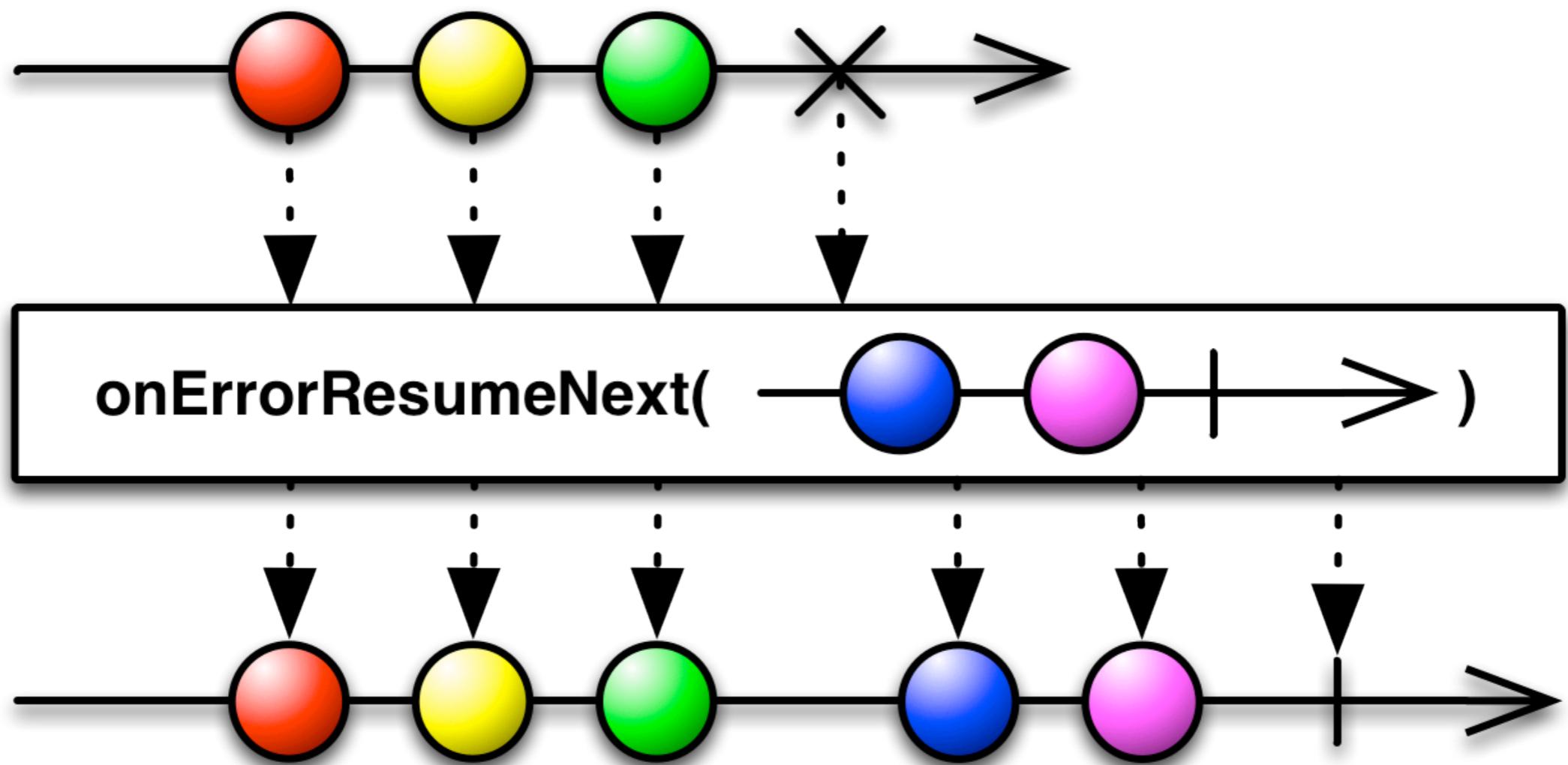
... and then fails and calls onError ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage()))})
```

... which being routed through 'onErrorResumeNext' ...



```

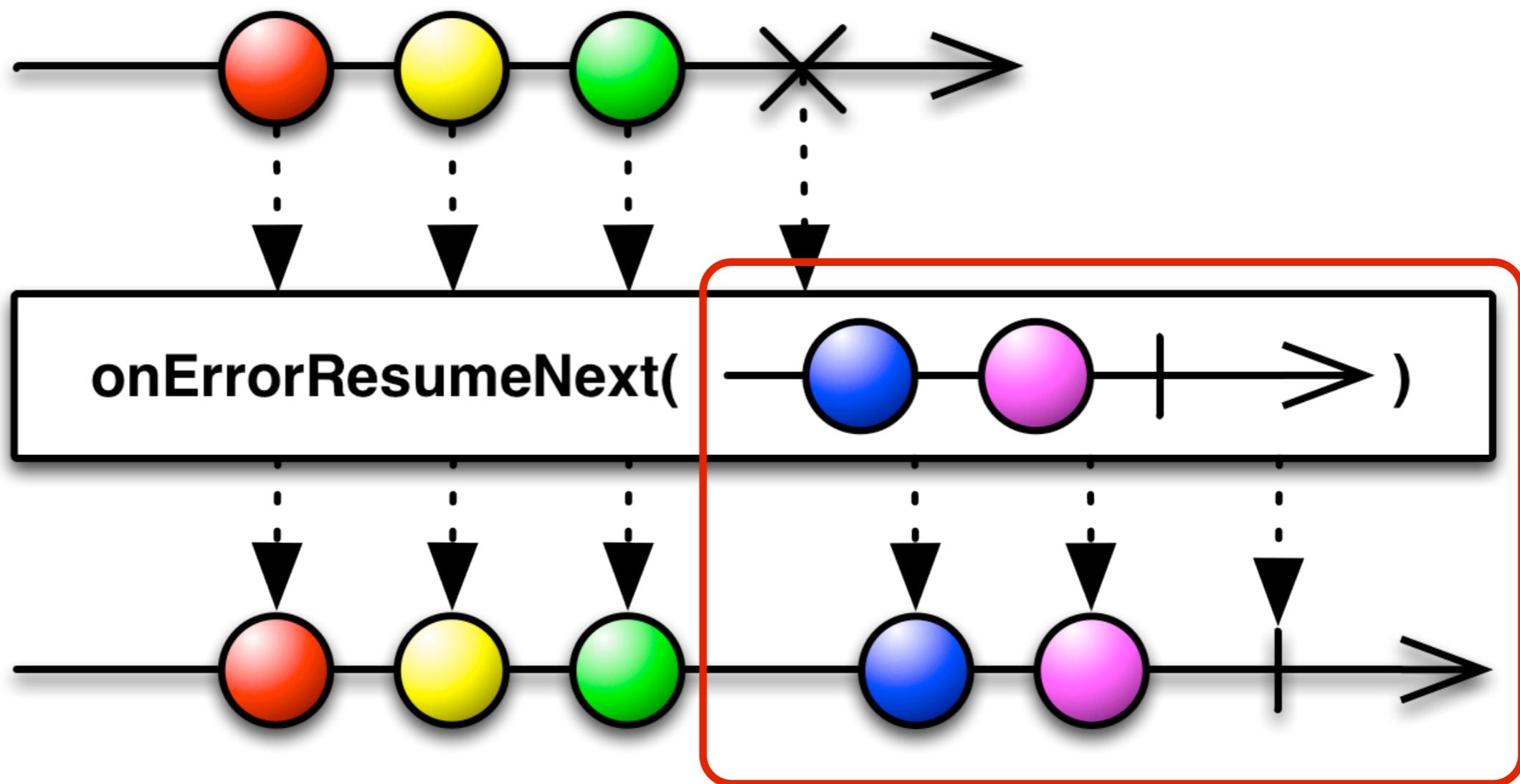
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());

Observable.zip(a, b, {x, y -> [x, y]})

.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage())})

```

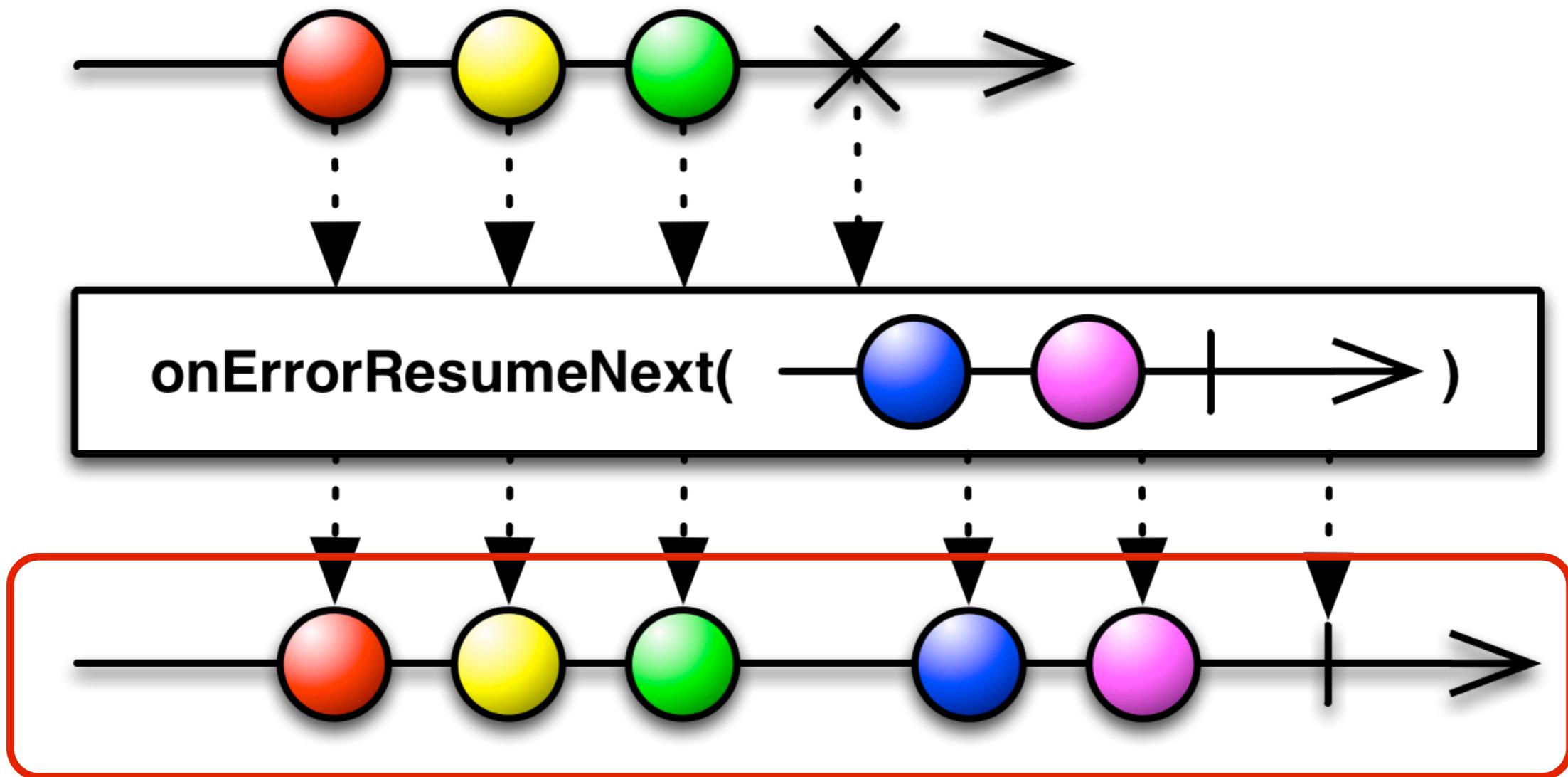
... triggers the invocation of 'getFallbackForB()' ...



