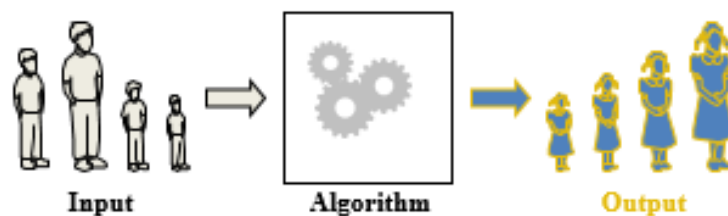


Data Structures & Algorithms

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Recap -1

Algorithm



Analyzing Algorithms

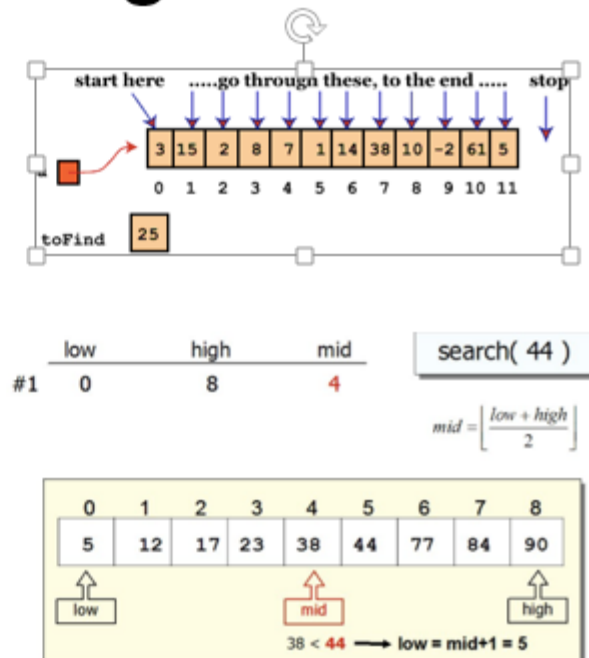
- How do we analyze algorithms?

Complexity Analysis: predicting the resources that an algorithm requires!

- **Time Complexity:** amount of time that an algorithm takes to run to completion
- **Space Complexity:** amount of memory that an algorithm needs to run to completion

Why Analyze Algorithms?

- Allows us to:
 - Compare the merits of two alternative approaches to a problem we need to solve
 - Determine whether a proposed solution will meet required resource constraints before we invest money and time coding



How to Measure Time Complexity?

- Analyze running time for the
 - **best case:** usually useless
 - **average case:** very difficult to determine
 - **worst case:** a safer choice

Recap -2

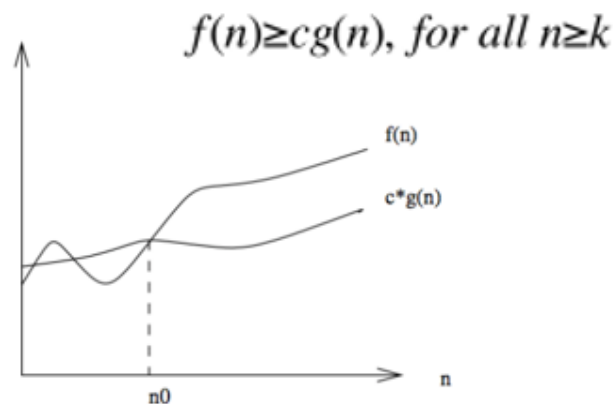
Measuring Time Complexity

- To measure the time complexity
- We count the total number of primitive operations for an algorithm as a function of the input size $T(n)$
- Analyze **growth rate** of $T(n)$

Big-Omega

- In other words, $f(n)$ is bounded below by a constant times of $g(n)$

Ω

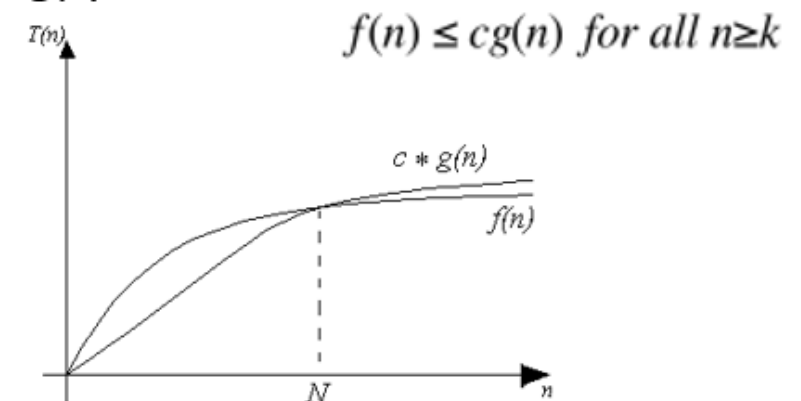


Here, n_0 is representing k

- Lower bounds are useful because they say that an algorithm requires **at least** so much time

Big-Oh Notation

- In other words, $f(n)$ is bounded above by a constant times of $g(n)$

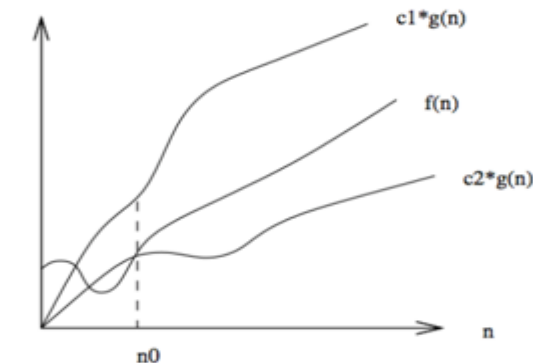
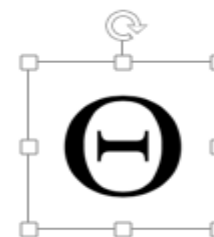


Here, N is representing k

Big-Theta

- In other words, $f(n)$ is bounded above by c_1 times of $g(n)$ and below by c_2 times of $g(n)$

$$f(n) \leq c_1 \cdot g(n), \text{ and, } f(n) \geq c_2 \cdot g(n) \text{ for all } n \geq k$$



Here, n_0 is representing k

Recap -3 (Correction)

	step	n>1
1 procedure fibonacci {print nth term}	1	1
2 read(n)	2	1
3 if n<0	3	1
4 then print(error)	4	0
5 else if n=0	5	1
6 then print(0)	6	0
7 else if n=1	7	1
8 then print(1)	8	0
9 else	9	1
10 fnm2 := 0;	10	1
11 fnm1 := 1;	11	1
12 FOR i := 2 to n DO	12	n
13 fn := fnm1 + fnm2;	13	n-1
14 fnm2 := fnm1;	14	n-1
15 fnm1 := fn	15	n-1
16 end	16	n-1
17 print(fn) ;	17	1

$$T(n) = 5n + 5$$

~~$T(n)$ is $O(n)$~~

Lists

TO DO LIST

[illegible]

Basic Operations

- Insert an item
- Check to see if a particular item is present
- Delete an item

List as a Data Structure

- Attendance monitoring system (List of attendees)
- Computer Games (List of top scores)
- Online shopping (List of selected items)

List Basics

- Completely unrestricted sequence of zero or more items
 - add, update, and remove items at any position
 - lookup an item by position
 - find the index at which a given value appears

Basics

Some of The Important List Operations

<code>add(x)</code>	add an item at the end
<code>addFirst(x)</code>	add an item at the beginning
<code>addLast(x)</code>	add an item at the end
<code>add(i, x)</code>	add an item at position i
<code>remove(x)</code>	remove the item from the list
<code>remove(i)</code>	remove the item at position i
<code>size()</code>	return the number of items in the list
<code>isEmpty()</code>	return whether the list has no items
<code>contains(x)</code>	return whether x is in the list
<code>...</code>	
<code>.</code>	<code>...</code>

Give some more operations as an exercise!

List ADT

```
1  /** A simplified version of the java.util.List interface. */
2  public interface List<E> {
3      /** Returns the number of elements in this list. */
4      int size();
5
6      /** Returns whether the list is empty. */
7      boolean isEmpty();
8
9      /** Returns (but does not remove) the element at index i. */
10     E get(int i) throws IndexOutOfBoundsException;
11
12     /** Replaces the element at index i with e, and returns the replaced element. */
13     E set(int i, E e) throws IndexOutOfBoundsException;
14
15     /** Inserts element e to be at index i, shifting all subsequent elements later. */
16     void add(int i, E e) throws IndexOutOfBoundsException;
17
18     /** Removes/returns the element at index i, shifting subsequent elements earlier. */
19     E remove(int i) throws IndexOutOfBoundsException;
20 }
```

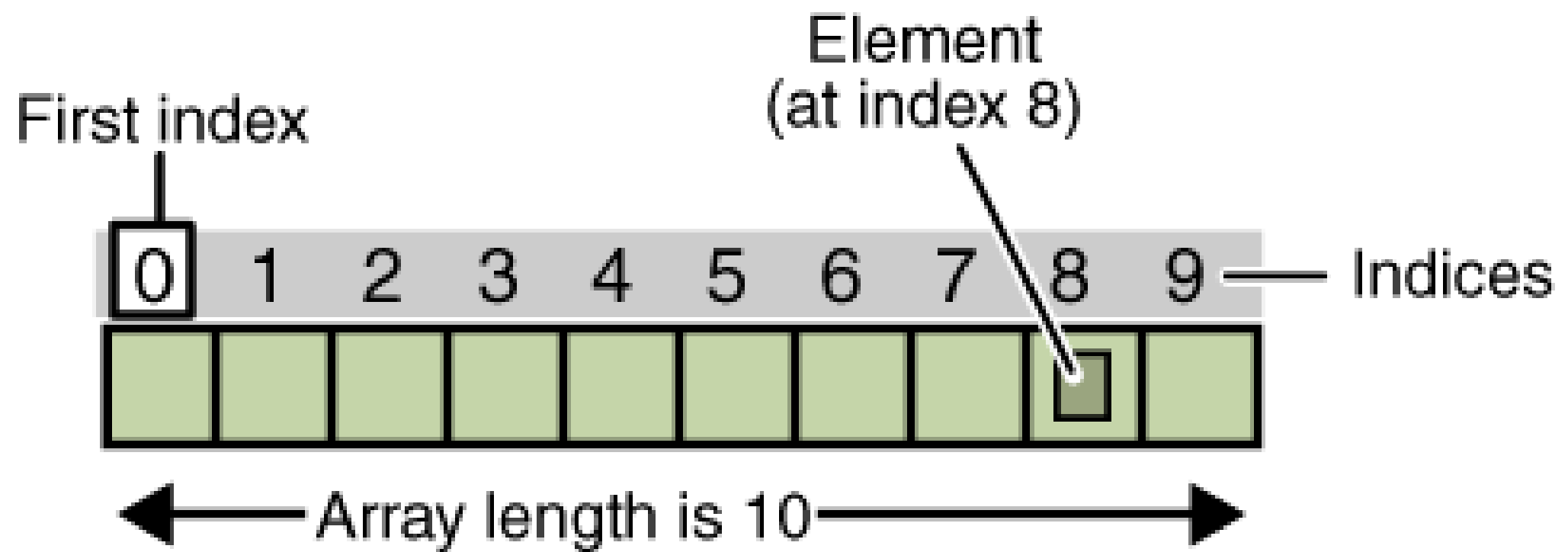
Code Fragment 7.1: A simple version of the List interface.

