

Java 8 Parallel ImageStreamGang

Example (Part 3)

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Learning Objectives in this Part of the Lesson

- Recognize the structure/functionality of the ImageStreamGang app
- Know how Java 8 parallel streams are applied to the ImageStreamGang app
- Understand the parallel streams implementation of ImageStreamGang

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages =  
        urls  
            .parallelStream()  
            .filter(not(this::urlCached))  
            .map(this::blockingDownload)  
            .flatMap(this::applyFilters)  
            .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

See github.com/douglasraigschmidt/LiveLessons/blob/master/ImageStreamGang

Learning Objectives in this Part of the Lesson

- Recognize the structure/functionality of the ImageStreamGang app
- Know how Java 8 parallel streams are applied to the ImageStreamGang app
- Understand the parallel streams implementation of ImageStreamGang
- Be aware of the pros & cons of the parallel streams solution



See github.com/douglasraigschmidt/LiveLessons/blob/master/ImageStreamGang

Implementing a Parallel Stream in ImageStreamGang

Implementing a Parallel Stream in ImageStreamGang

- We focus on `processStream()` in `ImageStreamParallel.java`

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
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    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

See [imagestreamgang/streams/ImageStreamParallel.java](https://github.com/Netflix/imagestreamgang/tree/master/streams/ImageStreamParallel.java)

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

Get a list of URLs

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

getInput() is defined by the underlying StreamGang framework

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

*Convert a collection
into a parallel stream*

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

Implementing a Parallel Stream in ImageStreamGang

- We focus on `processStream()` in `ImageStreamParallel.java`

Return an output stream consisting of the URLs in the input stream that are not already cached

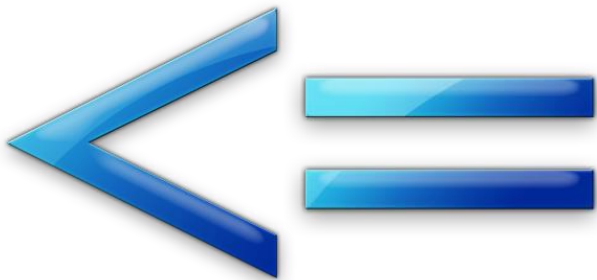
```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```


Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

Return an output stream consisting of the URLs in the input stream that are not already cached

```
void processStream() {  
    List<URL> urls = getInput();  
  
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        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```



of output stream elements will be $\leq$ # of input stream elements

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream()
in ImageStreamParallel.java

```
boolean urlCached(URL url) {  
    return mFilters  
        .stream()  
        .filter(filter ->  
            urlCached(url,  
                filter.getName()))  
        .count() > 0;  
}
```

*Determine whether this url has
been downloaded to an image
& had filters applied to it yet*

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

See [imagestreamgang/streams/ImageStreamGang.java](https://github.com/Netflix/imagestreamgang/blob/master/streams/ImageStreamGang.java)

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
boolean urlCached(URL url,
                  String filterName) {
    File file =
        new File(getPath(),
                 filterName);

    File imageFile =
        new File(file,
                 getNameForUrl(url));

    return imageFile.exists();
}
```

```
void processStream() {
    List<URL> urls = getInput();

    List<Image> filteredImages = urls
        .parallelStream()
        .filter(not(this::urlCached))
        .map(this::blockingDownload)
        .flatMap(this::applyFilters)
        .collect(toList());

    System.out.println(TAG
        + "Image(s) filtered = "
        + filteredImages.size());
}
```

Check if a file with this name already exists

See [imagestreamgang/streams/ImageStreamGang.java](https://github.com/Netflix/imagestreamgang/blob/master/streams/ImageStreamGang.java)

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java



```
void processStream() {  
    List<URL> urls = getInput();  
  
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        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

There are clearly better ways of implementing an image cache!

