

Lecture 5 – Immutable Collections

SWS121: Secure Programming

Jihyeok Park



2024 Spring

- **Functions**
 - Methods vs Functions
 - Eta Expansion
 - Recursive Functions
 - Tail-Call Optimization
 - Default Parameter Values
 - Nested Methods
 - Multiple Parameter Lists
- **Pattern Matching**
 - Sealed Types
 - Regular Expression Patterns
 - Extractor Objects
- **Functional Error Handling**
 - Option Type
 - Try Type
 - Either Type

1. Recall: Basic Immutable Collections
 - Lists, Options, Maps, and Sets
2. Why Immutable Collections?
3. Collections Hierarchy
4. Sequences
 - ArraySeq
 - Vector
 - Range
 - Queue
5. Sets and Maps
 - HashSet and HashMap
 - TreeSet and TreeMap
6. Performance Characteristics

1. Recall: Basic Immutable Collections Lists, Options, Maps, and Sets

2. Why Immutable Collections?

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4. Sequences

ArraySeq

Vector

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Queue

5. Sets and Maps

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TreeSet and TreeMap

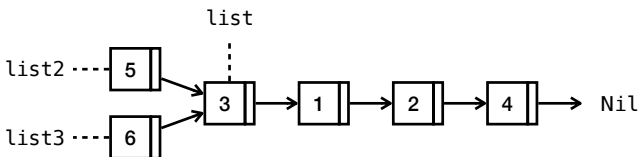
6. Performance Characteristics

Lists are **immutable** sequences of elements of the same type

```
val list: List[Int] = 3 :: 1 :: 2 :: 4 :: Nil
val list2: List[Int] = 5 :: list
val list3: List[Int] = 6 :: list
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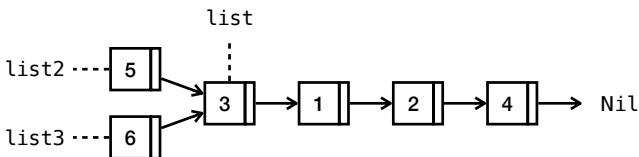
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and support various **methods**:

```
list.size                // 4                : Int
list.map(_ * 2)          // List(6, 2, 4, 8)    : List[Int]
list.filter(_ % 2 == 1) // List(3, 1)    : List[Int]
list.flatMap(x => List(x, -x)) // List(3, -3, ..., 4, -4) : List[Int]
list.foldLeft(0)(_ + _)  // 0 + 3 + 1 + 2 + 4 = 10 : Int
```

We learned other basic immutable collections:

- `Option[T]`: represents **optional** values
- `Map[K, V]`: represents a collection of **key-value** pairs
- `Set[T]`: represents a collection of **unique** elements

```
val opt: Option[Int]      = Some(5)
val map: Map[String, Int] = Map("one" -> 1, "two" -> 2)
val set: Set[Int]        = Set(1, 2, 3, 4)
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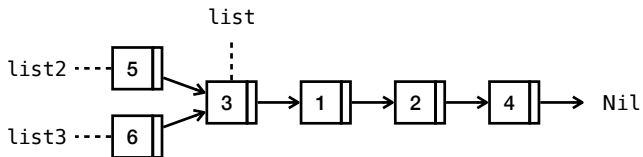
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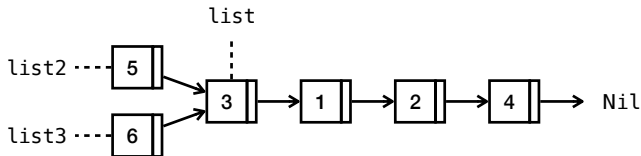
```
opt.size           // 1                : Int
set.map(_ * 2)     // Set(2, 4, 6, 8)   : Set[Int]
map.filter((k, v) => v < 2) // Map("one" -> 1) : Map[String, Int]
opt.flatMap(x => Some(x * 2)) // Some(10)       : Option[Int]
set.foldLeft(1)(_ * _) // 1 * 1 * 2 * 3 * 4 = 24 : Int
```

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Why Immutable Collections?

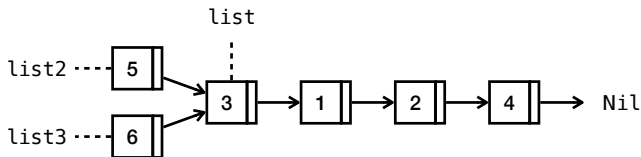


Why we should use **immutable** collections?



