



AAI2007 Introduction to Algorithms

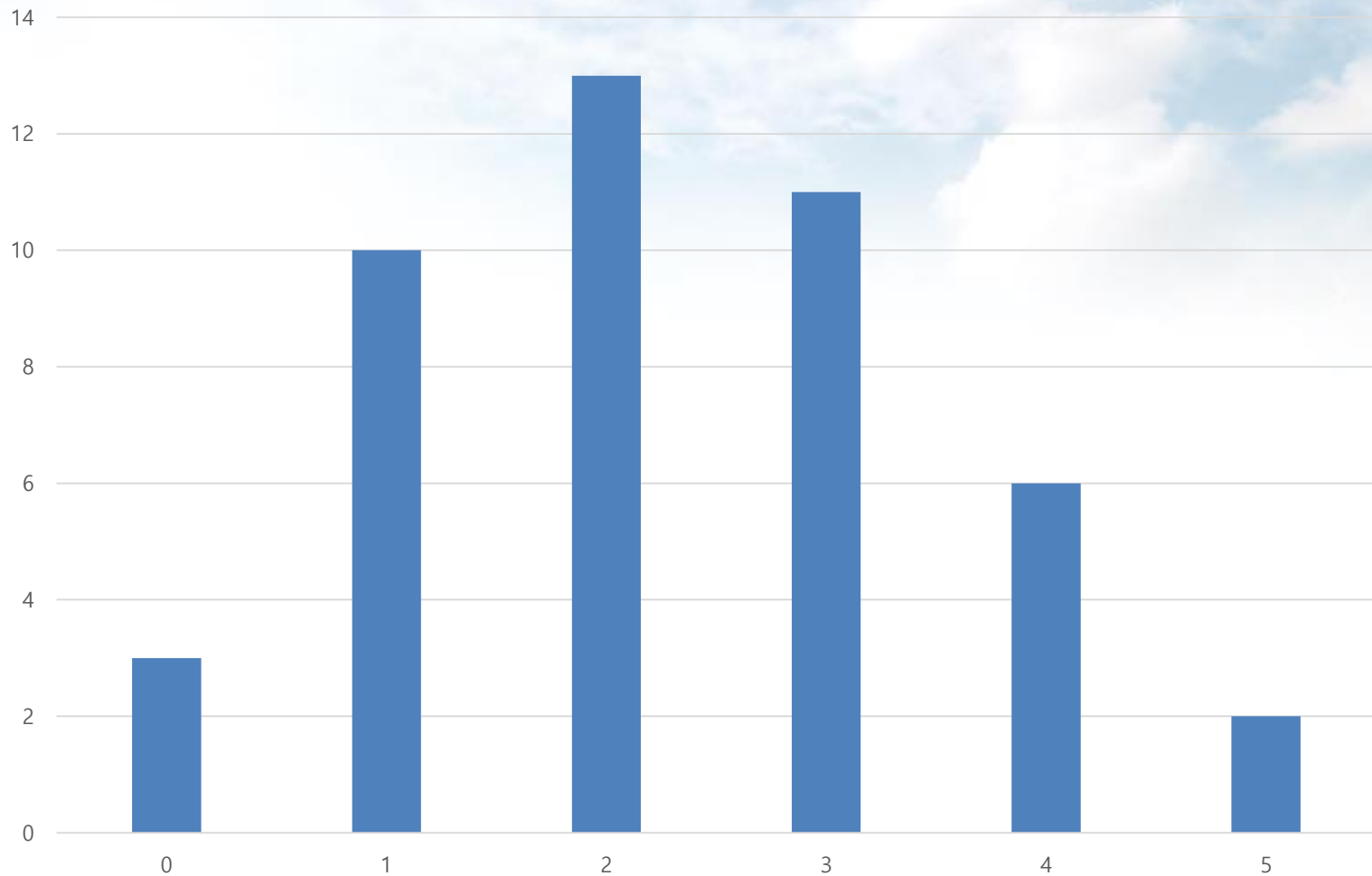
Week 2: Order of Complexity, List

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Level Test Result

Average: 2.28



In This Lecture

Outline

1. Order of Complexity
2. List

01. Order of Complexity

Algorithm Analysis

- Execution time measurement
 - Measures actual execution times of two algorithms
 - Requires actual implementation
 - Should use identical hardware
- Complexity analysis
 - (Roughly) Analyze without actual implementation
 - Count the number of operations during algorithm
 - Time complexity
 - Space complexity

01. Order of Complexity

Measurement

- An example code of measuring computing time

```
void main( void )
{
    clock_t start, finish;
    double duration;
    start = clock();
    // algorithm...
    // ....
    finish = clock();
    duration = (double)(finish - start) / CLOCKS_PER_SEC;
    printf("%f seconds.\n", duration);
}
```

01. Order of Complexity

Complexity Analysis

- How many algorithms can you imagine for solving a problem?
 - Many!
- Among them, what algorithm should we choose?
 - An efficient one!
 - So algorithm analysis is important!
- How to analyze algorithm (from an efficiency perspective)?
 - Complexity analysis!
 - Without actual implementation, roughly we can compare two algorithms
 - Independent for hardware or software environment

01. Order of Complexity

Complexity Analysis

- Computing time complexity
 - Count the number of operations
 - Basic operations: comparison, assignment, arithmetic, etc.
 - Not measure actual execution time!
- Represented by a time complexity function $\rightarrow T(n)$
 - A function of n (input size)
 - Roughly estimate time for running algorithm

01. Order of Complexity

An Example

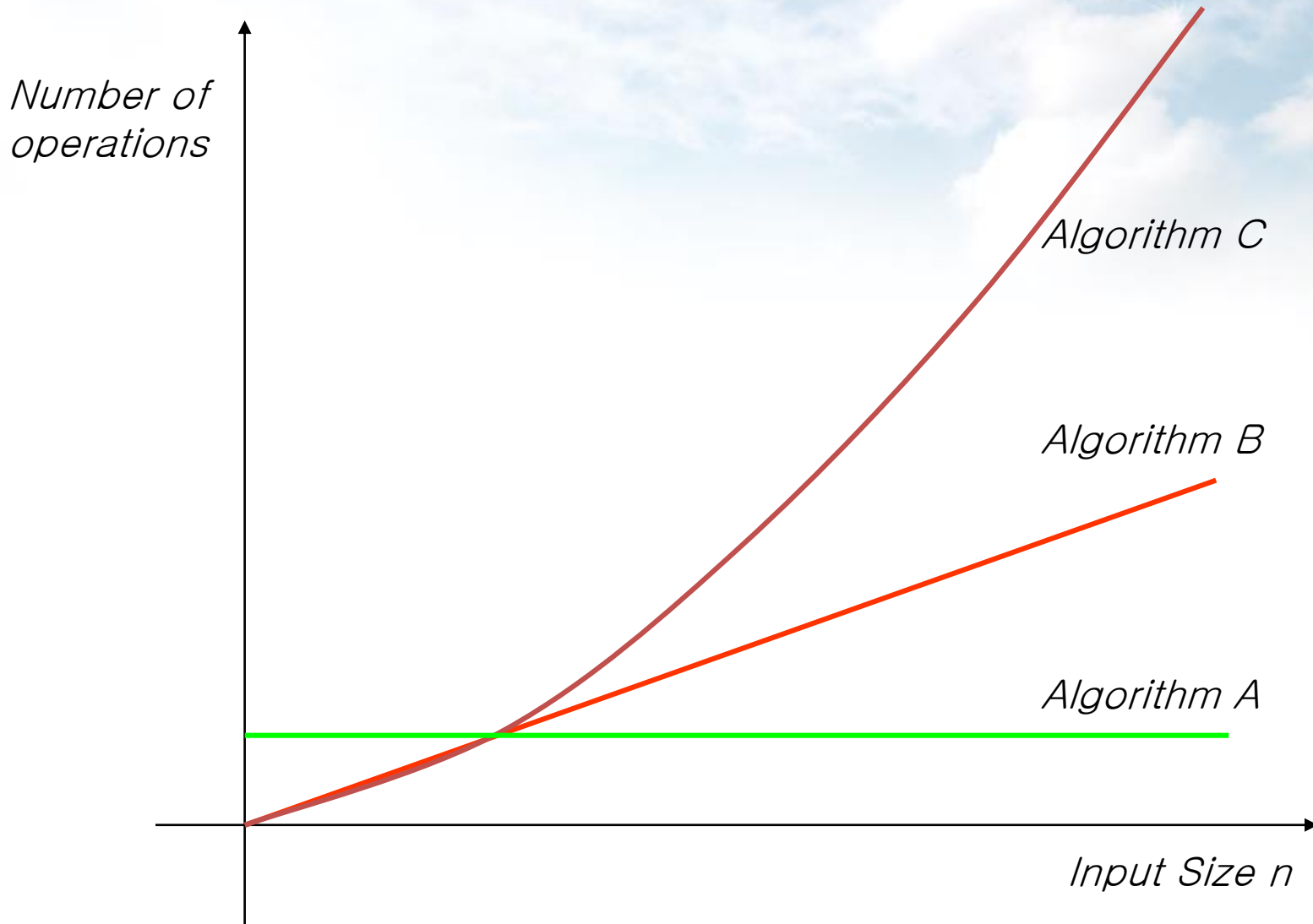
- Problem: sum n for n times
 - Let's count the number of operations
 - Let's not consider the for loop control operations

