#### **CS2040: Lecture 14**

# Week 13 Mix and Match

NUS CS2040

# Data Structures with Multiple Organizations

NUS CS2040 2

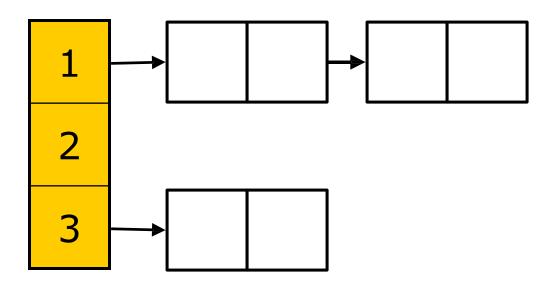
#### **Basic Data Structures**

- Arrays
- Linked Lists
- Trees

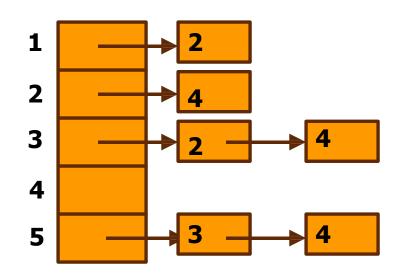
We can combine them to implement different data structures for different applications.

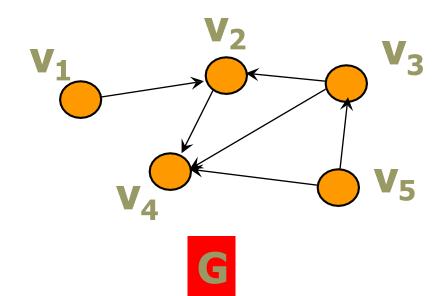
#### Mix-and-Match

- Array of Linked-Lists
  - E.g.: Adjacency list for representing graph
  - E.g.: Hash table with separate chaining



# Adjacency list for directed graph



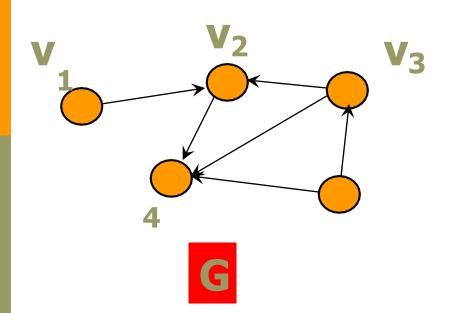


# Adjacency matrix for directed graph

$$\begin{aligned} \text{Matrix[i][j]} &= 1 & \text{if } (v_i, v_j) \in E \\ 0 & \text{if } (v_i, v_j) \notin E \end{aligned}$$

1 2 3 4 5

 $V_1$   $V_2$   $V_3$   $V_4$   $V_5$ 



	$V_1$		1		0	0
2		0	0		1	0
	<b>V</b> <sub>3</sub>	0	1	0	1	0
4	$V_4$	0		0	0	0
			0	1	1	0

#### CS2040 2003 (Exam Q)

(16 points) Let  $n_i$  be the number of vertices adjacent to a vertex i. Suppose we want to support the following four operations on a directed graph:

- **insert**(i, j), which adds an edge (i, j) into the graph;
- **delete**(i, j), which removes the edge (i, j) from the graph;
- exists(i, j), which checks if edge (i, j) exists in the graph; and
- **neighbours**(i), which returns the list of vertices adjacent to i.

Describe a data structure that supports insert(i, j), delete(i, j) and exists(i, j) in O(1) time, and neighbours(i) in O( $n_i$ ) time. You may use diagrams to illustrate your data structure. You may simply quote data structures taught in this class without going into details.