```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage()))})
```

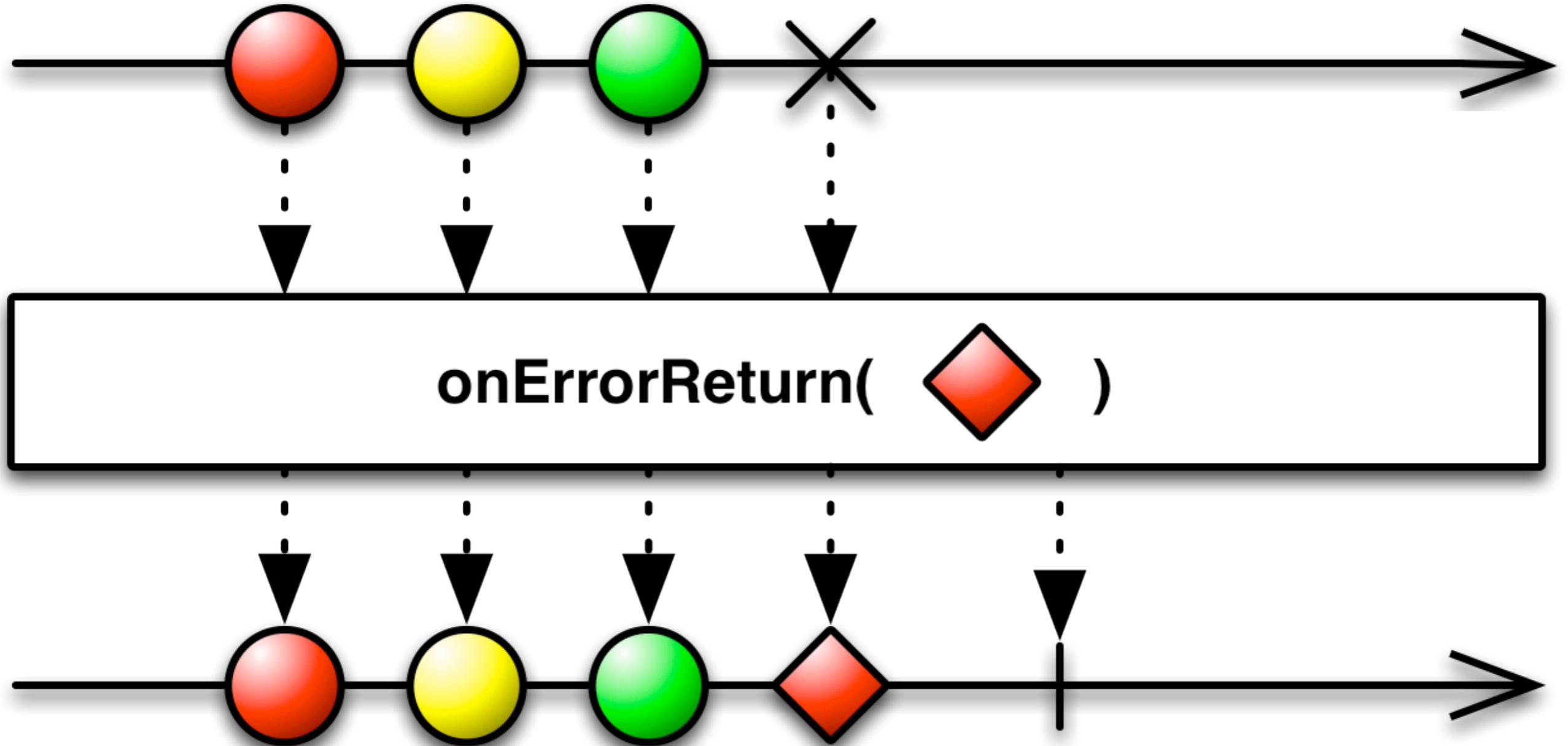
... which provides a new Observable that is subscribed to in place of the original Observable 'b' ...



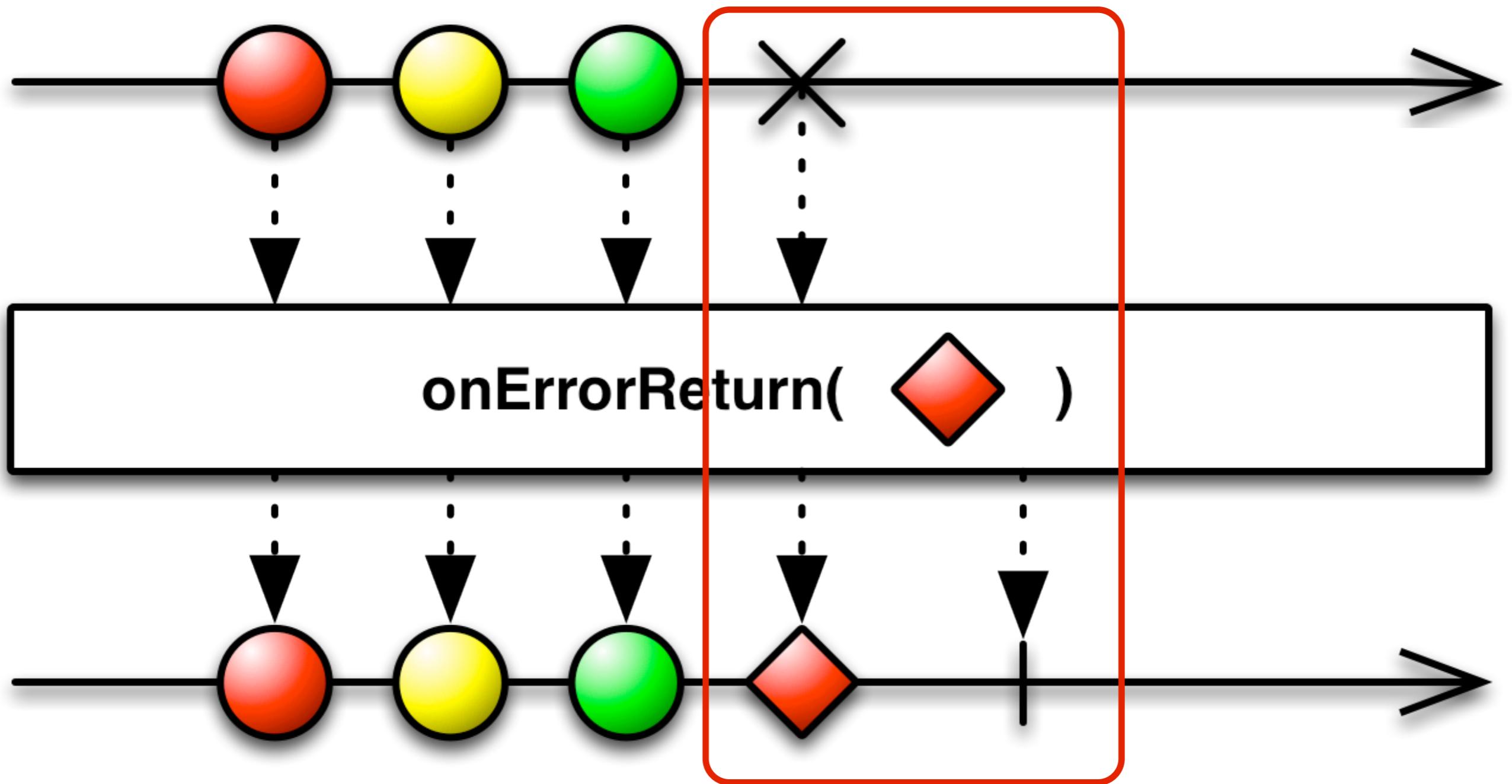
```
Observable<SomeData> a = getDataA();
Observable<String> b = getDataB()
    .onErrorResumeNext(getFallbackForB());
```