The key idea is that we have not specified how the list is to be implemented

Implementation

- **Two main representations**
 - **Array-based**
 - uses a static data structure
 - reasonable if we know in advance the maximum number of the items in the list
 - **Linked-list based**
 - uses dynamic data structure
 - best if don't know in advance the number of elements in the list (or if it varies greatly)

Array



Java Arrays Basics

```
int [ ] intArray; // defines a reference to an array
```

```
intArray = new int[100]; // creates the array, and
```

```
// sets intArray to refer to it
```

Java Arrays Basics

```
int [ ] intArray = new int[100]; // equivalent single-
```

```
// statement approach
```

```
int arrayLength = intArray.length; // find array length
```

Java Arrays Basics

```
int temp = intArray[5]; // get contents of the sixth  
                        // element of the array
```

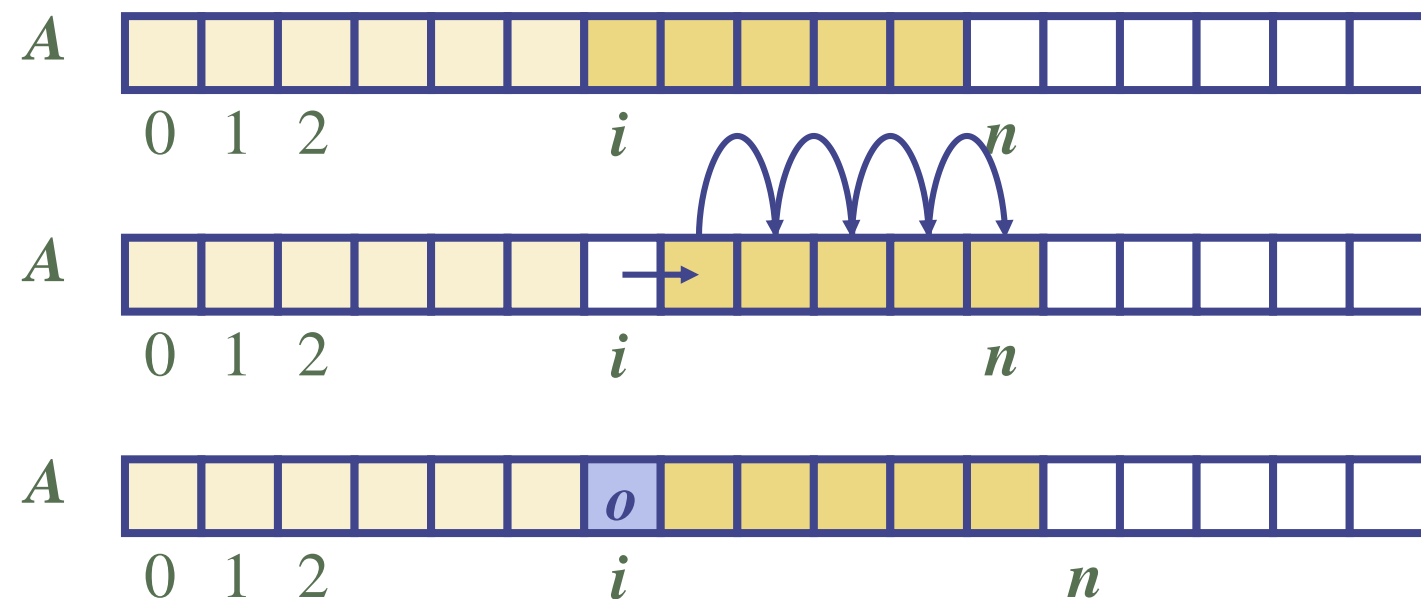
```
intArray[6] = 46; // insert 46 into the seventh cell
```


Array-based Lists

- An obvious choice for implementing the list ADT is to use an array, A ,
- where $A[i]$ stores (a reference to) the element with index i .
- With a representation based on an array A , the $get(i)$ and $set(i, e)$ methods are easy to implement by accessing $A[i]$ (assuming i is a legitimate index).

Array-based Lists

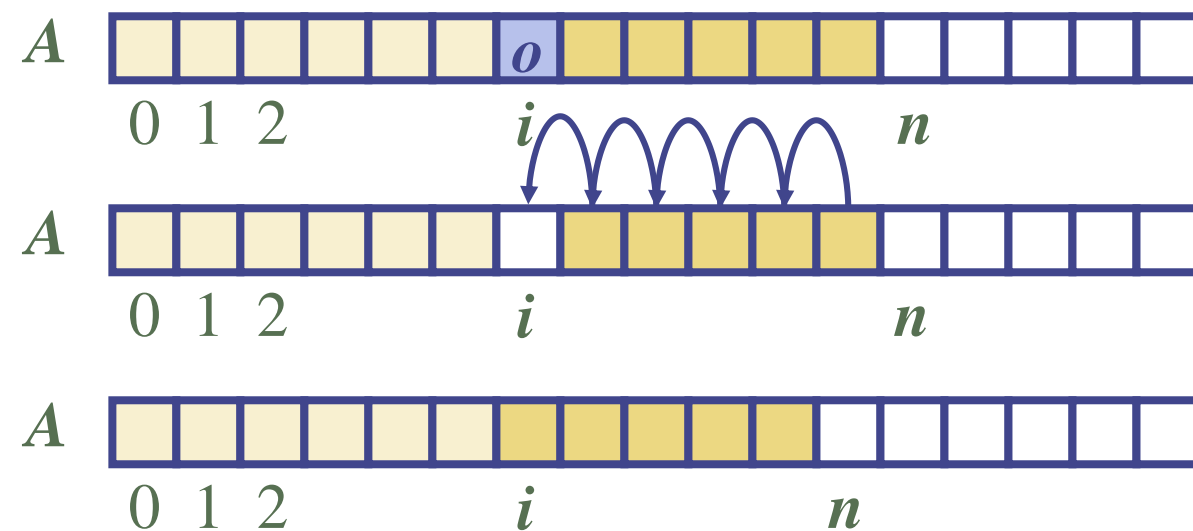
- Insertion at index i — $\text{add}(i, o)$
- shifting forward the $n - i$ items — worst case $i = 0$
[takes $O(n)$ time]



What about insertion at the end? — $\text{add}(o)$
How can we implement $\text{add}(o)$ using $\text{add}(i, o)$?

Array-based Lists

- Removal at index i — $\text{remove}(i)$
- shifting backwards the $n - i - 1$ items — worst case $i = 0$ [takes $O(n)$ time]



Array-based Lists

```
1 public class ArrayList<E> implements List<E> {  
2     // instance variables  
3     public static final int CAPACITY=16; // default array capacity  
4     private E[] data; // generic array used for storage  
5     private int size = 0; // current number of elements  
6     // constructors  
7     public ArrayList() { this(CAPACITY); } // constructs list with default capacity  
8     public ArrayList(int capacity) { // constructs list with given capacity  
9         data = (E[]) new Object[capacity]; // safe cast; compiler may give warning  
10 }
```

Array-based Lists

```
11 // public methods
12 /** Returns the number of elements in the array list. */
13 public int size() { return size; }
14 /** Returns whether the array list is empty. */
15 public boolean isEmpty() { return size == 0; }
16 /** Returns (but does not remove) the element at index i. */
17 public E get(int i) throws IndexOutOfBoundsException {
18     checkIndex(i, size);
19     return data[i];
20 }
21 /** Replaces the element at index i with e, and returns the replaced element. */
22 public E set(int i, E e) throws IndexOutOfBoundsException {
23     checkIndex(i, size);
24     E temp = data[i];
25     data[i] = e;
26     return temp;
27 }
```

Array-based Lists

```
28  /** Inserts element e to be at index i, shifting all subsequent elements later. */
29  public void add(int i, E e) throws IndexOutOfBoundsException,
30                                     IllegalStateException {
31      checkIndex(i, size + 1);
32      if (size == data.length)          // not enough capacity
33          throw new IllegalStateException("Array is full");
34      for (int k=size-1; k >= i; k--)    // start by shifting rightmost
35          data[k+1] = data[k];
36      data[i] = e;                      // ready to place the new element
37      size++;
38  }
39  /** Removes/returns the element at index i, shifting subsequent elements earlier. */
40  public E remove(int i) throws IndexOutOfBoundsException {
41      checkIndex(i, size);
42      E temp = data[i];
43      for (int k=i; k < size-1; k++)    // shift elements to fill hole
44          data[k] = data[k+1];
45      data[size-1] = null;              // help garbage collection
46      size--;
47      return temp;
48  }
```

Array-based Lists

```
49 // utility method
50 /** Checks whether the given index is in the range [0, n-1]. */
51 protected void checkIndex(int i, int n) throws IndexOutOfBoundsException {
52     if (i < 0 || i >= n)
53         throw new IndexOutOfBoundsException("Illegal index: " + i);
54 }
55 }
```