Algorithm A	Algorithm B	Algorithm C
$\text{sum} \leftarrow n * n;$	$\text{sum} \leftarrow 0;$ for $i \leftarrow 1$ to n do $\text{sum} \leftarrow \text{sum} + n;$	$\text{sum} \leftarrow 0;$ for $i \leftarrow 1$ to n do for $j \leftarrow 1$ to n do $\text{sum} \leftarrow \text{sum} + 1;$

	Algorithm A	Algorithm B	Algorithm C
Assignment	1	$n + 1$	$n * n + 1$
Addition		n	$n * n$
Multiplication	1		
Division			
Total	2	$2n + 1$	$2n^2 + 1$

01. Order of Complexity

An Example



01. Order of Complexity

Another Example

- By analyzing the code, we can roughly calculate the time complexity for the given algorithm

```
ArrayMax(A,n)
```

```
  tmp ← A[0];
```

```
  for i ← 1 to n-1 do
```

```
    if tmp < A[i] then
```

```
      tmp ← A[i];
```

```
  return tmp;
```

1 assignment

Exclude the for operation

n-1 comparisons

n-1 assignments (at most)

1 return

total = $2n$ (at most)

01. Order of Complexity

Big O Notation

- If n is large, the highest exponent part actually matters, ignoring other parts
 - E.g., $n = 1000$, $T(n) = 1,001,001$, first part accounts for about 99%

$n=1000$

$$T(n) = n^2 + n + 1$$

Input size: n

99% 1%

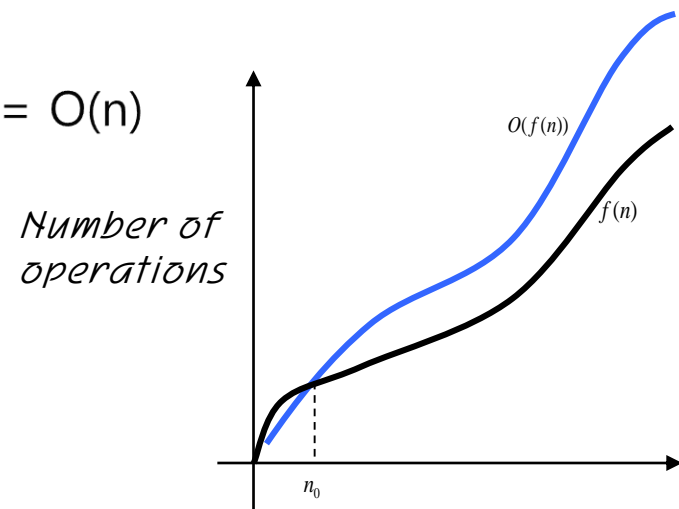
- So, typically it is enough to consider the part that most affect

01. Order of Complexity

Big O Notation


- Big O Definition: (Asymptotic Upper Bound)
 - For given $f(n)$ and $g(n)$,
for all $n \geq n_0$, if there exist two constants c and n_0
satisfying $|f(n)| \leq c|g(n)|$
then $f(n) = O(g(n))$
- Big O represents the upper bound
 - E.g., if $n \geq 5$, $2n+1 < 10n \rightarrow 2n+1 = O(n)$

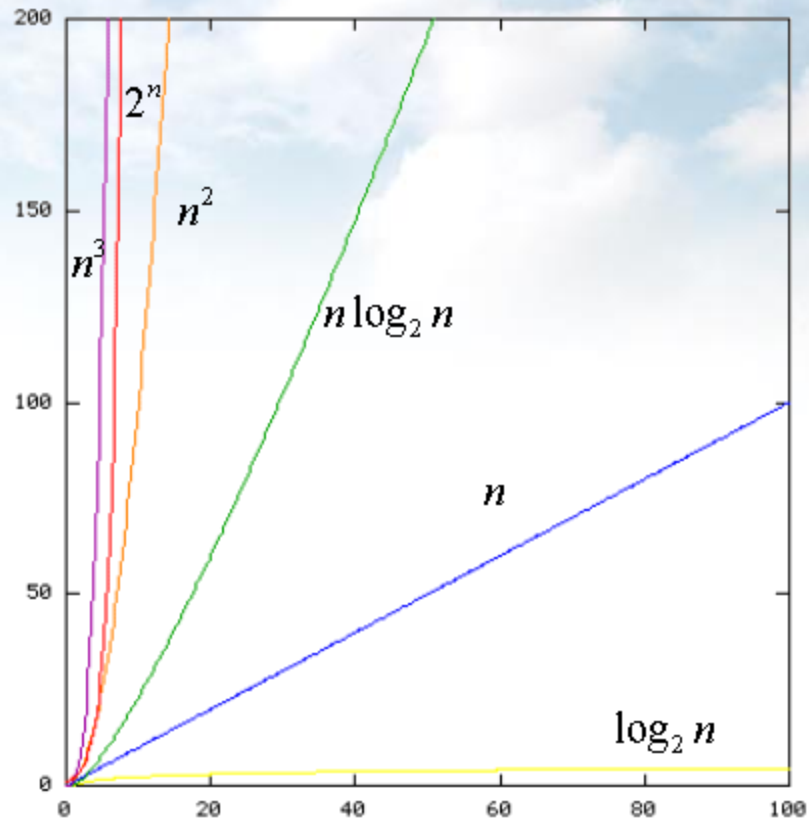
if $n_0 = 2$, $c = 2$,
for $n \geq 2$, $2n+1 \leq 2n^2$
 $\rightarrow O(n^2)$



01. Order of Complexity

Big O Notation

- 
- $O(1)$: constant
 - $O(\log n)$: log
 - $O(n)$: linear
 - $O(n \log n)$: log-linear
 - $O(n^2)$: quadratic
 - $O(n^3)$: cubic
 - $O(2^n)$: exponent
 - $O(n!)$: factorial



01. Order of Complexity

Comparisons

Complexity	n					
	1	2	4	8	16	32
1	1	1	1	1	1	1
$\log n$	0	1	2	3	4	5
n	1	2	4	8	16	32
$n \log n$	0	2	8	24	64	160
n^2	1	4	16	64	256	1024
n^3	1	8	64	512	4096	32768
2^n	2	4	16	256	65536	4294967296
$n!$	1	2	24	40326	20922789888000	26313×10^{33}