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

Return an output stream consisting of the images that were downloaded from the URLs in the input stream

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
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}
```

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

Return an output stream consisting of the images that were downloaded from the URLs in the input stream



```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

of output stream elements must match the # of input stream elements

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
Image blockingDownload
    (URL url) {
    return BlockingTask
        .callInManagedBlocker
        (() ->
            downloadImage(url));
}
```

*Downloads content from a url
& converts it into an image*

```
void processStream() {
    List<URL> urls = getInput();

    List<Image> filteredImages = urls
        .parallelStream()
        .filter(not(this::urlCached))
        .map(this::blockingDownload)
        .flatMap(this::applyFilters)
        .collect(toList());

    System.out.println(TAG
        + "Image(s) filtered = "
        + filteredImages.size());
}
```

See [imagestreamgang/streams/ImageStreamParallel.java](https://github.com/Netflix/imagestreamgang/tree/master/streams/ImageStreamParallel.java)

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
Image blockingDownload
    (URL url) {
    return BlockingTask
        .callInManagedBlocker
        (() ->
            downloadImage(url));
}
```

Uses a "managed blocker" to ensure sufficient threads are in the common fork-join pool

```
void processStream() {
    List<URL> urls = getInput();

    List<Image> filteredImages = urls
        .parallelStream()
        .filter(not(this::urlCached))
        .map(this::blockingDownload)
        .flatMap(this::applyFilters)
        .collect(toList());

    System.out.println(TAG
        + "Image(s) filtered = "
        + filteredImages.size());
}
```

We covered BlockingTask.callInManagedBlocker() earlier in this course

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
Image blockingDownload
    (URL url) {
    return BlockingTask
        .callInManagedBlocker
        (() ->
            downloadImage(url));
}
```

I/O-bound tasks on an N-core CPU typically run best with $N \cdot (1 + WT/ST)$ threads (WT = wait time & ST = service time)

```
void processStream() {
    List<URL> urls = getInput();

    List<Image> filteredImages = urls
        .parallelStream()
        .filter(not(this::urlCached))
        .map(this::blockingDownload)
        .flatMap(this::applyFilters)
        .collect(toList());

    System.out.println(TAG
        + "Image(s) filtered = "
        + filteredImages.size());
}
```

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

Return an output stream containing the results of applying a list of filters to each image in the input stream & storing the results in the file system

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

See docs.oracle.com/javase/8/docs/api/java/util/stream/Stream.html#flatMap

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

Return an output stream containing the results of applying a list of filters to each image in the input stream & storing the results in the file system



of output stream elements may differ from the # of input stream elements

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
Stream<Image> applyFilters
    (Image image) {
    return mFilters
        .parallelStream()
        .map(filter ->
            makeFilterWithImage
            (filter,
             image).run())
}
```

Apply all filters to an image in parallel & store on the device

```
void processStream() {
    List<URL> urls = getInput();

    List<Image> filteredImages = urls
        .parallelStream()
        .filter(not(this::urlCached))
        .map(this::blockingDownload)
        .flatMap(this::applyFilters)
        .collect(toList());

    System.out.println(TAG
        + "Image(s) filtered = "
        + filteredImages.size());
}
```

See [imagestreamgang/streams/ImageStreamParallel.java](https://github.com/GoogleCloudPlatform/java-examples/blob/master/imagestreamgang/streams/ImageStreamParallel.java)

Implementing a Parallel Stream in ImageStreamGang

- We focus on `processStream()` in `ImageStreamParallel.java`

collect() is a "reduction" operation that combines elements into one result

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

See docs.oracle.com/javase/8/docs/api/java/util/stream/Stream.html#collect

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
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        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