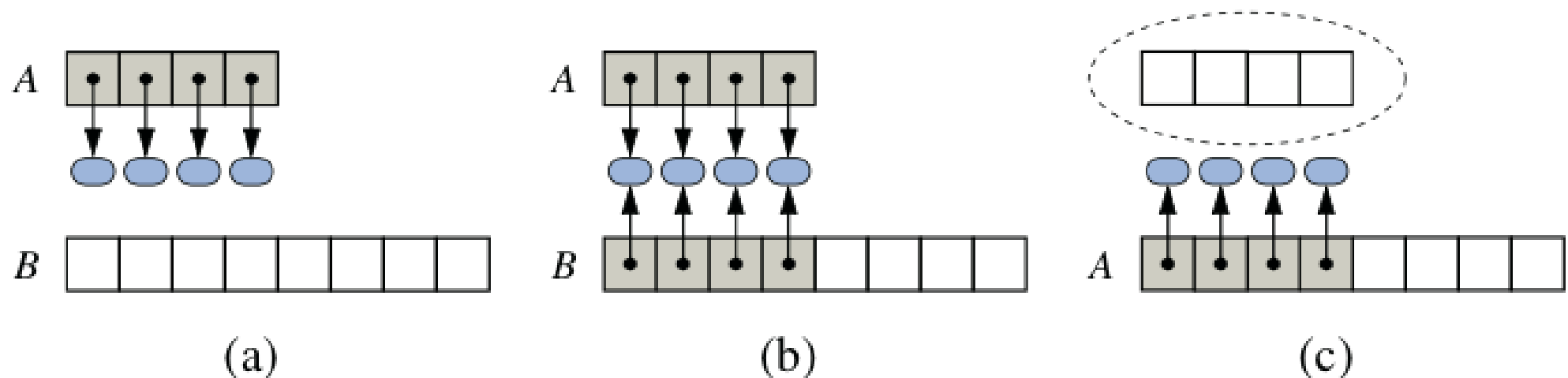
Array-based Lists

Method	Running Time
size()	$O(1)$
isEmpty()	$O(1)$
get(i)	$O(1)$
set(i, e)	$O(1)$
add(i, e)	$O(n)$
remove(i)	$O(n)$

Table 7.1: Performance of an array list with n elements realized by a fixed-capacity array.

Dynamic Arrays-based Lists

- When the array is full, we replace the array with a larger one



An illustration of “growing” a dynamic array: (a) create new array *B*; (b) store elements of *A* in *B*; (c) reassign reference *A* to the new array.

Dynamic Array-based Lists

```
/** Resizes internal array to have given capacity >= size. */  
protected void resize(int capacity) {  
    E[ ] temp = (E[ ]) new Object[capacity]; // safe cast; compiler may give warning  
    for (int k=0; k < size; k++)  
        temp[k] = data[k];  
    data = temp; // start using the new array  
}
```

A concrete implementation of a `resize` method, which should be included as a protected method within the original `ArrayList` class. The instance variable **data** corresponds to array *A* in the discussion (previous slide), and local variable **temp** corresponds to array *B*.

Dynamic Arrays-based Lists

- How large should the new array be?
 - ***Doubling strategy:*** double the size

```
28  /** Inserts element e to be at index i, shifting all subsequent elements later. */
29  public void add(int i, E e) throws IndexOutOfBoundsException {
30      checkIndex(i, size + 1);
31      if (size == data.length)                // not enough capacity
32          resize(2 * data.length);           // so double the current capacity
...    // rest of method unchanged...
```

Code Fragment 7.5: A revision to the ArrayList.add method, originally from Code Fragment 7.3, which calls the resize method of Code Fragment 7.4 when more capacity is needed.

Dynamic Arrays-based Lists

- Doubling Strategy

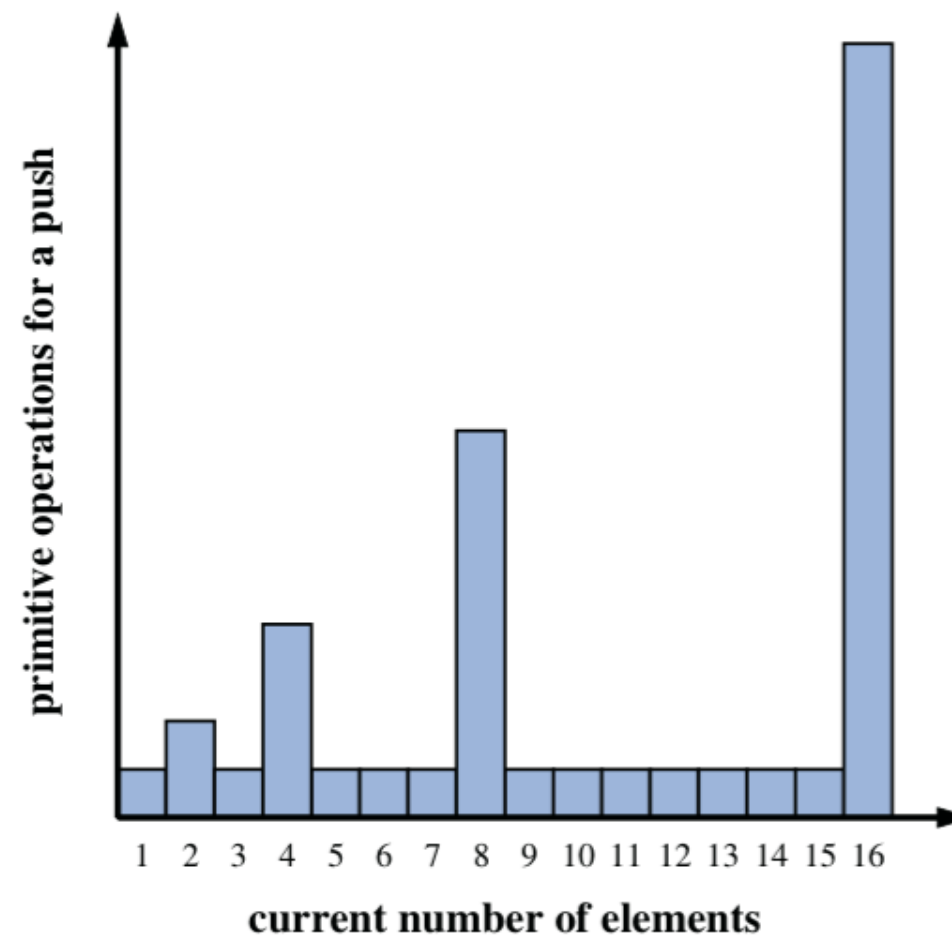


Figure 7.4: Running times of a series of push operations on a dynamic array.

Array vs. Array-based Lists

```
int [ ] intArray = new int[100];
```

```
ArrayList<Integer> arrayList = new ArrayList<Integer>;
```

What do you think is the difference between these two?

Implementation

- Two main representations
 - Array-based
 - uses a static data structure
 - reasonable if we know in advance the maximum number of the items in the list
 - **Linked-list based**
 - **uses dynamic data structure**
 - **best if don't know in advance the number of elements in the list (or if it varies greatly)**

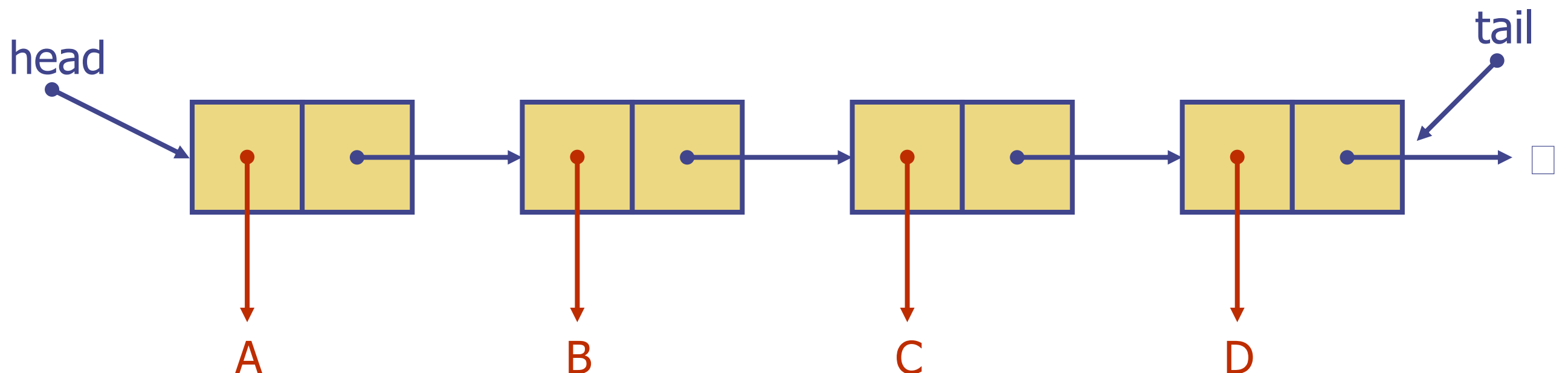
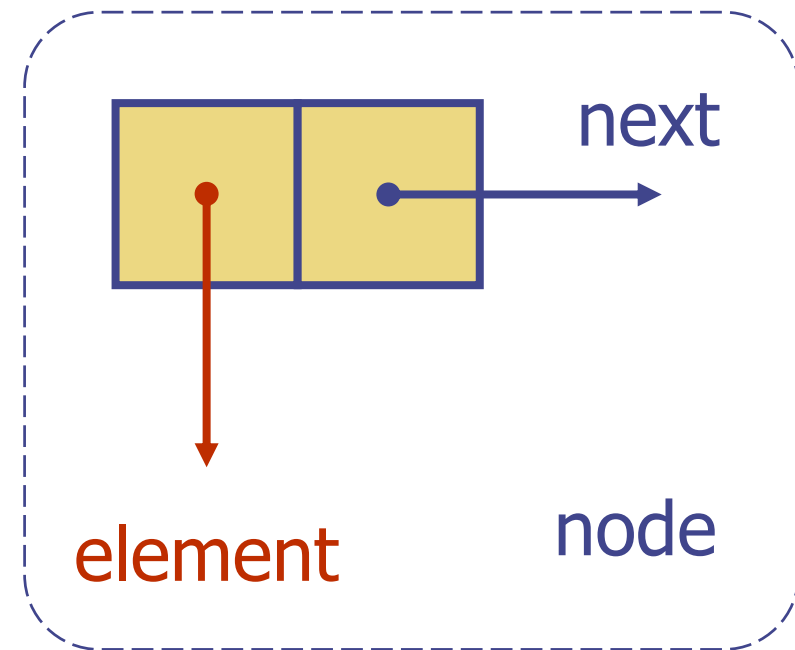
Singly Linked List

Singly Linked List

A singly linked list is a concrete data structure consisting of a sequence of nodes, starting from a head pointer