```
Observable.zip(a, b, {x, y -> [x, y]})
.subscribe(
    { pair -> println("a: " + pair[0]
        + " b: " + pair[1])},
    { exception -> println("error occurred: "
        + exception.getMessage()))})
```

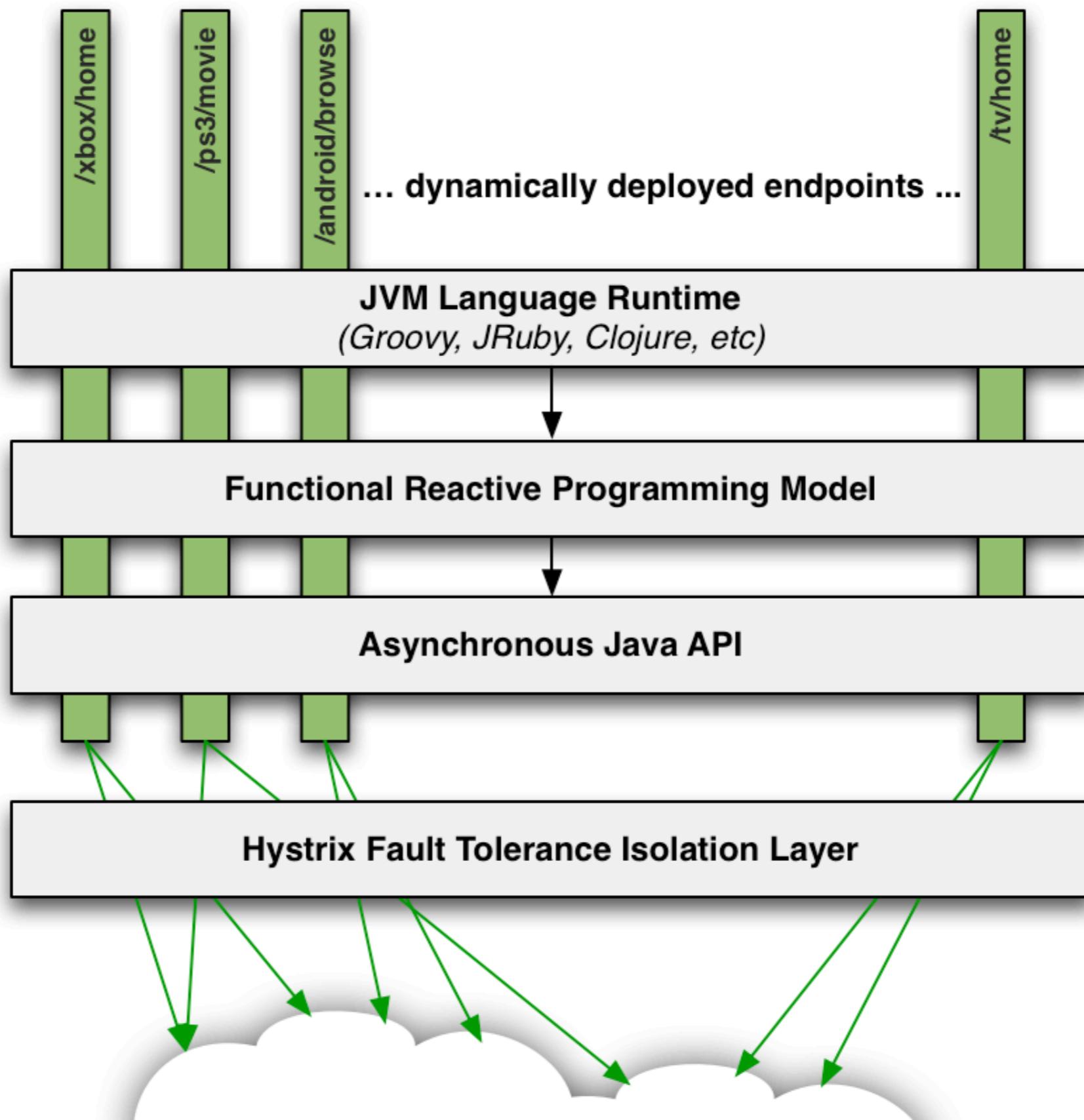
... so the returned Observable emits a single sequence of 5 onNext calls and a successful onCompleted without an onError.

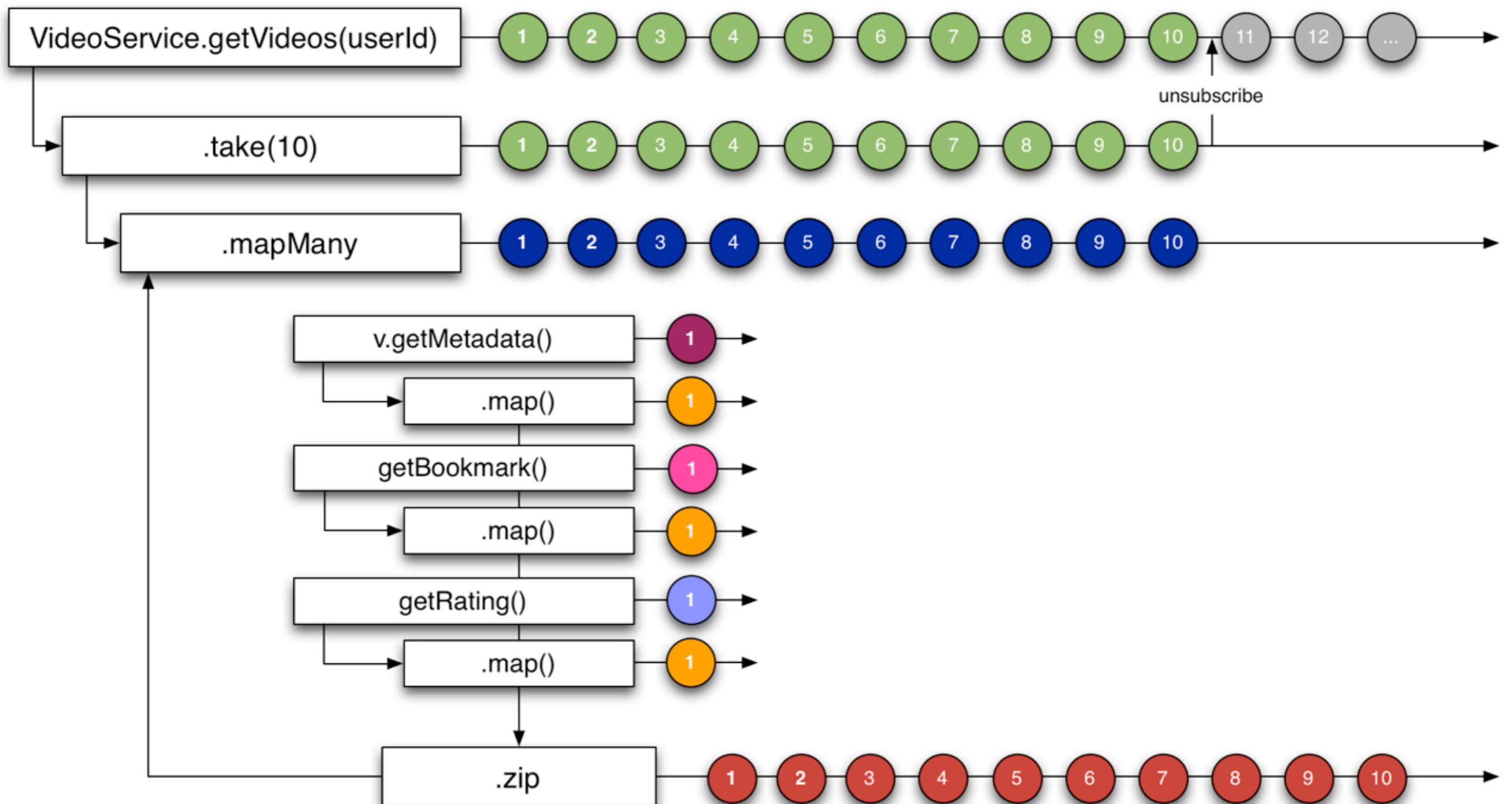


The 'onErrorReturn' operator is similar ...

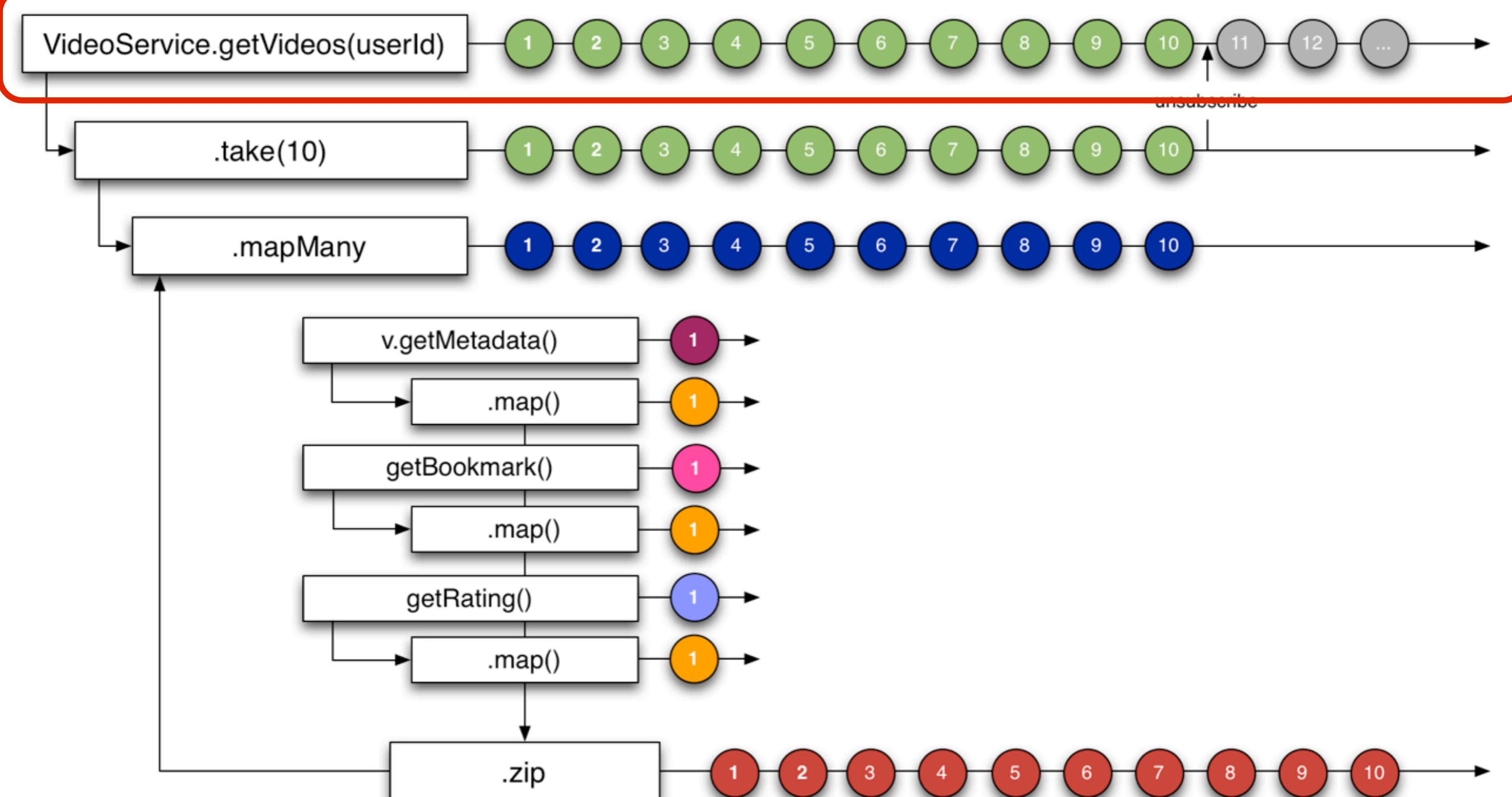


# NETFLIX API USE CASE





[**id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]**]



[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

Observable<Video> emits n videos to onNext()

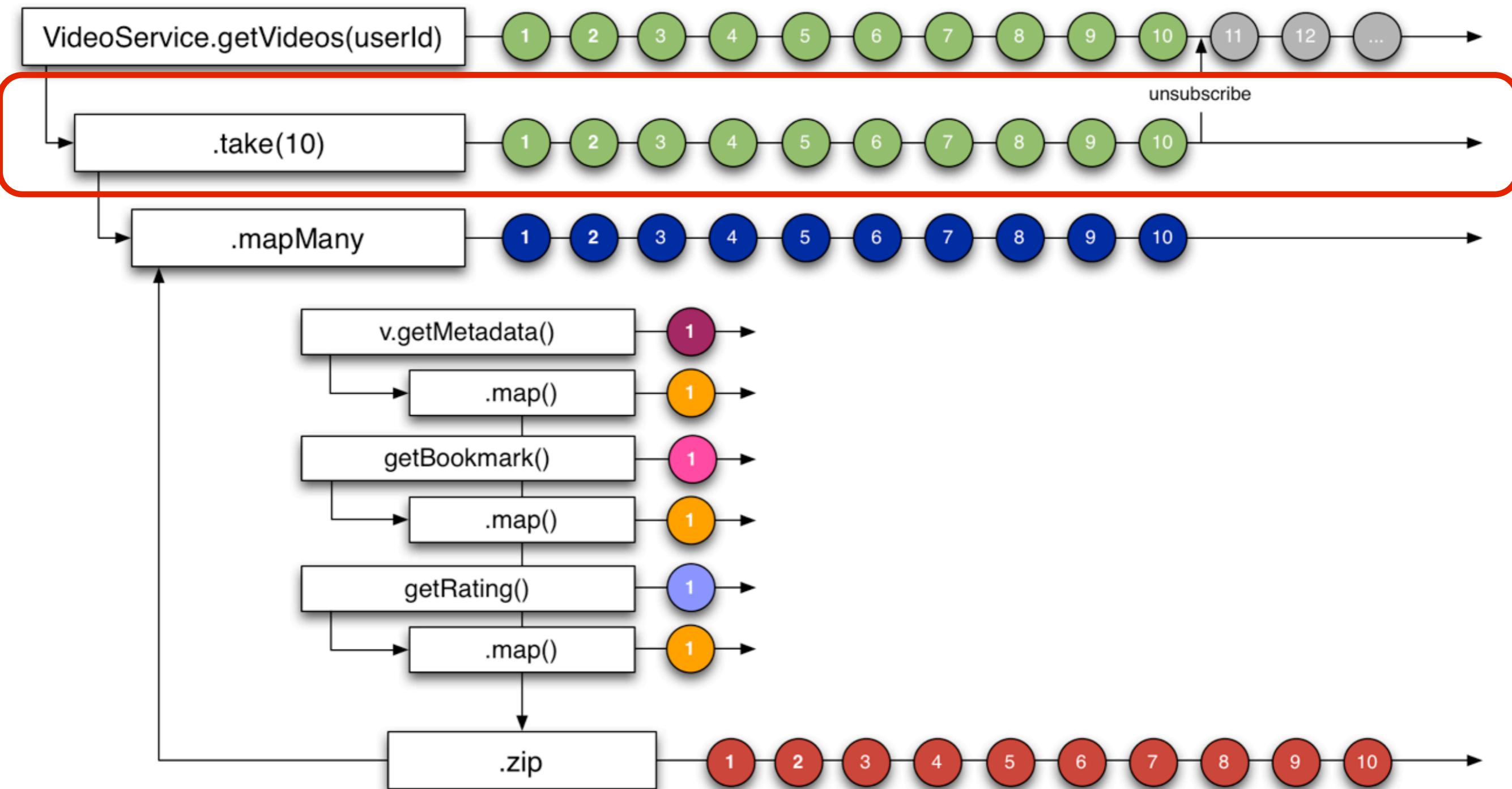
First we start with a request to fetch videos asynchronously ...

```
def Observable<Map> getVideos(userId) {  
    return VideoService.getVideos(userId)  
}  
}
```

Observable<Video> emits n videos to onNext()

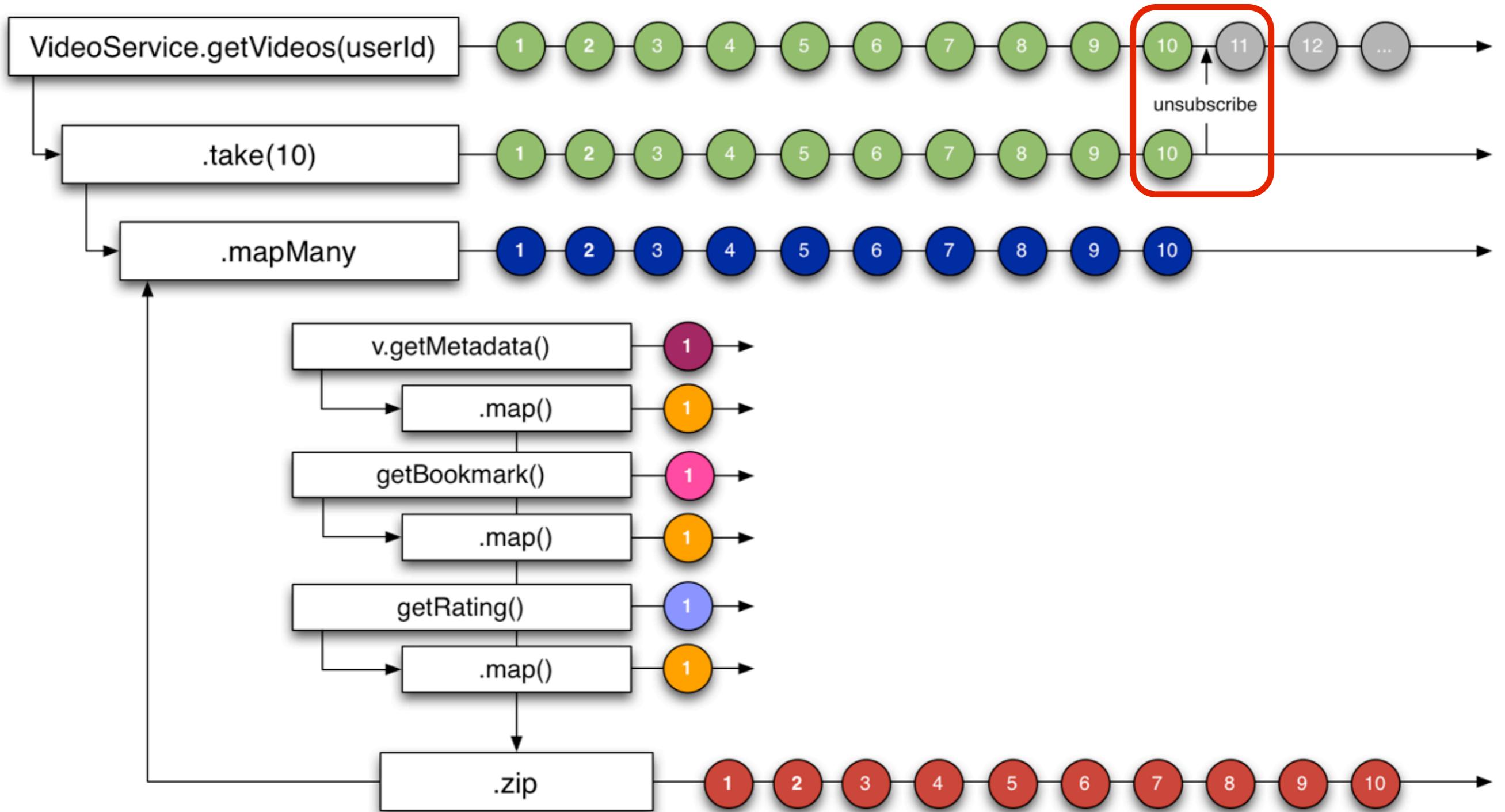
```
def Observable<Map> getVideos(userId) {  
    return VideoService.getVideos(userId)  
        // we only want the first 10 of each list  
        .take(10)  
}
```

Takes first 10 then unsubscribes from origin.  
Returns Observable<Video> that emits 10 Videos.



[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

Takes first 10 then unsubscribes from origin.  
Returns Observable<Video> that emits 10 Videos.



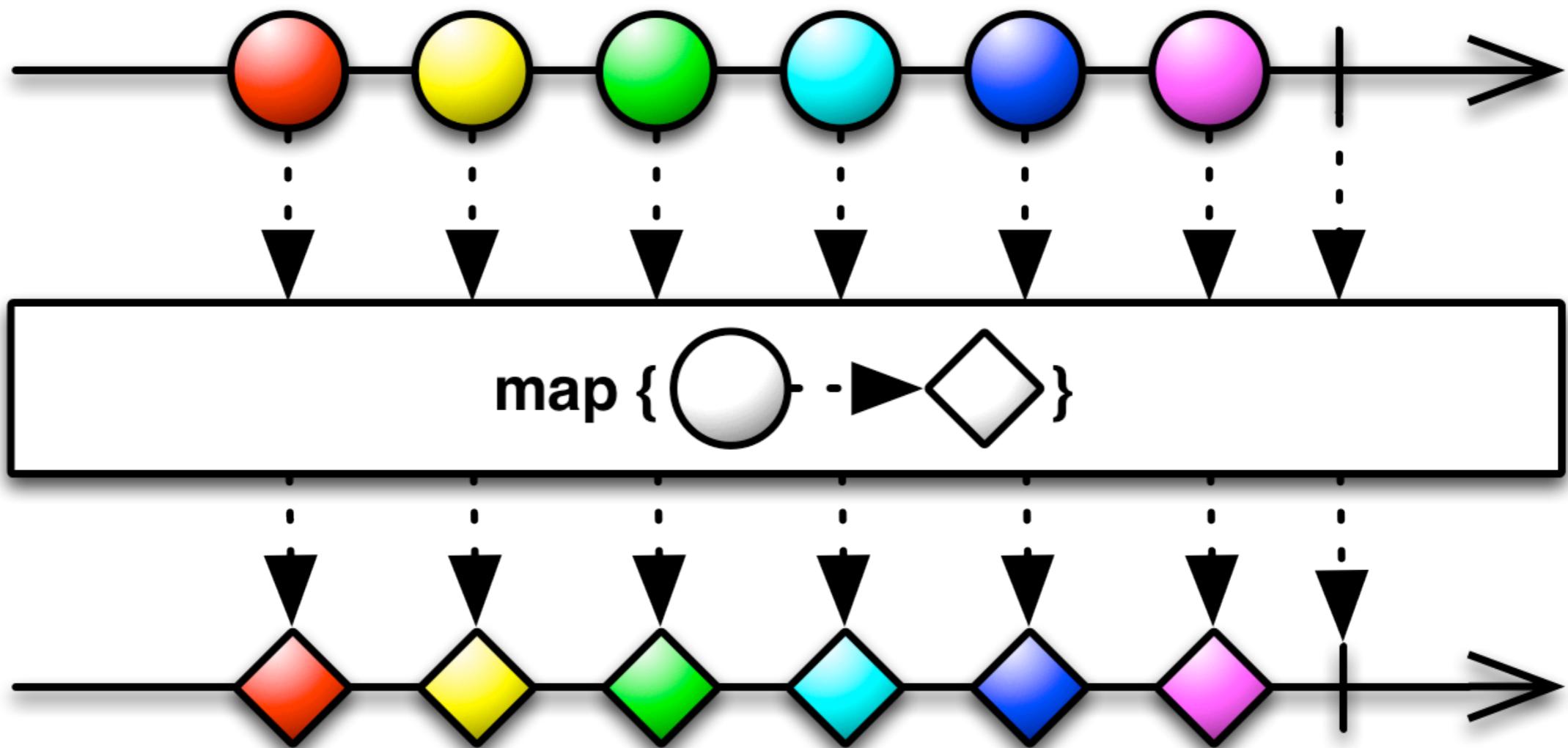
[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

Takes first 10 then unsubscribes from origin.  
Returns Observable<Video> that emits 10 Videos.