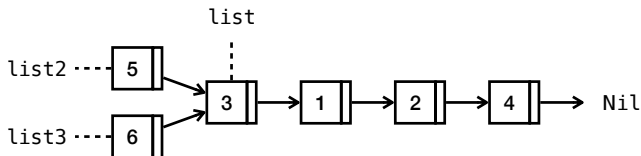
Why we should use **immutable** collections?

- **Thread Safety:** Since immutable collections cannot be modified once created, they are inherently thread-safe (e.g., no race conditions).



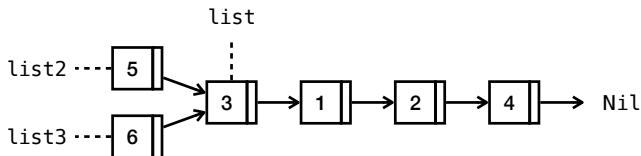
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- **Memory Efficiency:** Immutable collections are more memory-efficient as they can share common parts of their structure instead.

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- Let's explore the collections hierarchy in Scala.

Trait Iterable

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Category	Methods
Addition	concat (++)
Map	map, flatMap, collect
Conversions	to, toList, toVector, toMap, toSet, toSeq, toIndexedSeq, toBuffer, toArray
Copying	copyToArray
Size Info	isEmpty, nonEmpty, size, knownSize, sizeIs
Element	head, last, headOption, lastOption, find
Sub-collection	tail, init, slice, take, drop, takeWhile, dropWhile, filter, filterNot, withFilter
Subdivision	splitAt, span, partition, partitionMap, groupBy, groupMap, groupMapReduce
Element Tests	exists, forall, count
Folds	foldLeft, foldRight, reduceLeft, reduceRight
Specific Folds	sum, product, min, max
String Operations	mkString, addString
View	view

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For example, the `headOption` method is implemented as follows:

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def headOption: Option[A] =
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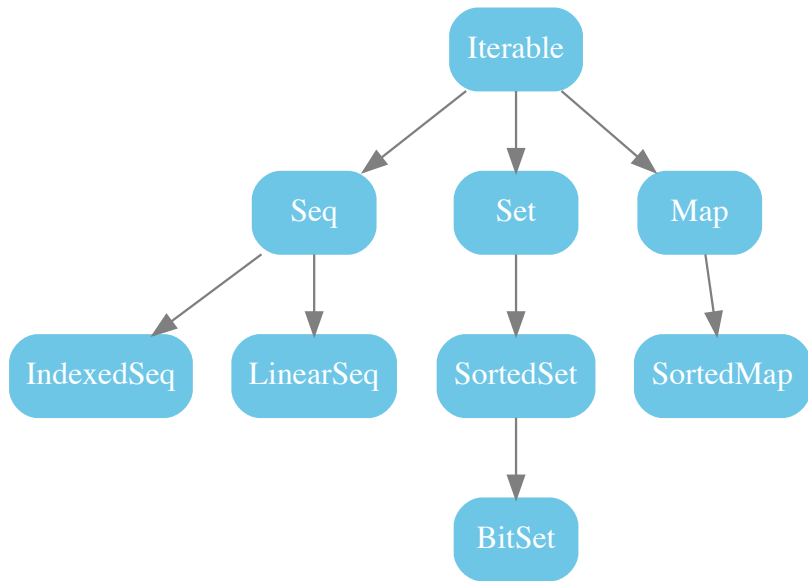
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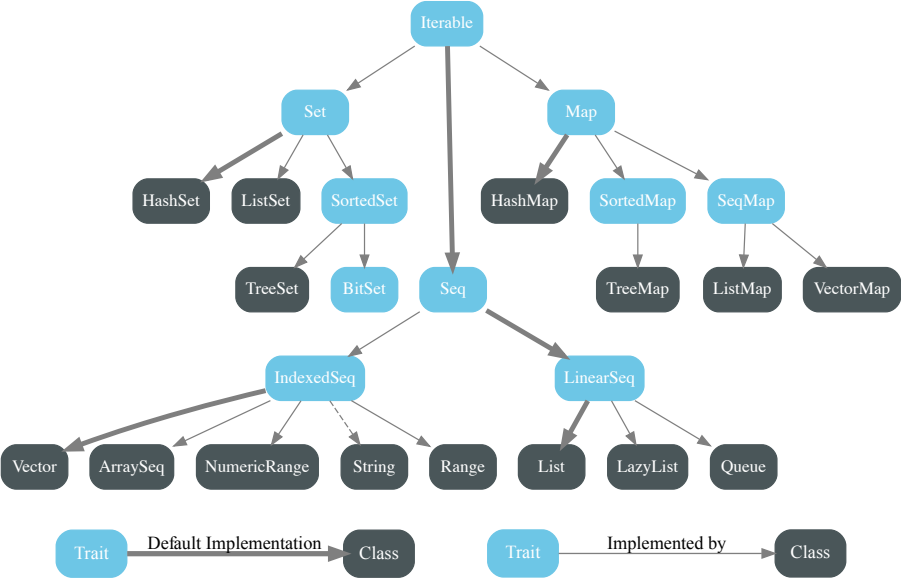
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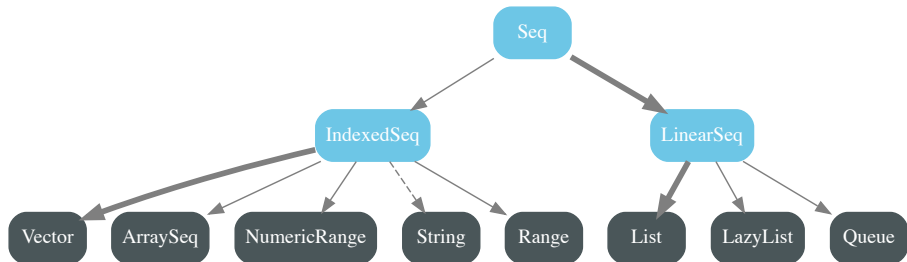
Then, we can use the `headOption` method as follows:

```
Nil.headOption           // None
List(1, 2, 3).headOption // Some(1)
```