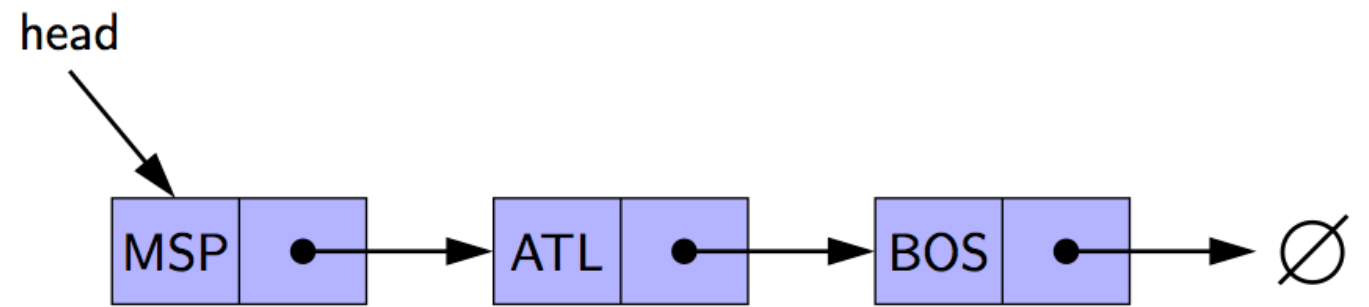
Each node stores

- element
- link to the next node

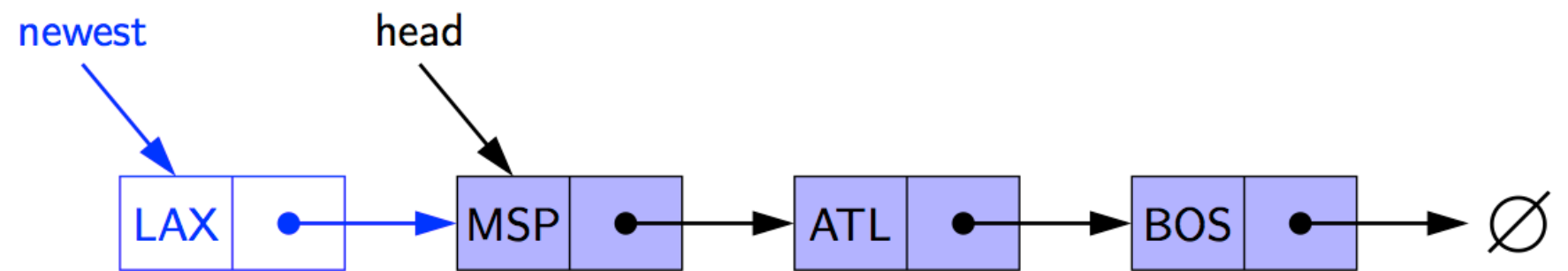


Addition to the Front

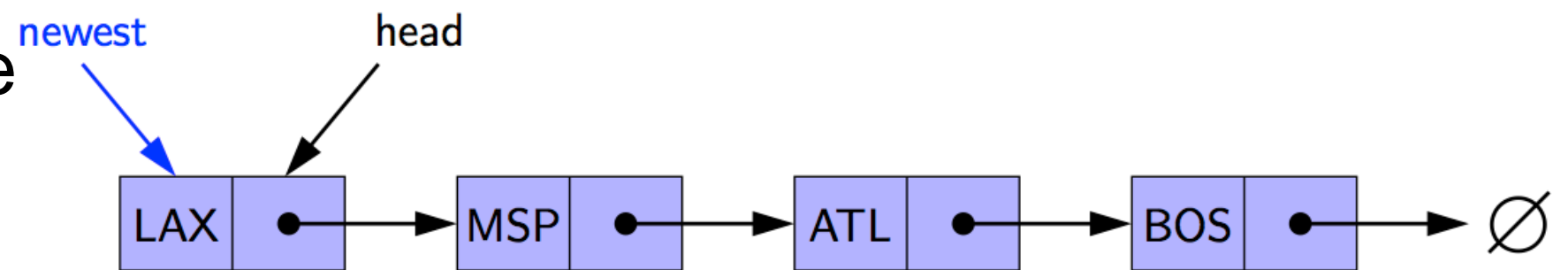
- Allocate new node
- Insert new element
- Have new node point to old head
- Update head to point to new node



(a)



(b)

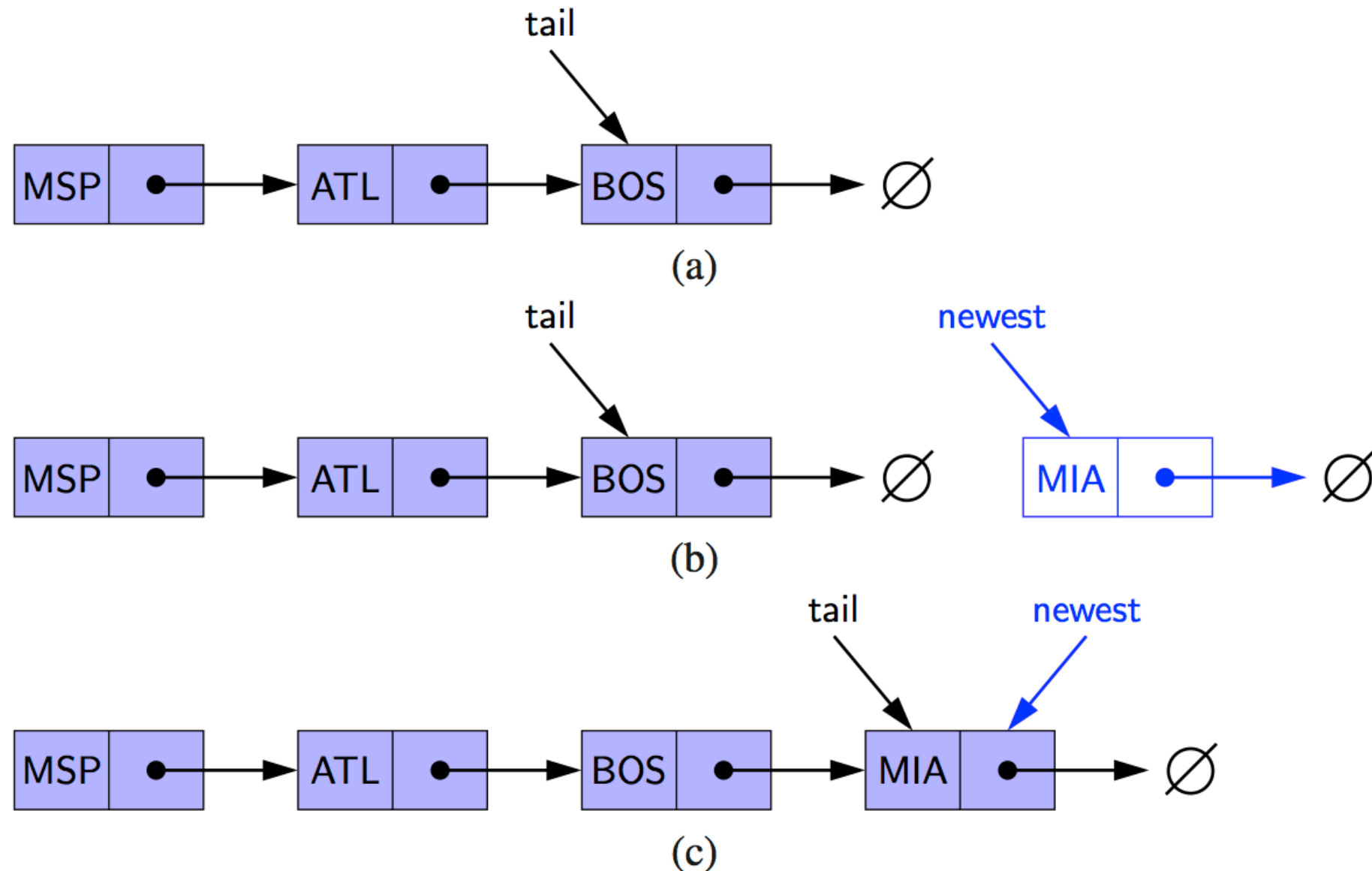


(c)

Time Complexity?