01. Order of Complexity

Comparisons

	A	B	C	D	E
	$100n$	$10n\log_2 n$	$5n^2$	n^3	2^n
10	10^{-3} sec	$1.5 \cdot 10^{-3}$ sec	$5 \cdot 10^{-4}$ sec	10^{-3} sec	10^{-3} sec
100	10^{-2} sec	0.03 sec	$5 \cdot 10^{-2}$ sec	1 sec	$4 \cdot 10^{14}$ cent
1,000	10^{-1} sec	0.45 sec	5 sec	1.6 min	***
10,000	1 sec	6.1 sec	8.3 min	11.57 d	***
100,000	10 sec	1.5 min	13.8 hour	31.7 y	***

01. Order of Complexity

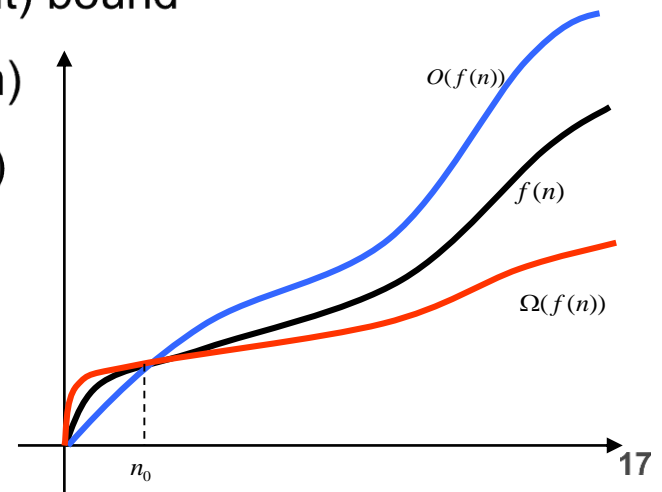
Big Ω Notation

- Big Omega Definition: (Asymptotic Lower Bound)
 - For given $f(n)$ and $g(n)$,
for all $n \geq n_0$, if there exist two constants c and n_0
satisfying $|f(n)| \geq c|g(n)|$
then $f(n) = \Omega(g(n))$
- Big Omega represents the lower bound
 - E.g., if $n \geq 1$, $2n+1 \geq 10n \rightarrow 2n+1 = \Omega(n)$

01. Order of Complexity

Big θ Notation

- Big Theta Definition: (Asymptotic Tight Bound)
 - For given $f(n)$ and $g(n)$,
for all $n \geq n_0$, if there exist three constants c_1 , c_2 , and n_0
satisfying $c_1|g(n)| \leq |f(n)| \leq c_2|g(n)|$
then $f(n) = \theta(g(n))$
- Big Theta represents the lower and upper (tight) bound
 - $f(n) = O(g(n))$ and $f(n) = \Omega(g(n)) \rightarrow f(n) = \theta(n)$
 - E.g., if $n \geq 1$, $n \leq 2n+1 \leq 3n \rightarrow 2n+1 = \theta(n)$





List

02. List

Definition

- An abstract data type (ADT) that represents a countable number of ordered values, where the same value may occur more than once
- Examples
 - Days (Monday, Tuesday, ...)
 - Alphabet (A, B, ...)
 - Card (Ace, 2, 3, ...)
 - Phone numbers



$$L = (item_0, item_1, \dots, item_{n-1})$$

02. List

ADT

- Object:

A sequence with n values

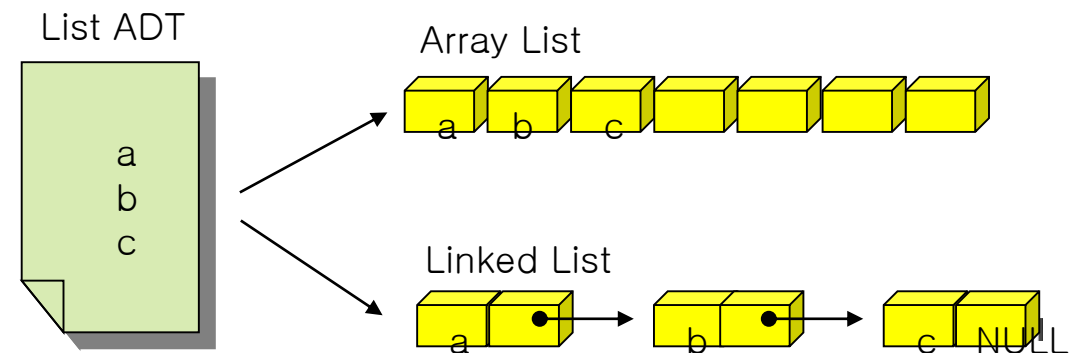
- Operations:

- `add_last(list, item)`
- `add_first(list, item)`
- `add(list, pos, item)`
- `delete(list, pos)`
- `clear(list)`
- `replace(list, pos, item)`
- `is_in_list(list, item)`
- `get_entry(list, pos)`
- `get_length(list)`
- `is_empty(list)`
- `is_full(list)`
- `display(list)`

02. List

List Implementation

- Array List
 - Simple
 - Insertion and deletion may not be easy
 - Limited capacity
- Linked List
 - Difficult
 - Efficient in insertion and deletion
 - No limitation in capacity