Trigger all intermediate operations

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

*Create a list containing all
the filtered & stored images*

Implementing a Parallel Stream in ImageStreamGang

- We focus on processStream() in ImageStreamParallel.java

```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
        .parallelStream()  
        .filter(not(this::urlCached))  
        .map(this::blockingDownload)  
        .flatMap(this::applyFilters)  
        .collect(toList());  
  
    System.out.println(TAG  
        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

*Logs the # of images that were
downloaded, filtered, & stored*

Pros of the Java 8 Parallel Streams Solution

Pros of the Java 8 Parallel Streams Solution

- The parallel stream version is faster than the sequential streams version

Starting ImageStreamGangTest

Printing results for input 1 from fastest to slowest

COMPLETABLE_FUTURES_2 executed in 276 msecs

COMPLETABLE_FUTURES_1 executed in 285 msecs

PARALLEL_STREAM executed in 383 msecs

SEQUENTIAL_STREAM executed in 1288 msecs

Printing results for input 2 from fastest to slowest

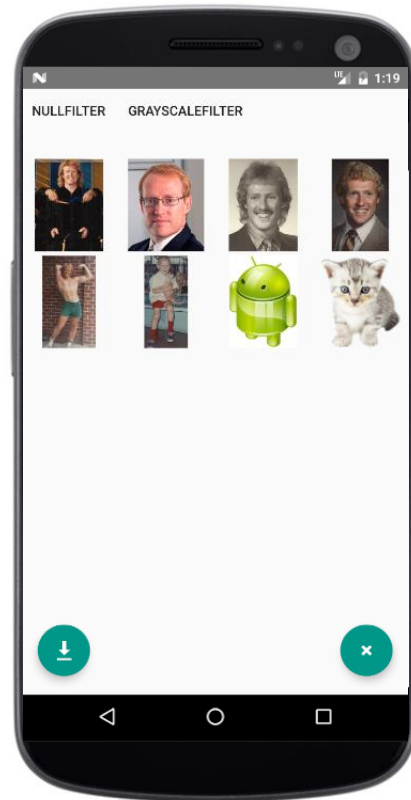
COMPLETABLE_FUTURES_1 executed in 137 msecs

COMPLETABLE_FUTURES_2 executed in 138 msecs

PARALLEL_STREAM executed in 170 msecs

SEQUENTIAL_STREAM executed in 393 msecs

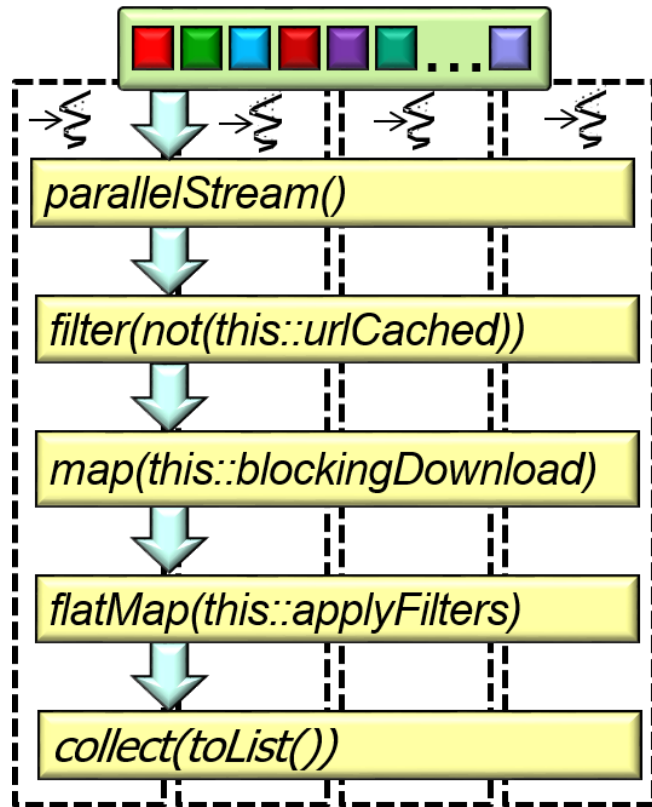
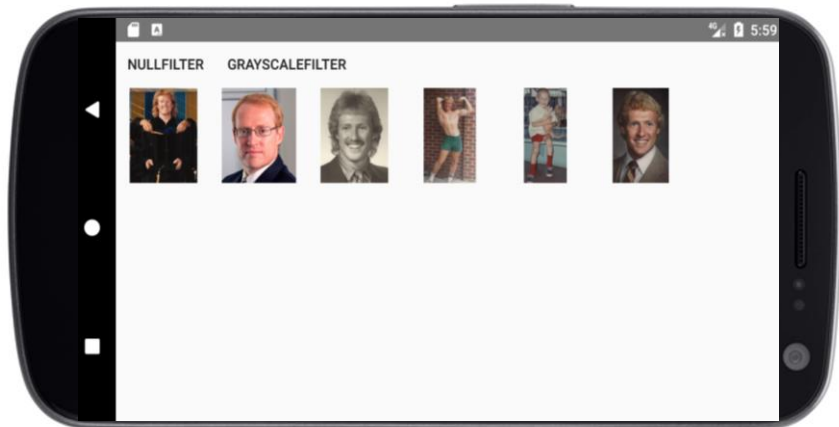
Ending ImageStreamGangTest



The performance speedup isn't quite linear on my quad-core computer

Pros of the Java 8 Parallel Streams Solution

- The parallel stream version is faster than the sequential streams version
 - e.g., images are downloaded & processed in parallel on multiple cores



Pros of the Java 8 Parallel Streams Solution

- The solution is relatively straight forward to understand



