Fundamentals

SFWRENG 2CO3: Data Structures and Algorithms

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Collection types

A collection type is an data type used to manage a collection of values.

Typically an *abstract data type*: the implementation is hidden from the user.

Collection types are implemented via *data structures*.

Collection types: Bag

A *bag B* is a collection to which values can be added, but not removed:

Add(B, v) add value v to a bag B;

EMPTY(B) return true if bag B holds no values;

Size(B) returns the number of values in B.

In addition, one can *iterate* over the values currently in bag *B*.

3/1

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Remark

Note that Empty can be implemented via Size.

Not all data structures provide an efficient Size, however!

Stack: collection to which values can be added to the top, removed from the top.

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- Push(S, v) add value v to the top of stack S;
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Stacks are sometimes referred to as first-in-last-out (FILO) queues.

(top)

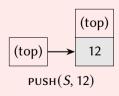
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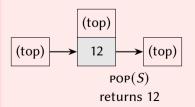
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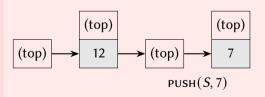
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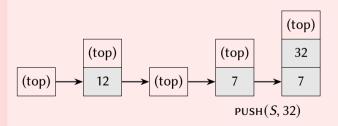
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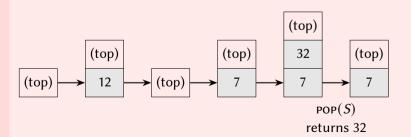
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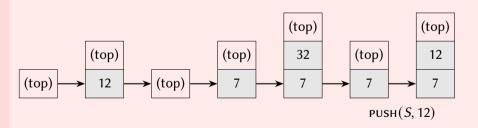
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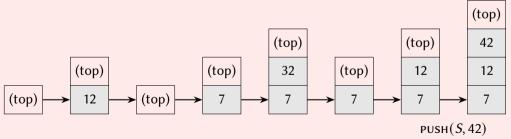
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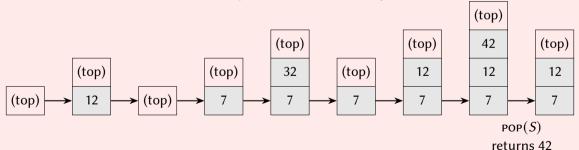
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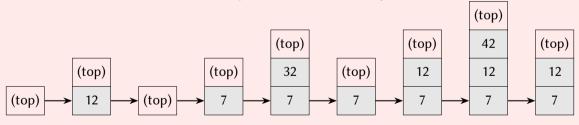
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Stacks are used everywhere: e.g., function calls are implemented via stacks.

Postfix notation is a notation in which operators follow their operands.

Example

- ► "1 2 +" is equivalent to 1 + 2.
- "1 2 3 + -" is equivalent to 1 (2 + 3).
- "1 2 + 3 -" is equivalent to (1 + 2) 3.
- "1 2 3 + 4 5 · /" is equivalent to $1/((2+3)-(4\cdot5))$.

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Expressions in postfix notation are very easy to evaluate using a stack.

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"1 2 3 + 4 5 · - /" is equivalent to
$$1/((2+3) - (4 \cdot 5))$$
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Algorithm EVALUATEPN(e):

- 1: S :=an empty stack.
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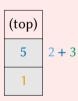
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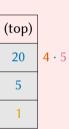
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Dijkstra's Two-Stack Algorithm (book) evaluates expressions in *infix* (normal) notation: this by building a postfix notation and simultaneously applying EVALUATEPN.