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- **IndexedSeq**: A sequence of elements with efficient **random access**.

```
val seq: IndexedSeq[Int] = ArraySeq(0, 1, 2, 3, 4)
seq(3)                    // 3                    (constant time)
```

- **LinearSeq**: A sequence of elements with efficient **linear access**.

```
val list: LinearSeq[Int] = List(0, 1, 2, 3, 4)
list.head                // 0                    (constant time)
list.tail                // List(1, 2, 3, 4)    (constant time)
```

Indexed Sequence – ArraySeq

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Thus, the time complexity of `apply` is **constant time**.

However, the time complexity of `prepend`, `update`, `prepend`, and `append` is **linear time** because we need to **copy all elements**.

Vector is a indexed sequence collection type that provides good performance for all its operations.

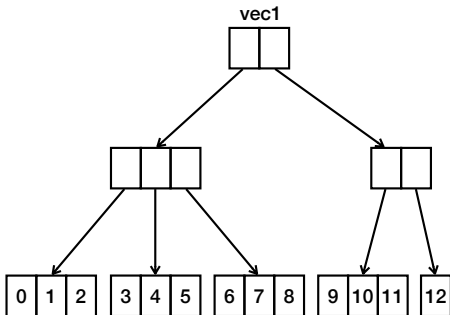
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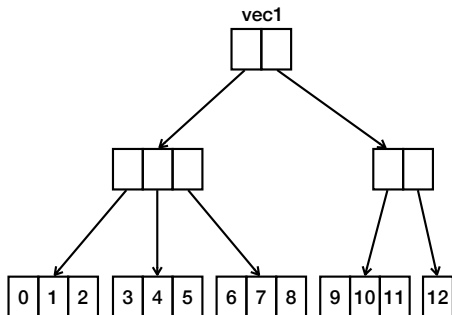
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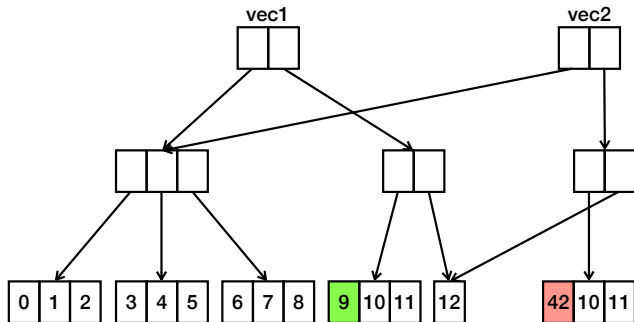
```
val vec1: Vector[Int] = Vector(0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12)
```





The indexing operation is **effectively constant time** because the depth of the tree is **logarithmic** in the number of elements.

```
vec1(9) // 9
```



The update operation is also **effectively constant time** because the depth of the tree is **logarithmic** in the number of elements.

