

# ArrayStack: Amortized Analysis

Open Data Structures



# ArrayStack

## Amortized analysis of `resize()`

### Theorem

An ArrayStack implements the List interface.

Ignoring the time spent in calls to `resize()`,

- `get(i)` and `set(i, x)` each run in  $O(1)$  time; and
- `add(i, x)` and `remove(i)` each run in  $O(1 + n - i)$  time.

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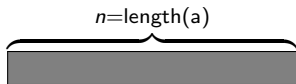
Furthermore, if we start with an empty ArrayStack and perform any sequence of  $m$  `add( $i, x$ )` and `remove( $i$ )` operations, then the total time spent in all calls to `resize()` is  $O(m)$ .

# The Plan

resize() during  $\text{add}(i, x)$

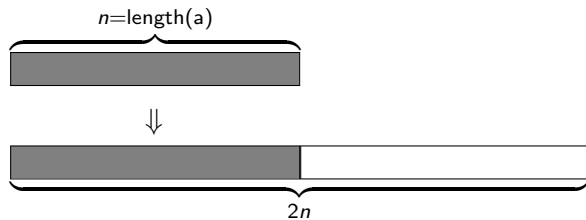
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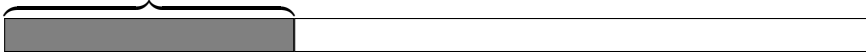
resize() during remove( $i$ )



# The Plan

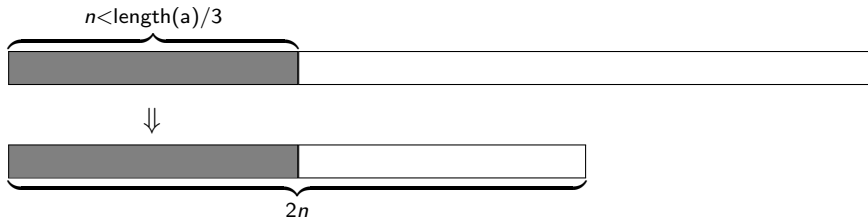
resize() during remove( $i$ )

$$n < \text{length}(a)/3$$



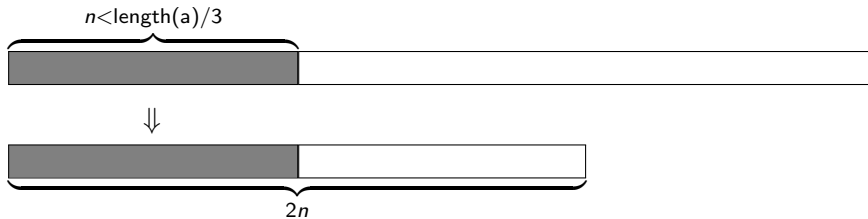
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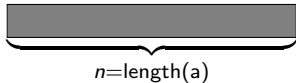
**Plan**

Show that the total number of items copied by `resize()` is at most  $2m$ .

# Time Between Resizes

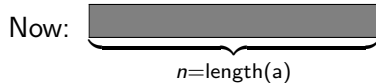
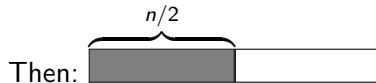
Resize triggered by  $\text{add}(i, x)$

Now:



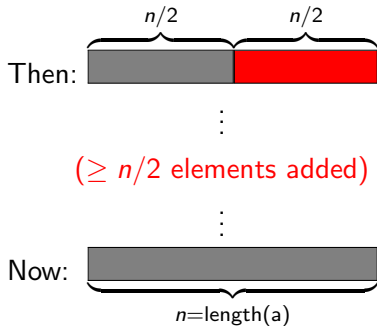
# Time Between Resizes

Resize triggered by `add(i, x)`



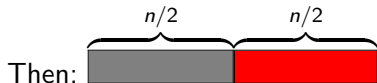
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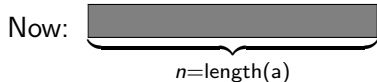
Resize triggered by  $\text{add}(i, x)$



⋮

( $\geq n/2$  elements added)

⋮

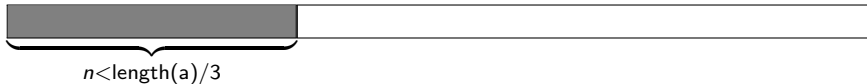


- At least  $n/2$   $\text{add}(i, x)$  operations between then and now

# Time Between Resizes

Resize triggered by `remove(i)`

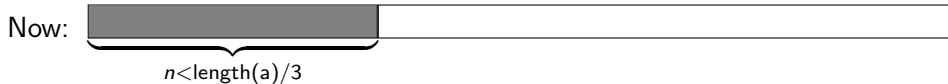
Now:





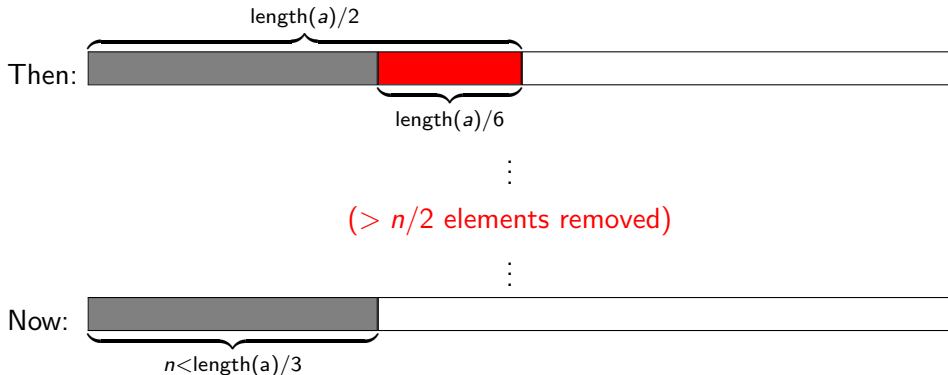
# Time Between Resizes

Resize triggered by  $\text{remove}(i)$



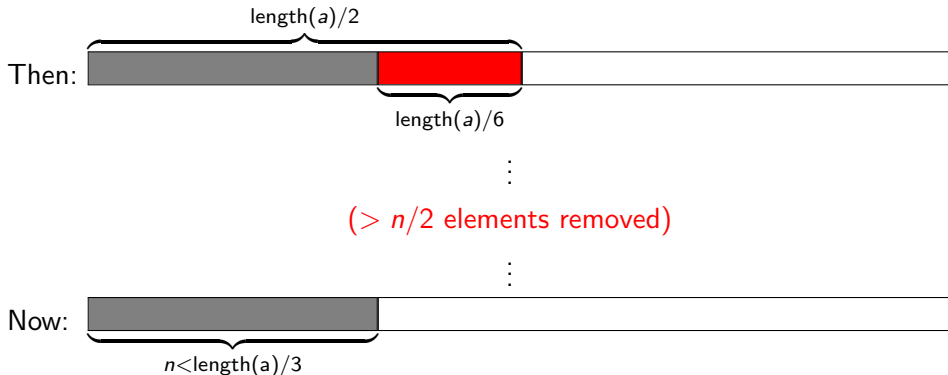
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Resize triggered by  $\text{remove}(i)$



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Resize triggered by  $\text{remove}(i)$



- At least  $n/2$   $\text{remove}(i)$  operations between then and now

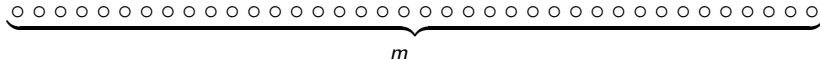
# Time Between Resizes

## Summary

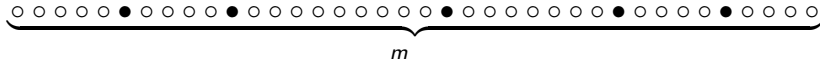
### Operations Between Resizes

If a `resize()` operation copies  $n$  elements, then there have been at least  $n/2$  `add( $i, x$ )` or `remove( $i$ )` operations since the preceding `resize()` operation.

# Overview

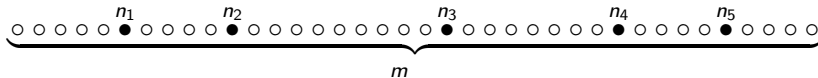


# Overview



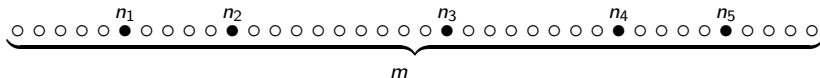
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- $n_i =$  number of items copied by the  $i^{\text{th}}$  `resize()` operation



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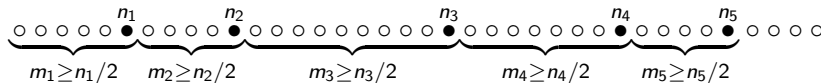
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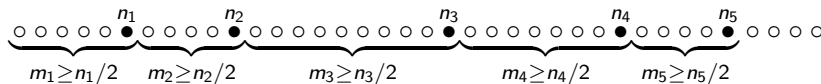
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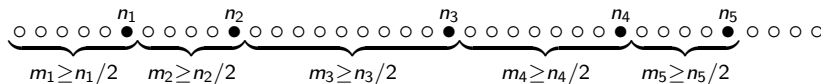
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- Total number of items copied:  $N = n_1 + n_2 + n_3 + \dots$

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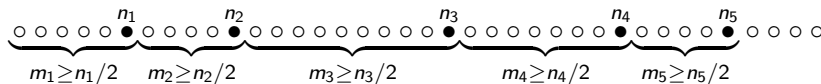
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- Total number of items copied:  $N = n_1 + n_2 + n_3 + \dots$
- Total number of add/remove operations:  $m \geq m_1 + m_2 + m_3 + \dots$

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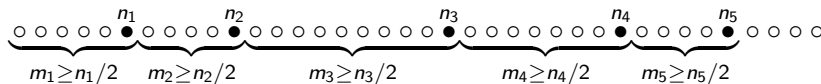
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- Total number of items copied:  $N = n_1 + n_2 + n_3 + \dots$
- Total number of add/remove operations:  $m \geq n_1/2 + n_2/2 + n_3/2 + \dots$

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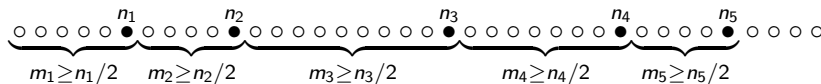
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- Total number of items copied:  $N = n_1 + n_2 + n_3 + \dots$
- Total number of add/remove operations:  $m \geq N/2$

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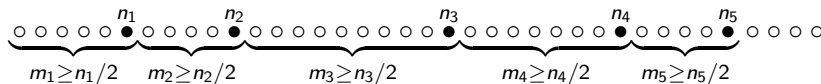
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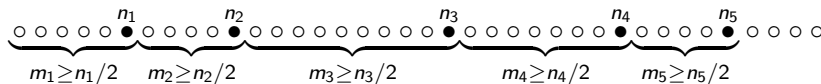
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- The total time spent in all calls to `resize()` is  $O(m)$



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# End of Lesson