```
def Observable<Map> getVideos(userId) {  
    return VideoService.getVideos(userId)  
        // we only want the first 10 of each list  
        .take(10)  
        .map({ Video video ->  
            // transform video object  
        })  
}
```

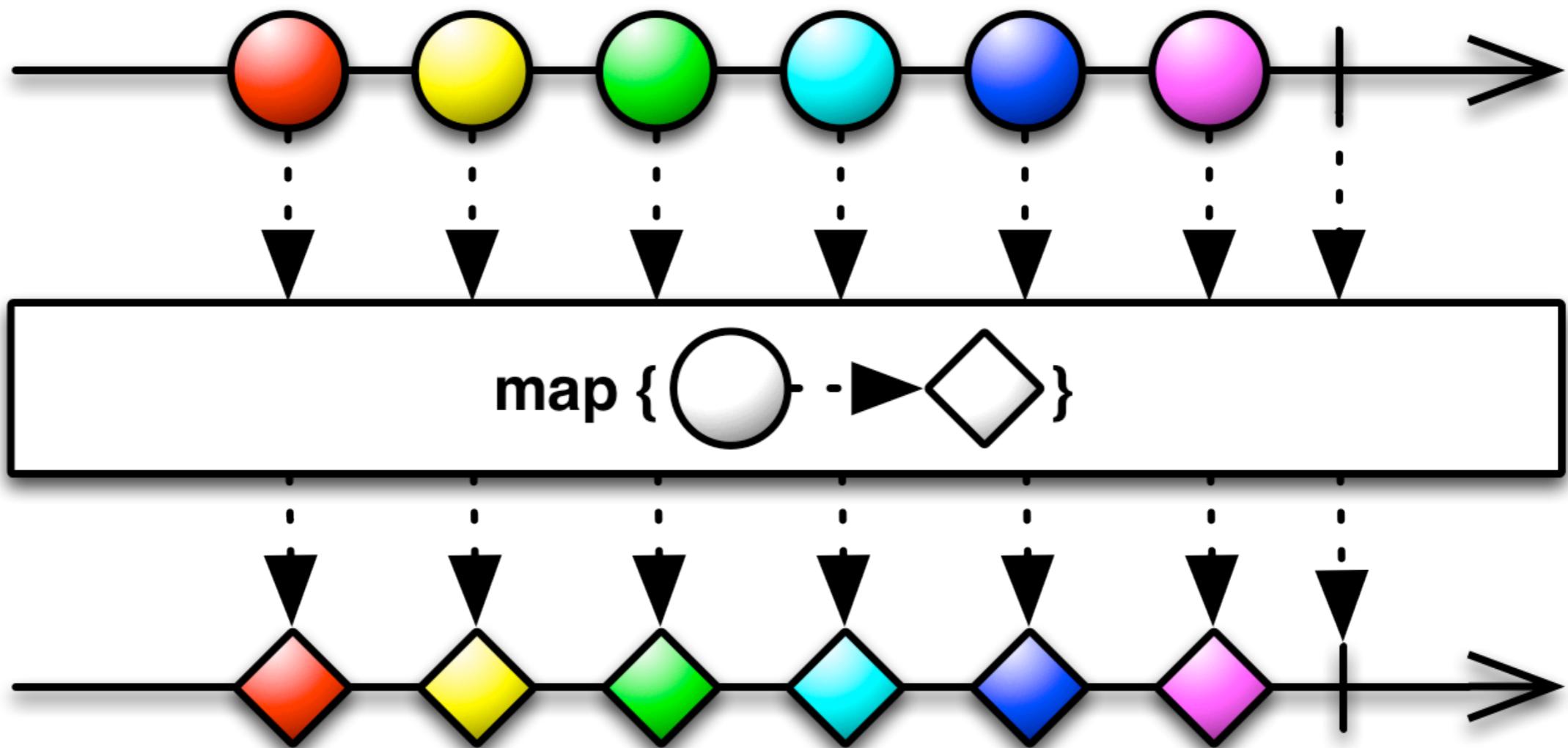
The ‘map’ operator allows transforming the input value into a different output.

We now apply the ‘map’ operator to each of the 10 Video objects we will receive so we can transform from Video to something else.



```
Observable<R> b = Observable<T>.map({ T t ->
    R r = ... transform t ...
    return r;
})
```

The 'map' operator allows transforming from type T to type R.



```
Observable<R> b = Observable<T>.map({ T t ->
    R r = ... transform t ...
    return r;
})
```

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```
def Observable<Map> getVideos(userId) {  
    return VideoService.getVideos(userId)  
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        .take(10)  
        .map({ Video video ->  
            // transform video object  
        })  
}
```

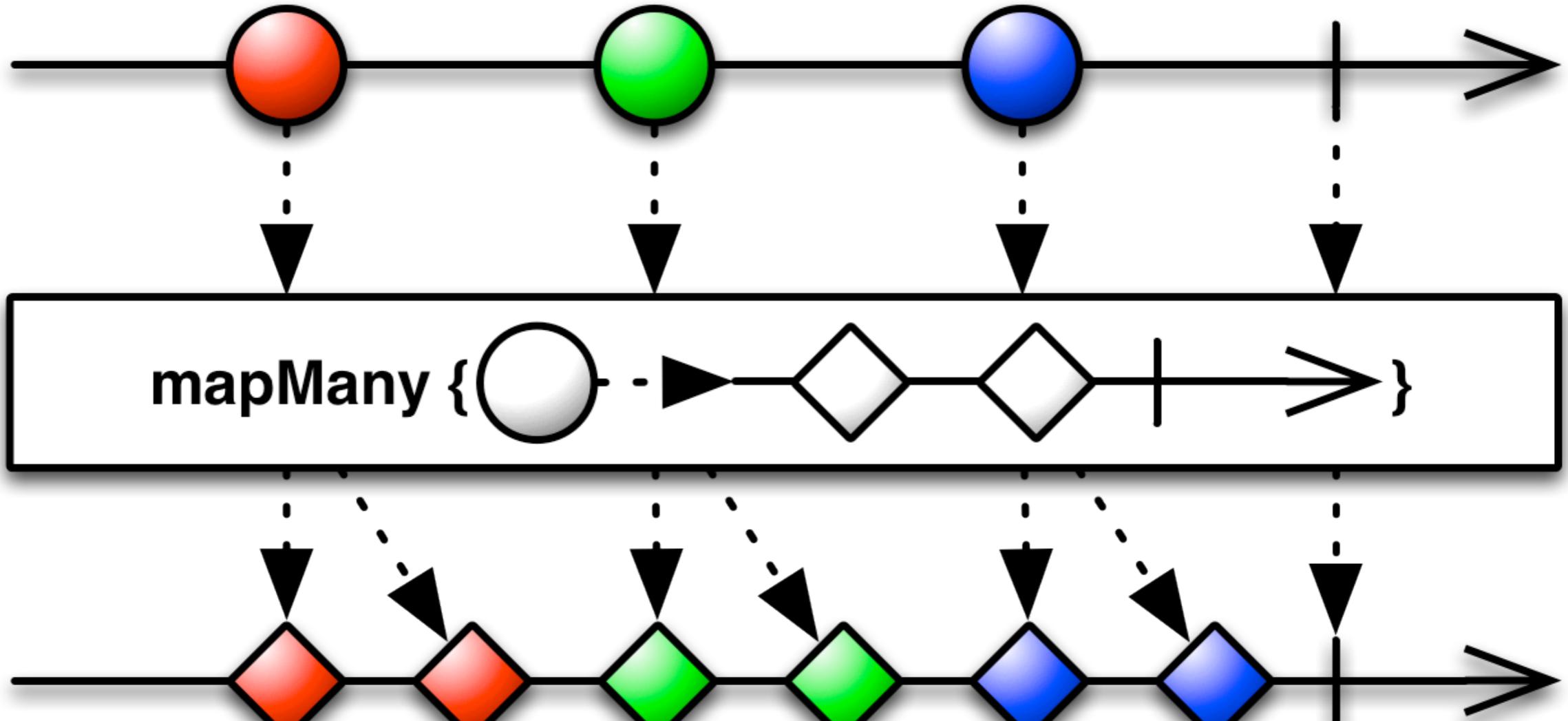
The ‘map’ operator allows transforming the input value into a different output.

```

def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            // for each video we want to fetch metadata
            def m = video.getMetadata()
            .map({ Map<String, String> md ->
                // transform to the data and format we want
                return [title: md.get("title"),
                        length: md.get("duration")]
            })
            // and its rating and bookmark
            def b ...
            def r ...
        })
}

```

We change to ‘mapMany’/‘flatMap’ which is like `merge(map[])` since we will return an `Observable<T>` instead of `T`.