It is memory-efficient because it **shares common parts** of the tree.

```
val vec2 = vec1.updated(9, 42)
```

- In fact, vectors are represented as variants of 32-wide trees.¹

¹At the first time, the **relaxed radix balanced (RRB) trees** (ICFP 2015) were used, but now they are replaced by the **radix-balanced finger (RBF) trees** (2019).

- In fact, vectors are represented as variants of 32-wide trees.¹
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- **Five hops** for vectors with up to $2^{30} \approx 1$ billion elements.
- So for all vectors of reasonable size, an element selection involves up to 5 primitive array selections.
- This is why the time complexity of element access is **effectively constant time**.

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Indexed Sequence – Range

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It represents the range **starting** from 2 and **ending** at 28 with a **step** of 3:

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We can define ranges also using the methods (`to`, `until`, and `by`):

```
0 to 10           // Range(0, 1, 2, ..., 10)
0 to 10 by 2      // Range(0, 2, 4, 6, 8, 10)
0 until 10        // Range(0, 1, 2, ..., 9)
0 until 10 by 2   // Range(0, 2, 4, 6, 8)
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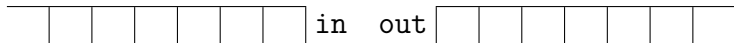
The time complexity of `apply` is **constant time** because we can compute the element using the formula:

$$\text{start} + \text{step} \times \text{index}$$

We can treat a **List** as a **stack** by using the `::` operator for **pop** and `head/tail` methods for **push**.

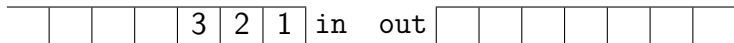
We can treat a **List** as a **stack** by using the `::` operator for **pop** and `head/tail` methods for **push**.

By combining **two lists**, we can implement a **queue**:

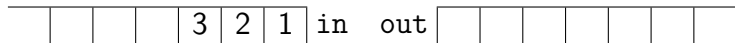


- The **enqueue** operation is implemented by **pushing** the elements to the `in` list.
- The **dequeue** operation is implemented by 1) **moving** the elements from the `in` list to the `out` list only when the `out` list is empty and 2) **poping** an element from the `out` list.

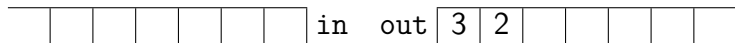
```
val q1 = Queue().enqueue(1).enqueue(2).enqueue(3)
```



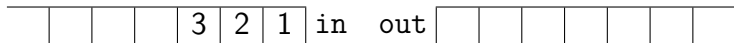
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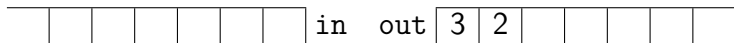
```
val (x, q2) = q1.dequeue // x == 1
```



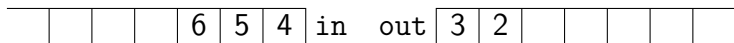
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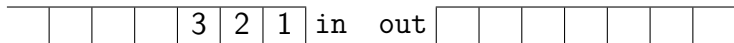
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```
val q3 = q2.enqueue(4).enqueue(5).enqueue(6)
```



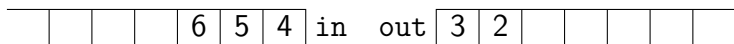

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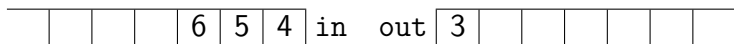
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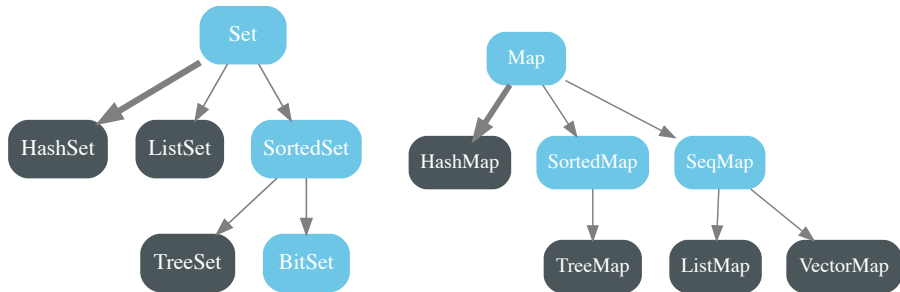
```
val q3 = q2.enqueue(4).enqueue(5).enqueue(6)
```



```
val (y, q4) = q3.dequeue // y == 2
```