## **Use adjacency Matrix**

Operation	Big-O
Insert (i, j)	
Delete (i, j)	
Exist (i, j)	
Neighbour(i)	

	1	2	3	4
1		Т		
2	Т		Т	
3		Т		
4	Т			

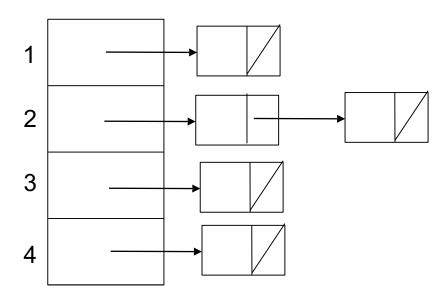
## **Use adjacency Matrix**

Operation	Big-O
Insert (i, j)	0(1)
Delete (i, j)	0(1)
Exist (i, j)	0(1)
Neighbour(i)	O(n)

	1	2	3	4
1		Т		
2	Т		Т	
3		Т		
4	Т			

## Use adjacency list

Operation	Big-O
Insert (i, j)	O(1)
Delete (i, j)	O(n)
Exist (i, j)	O(n)
Neighbour(i)	O(n <sub>i</sub> )



#### **Problem**

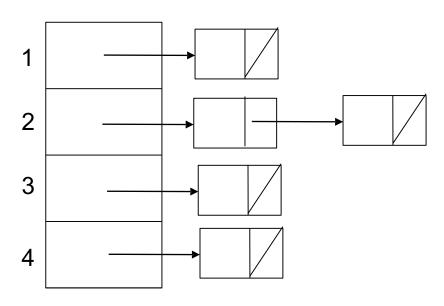
- Searching on an unsorted linked list is always O(n)
- How to improve it to O(1)?

#### Use hashing.

(i, j) as key and the hash value returned by hash function to be index to a hash table where (i, j) is stored together with the reference to the node in the linked list.

### Use adjacency list

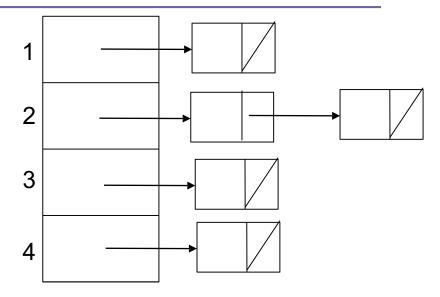
Operation	Big-O
Insert (i, j)	O(1)
Delete (i, j)	O(n)
Exist (i, j)	O(1)
Neighbour(i)	O(n <sub>i</sub> )



Is delete (i, j) O(1)?

### Use adjacency list

Operation	Big-O
Insert (i, j)	O(1)
Delete (i, j)	O(n)
Exist (i, j)	O(1)
Neighbour(i)	O(n <sub>i</sub> )



No, hash table will find the node to be deleted, but you need to find the previous node

#### CS2040 2003

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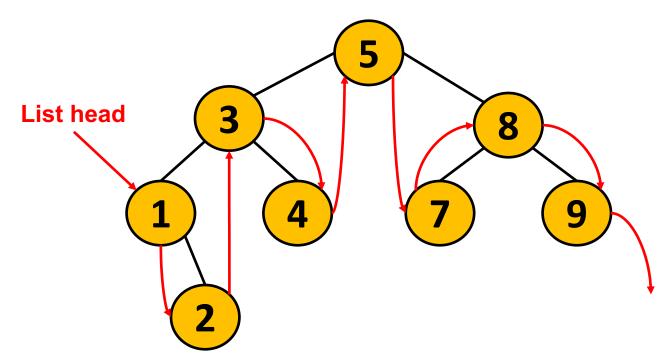
- **insert**(i, j), which adds an edge (i, j) into the graph;
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Describe a data structure that supports insert(i, j), delete(i, j) and exists(i, j) in O(1) time, and neighbours(i) in O( $n_i$ ) time. You may use diagrams to illustrate your data structure. You may simply quote data structures taught in this class without going into details.

Build an adjacency list of the graph, where the lists are doubly linked. Build a hash table with (i, j) as key, and a reference to the node representing (i, j) in the adjacency list as value.

#### Mix-and-Match 2

- Binary Search Tree + Linked-List
- Can find the successors easily



Q: How to handle updates?

#### More Examples

- Suppose we need an ADT that support the following operations
  - enqueue(item)
  - dequeue()
  - peek()
  - printInOrder()

### Use a Queue

- If we use a queue, we can support the queue operations efficiently O(1).
- But to print the items in order, we need to first sort the items in the queue, which is O(N log N) time.