Addition to the Back

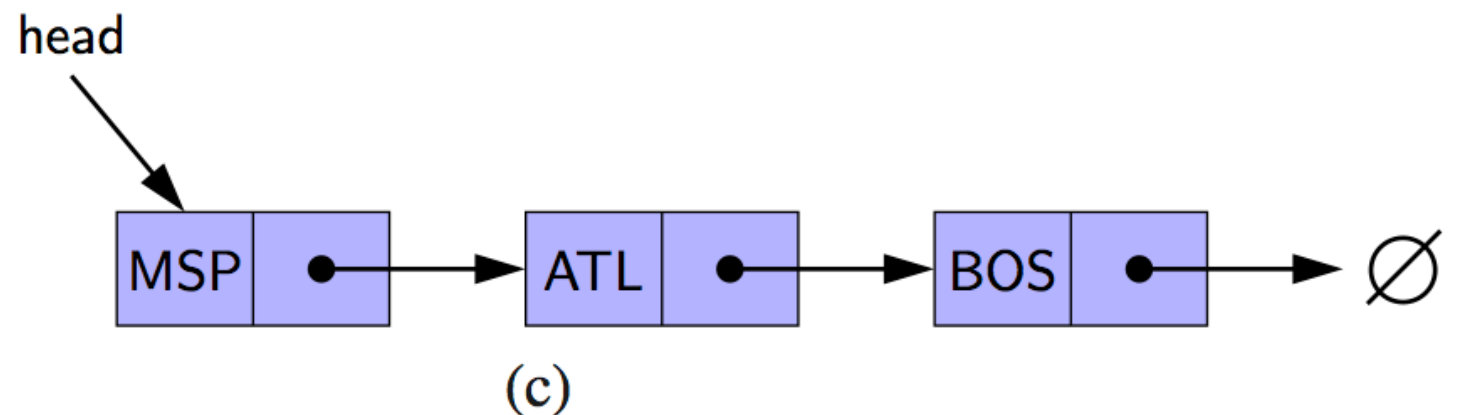
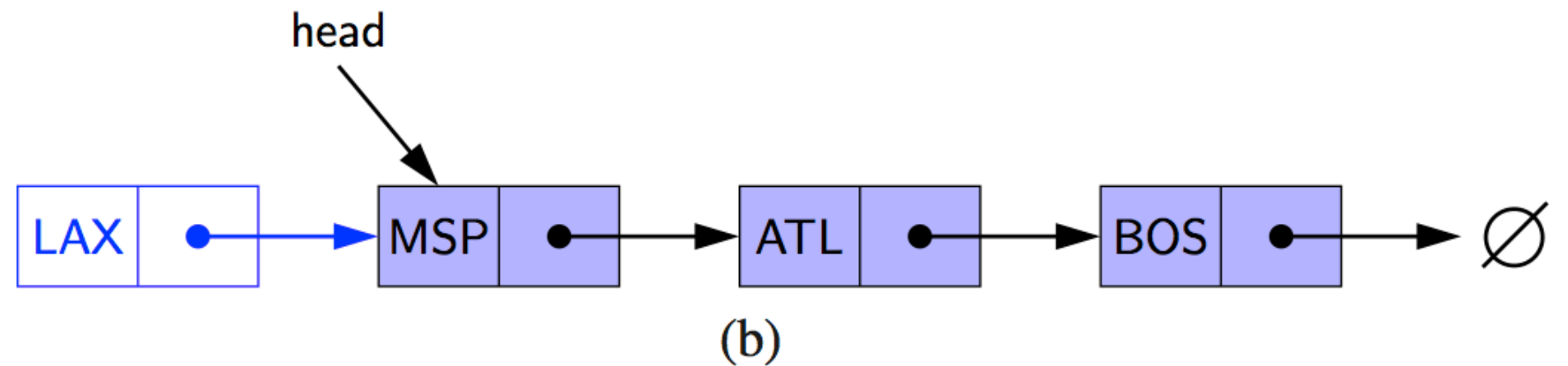
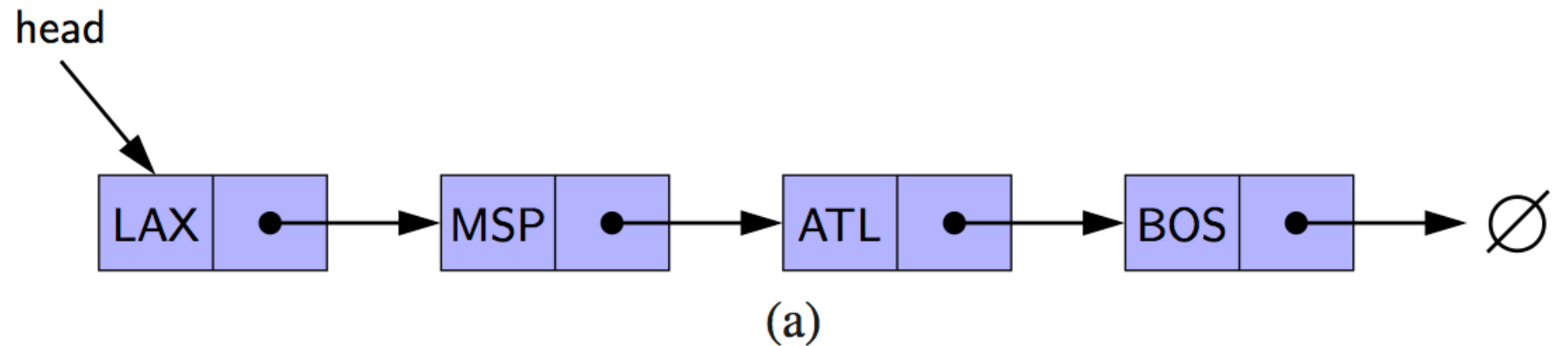
- Allocate a new node
- Insert new element
- Have new node point to null
- Have old last node point to new node
- Update tail to point to new node



Time Complexity?

Removal from the Front

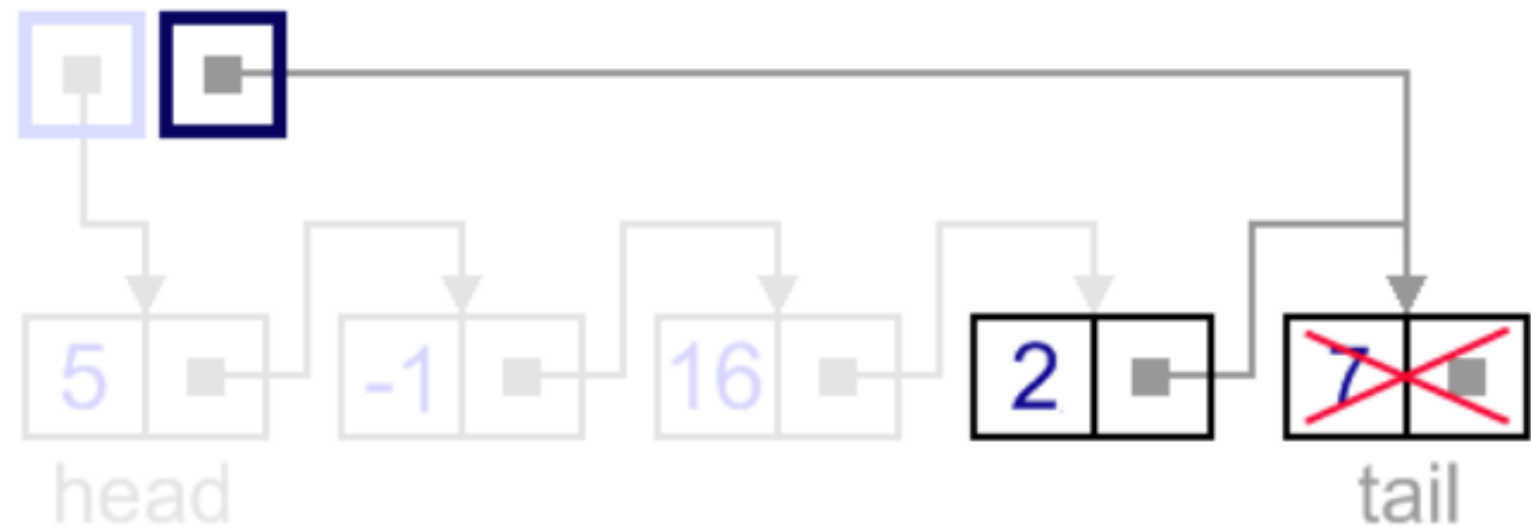
- Update head to point to next node in the list
- Allow garbage collector to reclaim the former first node



Time Complexity?

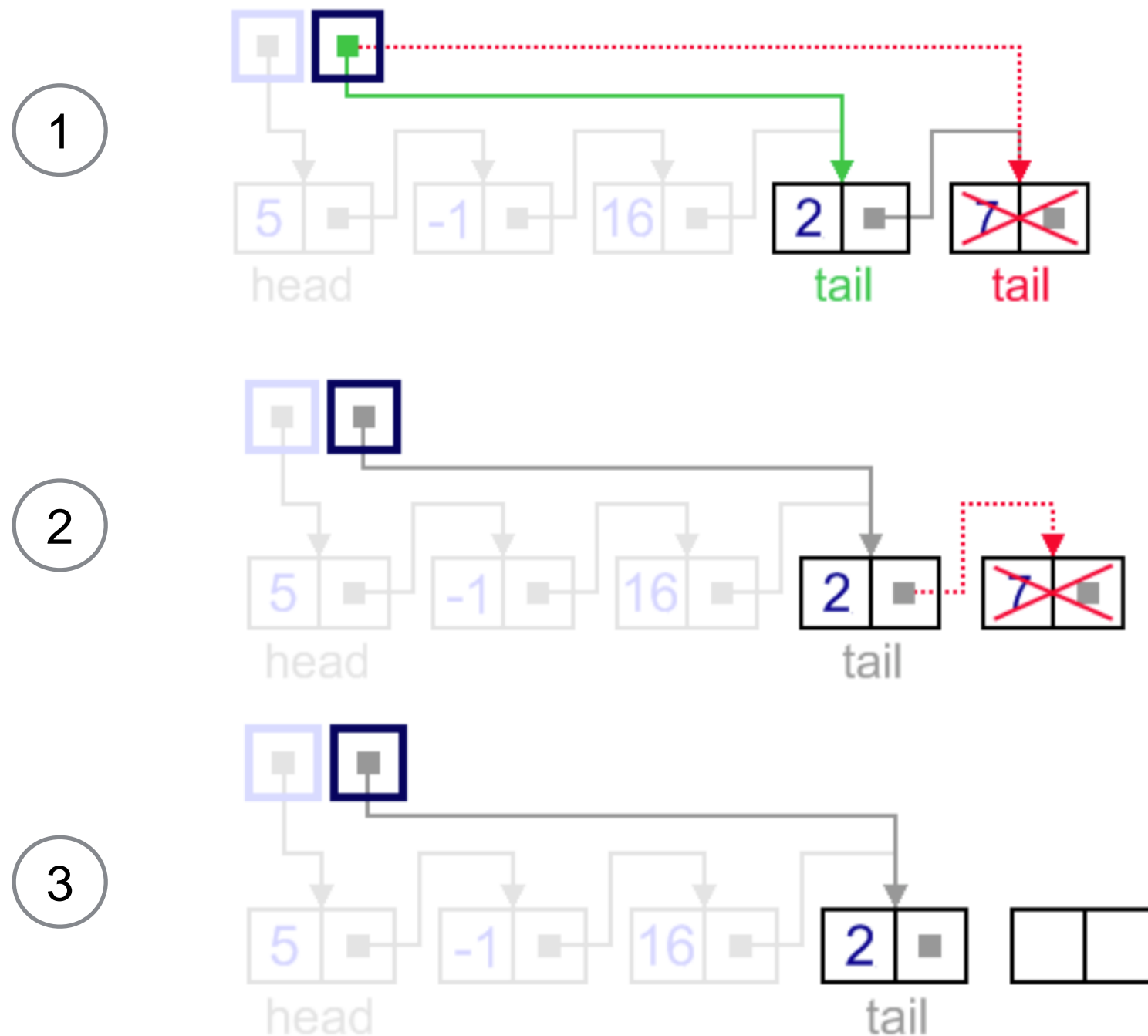
Removal from the Back

- Removing at the tail of a singly linked list is not efficient!
- There is no constant-time way to update the tail to point to the previous node
 - you must find the node before the tail iteratively