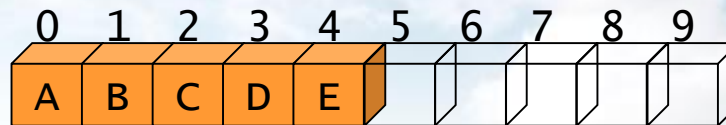


02. List

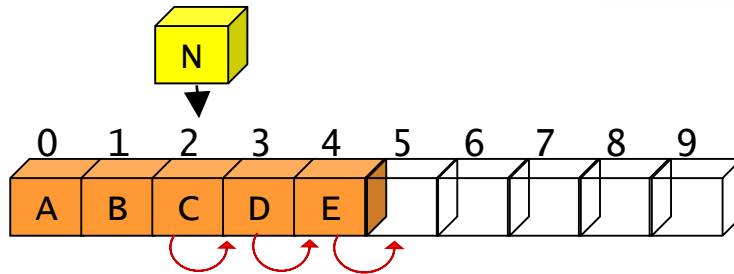
Array List

- Store data in one-dimensional array sequentially

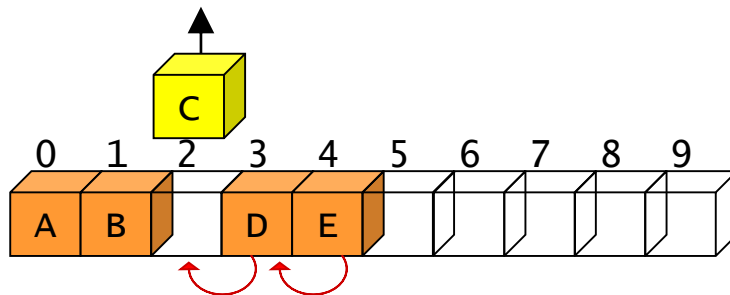
- $L = (A, B, C, D, E)$



- Insertion



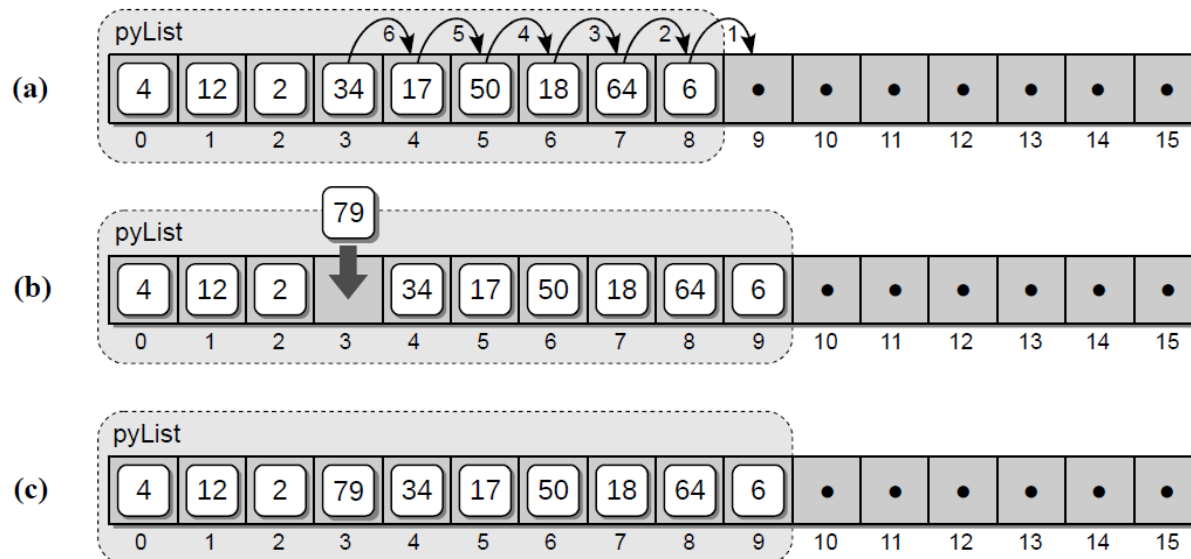
- Deletion



02. List

Array List: Insertion

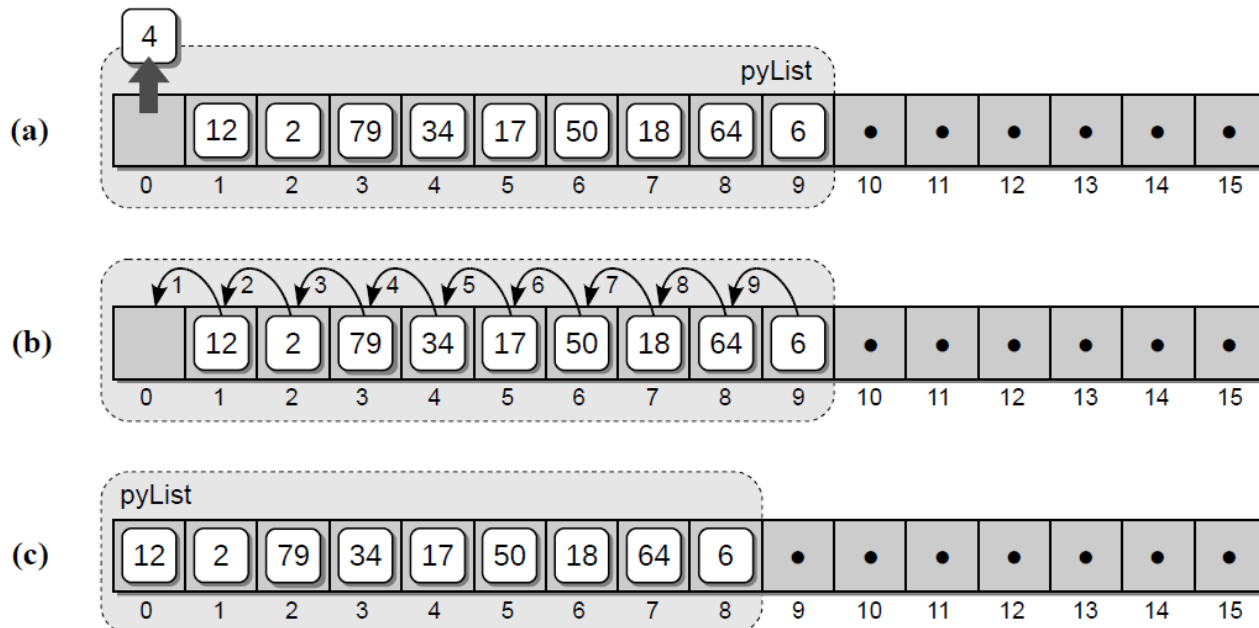
- Inserting an item into a list
 - (a) the array elements are shifted to the right one at a time, traversing from right to left
 - (b) the new value is then inserted into the array at the given position
 - (c) the result after inserting the item



02. List

Array List: Deletion

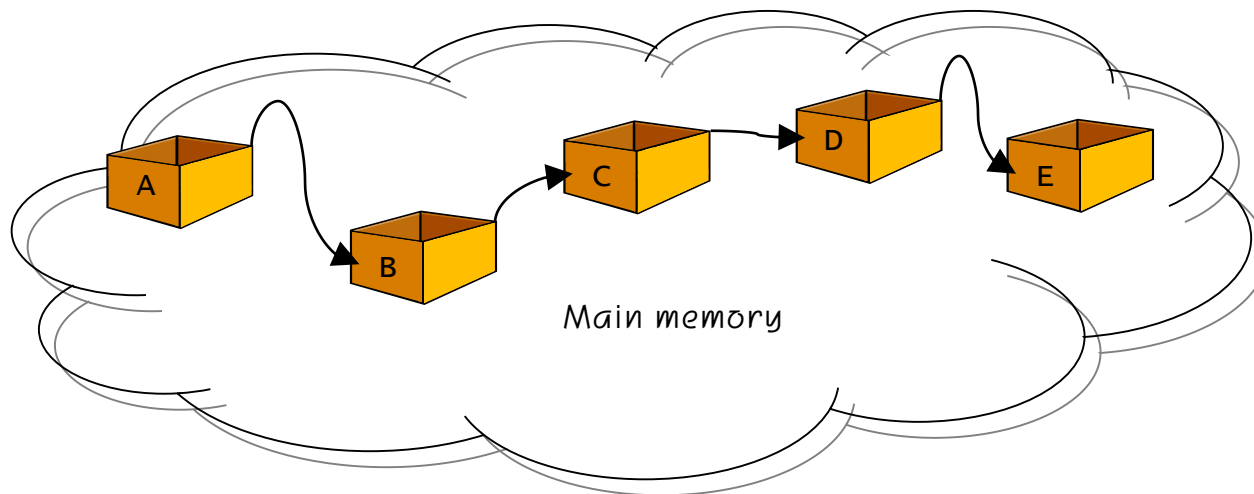
- Removing an item from a list
 - (a) a copy of the item is saved
 - (b) the array elements are shifted to the left one at a time, traversing left to right
 - (c) the size of the list is decremented by one



02. List

Linked Representation

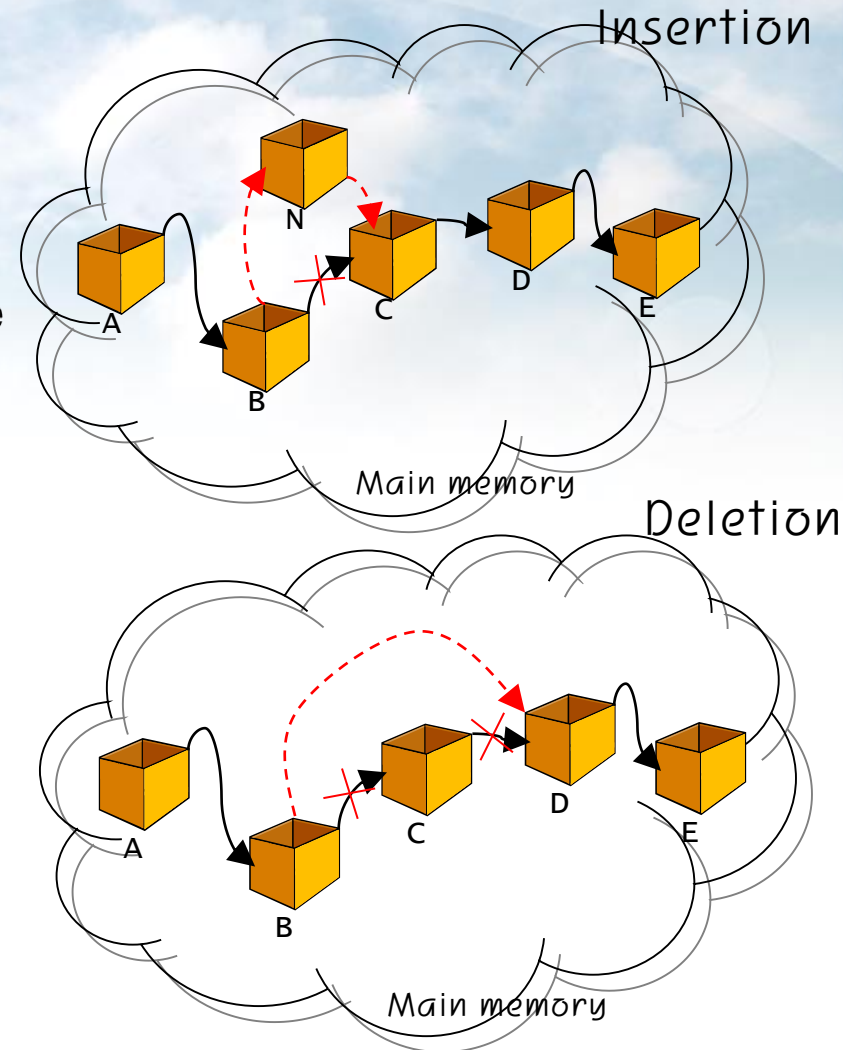
- Linked Representation
 - Node: Data & Link
 - Data: data value
 - Link: next node
- The sequence of link may not be identical to that in physical memory