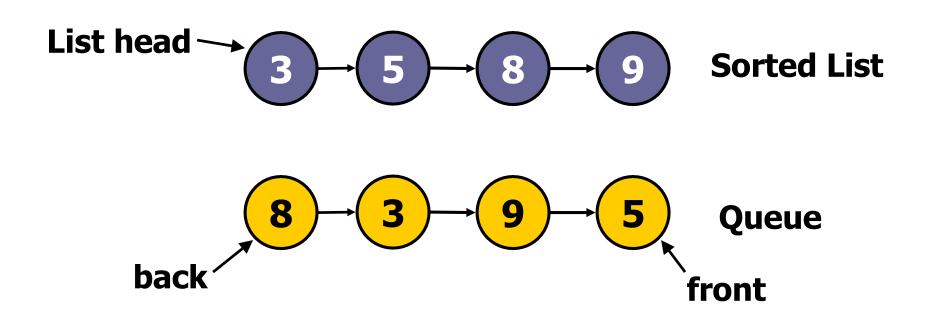
enqueue(item)	O(1)
dequeue()	O(1)
peek()	O(1)
printInOrder()	O(N log N)

#### **Use a Sorted Linked List**

- We can reduce printInOrder() to O(N) using a sorted linked list instead.
- But the queue operations are not supported.

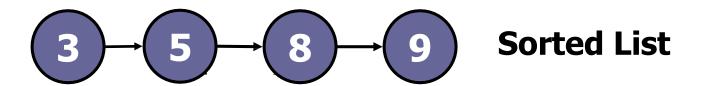
enqueue(item)	?
dequeue()	?
peek()	?
printInOrder()	O(N)

# Use both: Queue + Sorted List?



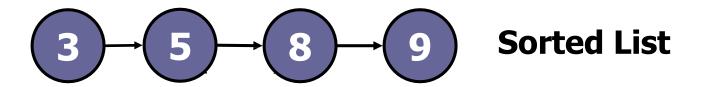
Trivial problem: Need to duplicate the data.

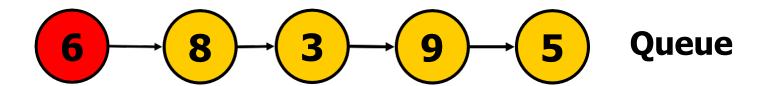
## Enqueue(6)