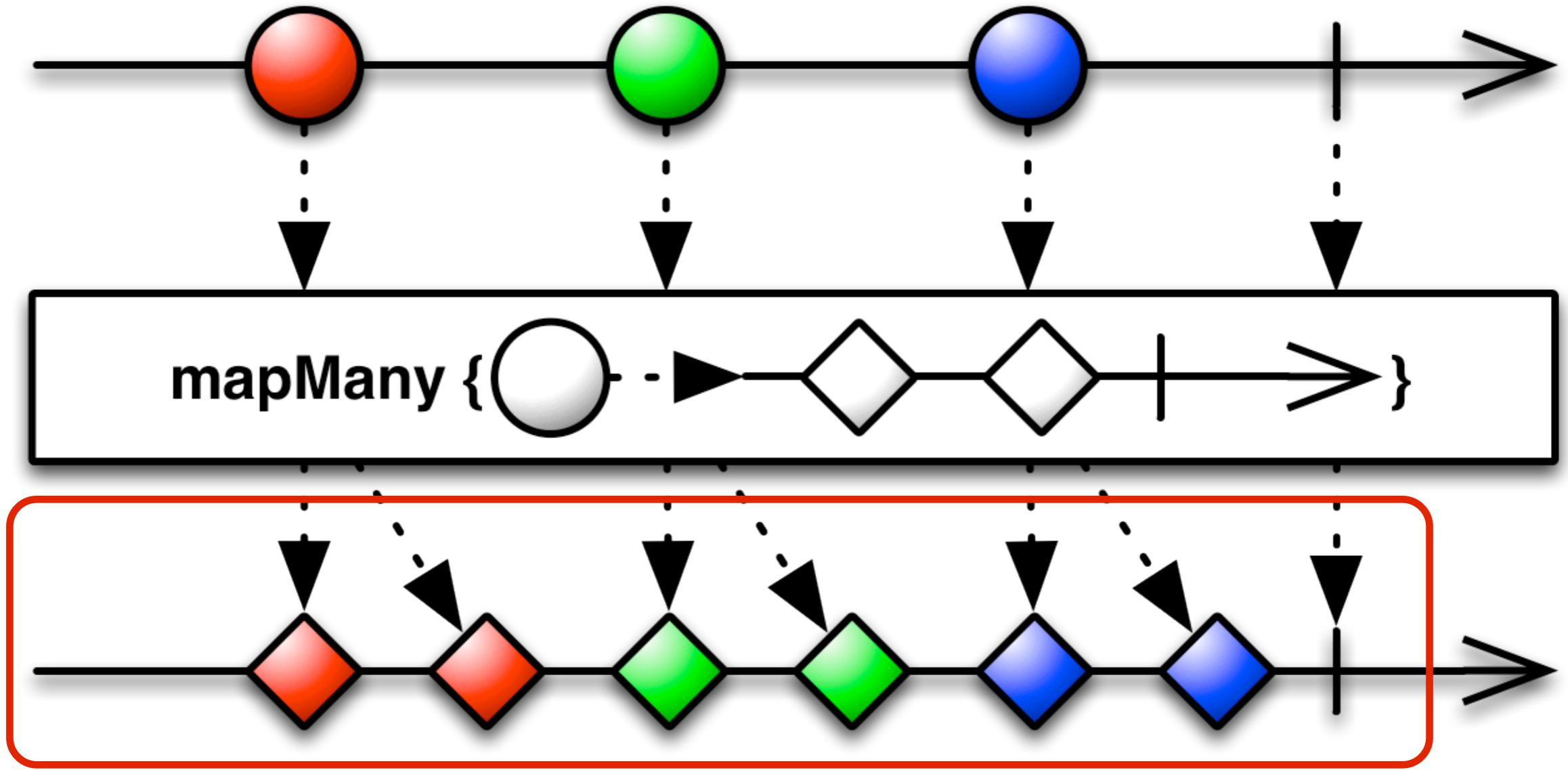


## flatMap

```
Observable<R> b = Observable<T>.mapMany({ T t ->
    Observable<R> r = ... transform t ...
    return r;
})
```

The 'flatMap'/'mapMany' operator allows transforming from type T to type Observable<R>. If 'map' were being used this would result in an Observable<Observable<R>> which is rarely what is wanted, so 'flatMap'/'mapMany' flattens this via 'merge' back into Observable<R>.

This is generally used instead of 'map' anytime nested work is being done that involves fetching and returning other Observables.



```

Observable<R> b = Observable<T>.mapMany({ T t ->
    Observable<R> r = ... transform t ...
    return r;
})

```

```

def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            // for each video we want to fetch metadata
            def m = video.getMetadata()
                .map({ Map<String, String> md ->
                    // transform to the data and format we want
                    return [title: md.get("title"),
                            length: md.get("duration")]
                })
            // and its rating and bookmark
            def b ...
            def r ...
        })
}

```

Nested asynchronous calls  
that return more Observables.

```

def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            // for each video we want to fetch metadata
            def m = video.getMetadata()
                .map({ Map<String, String> md ->
                    // transform to the data and format we want
                    return [title: md.get("title"),
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                })
            // and its rating and bookmark
            def b ...
            def r ...
        })
}

```

Nested asynchronous calls  
that return more Observables.

```

def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
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                .map({ Map<String, String> md ->
                    // transform to the data and format we want
                    return [title: md.get("title"),
                            length: md.get("duration")]
                })
            // and its rating and bookmark
            def b ...
            def r ...
        })
}

```

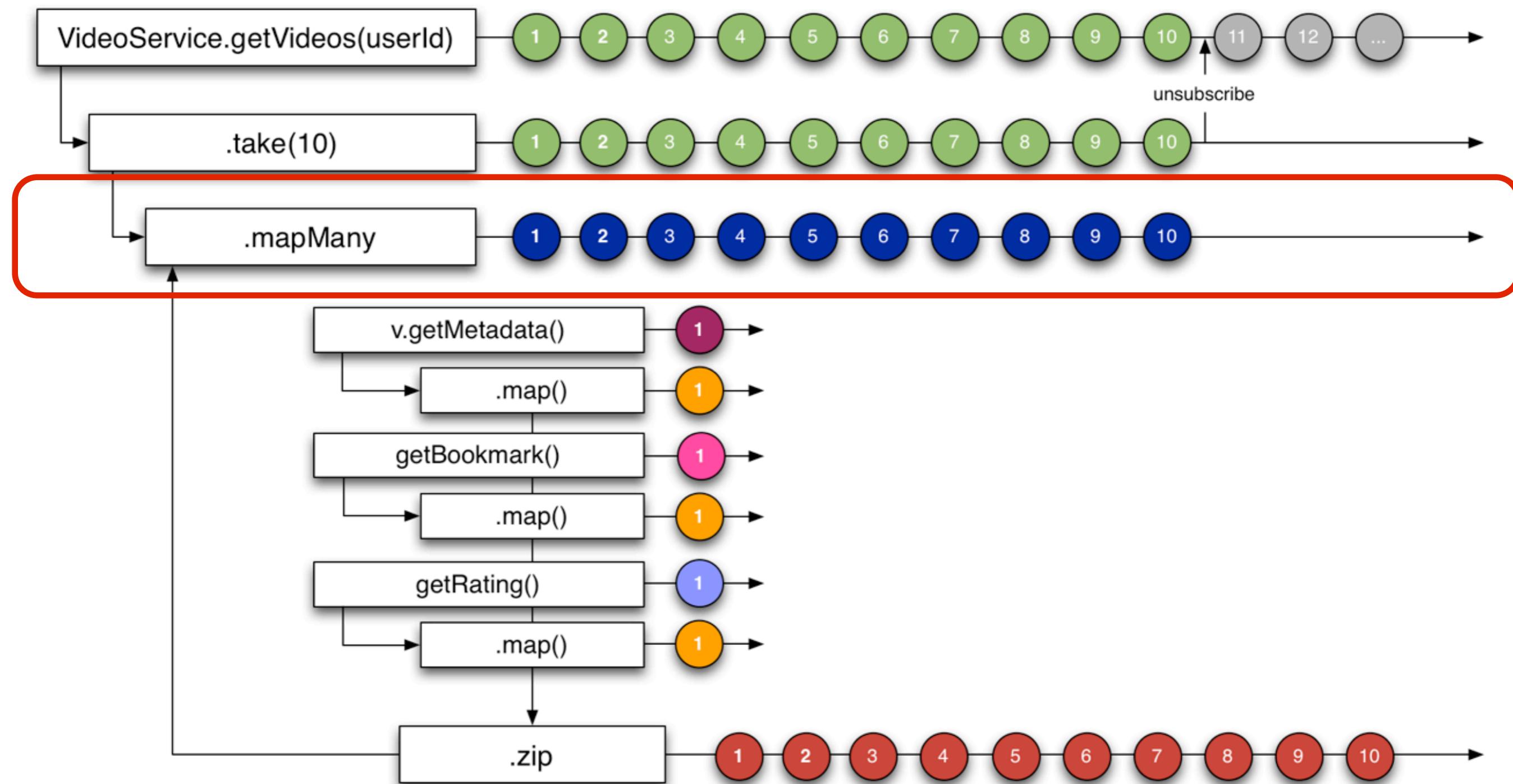
Observable<VideoMetadata>  
 Observable<VideoBookmark>  
 Observable<VideoRating>

```

def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            // for each video we want to fetch metadata
            def m = video.getMetadata()
                .map({ Map<String, String> md ->
                    // transform to the data and format we want
                    return [title: md.get("title"),
                            length: md.get("duration")]
                })
            // and its rating and bookmark
            def b ...
            def r ...
        })
}

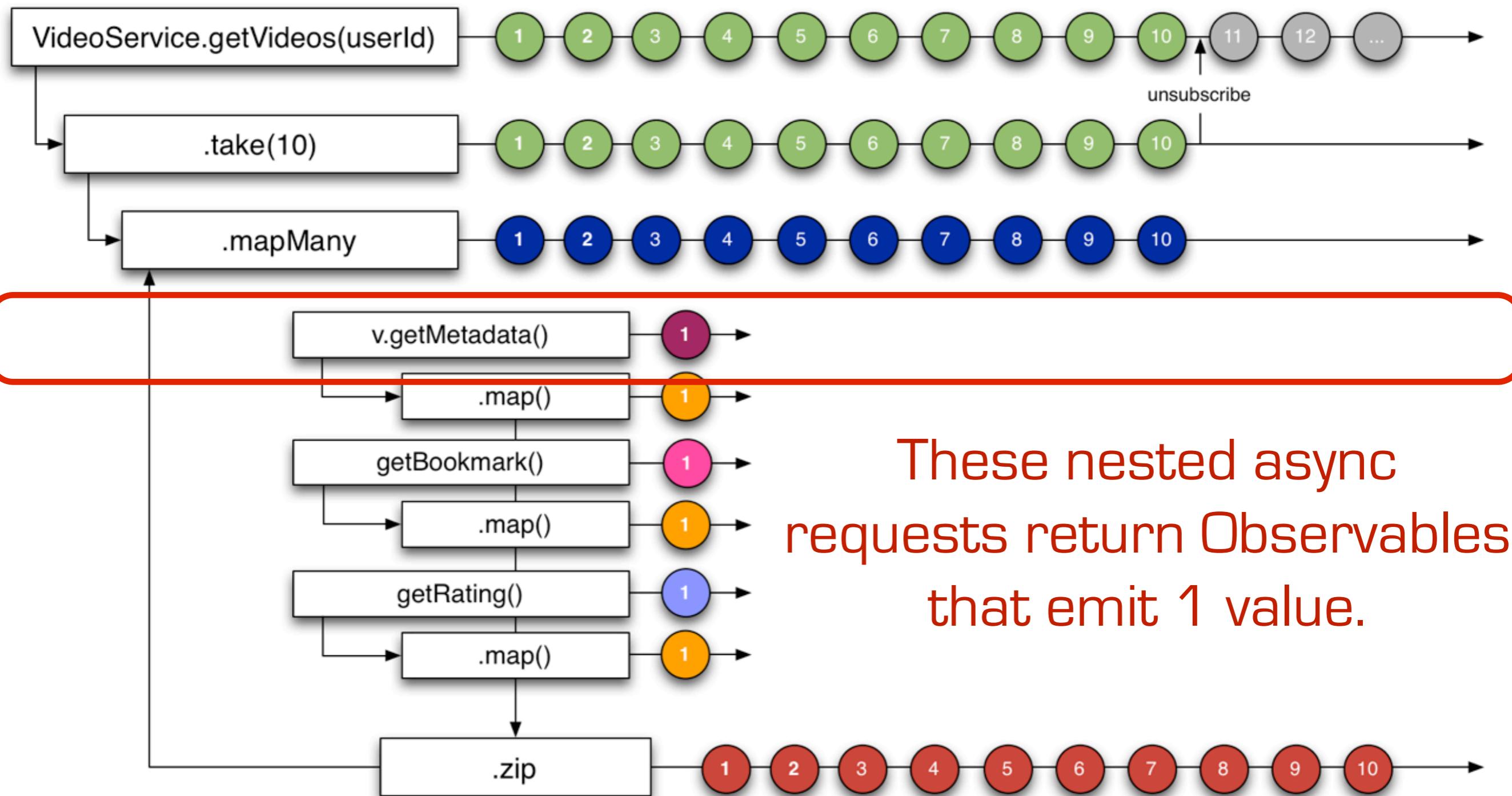
```

Each Observable transforms  
its data using 'map'