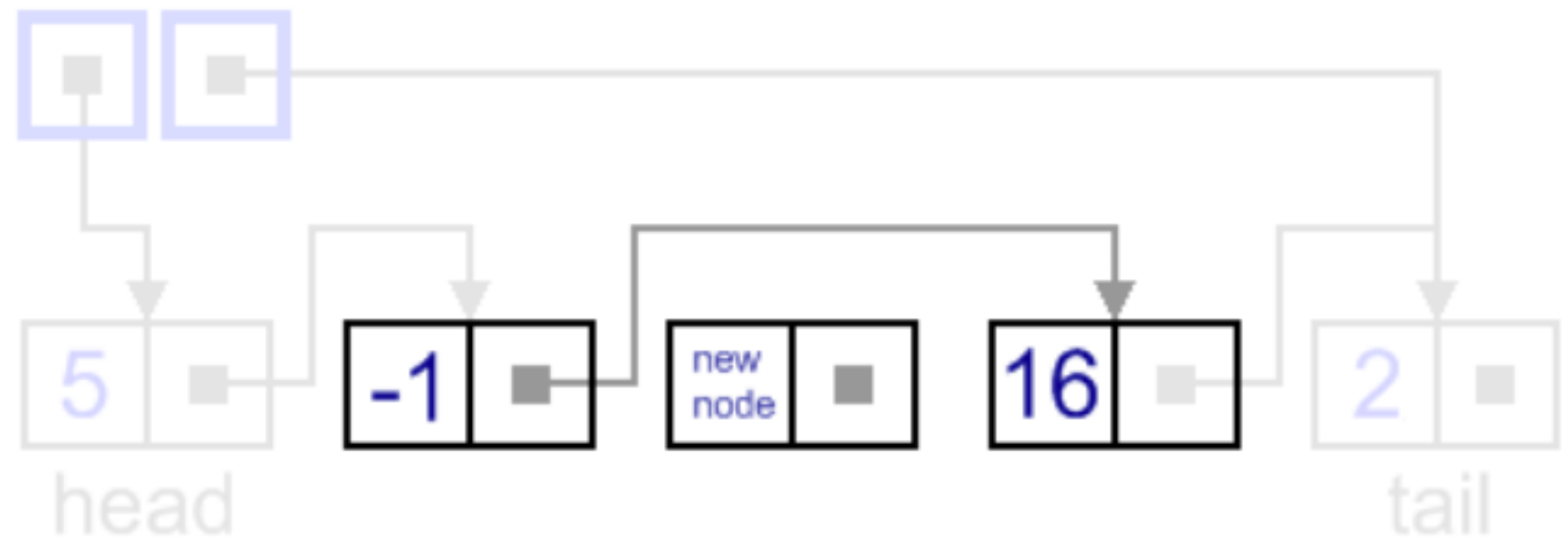
Time Complexity?

Removal from the Back

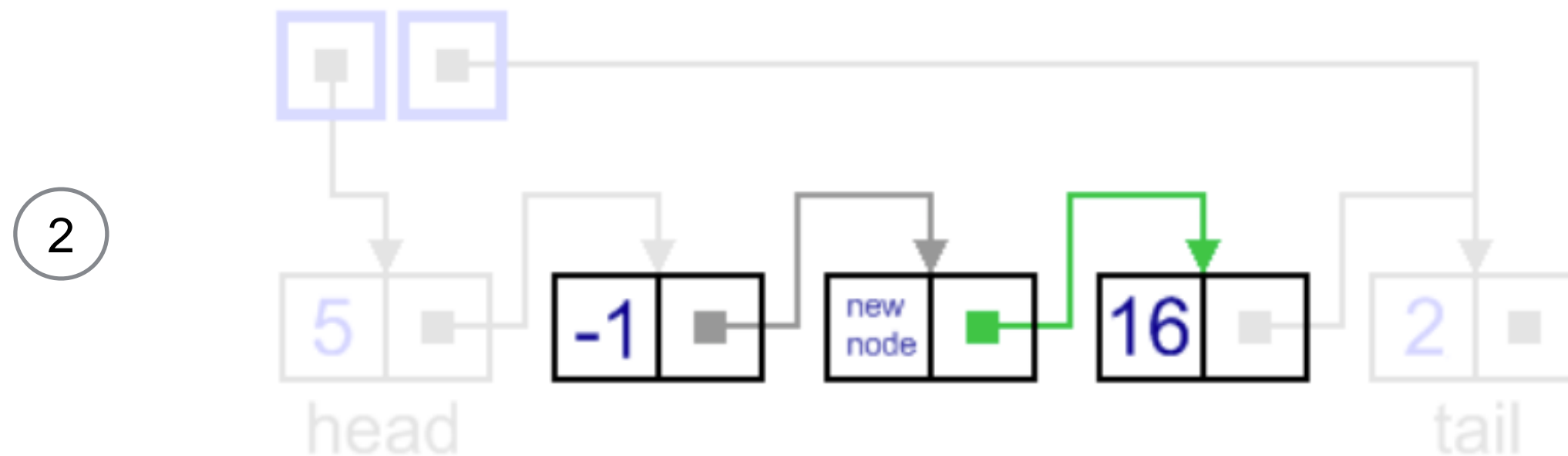
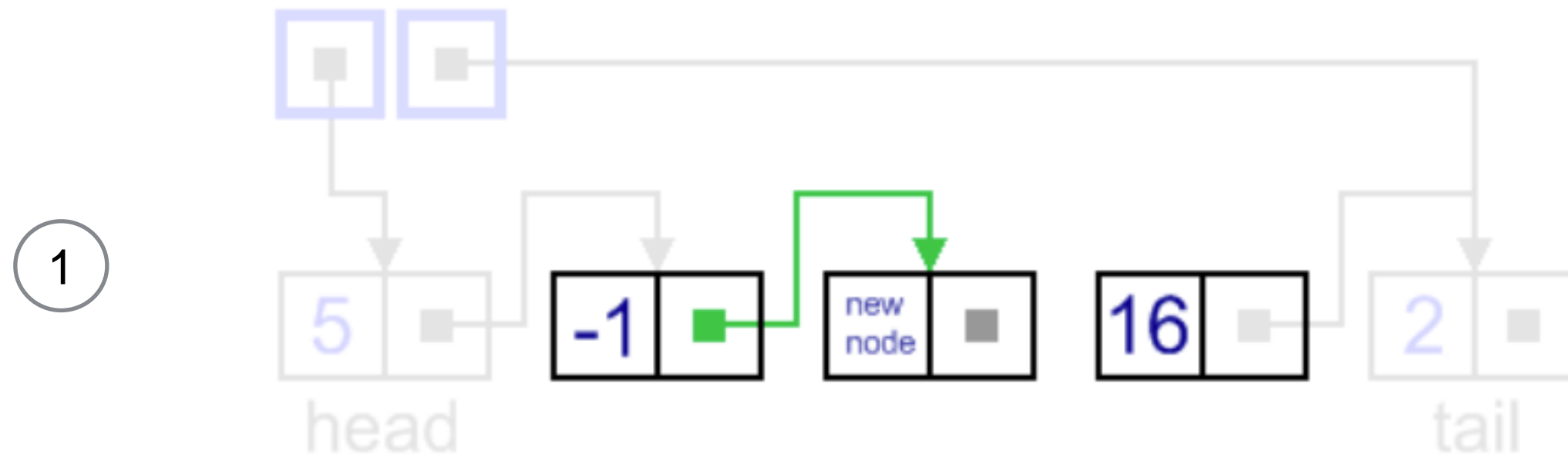