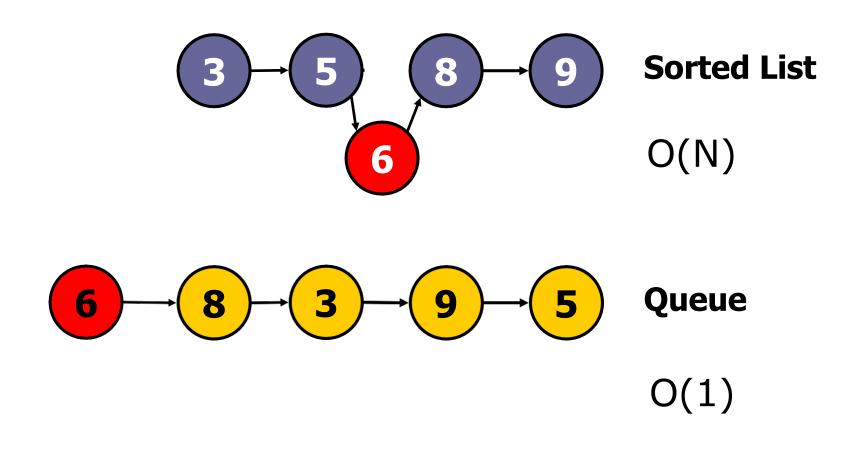


## Enqueue(6)

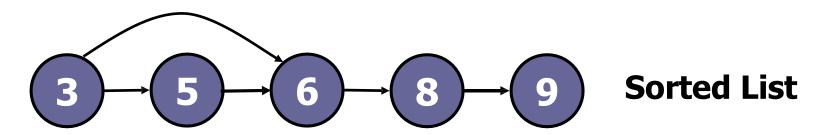


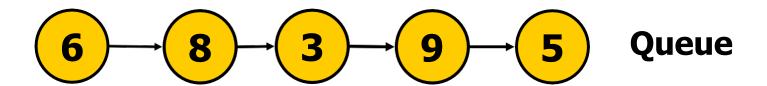


## Enqueue(6)

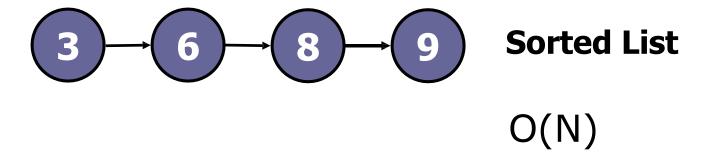


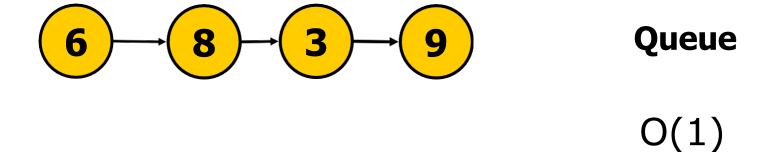
## Dequeue()





### Dequeue()





#### **Use Queue + Sorted List**

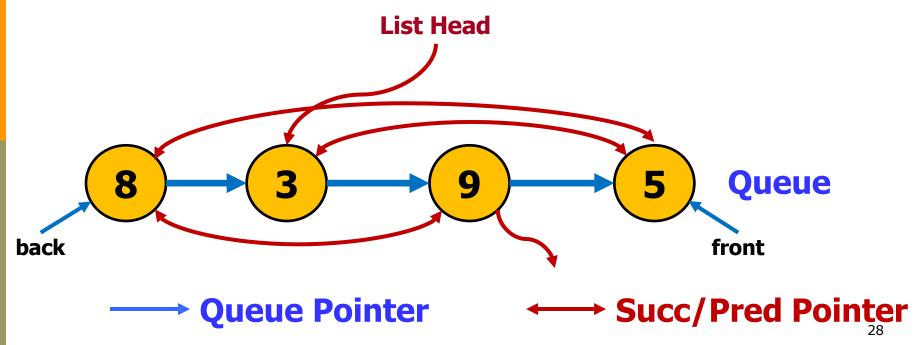
But then enqueue and dequeue take linear time O(N), because we have to look for the position of the item in the linked list to insert/delete. Too slow.

enqueue(item)	O(N)
dequeue()	O(N)
peek()	O(1)
printInOrder()	O(N)

Q: Can we improve them?

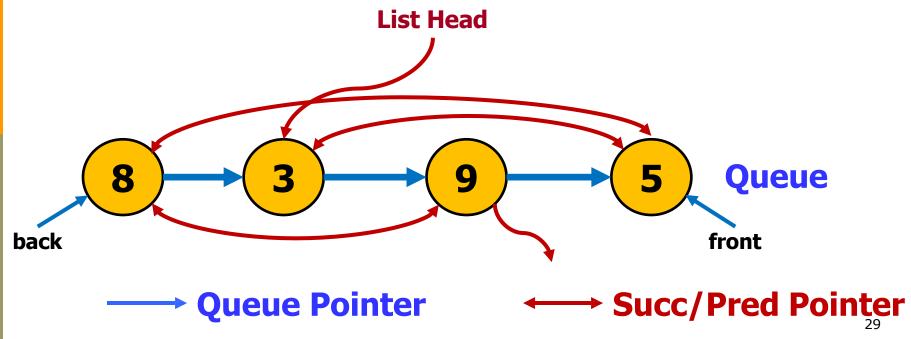
# Improvement: Queue combines with DLinked List

- Only store one copy of each item
- Each node have 2 sets of pointers:
  - One for queue and one for a doubly linked list



#### **Combine Queue and DLinked List**

- Dequeue of a doubly linked list can be done in O(1) time.
   Q: How?
- However, enqueue is still O(N). Why? E.g., enqueue 4?
   A: Need to find the insertion point in the DLinked List



#### **Combine Queue and DLinked List**

- Dequeue of a doubly linked list can be done in O(1) time.
   Q: How?
- However, enqueue is still O(N). Why? E.g. enqueue 4?