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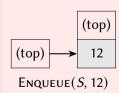
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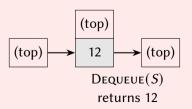
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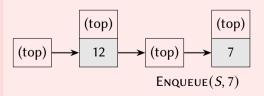
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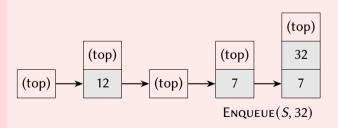
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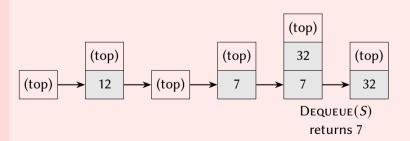
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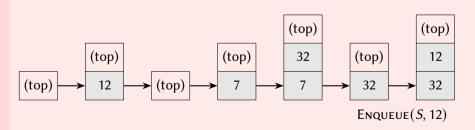
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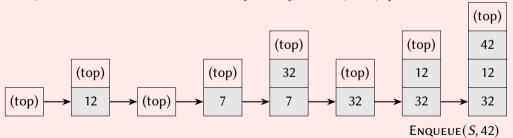
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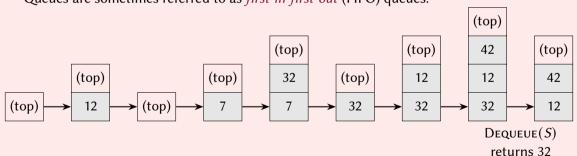
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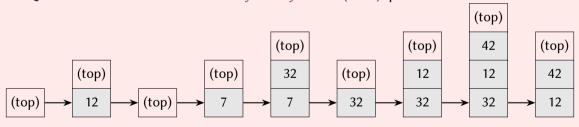
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Queues are used used *everywhere*: e.g., communication buffers (for network packages, for tasks exchanged between producer-consumer threads, ...).

Ring Buffer: a data structure that can hold up-to-N values.
entries[0...N) An array that can hold N values.
start The position in entries of the first value in the buffer.
length The current number of values in the buffer.
The values start at position start and wrap-around at the end of entries.

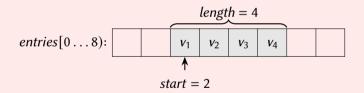
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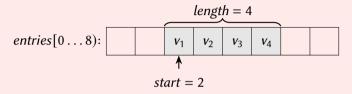
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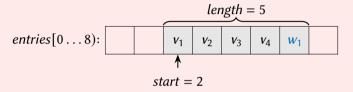


Algorithm PushBack(R, v):

Input: R is a non-full ring buffer (R.length $\neq N$).

- 1: **if** R.start + R.length < N **then**
- 2: R.entries[R.start + R.length] := v.
- 3: **else** Wrap-around the end of the list
- 4: R.entries[R.start + R.length N] := v.
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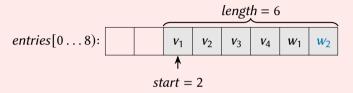
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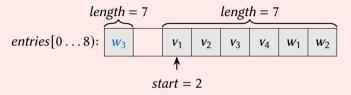
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PushBack(R, w_1); PushBack(R, w_2); PushBack(R, w_3);

PushBack(R, w_4).

Ring Buffer: a data structure that can hold up-to-*N* values.



Algorithm PushBack(R, v):

Input: R is a non-full ring buffer (R.length $\neq N$).

- 1: **if** R.start + R.length < N **then**
- 2: R.entries[R.start + R.length] := v.
- 3: **else** Wrap-around the end of the list
- 4: R.entries[R.start + R.length N] := v.
- 5: R.length := R.length + 1.

PushBack(R, w_1);

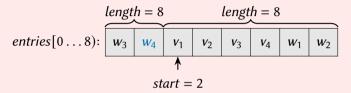
PushBack(R, w_2);

PushBack(R, w_3);

PushBack(R, w_4).

7/1

Ring Buffer: a data structure that can hold up-to-*N* values.



Algorithm PushBack(R, v):

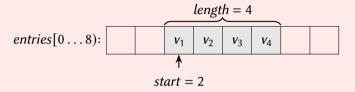
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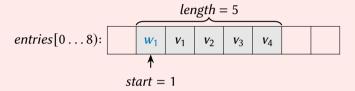


Algorithm PushFront(R, v):

Input: R is a non-full ring buffer ($R.length \neq N$).

- 1: **if** R.start > 0 **then**
- 2: R.start := R.start 1.
- 3: **else** Wrap-around the begin of the list
- 4: R.start := N 1.
- 5: R.entries[R.start], R.length := v, R.length + 1.

Ring Buffer: a data structure that can hold up-to-*N* values.