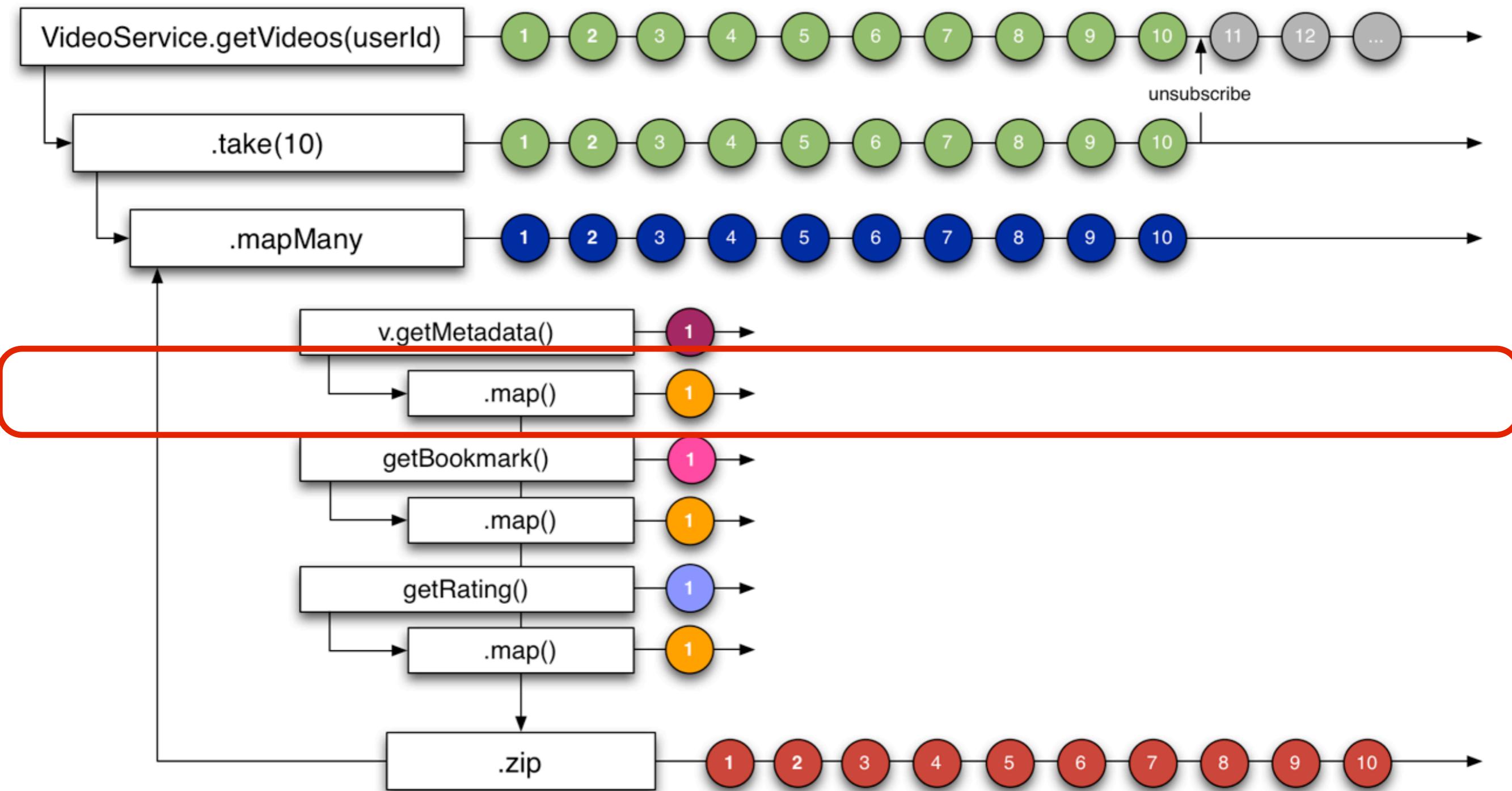
[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

For each of the 10 Video objects it transforms via ‘mapMany’ function that does nested async calls.



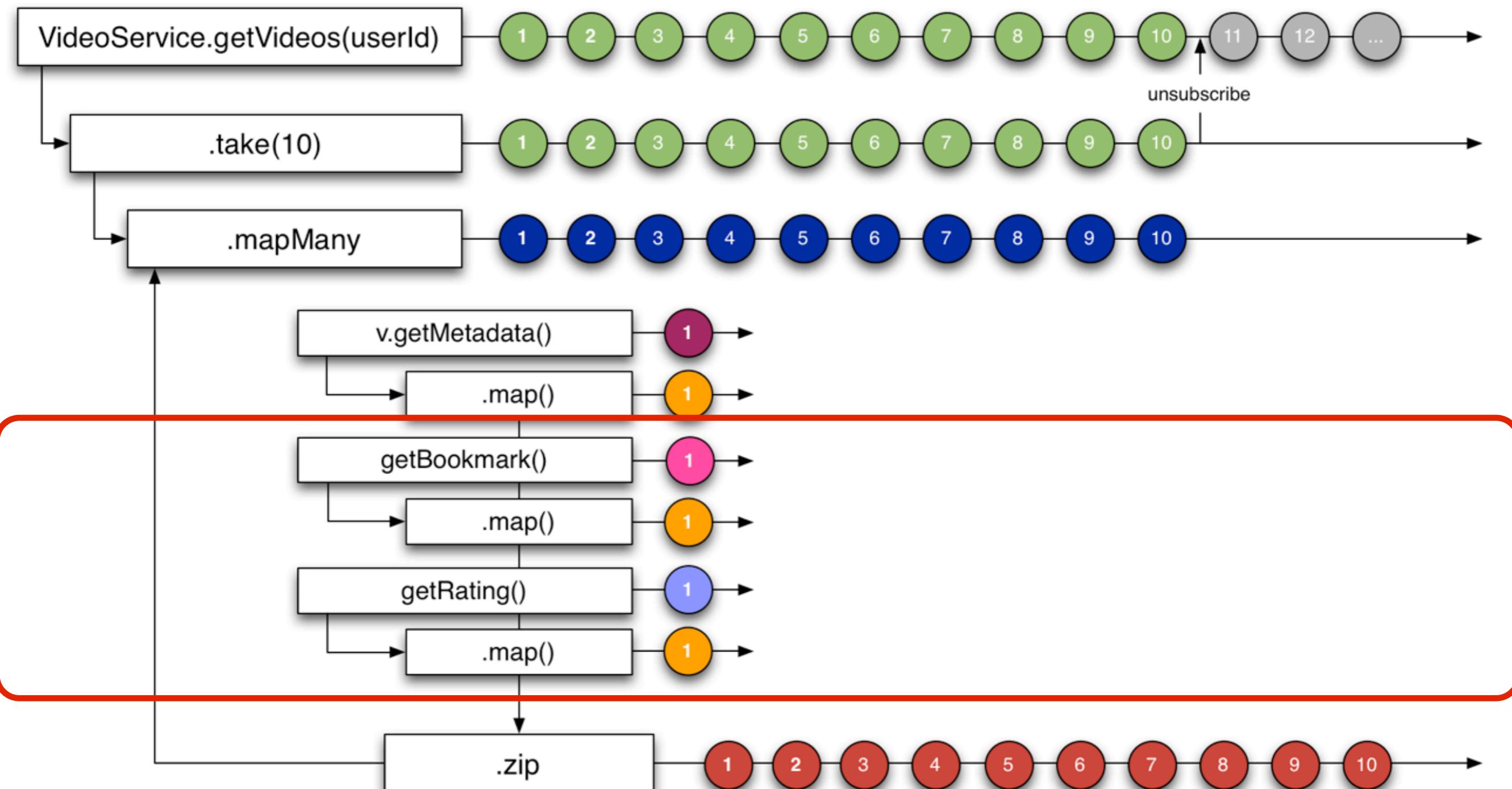
[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

For each Video 'v' it calls `getMetadata()` which returns `Observable<VideoMetadata>`



[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

The Observable<VideoMetadata> is transformed via a 'map' function to return a Map of key/values.



```
[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]
```

Same for Observable<VideoBookmark> and  
Observable<VideoRating>

```
def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            // for each video we want to fetch metadata
            def m = video.getMetadata()
            .map({ Map<String, String> md ->
                // transform to the data and format we want
                return [title: md.get("title"),
                        length: md.get("duration")]
            })
            // and its rating and bookmark
            def b ...
            def r ...
            // compose these together
        })
}
```

```
def Observable<Map> getVideos(userId) {  
    return VideoService.getVideos(userId)  
        // we only want the first 10 of each list  
        .take(10)  
        .flatMap({ Video video ->  
            def m ...  
            def b ...  
            def r ...  
            // compose these together  
        })  
}
```

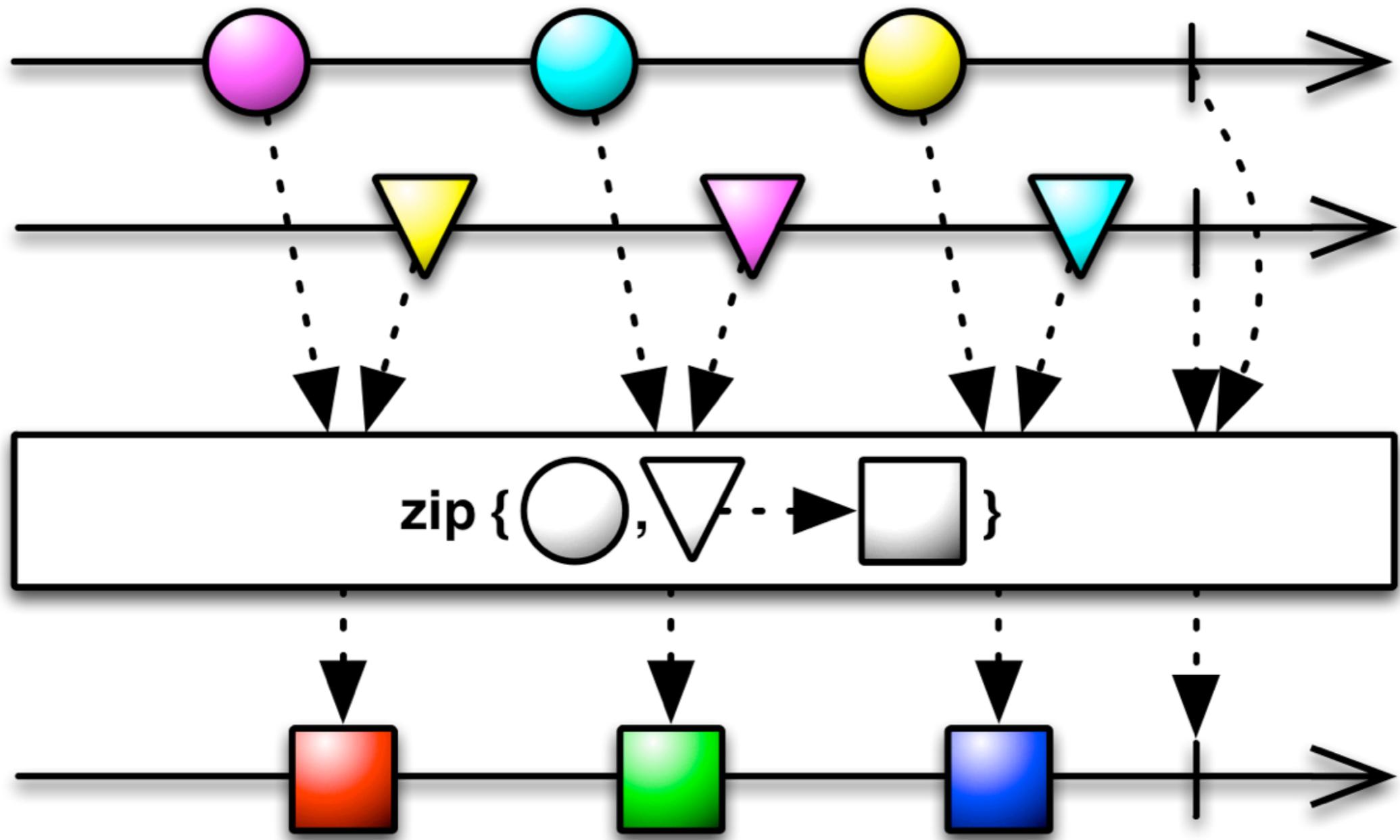
```
def Observable<Map> getVideos(userId) {  
    return VideoService.getVideos(userId)  
        // we only want the first 10 of each list  
        .take(10)  
        .flatMap({ Video video ->  
            def m ...  
            def b ...  
            def r ...  
            // compose these together  
            return Observable.zip(m, b, r, {  
                metadata, bookmark, rating ->  
                // now transform to complete dictionary  
                // of data we want for each Video  
                return [id: video.videoId]  
                    << metadata << bookmark << rating  
            })  
        })  
}
```

```

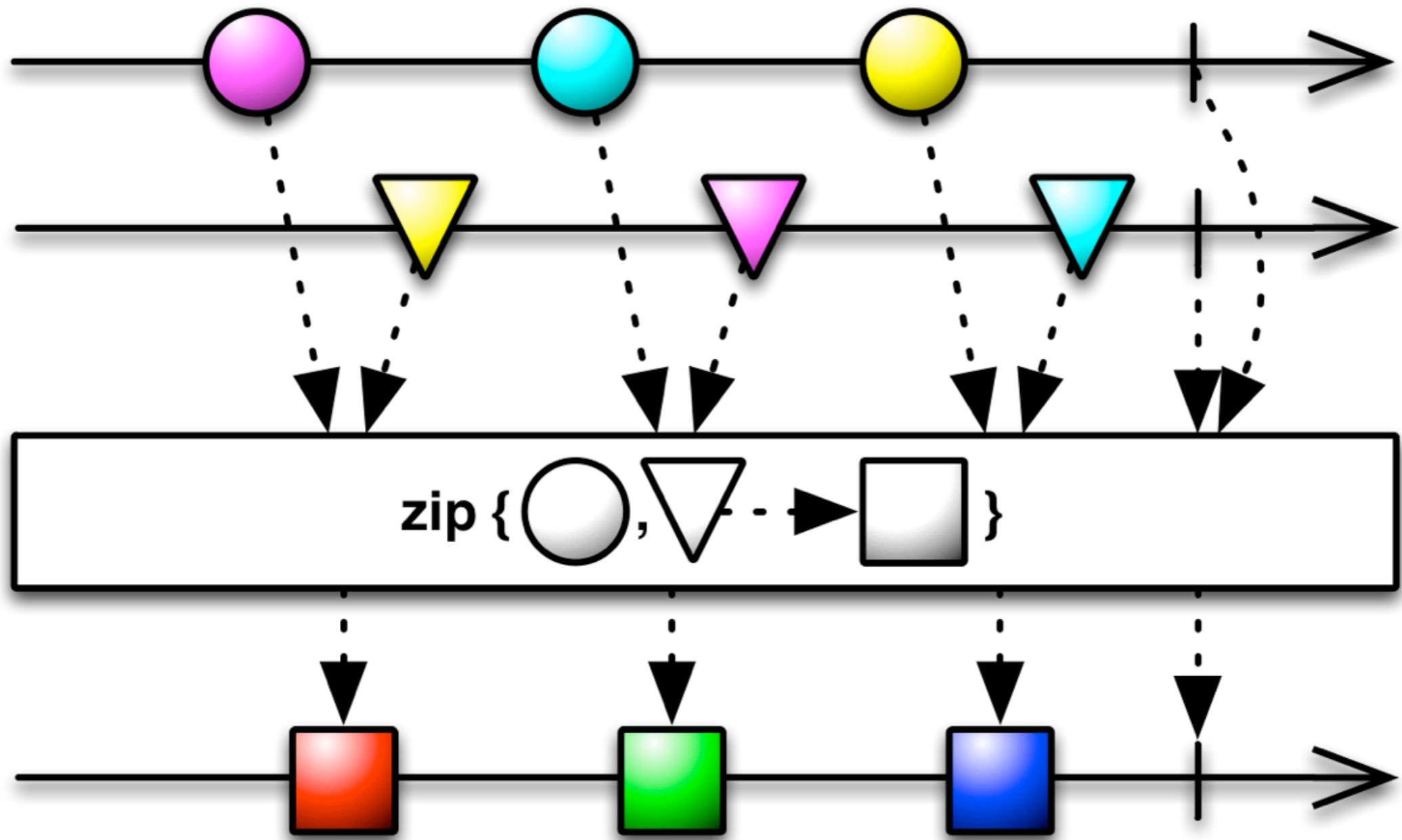
def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
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            def b ...
            def r ...
            // compose these together
            return Observable.zip(m, b, r, {
                metadata, bookmark, rating ->
                // now transform to complete dictionary
                // of data we want for each Video
                return [id: video.videoId]
                    << metadata << bookmark << rating
            })
        })
    }
}