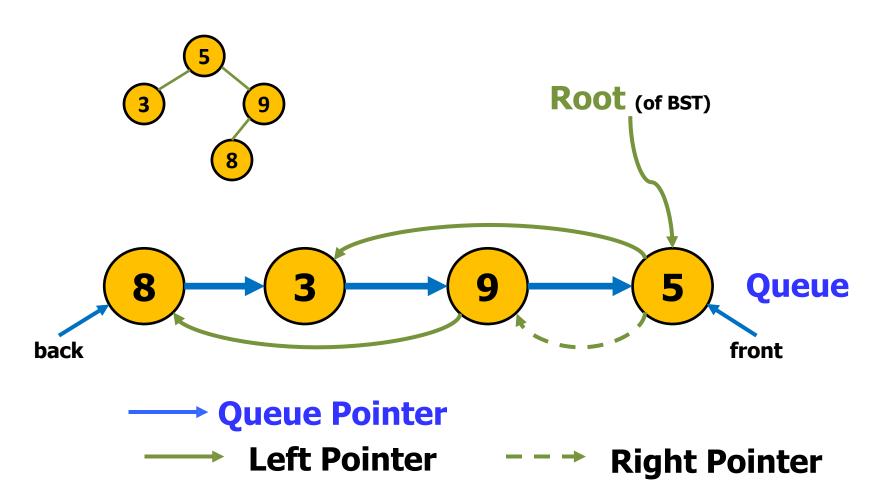
enqueue(item)	O(N)
dequeue()	O(1)
peek()	O(1)
printInOrder()	O(N)

Q: Can we improve it?

### **Combine Queue and BST**

 We can improve enqueue to O(log N) by combing a queue with a BST instead of a linked list.

#### More improvement: Queue combines with BST



### **Combine Queue and BST**

But now dequeue also takes O(log N).

enqueue(item)	O(log N)	
dequeue() O(log N)		
peek()	O(1)	
printInOrder()	O(N)	

**Q:** Is there a way to make dequeue O(1)?

### **Combine Queue and BST**

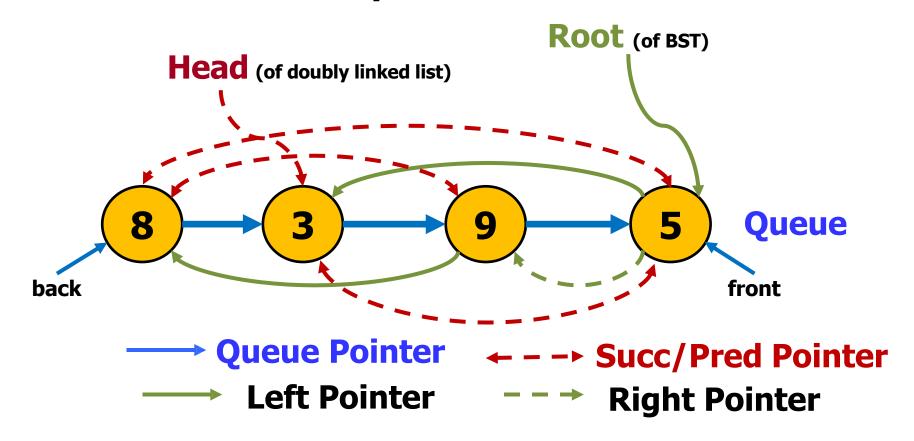
enqueue(item)	O(log N)
dequeue()	O(1) ?
peek()	O(1)
printInOrder()	O(N)

Q: Is there a way to make dequeue O(1)?

Yes, use another doubly linked list, so that finding the replacement for BST deletion can be done in O(1) instead of O(log N).

# More improvement: combine Queue + BST + DList

Use another doubly linked list.



#### **Combine queue + BST + DList**

enqueue(item)	O(log N)
dequeue()	O(1)
peek()	O(1)
printInOrder()	O(N)

Recall: use another doubly linked list, so that finding the replacement for BST deletions can be done in O(1) instead of O(log N). Why?