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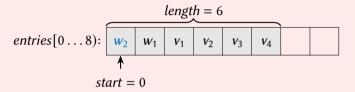
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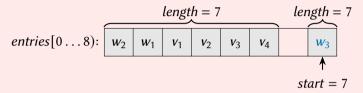
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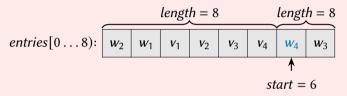
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Ring Buffer: a data structure that can hold up-to-N values.
entries[0...N) An array that can hold N values.
start The position in entries of the first value in the buffer.
length The current number of values in the buffer.
The values start at position start and wrap-around at the end of entries.

Removing elements from the front or the back is similar:

PopFront(R) undoes PushFront.

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- ▶ Provides all queue operations in $\Theta(1)$.
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- ▶ Provides all stack operations in $\Theta(1)$.
- ▶ Provides all queue operations in $\Theta(1)$.
- ► Support *random access* efficiently.
- ► Can be used to implement a *double-ended queue*.
- Drawback: can hold at-most N values.

Linked Lists: a data structure that can hold a sequence of values, each stored in a *list node*.

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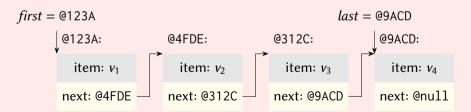
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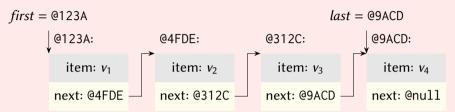
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8/1

Linked Lists: a data structure that can hold a sequence of values, each stored in a list node.



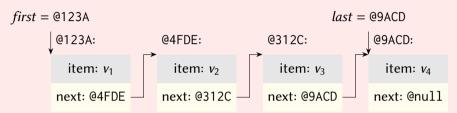
Algorithm PushFront(L, v):

Input: *L* is a linked list.

- 1: Create new list node *n* for value *v*.
- 2: n.next := L.first.
- 3: L.first := pointer to n.
- 4: **if** *L.last* = @null **then** List *L* was empty
- 5: L.last := pointer to n.

/15

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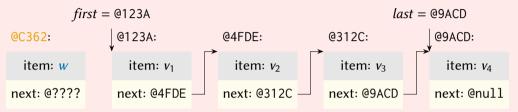
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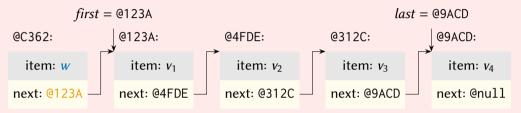
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Input: *L* is a linked list.

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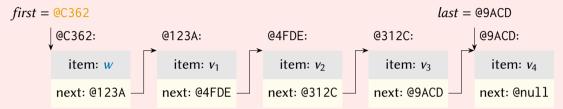
3: L.first := pointer to n.

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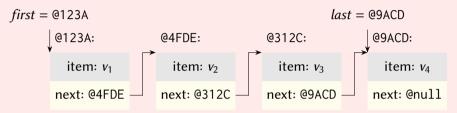


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Linked Lists: a data structure that can hold a sequence of values, each stored in a list node.



Algorithm AppendNode(L, m, v):

Input: *L* is a linked list with node *m*.

- 1: Create new list node n for value v.
- 2: n.next := m.next.
- 3: m.next := pointer to n.
- 4: **if** L.last = m **then** m was the last node in L
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/15

Linked Lists: a data structure that can hold a sequence of values, each stored in a list node.



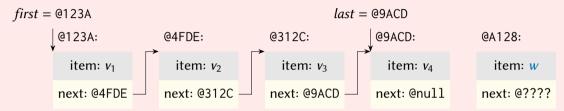
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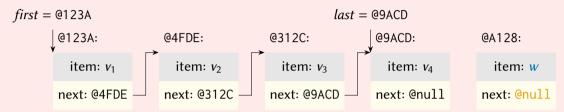
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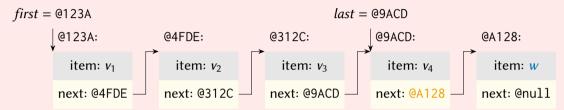
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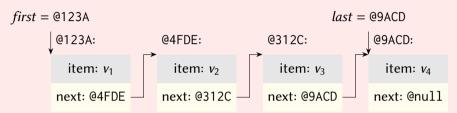
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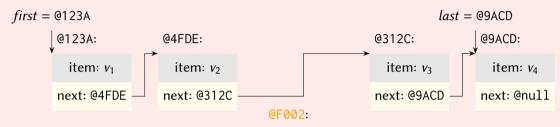
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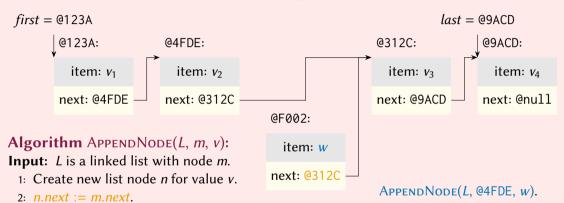
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item: w