```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
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        .flatMap(this::applyFilters)  
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    System.out.println(TAG  
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}
```

Pros of the Java 8 Parallel Streams Solution

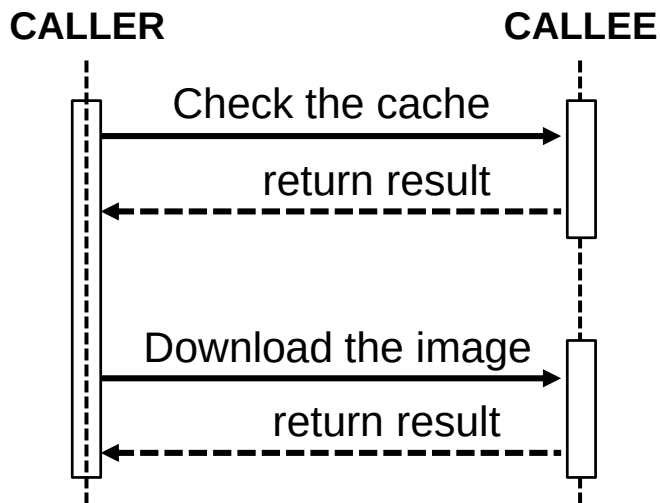
- The solution is relatively straight forward to understand, e.g.
- The behaviors map cleanly onto the design intent



```
void processStream() {  
    List<URL> urls = getInput();  
  
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        + filteredImages.size());  
}
```

Pros of the Java 8 Parallel Streams Solution

- The solution is relatively straight forward to understand, e.g.
- The behaviors map cleanly onto the design intent
- Behaviors are all synchronous



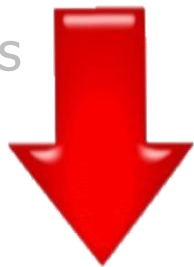
```
void processStream() {
    List<URL> urls = getInput();

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        .parallelStream()
        .filter(not(this::urlCached))
        .map(this::blockingDownload)
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        .collect(toList());

    System.out.println(TAG
        + "Image(s) filtered = "
        + filteredImages.size());
}
```

Pros of the Java 8 Parallel Streams Solution

- The solution is relatively straight forward to understand, e.g.
- The behaviors map cleanly onto the design intent
- Behaviors are all synchronous
- The flow of control can be read “linearly”



```
void processStream() {  
    List<URL> urls = getInput();  
  