02. List

Linked Representation

- Pros
 - Insertion/deletion are easy
 - Need not continuous memory space
 - No space limitation
- Cons
 - Difficult to implement
 - Possible errors



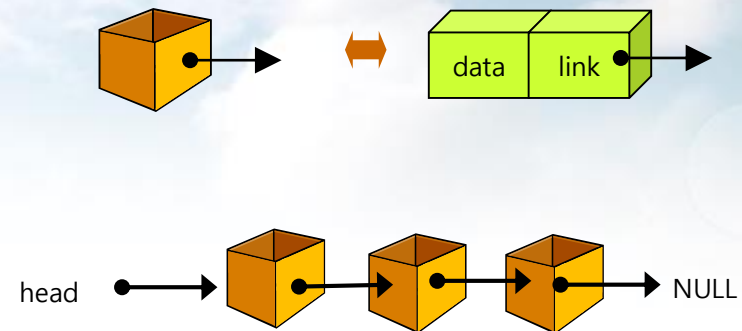
02. List

Structure

- Node = (data, link)

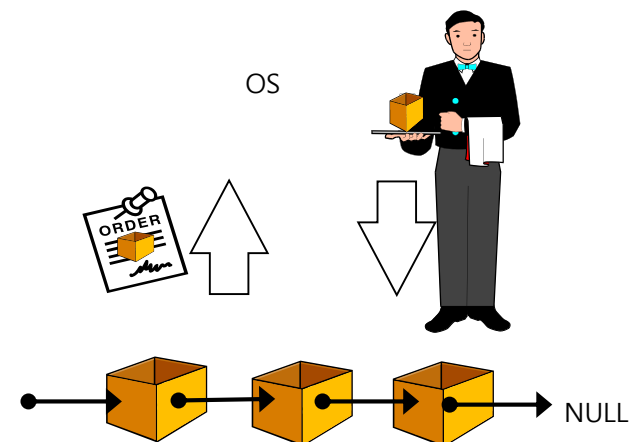
```
class ListNode :  
    def __init__( self, data ) :  
        self.data = data  
        self.next = None
```

- “Head” indicates the first node



- Node creation

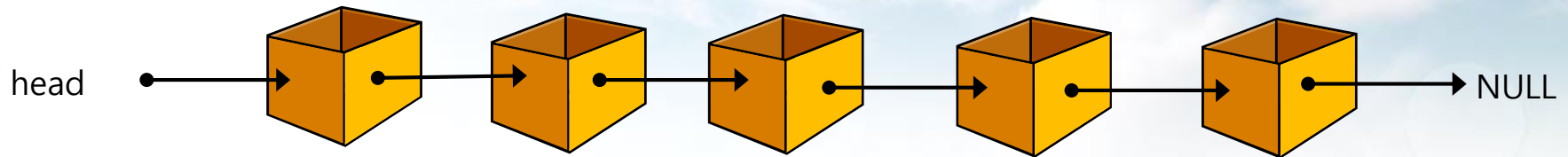
- `a = ListNode(11); a.next = b`
- `b = ListNode(52); b.next = c`
- `c = ListNode(18)`



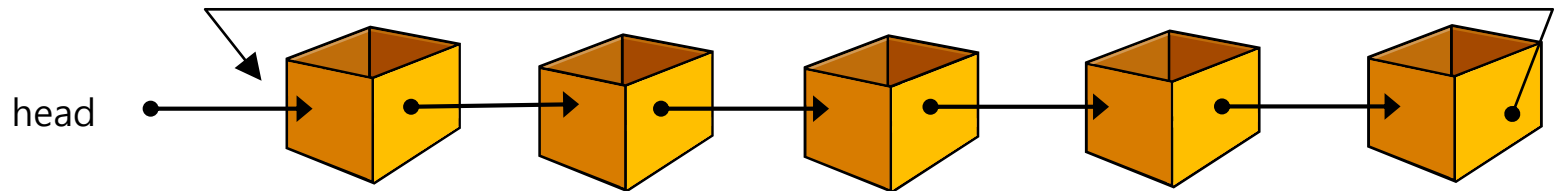
02. List

Linked List Types

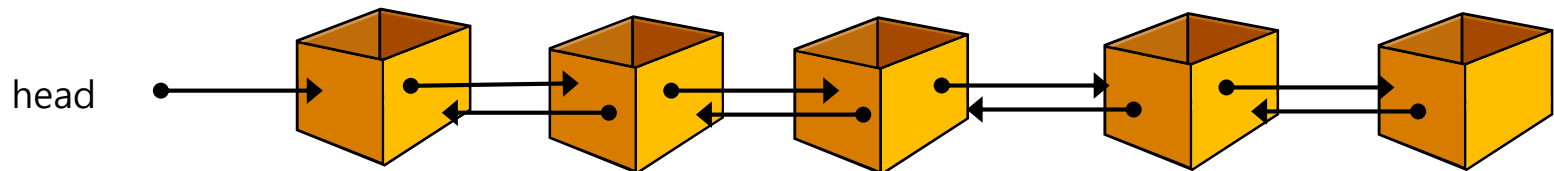
- Singly linked list



- Circular linked list



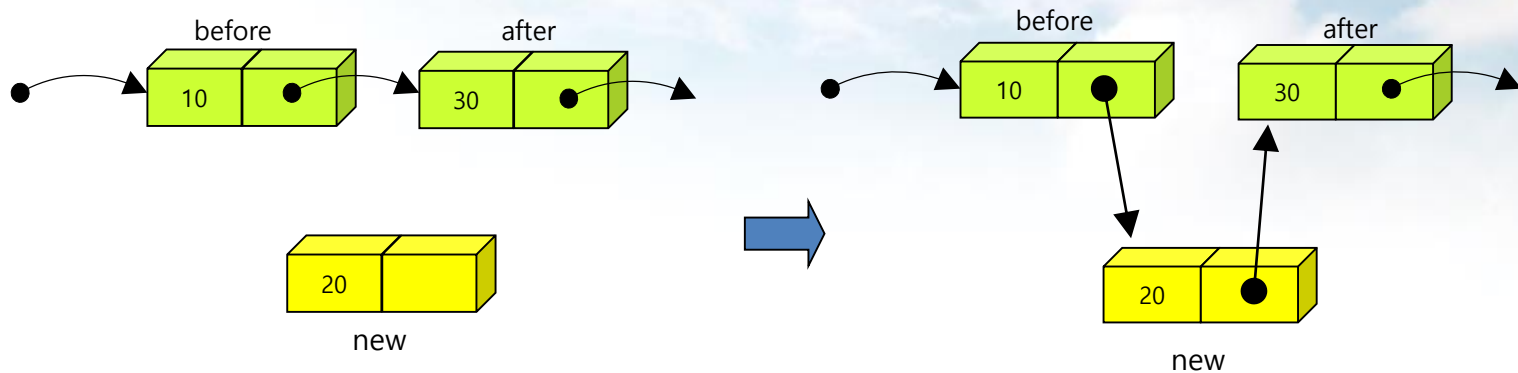
- Doubly linked list



02. List

Insertion

- Basic idea



```
insert_node(L, before, new)
```

```
if L = NULL
```

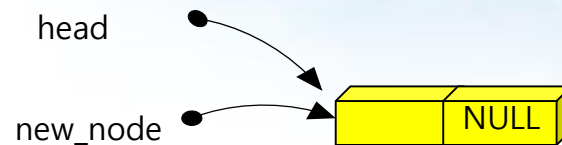
```
then L ← new
```

```
else new.link ← before.link  
      before.link ← new
```