next: @????

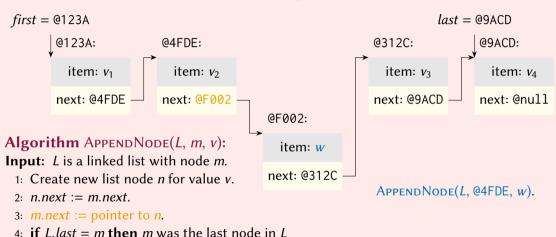
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Make sure to free the memory associated with nodes.

In C++: use either std::unique_ptr or std::shared_ptr to free nodes *for* you.

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- ▶ *Drawback*: Low performance due to *pointer-chasing*, memory overhead of list nodes.

Linked Lists: a data structure that can hold a sequence of values, each stored in a list node.

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Each value in a *doubly* linked list is held by a *list node*:

item The value held by the list node.

next A pointer to the next list node in the linked list, if any.

prev A pointer to the previous list node in the linked list, if any.

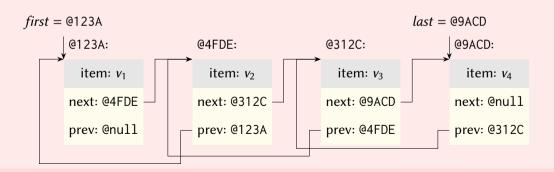
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Each value in a *doubly* linked list is held by a *list node*:

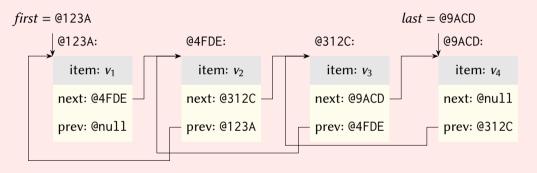
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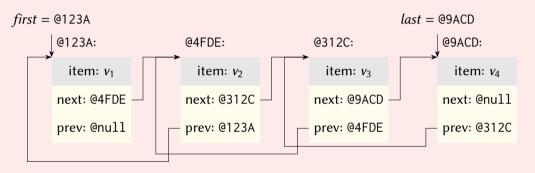


Linked Lists: a data structure that can hold a sequence of values, each stored in a list node.



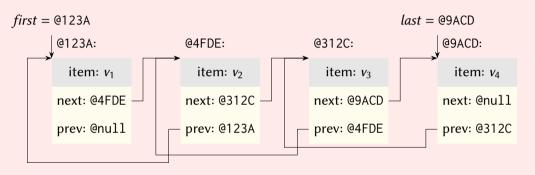
▶ Doubly-linked lists provide flexible *iteration* and *modifications* of the list: you can easily remove a given doubly linked list node *n* or visit the node preceding *n*.

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- ▶ Doubly-linked lists provide flexible *iteration* and *modifications* of the list: you can easily remove a given doubly linked list node *n* or visit the node preceding *n*.
- ▶ Doubly-linked lists can be used to implement a *double-ended queue*.

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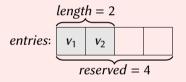
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Dynamic Array: a data structure that can hold an array of values that is resizes upon need. reserved Current internal reserved size for the array of values.

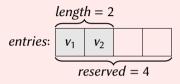
entries An array that can hold up-to-reserved values.

length The current number of values in the array, length ≤ reserved.

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Algorithm PushBack(D, v):

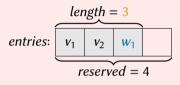
Input: *D* is a dynamic array.