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- **HashSet/HashMap**: A set/map of elements with **no order**.
- **TreeSet/TreeMap**: A set/map of elements with **sorted order**
- **BitSet**: A set of bits with **dense packing**.
- **VectorMap**: A map of elements with **insertion order**.

HashSet and **HashMap** are sets and maps of elements with **no order** using a **compressed hash-array mapped prefix-tree (CHAMP)**², which is a variant of the **hash-array mapped trie (HAMT)**.

²The [CHAMP](#) (OOPSLA 2015) data structure is a variant of the [HAMT](#).

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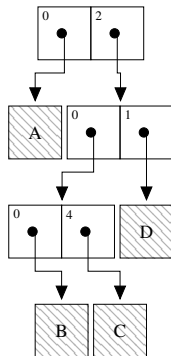
Following shows an example of a HAMT with 32-ary nodes:

$$\text{hash}(A) = 32_{10} = 0 \ 1 \ 0 \ 32$$

$$\text{hash}(B) = 2_{10} = 2 \ 0 \ 0 \ 32$$

$$\text{hash}(C) = 4098_{10} = 2 \ 0 \ 4 \ 32$$

$$\text{hash}(C) = 34_{10} = 2 \ 1 \ 0 \ 32$$



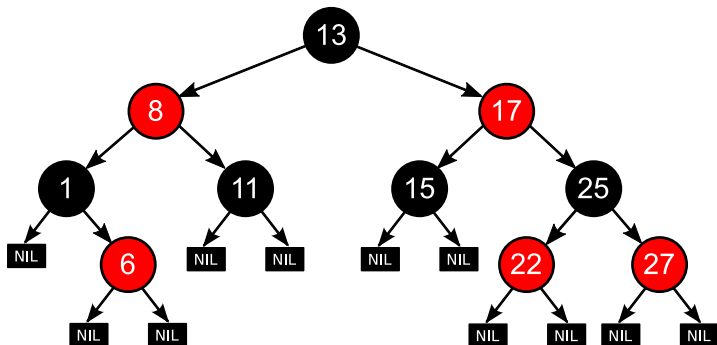
²The [CHAMP](#) (OOPSLA 2015) data structure is a variant of the [HAMT](#).

TreeSet and **TreeMap** are sets and maps of elements with **sorted order** using **red-black trees**.

TreeSet and **TreeMap** are sets and maps of elements with **sorted order** using **red-black trees**.

For example, the following set is represented as a red-black tree:

```
val set = Set(1, 6, 8, 11, 13, 15, 17, 25, 22, 27)
```



1. Recall: Basic Immutable Collections
 - Lists, Options, Maps, and Sets
2. Why Immutable Collections?
3. Collections Hierarchy
4. Sequences
 - ArraySeq
 - Vector
 - Range
 - Queue
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 - HashSet and HashMap
 - TreeSet and TreeMap
6. Performance Characteristics

	head	tail	apply	update	prepend	append
List	C	C	L	L	C	L
ArraySeq	C	L	C	L	L	L
Vector	eC	eC	eC	eC	eC	eC
Queue	aC	aC	L	L	L	C
Range	C	C	C	-	-	-
String	C	L	C	L	L	L

	lookup	add	remove	min
HashSet/HashMap	eC	eC	eC	L
TreeSet/TreeMap	Log	Log	Log	Log
BitSet	C	L	L	eC ³
VectorMap	eC	eC	aC	L
ListMap	L	L	L	L

where **L** = linear time, **Log** = logarithmic time, **C** = constant time, **eC** = effectively constant time, and **aC** = amortized constant time.

³Assuming bits are densely packed.

Summary

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- For Comprehensions

Jihyeok Park
jihyeok_park@korea.ac.kr
<https://plrg.korea.ac.kr>