## **Fundamentals** SFWRENG 2CO3: Data Structures and Algorithms

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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.

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Remark Note that EMPTY can be implemented via Size. Not all data structures provide an efficient Size, however!

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Stacks are sometimes referred to as first-in-last-out (FILO) queues.

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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  $1/((2+3) (4 \cdot 5))$ .

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

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## **Algorithm** EVALUATEPN(e):

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- 2: for each term  $t \in e$  do
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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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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.
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**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
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- Support *random access* efficiently.
- Can be used to implement a *double-ended queue*.
- Drawback: can hold at-most N values.

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**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
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PUSHFRONT(L, w).

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



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*first* = @C362

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*first* = @123A

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AppendNode(L, @4FDE, w).

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Each value in a 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.

Removing elements from the front or after a given node is similar: POPFRONT(L) undoes PUSHFRONT. REMOVENODE(L, w) undoes APPENDNODE (removes a node after node w).

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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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### Algorithm PUSHBACK(D, v):

**Input:** *D* is a dynamic array.

- 1: **if** *D*.*reserved* = *D*.*length* **then**
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$$a: \underbrace{v_1 \quad v_2 \quad w_1 \quad w_2}_{n=8}$$

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PUSHBACK(D, v) is either  $\Theta(1)$  or  $\Theta(D.reserved)$  (if InternalResize is called).

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Can we provide a better analysis?

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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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$$\begin{split} \sum_{k=0}^{j} c \cdot 2^{k} + d &= \left( c \sum_{k=0}^{j} 2^{k} \right) + \left( \sum_{k=0}^{j} d \right) \\ &= c \left( 2^{j+1} - 1 \right) + d(j+1) \\ &\leq c \left( 2^{\log_{2}(M)+1} - 1 \right) + d(\log_{2}(M)+1) = c(2M-1) + d(\log_{2}(M)+1). \end{split}$$

After *M* PUSHBACKS on *D*: *D*.*length* = *M* with  $2^j < M \le D$ .*reserved* =  $2^{j+1}$ . Hence, we must have  $j = \lfloor \log_2(M) \rfloor < \log_2(M)$ .

Consider an empty dynamic array *D* with *D*.reserved = 1, and a sequence of M, M > 0, PUSHBACK operations.

- **C**ost of PUSHBACK: some base cost *b* plus the cost of INTERNALRESIZE.
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The above analysis can be generalized to include other operations, e.g., POPBACK.

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

#### Dynamic arrays

Dynamic Array: a data structure that can hold an array of values that is resizes upon need.

Removing elements from the the back is similar:

РорВаск(D) undoes РознВаск (typically without shrinking).

Arbitrary inserts at position i,  $i \neq D$ .length, is costly: Requires one to copy over by one position all values at-or-after position i.

#### What about the complexity?

PUSHBACK(D, v) is either  $\Theta(1)$  or  $\Theta(D.reserved)$  (if InternalResize is called).

Can we provide a better analysis?

Amortized complexity of PUSHBACK:  $\Theta(1)$ .

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- Provides stack modifications in amortized  $\Theta(1)$ .
- Queue modifications in  $\Theta(D.length)$ .
- 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
Dunamia array		$\Theta(1)$		$\Theta(1)$	$\leq M + 2T$
Dynamic array		(amortized)		0(1)	$\leq 2M + 3T$ (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	<pre>std::forward_list std::list</pre>	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!