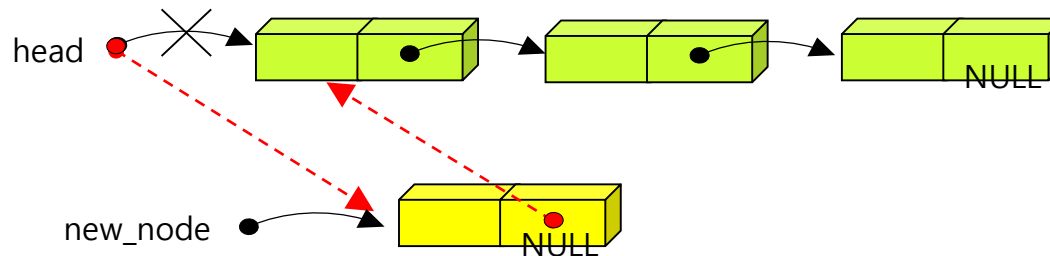
02. List

Insertion

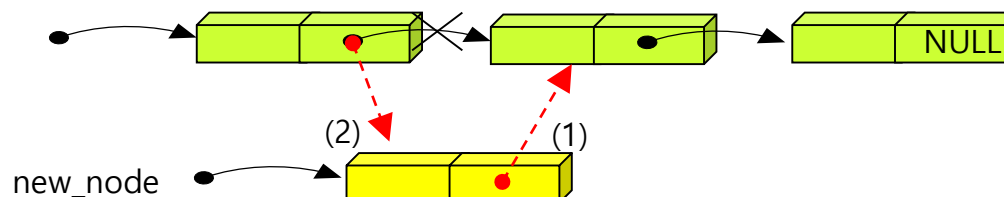
- 3 cases
 - Empty list



- Add to first



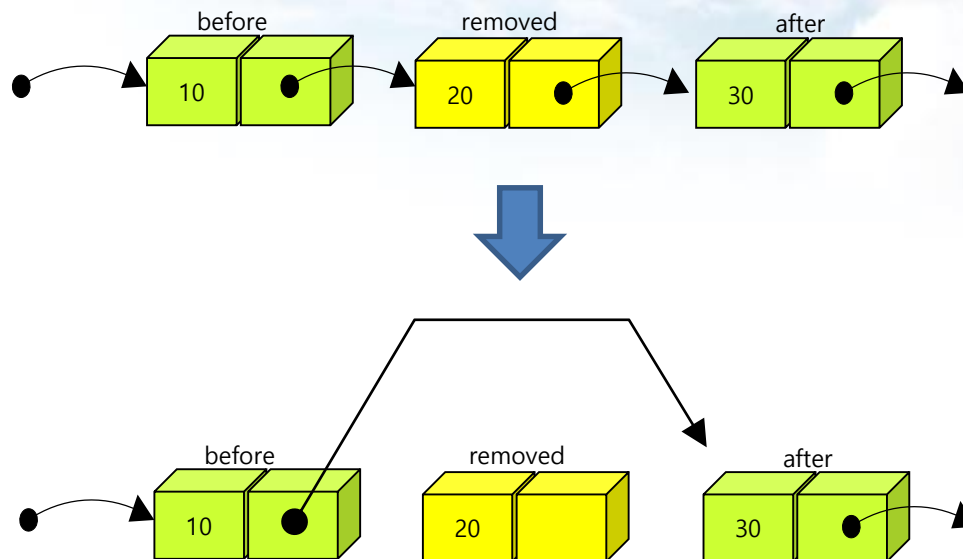
- General case



02. List

Deletion

- Basic idea



```
remove_node(L, before)
```

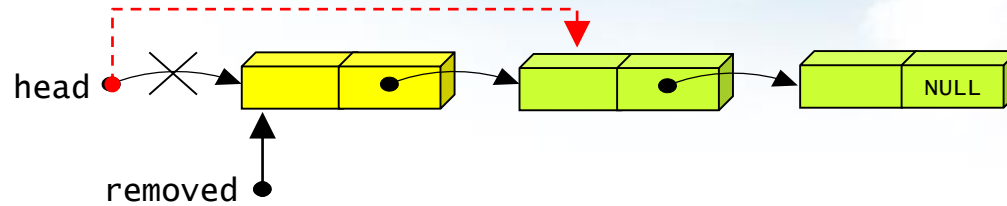
```
if L  $\neq$  NULL
```

```
then before.link  $\leftarrow$  removed.link
```

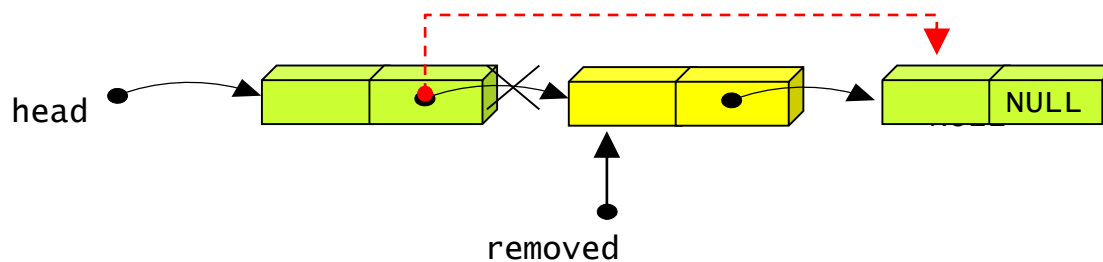
02. List

Deletion

- 2 cases
 - First node



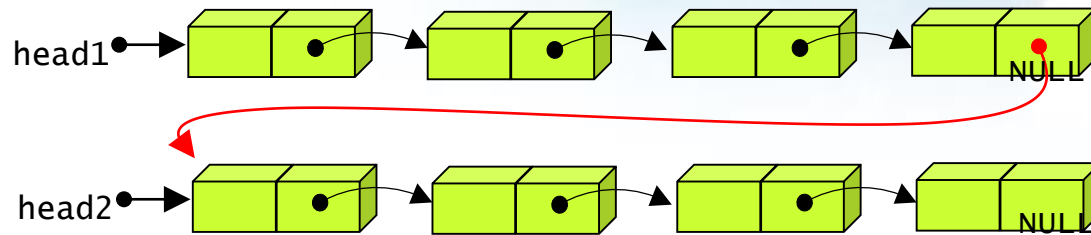
- General case



02. List

Merge Two Lists

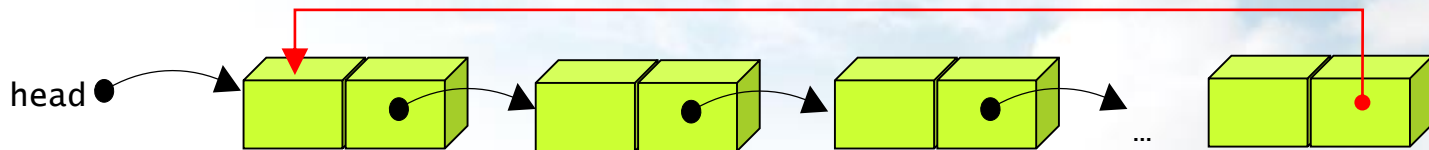
- An example of list operations: merging two lists