```

The ‘zip’ operator combines the 3 asynchronous Observables into 1



```
Observable.zip(a, b, { a, b, ->
    ... operate on values from both a & b ...
    return [a, b]; // i.e. return tuple
})
```



```
Observable.zip(a, b, { a, b, ->
    ... operate on values from both a & b ...
    return [a, b]; // i.e. return tuple
})
```

```

def Observable<Map> getVideos(userId) {
    return VideoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            def m ...
            def b ...
            def r ...
            // compose these together
            return Observable.zip(m, b, r, {
                metadata, bookmark, rating ->
                // now transform to complete dictionary
                // of data we want for each Video
                return [id: video.videoId]
                    << metadata << bookmark << rating
            })
        })
}

```

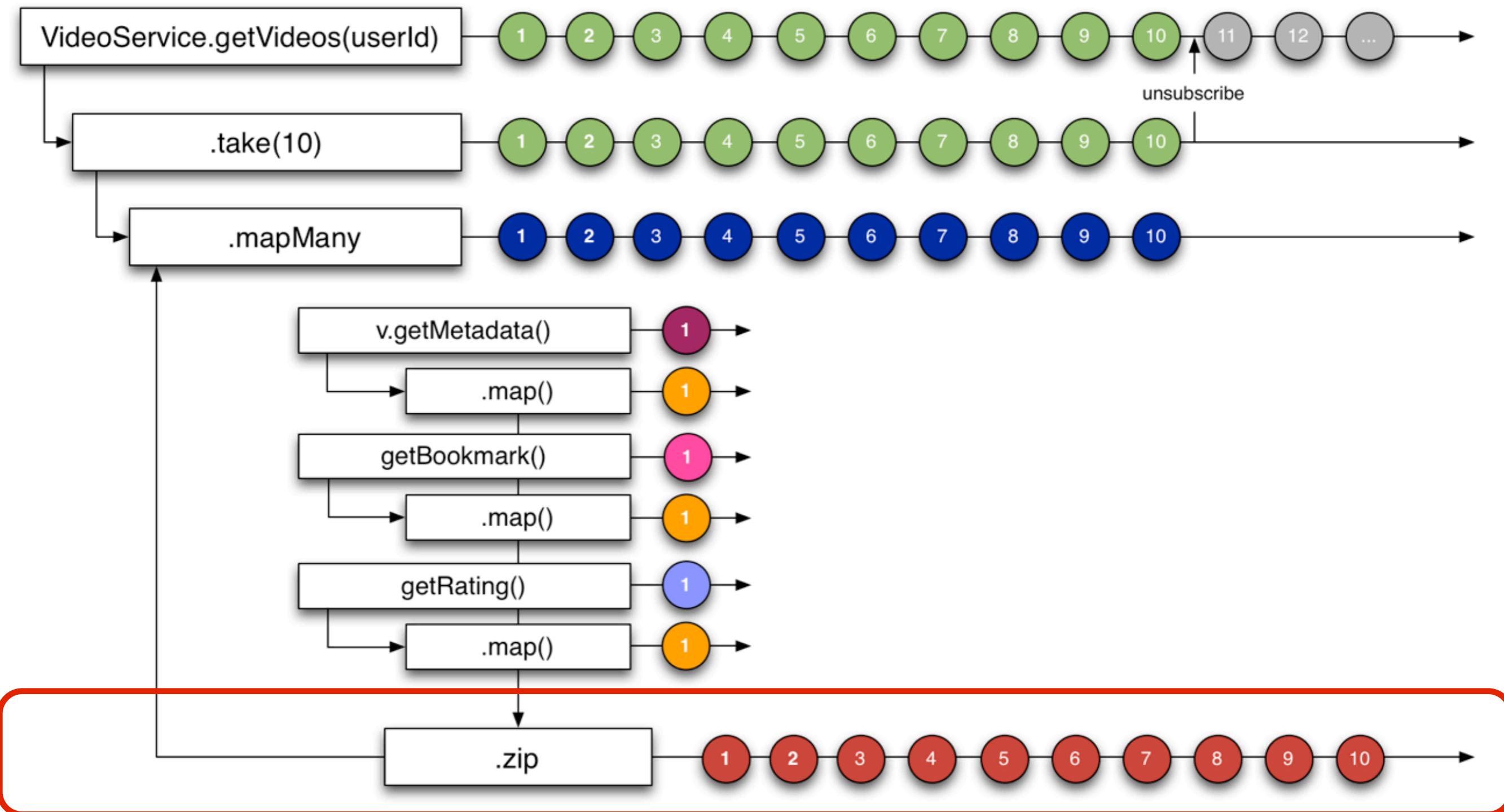
return a single Map (dictionary)  
 of transformed and combined data  
 from 4 asynchronous calls

```

def Observable<Map> getVideos(userId) {
    return videoService.getVideos(userId)
        // we only want the first 10 of each list
        .take(10)
        .flatMap({ Video video ->
            def m ...
            def b ...
            def r ...
            // compose these together
            return Observable.zip(m, b, r, {
                metadata, bookmark, rating ->
                // now transform to complete dictionary
                // of data we want for each Video
                return [id: video.videoId]
                    << metadata << bookmark << rating
            })
        })
}

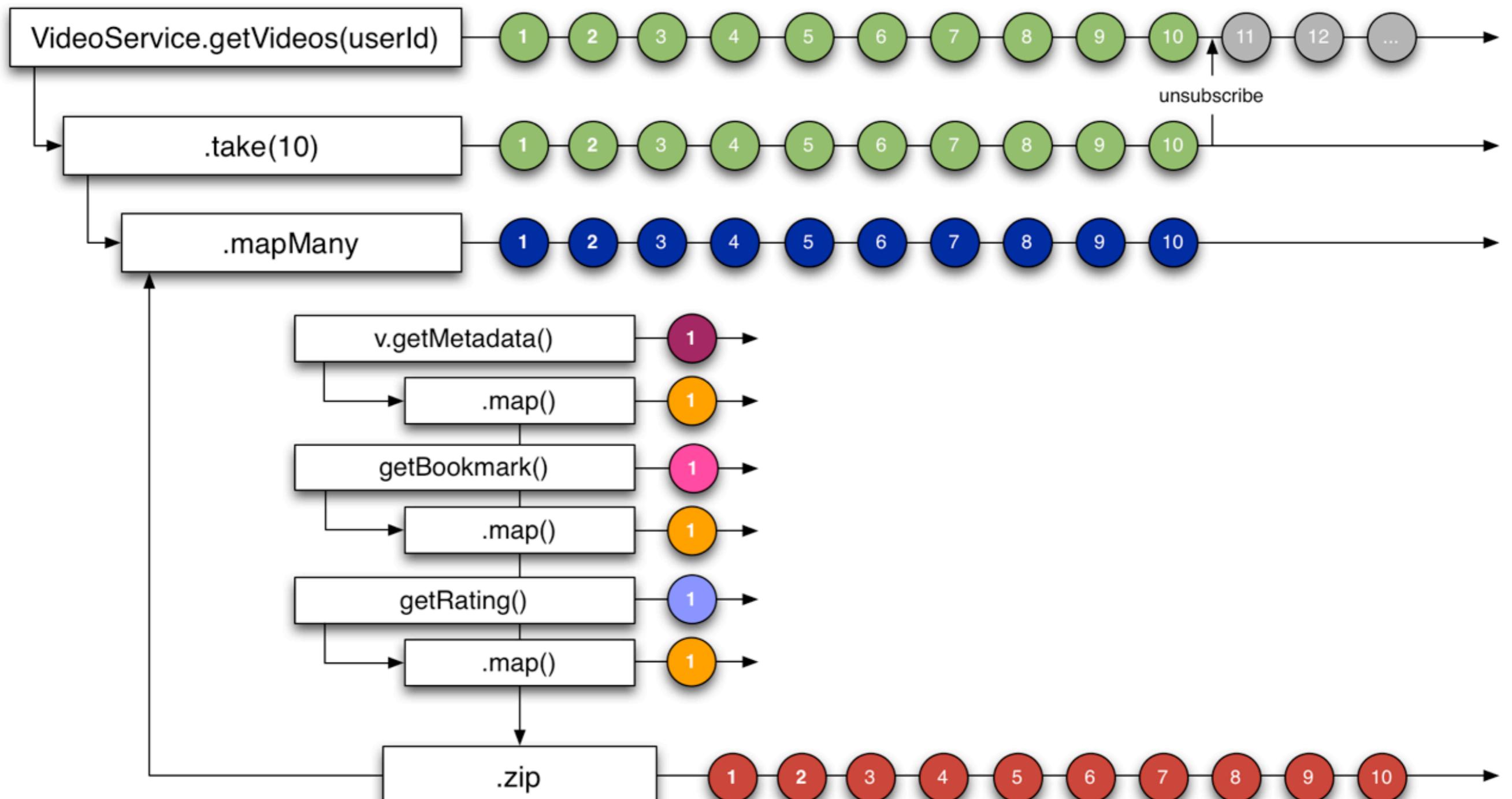
```

return a single Map (dictionary)  
 of transformed and combined data  
 from 4 asynchronous calls



[id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]]

The ‘mapped’ Observables are combined with a ‘zip’ function that emits a Map (dictionary) with all data.