    List<Image> filteredImages = urls  
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        .filter(not(this::urlCached))  
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        + "Image(s) filtered = "  
        + filteredImages.size());  
}
```

Cons of the Java 8 Parallel Streams Solution

Cons of the Java 8 Parallel Streams Solution

- The completable futures versions are faster than the parallel streams version

Starting ImageStreamGangTest

Printing results for input 1 from fastest to slowest

COMPLETABLE_FUTURES_2 executed in 276 msecs

COMPLETABLE_FUTURES_1 executed in 285 msecs

PARALLEL_STREAM executed in 383 msecs

SEQUENTIAL_STREAM executed in 1288 msecs

Printing results for input 2 from fastest to slowest

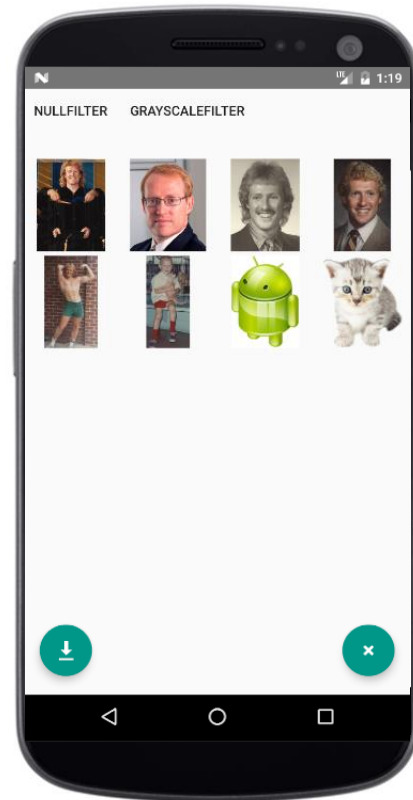
COMPLETABLE_FUTURES_1 executed in 137 msecs

COMPLETABLE_FUTURES_2 executed in 138 msecs

PARALLEL_STREAM executed in 170 msecs

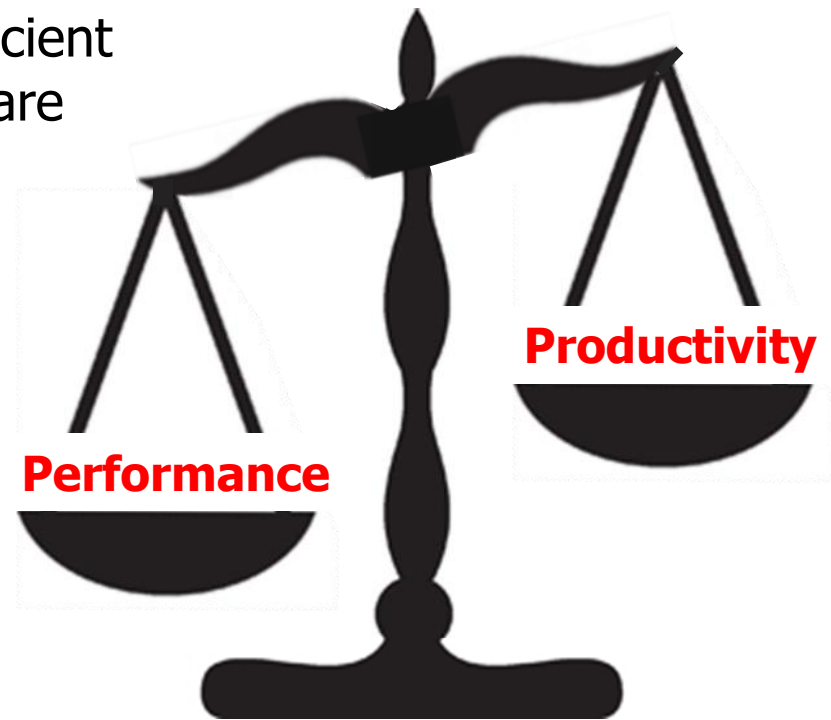
SEQUENTIAL_STREAM executed in 393 msecs

Ending ImageStreamGangTest



Cons of the Java 8 Parallel Streams Solution

- In general, there's a tradeoff between computing performance & programmer productivity when choosing amongst Java 8 parallelism frameworks
- i.e., completable futures are more efficient & scalable than parallel streams, but are somewhat harder to program



End of Java 8 Parallel ImageStreamGang Example (Part 3)