Addition between Nodes

- Inserted between two nodes



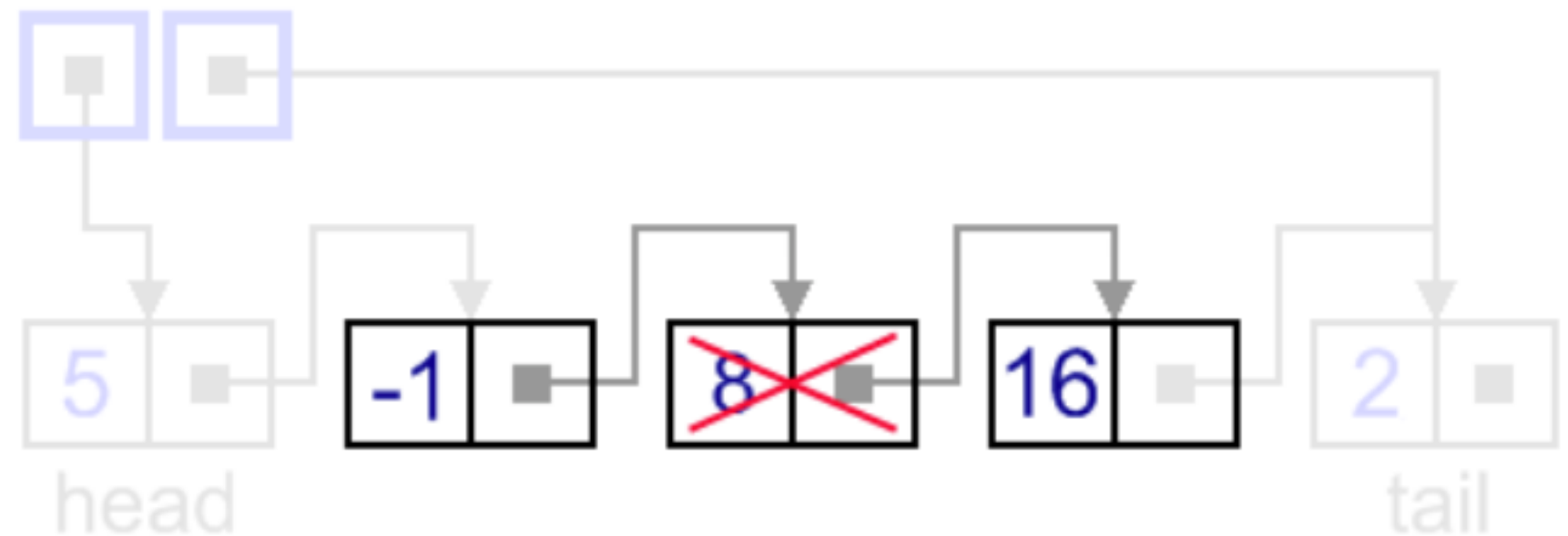
Addition between Nodes



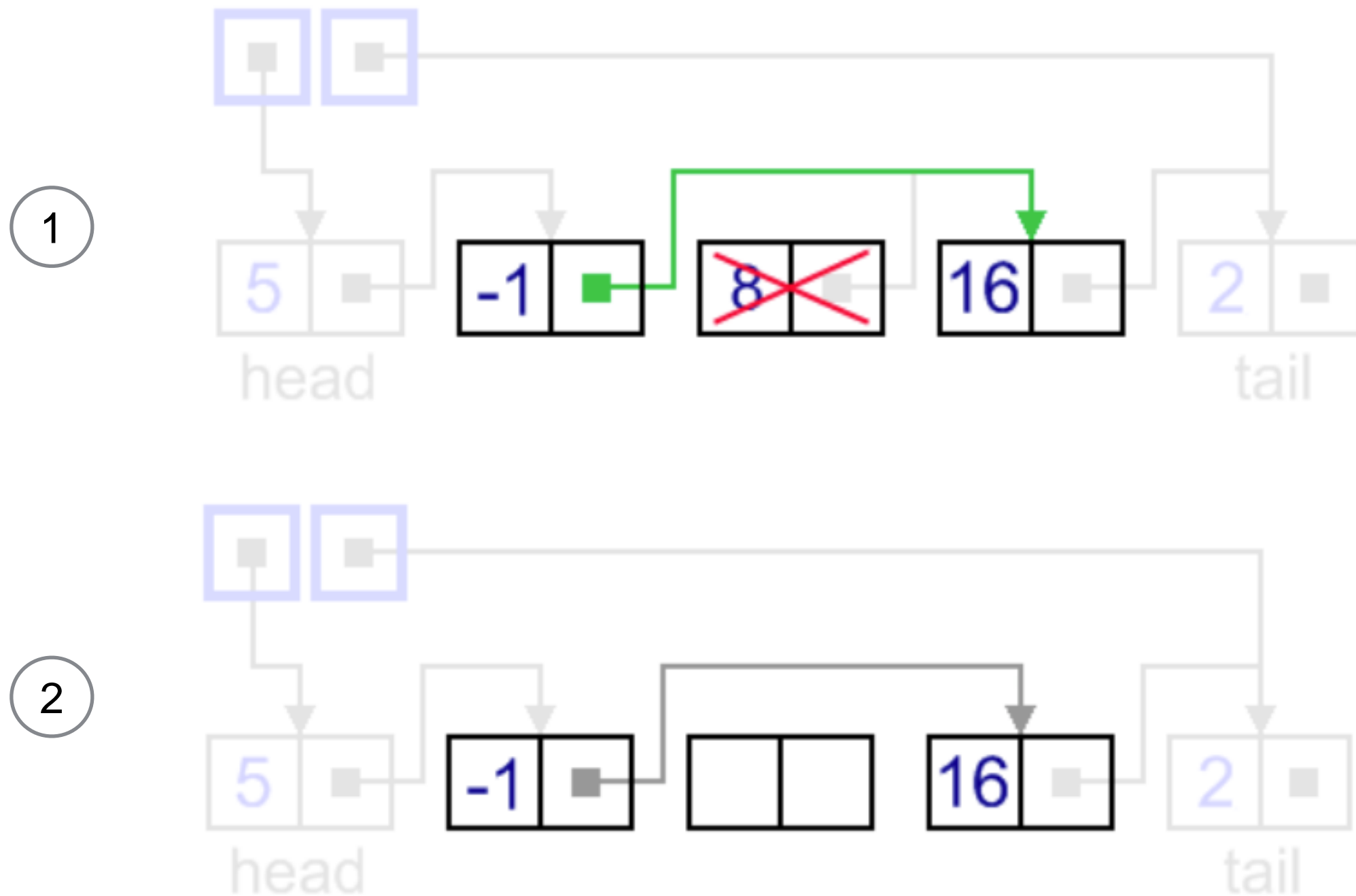
Time Complexity?

Removal between Nodes

- Node located between two nodes



Removal between Nodes



Time Complexity?

Singly Linked List Implementation

- Next few slides will present a complete implementation of a SinglyLinkedList supporting the following methods

`size()`: Returns the number of elements in the list.

`isEmpty()`: Returns **true** if the list is empty, and **false** otherwise.

`first()`: Returns (but does not remove) the first element in the list.

`last()`: Returns (but does not remove) the last element in the list.

`addFirst(e)`: Adds a new element to the front of the list.

`addLast(e)`: Adds a new element to the end of the list.

`removeFirst()`: Removes and returns the first element of the list.

Singly Linked List

```
1 public class SinglyLinkedList<E> {
2     //----- nested Node class -----
3     private static class Node<E> {
4         private E element;           // reference to the element stored at this node
5         private Node<E> next;        // reference to the subsequent node in the list
6         public Node(E e, Node<E> n) {
7             element = e;
8             next = n;
9         }
10        public E getElement() { return element; }
11        public Node<E> getNext() { return next; }
12        public void setNext(Node<E> n) { next = n; }
13    } //----- end of nested Node class -----
```

Singly Linked List

```
14 // instance variables of the SinglyLinkedList
15 private Node<E> head = null; // head node of the list (or null if empty)
16 private Node<E> tail = null; // last node of the list (or null if empty)
17 private int size = 0; // number of nodes in the list
18 public SinglyLinkedList() { } // constructs an initially empty list
19 // access methods
20 public int size() { return size; }
21 public boolean isEmpty() { return size == 0; }
22 public E first() { // returns (but does not remove) the first element
23     if (isEmpty()) return null;
24     return head.getElement();
25 }
26 public E last() { // returns (but does not remove) the last element
27     if (isEmpty()) return null;
28     return tail.getElement();
29 }
```

Singly Linked List

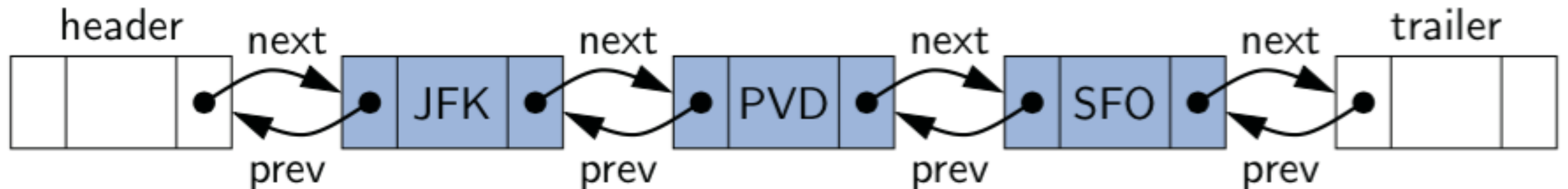
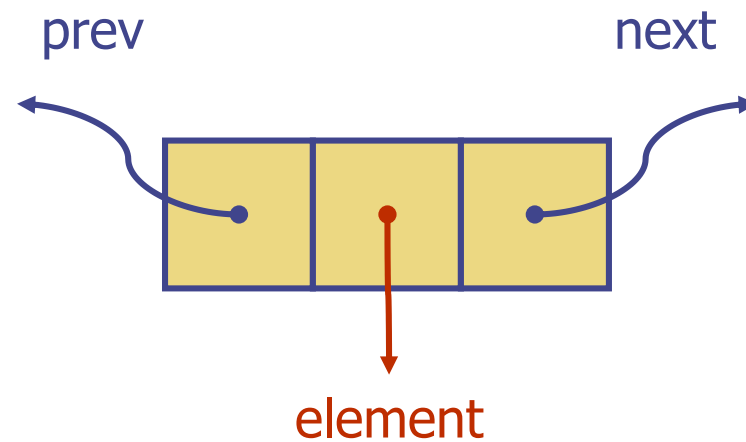
```
30 // update methods
31 public void addFirst(E e) { // adds element e to the front of the list
32     head = new Node<>(e, head); // create and link a new node
33     if (size == 0)
34         tail = head; // special case: new node becomes tail also
35     size++;
36 }
37 public void addLast(E e) { // adds element e to the end of the list
38     Node<E> newest = new Node<>(e, null); // node will eventually be the tail
39     if (isEmpty())
40         head = newest; // special case: previously empty list
41     else
42         tail.setNext(newest); // new node after existing tail
43     tail = newest; // new node becomes the tail
44     size++;
45 }
```

Singly Linked List

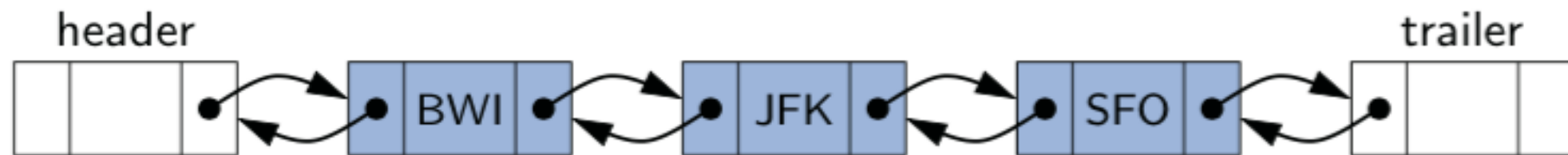
```
46  public E removeFirst() {           // removes and returns the first element
47      if (isEmpty()) return null;    // nothing to remove
48      E answer = head.getElement();
49      head = head.getNext();         // will become null if list had only one node
50      size--;
51      if (size == 0)
52          tail = null;              // special case as list is now empty
53      return answer;
54  }
55 }
```

Doubly Linked List

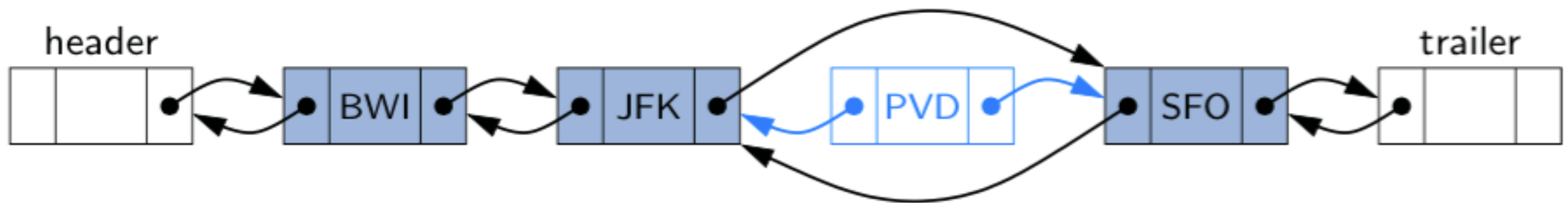
Doubly Linked List



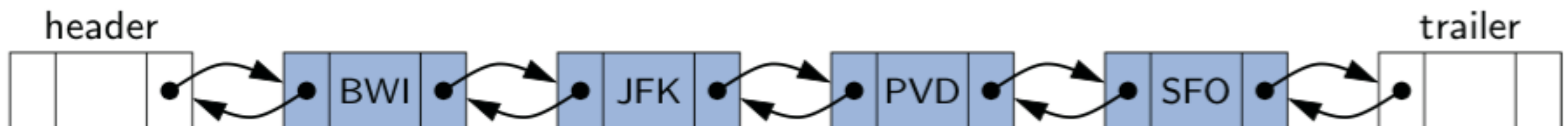
Addition between Nodes



(a)