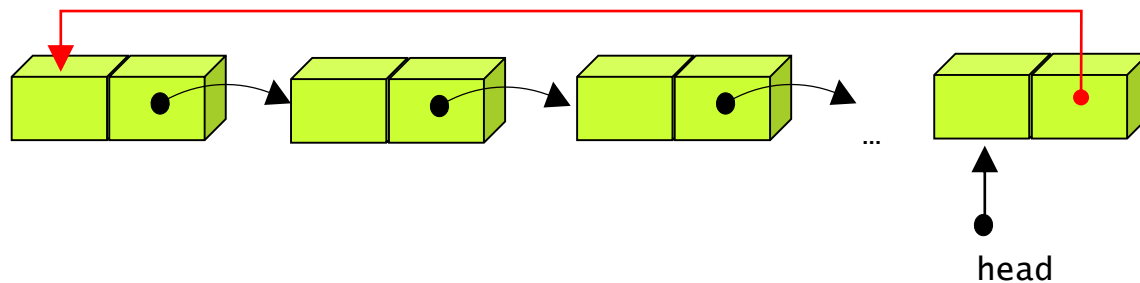
02. List

Circular Linked List

- The last node points the first node



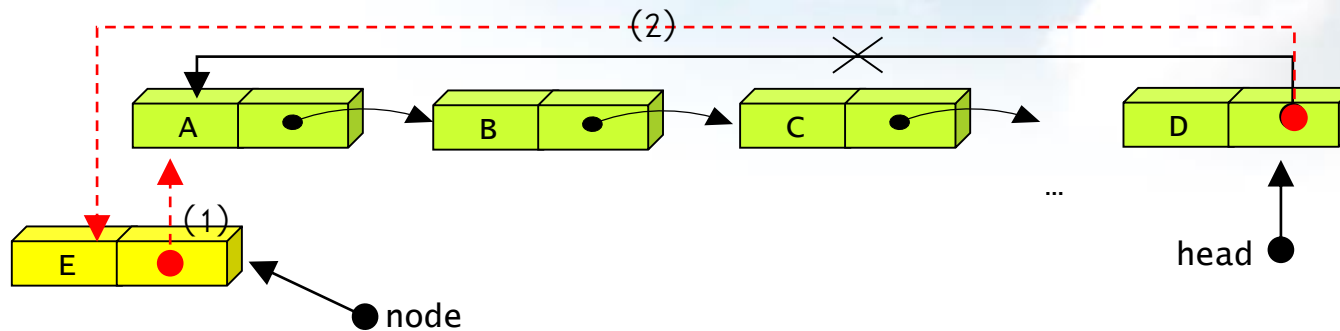
- We can traverse the list starting from any node
- Easier than single linked list in insertion / deletion
- If head points to the last node, “addFirst” and “addLast” can be easily implemented compared to single linked list



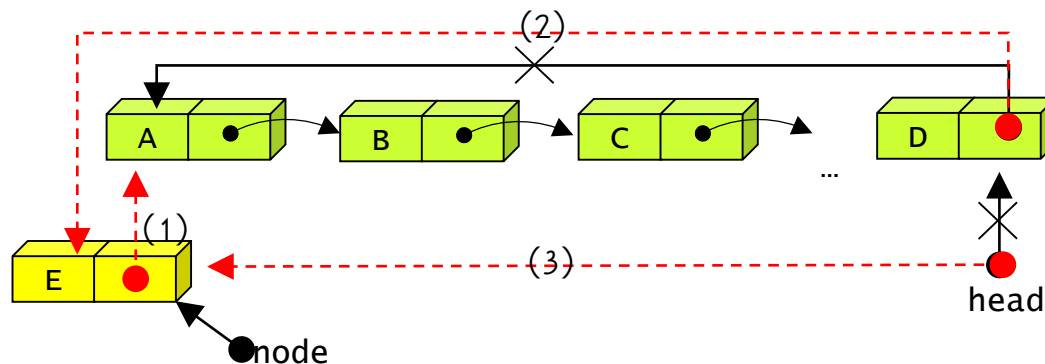
02. List

Insertion

- Two cases
 - Insertion in the first



- Insertion in the last



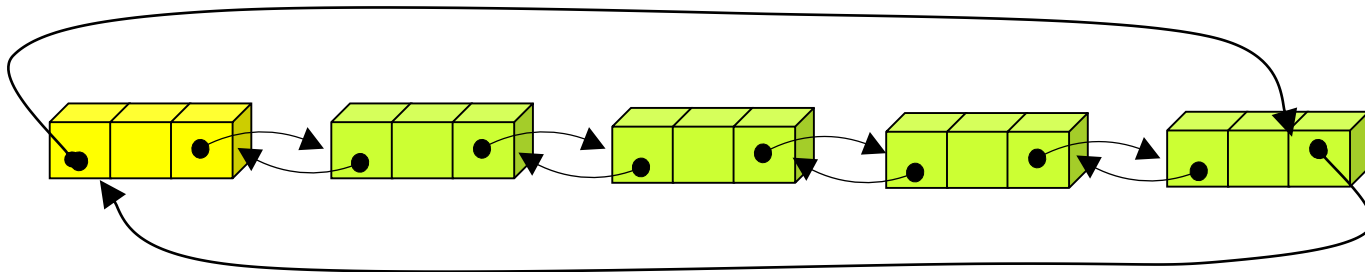
02. List

Double Linked List

- Double linked list
 - Node has two links for previous and next data
 - Link => bidirectional



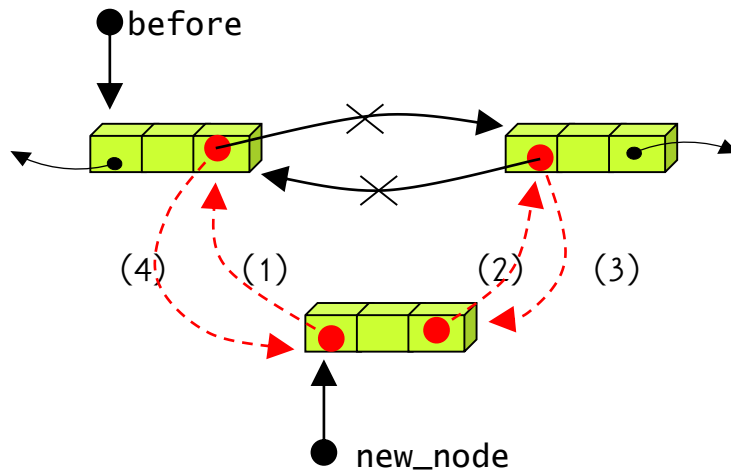
- Practically, “double linked list + circular linked list” type is widely used



02. List

Insertion

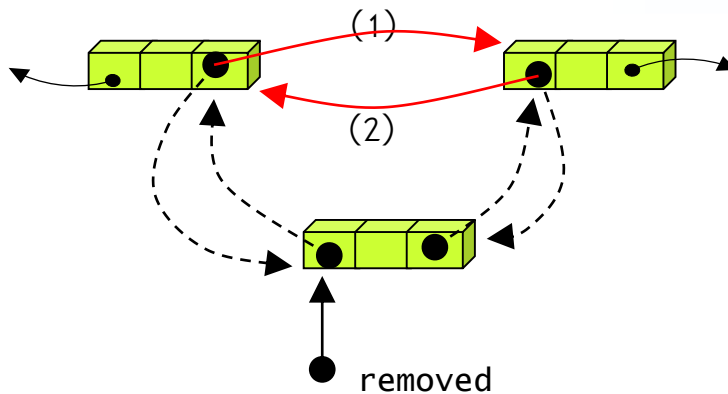
- `new_node.llink = before;` (1)
- `new_node.rlink = before.rlink;` (2)
- `before.rlink.llink = new_node;` (3)
- `before.rlink = new_node;` (4)