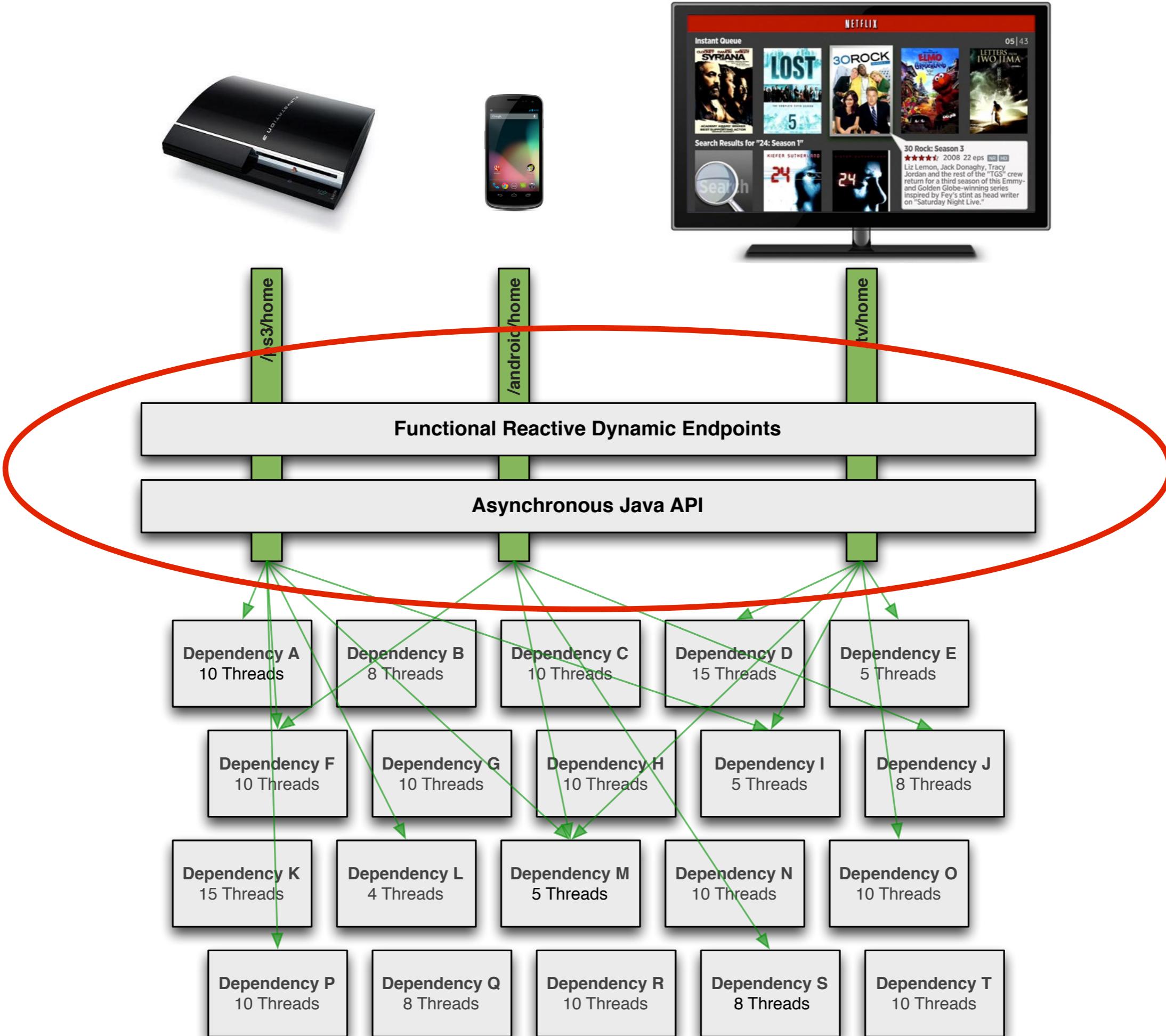


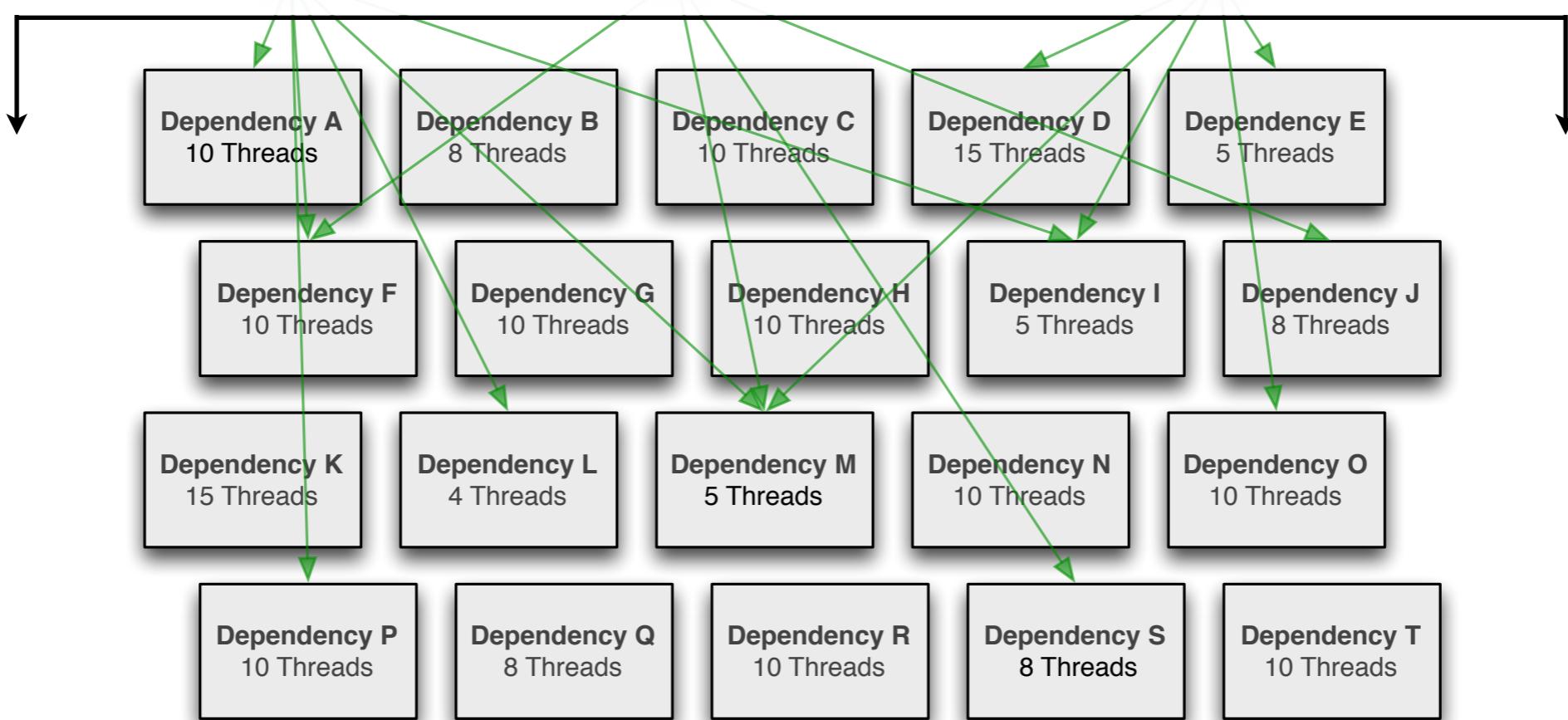
[**id:1000, title:video-1000-title, length:5428, bookmark:0, rating:[actual:4, average:3, predicted:0]**]

The full sequence emits Observable<Map> that emits a Map (dictionary) for each of 10 Videos.

**INTERACTIONS WITH THE API  
ARE ASYNCHRONOUS AND DECLARATIVE.**

**API IMPLEMENTATION CONTROLS  
CONCURRENCY BEHAVIOR.**







```
Observable<User> u = new GetUserCommand(id).observe();
Observable<Geo> g = new GetGeoCommand(request).observe();

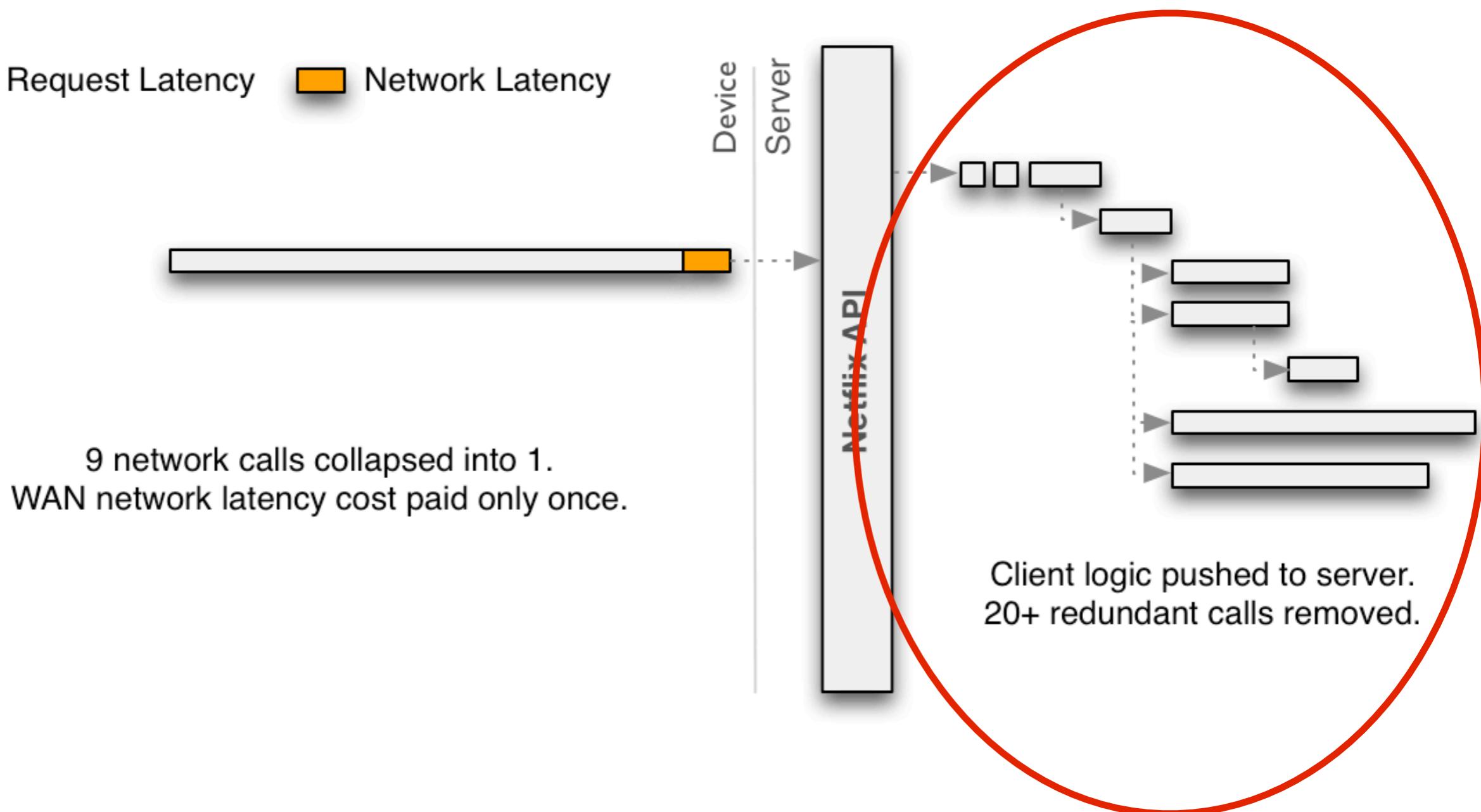
Observable.zip(u, g, {user, geo ->
    return [username: user.getUsername(),
            currentLocation: geo.getCounty()]
})
```

## RxJava coming to Hystrix

<https://github.com/Netflix/Hystrix>

# OBSERVABLE APIs

■ Server Request Latency ■ Network Latency



Looking back, Rx has enabled us to achieve our goals that started us down this path.

# LESSONS LEARNED

## DEVELOPER TRAINING & DOCUMENTATION

138

As we implemented and adopted Rx and enabled dozens of developers (most of them of either Javascript or imperative Java backgrounds) we found that workshops, training sessions and well-written documentation was very helpful in “onboarding” them to the new approach. We have found it generally takes a few weeks to get adjusted to the style.

# **LESSONS LEARNED**

## **DEVELOPER TRAINING & DOCUMENTATION**

### **DEBUGGING AND TRACING**

# **LESSONS LEARNED**

## **DEVELOPER TRAINING & DOCUMENTATION**

### **DEBUGGING AND TRACING**

**ONLY “RULE” HAS BEEN  
“DON’T MUTATE STATE OUTSIDE OF FUNCTION”**

Generally the model has been self-governing (get the code working and all is fine) but there has been one principle to teach since we are using this approach in mutable, imperative languages - don't mutate state outside the lambda/closure/function.

**ASYNCHRONOUS  
VALUES  
EVENTS  
PUSH**

**FUNCTIONAL REACTIVE**

**LAMBDAS  
CLOSURES  
(MOSTLY) PURE  
COMPOSABLE**

The Rx “functional reactive” approach is a powerful and straight-forward abstraction for asynchronously composing values and events and has worked well for the Netflix API.



## **Functional Reactive in the Netflix API with RxJava**

<http://techblog.netflix.com/2013/02/rxjava-netflix-api.html>

## **Optimizing the Netflix API**

<http://techblog.netflix.com/2013/01/optimizing-netflix-api.html>

## **RxJava**

<https://github.com/Netflix/RxJava>  
@RxJava

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