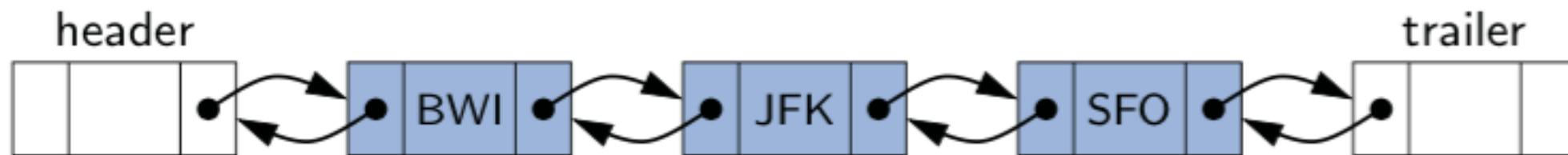
(b)



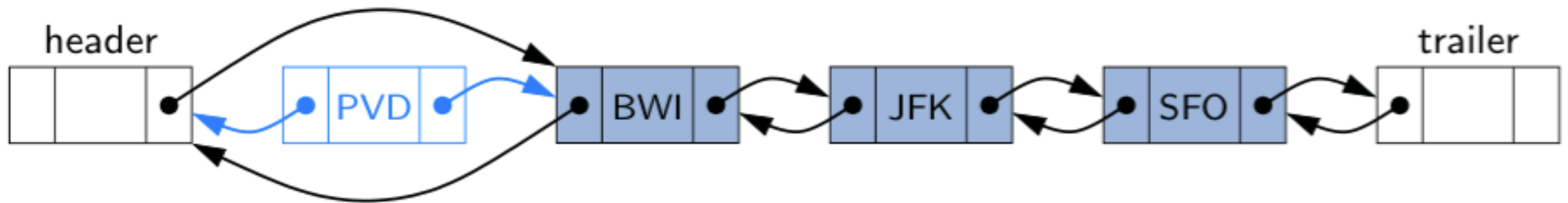
(c)

Adding an element to a doubly linked list: (a) before the operation; (b) after creating the new node; (c) after linking the neighbors to the new node.

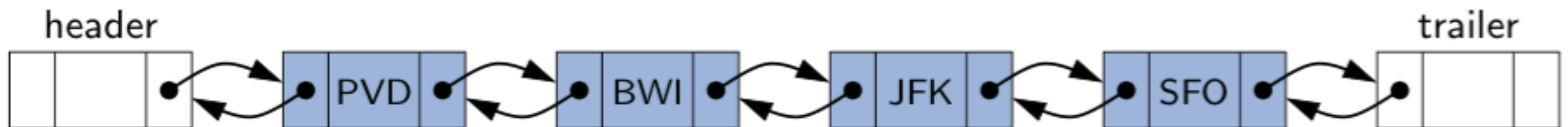
Addition to the Front



(a)



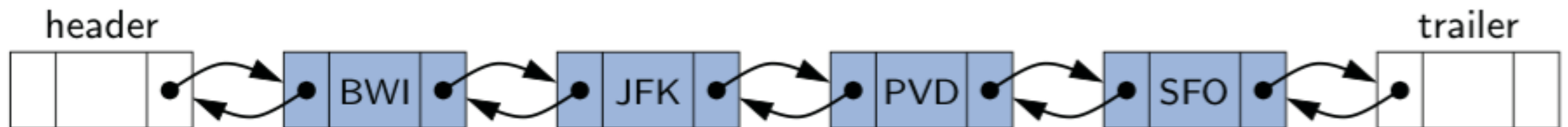
(b)



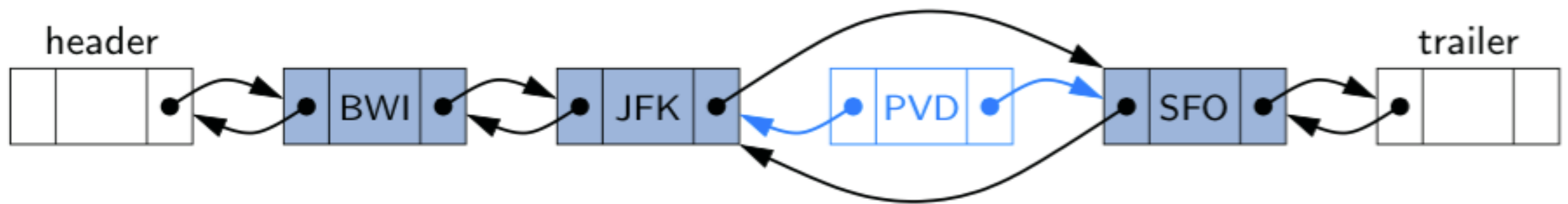
(c)

Adding an element to the front of a doubly linked list: (a) before the operation; (b) after creating the new node; (c) after linking the neighbors to the new node.

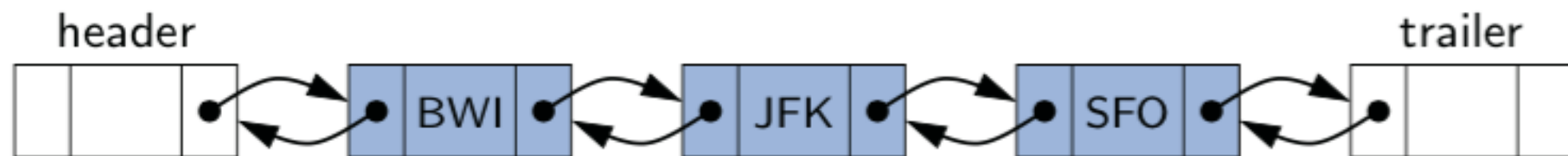
Removal between Nodes



(a)



(b)



(c)

Removing an element from a doubly linked list: (a) before the removal; (b) after linking out the old node; (c) after the removal and garbage collection.

Double Linked List Implementation

- Next few slides will present a complete implementation of a DoublyLinkedList supporting the following methods

`size()`: Returns the number of elements in the list.

`isEmpty()`: Returns **true** if the list is empty, and **false** otherwise.

`first()`: Returns (but does not remove) the first element in the list.

`last()`: Returns (but does not remove) the last element in the list.

`addFirst(e)`: Adds a new element to the front of the list.

`addLast(e)`: Adds a new element to the end of the list.

`removeFirst()`: Removes and returns the first element of the list.

`removeLast()`: Removes and returns the last element of the list.

Double Linked List

```
1  /** A basic doubly linked list implementation. */
2  public class DoublyLinkedList<E> {
3      //----- nested Node class -----
4      private static class Node<E> {
5          private E element;           // reference to the element stored at this node
6          private Node<E> prev;        // reference to the previous node in the list
7          private Node<E> next;        // reference to the subsequent node in the list
8          public Node(E e, Node<E> p, Node<E> n) {
9              element = e;
10             prev = p;
11             next = n;
12         }
13         public E getElement() { return element; }
14         public Node<E> getPrev() { return prev; }
15         public Node<E> getNext() { return next; }
16         public void setPrev(Node<E> p) { prev = p; }
17         public void setNext(Node<E> n) { next = n; }
18     } //----- end of nested Node class -----
19 }
```

Double Linked List

```
20 // instance variables of the DoublyLinkedList
21 private Node<E> header; // header sentinel
22 private Node<E> trailer; // trailer sentinel
23 private int size = 0; // number of elements in the list
24 /** Constructs a new empty list. */
25 public DoublyLinkedList() {
26     header = new Node<>(null, null, null); // create header
27     trailer = new Node<>(null, header, null); // trailer is preceded by header
28     header.setNext(trailer); // header is followed by trailer
29 }
30 /** Returns the number of elements in the linked list. */
31 public int size() { return size; }
32 /** Tests whether the linked list is empty. */
33 public boolean isEmpty() { return size == 0; }
34 /** Returns (but does not remove) the first element of the list. */
35 public E first() {
36     if (isEmpty()) return null;
37     return header.getNext().getElement(); // first element is beyond header
38 }
```

Double Linked List

```
39  /** Returns (but does not remove) the last element of the list. */
40  public E last() {
41      if (isEmpty()) return null;
42      return trailer.getPrev().getElement();           // last element is before trailer
43  }
```


Double Linked List

```
44 // public update methods
45 /** Adds element e to the front of the list. */
46 public void addFirst(E e) {
47     addBetween(e, header, header.getNext()); // place just after the header
48 }
49 /** Adds element e to the end of the list. */
50 public void addLast(E e) {
51     addBetween(e, trailer.getPrev(), trailer); // place just before the trailer
52 }
53 /** Removes and returns the first element of the list. */
54 public E removeFirst() {
55     if (isEmpty()) return null; // nothing to remove
56     return remove(header.getNext()); // first element is beyond header
57 }
58 /** Removes and returns the last element of the list. */
59 public E removeLast() {
60     if (isEmpty()) return null; // nothing to remove
61     return remove(trailer.getPrev()); // last element is before trailer
62 }
```


Double Linked List

```
63
64 // private update methods
65 /** Adds element e to the linked list in between the given nodes. */
66 private void addBetween(E e, Node<E> predecessor, Node<E> successor) {
67     // create and link a new node
68     Node<E> newest = new Node<>(e, predecessor, successor);
69     predecessor.setNext(newest);
70     successor.setPrev(newest);
71     size++;
72 }
73 /** Removes the given node from the list and returns its element. */
74 private E remove(Node<E> node) {
75     Node<E> predecessor = node.getPrev();
76     Node<E> successor = node.getNext();
77     predecessor.setNext(successor);
78     successor.setPrev(predecessor);
79     size--;
80     return node.getElement();
81 }
82 } //----- end of DoublyLinkedList class -----
```

Look at remove(e) method, and tell me what can go wrong?