- 1: **if** *D.reserved* = *D.length* **then**
- 2: InternalResize(D).
- 3: D.entries[D.length] := v.
- 4: D.length := D.length + 1.

Algorithm Internal Resize(*D*):

- 1: $n := \max(2 \cdot D.reserved, 1)$.
- 2: Create new array *a* that can hold *n* values.
- 3: **for** pos := 0 **to** D.length **do** copy D.entries to a
- 4: a[pos] := D.entries[pos].
- 5: Free the memory for array *D.entries*.
- 6: D.reserved, D.entries := n, a.

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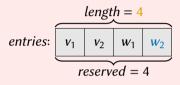
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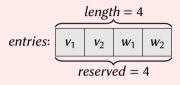
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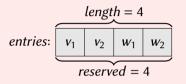
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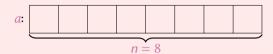
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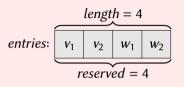
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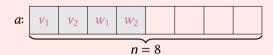
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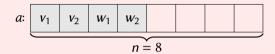
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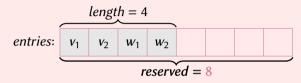
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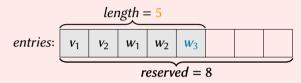
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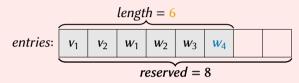
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Amortized complexity is not average case complexity!

Average case complexity looks at the average cost of a *single* operation.

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To support PopBack efficiently: do not *shrink* too soon: either *never shrink* or shrink *if requested* or when $4 \cdot D.length < D.reserved$.

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- ► Support *random access* efficiently.
- ▶ *Drawback*: sometimes expensive *resizes*, no efficient queue operations.

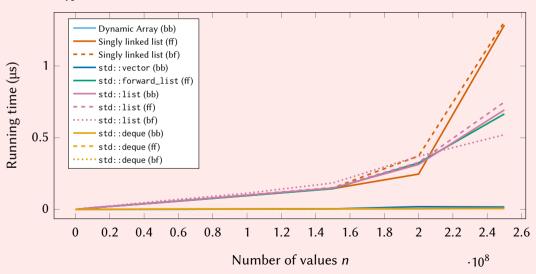
A summary of elementary containers

	Supports ADT			Random	
Data structure	Queue	Stack	Dequeue	Access	Memory Usage
Ring Buffer	Θ(1)	Θ(1)	Θ(1)	Θ(1)	Always NT
Singly linked list	$\Theta(1)$	$\Theta(1)$			T + P + M per value
Doubly linked list	$\Theta(1)$	$\Theta(1)$	$\Theta(1)$		T + 2P + M per value
Dynamic array		$\Theta(1)$ (amortized)		Θ(1)	$\leq M + 2T$ $\leq 2M + 3T$ (during resize)

T is the size of a value, P is the size of a pointer, M is the overhead per memory allocation.

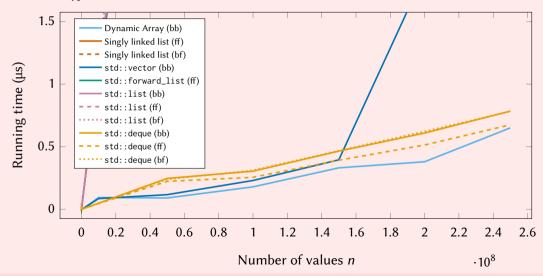
Comparing common containers

 $_{\cdot 10^8}$ Measured runtime complexity (adding and then removing *n* values)



Comparing common containers

 \cdot_{10^6} Measured runtime complexity (adding and then removing *n* values)



Elementary containers in practice

Data Collection or Structure	C++	Java	
Ring Buffer		java.util.ArrayDeque	
Singly Linked List Doubly Linked List	std::forward_list std::list	java.util.LinkedList	
Dynamic Array	std::vector	java.util.ArrayList	
Other	std::deque		
Stack Queue	std::stack std::queue	Use ArrayDeque or ArrayList Use ArrayDeque	

Java provides java.util.Vector and Stack and Queue on top of Vector. These are ancient and their usage is *not recommended*. Use ArrayList or ArrayDeque instead!