02. List

Deletion

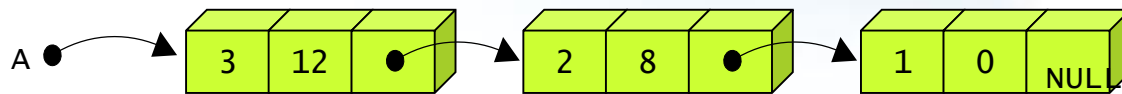
- `removed.llink.rlink = removed.rlink` (1)
- `removed.rlink.llink = removed.llink` (2)



02. List

Application: Polynomial

- A polynomial (in one variable) can be expressed as a list
 - $A=3x^{12}+2x^8+1$

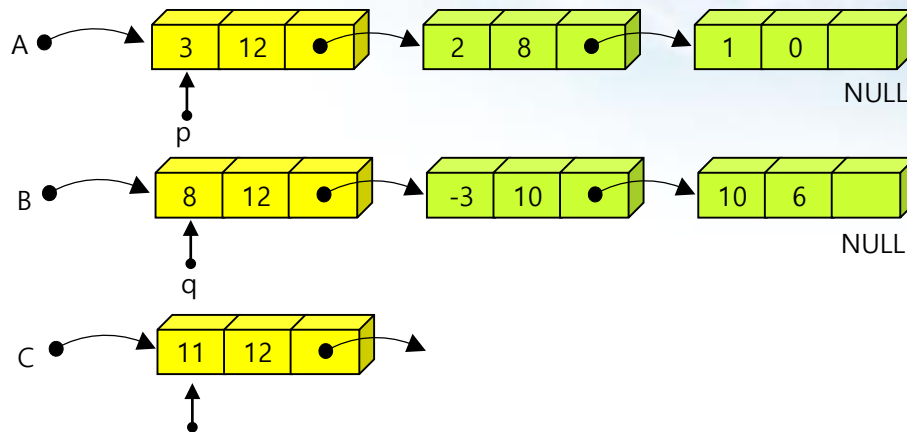


```
class _PolyTermNode( object ):
    def __init__( self, degree, coefficient ):
        self.degree = degree
        self.coefficient = coefficient
        self.next = None
```

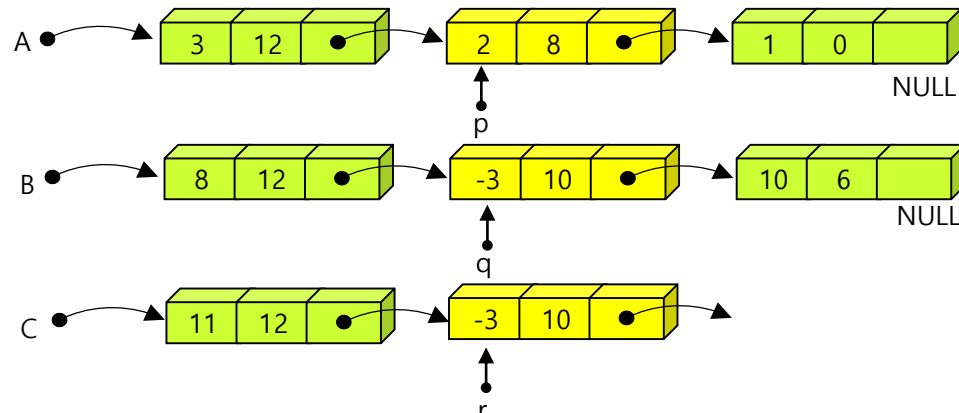
02. List

Polynomial Addition

① $p.\text{expon} == q.\text{expon}$



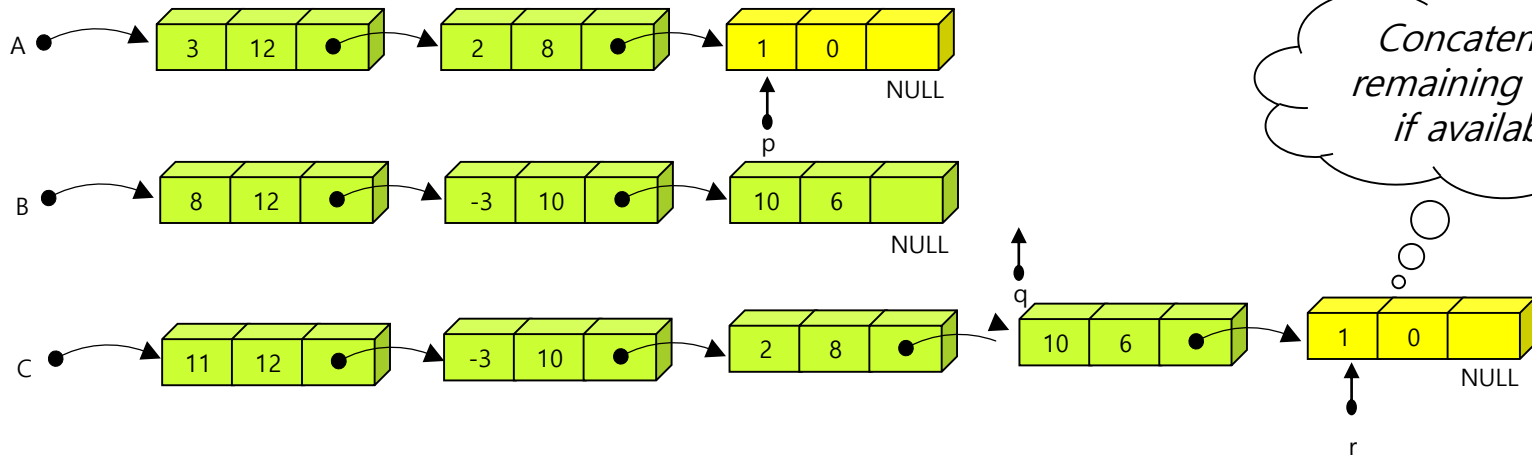
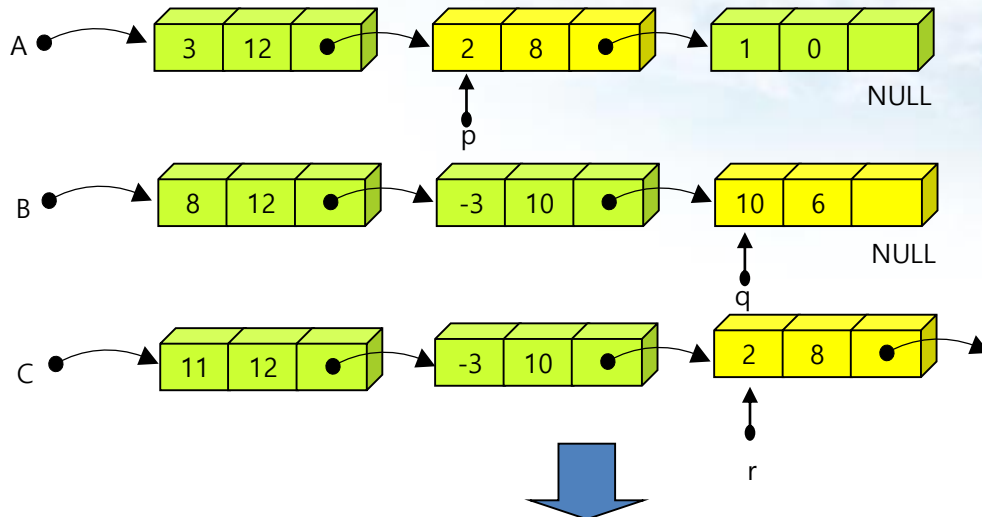
② $p.\text{expon} < q.\text{expon}$



02. List

Polynomial Addition

③ $p.\text{expon} > q.\text{expon}$



What You Need to Know

Summary

- Algorithm analysis
 - Time complexity
- List
 - Array list
 - Linked list
 - Linked representations
 - Singly linked list
 - Circular linked list
 - Double linked list
 - Application: Polynomials

Thanks

Week 2: Order of Complexity, List
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