### Improvement summary

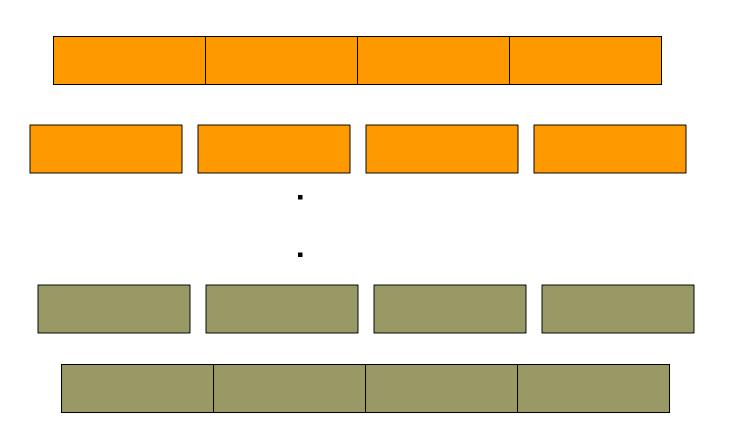
- use a queue and a linked list
- combine queue with doubly linked list
- combine queue and BST
- combine queue, BST, and doubly linked list
- Q: Which improvement should be used?

  Depends on the application.

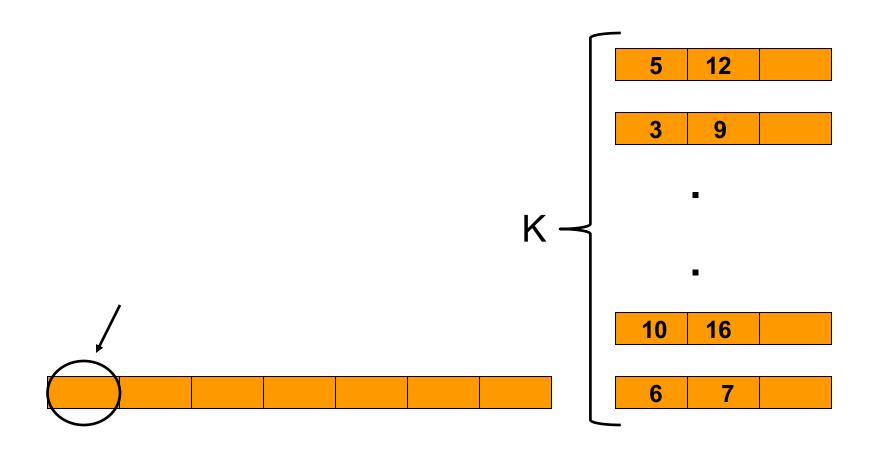
  E.g., it depends how often certain operations are executed.

# K-way Merge Sort

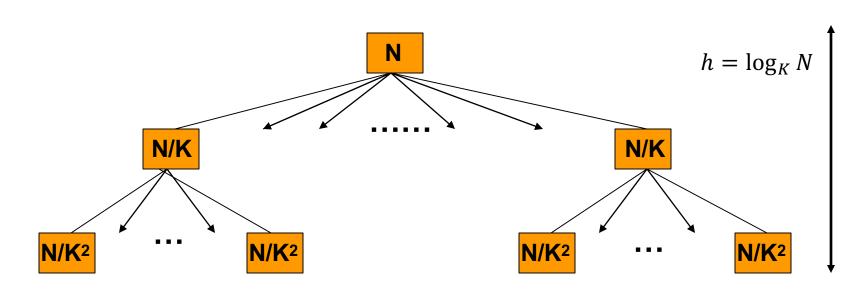
# Can we make merge sort more efficient by dividing by k instead of 2?



### K-way merge sort



#### Running time: O(K Nlog<sub>k</sub>N)



$$\log_K N = \log_2 N / \log_2 K$$

$$KN\log_2 N = \frac{K}{\log_2 K}N\log_2 N$$

1 1 1 1 1 1 1 1 1 1 1

# Improved K-way merge sort

- K-way mergesort is more expensive than 2-way mergesort
- Can we improve it further?
- Improve selection of smallest among K elements => use heap!
- Instead of factor NK we now have  $N \log_2 K$ .

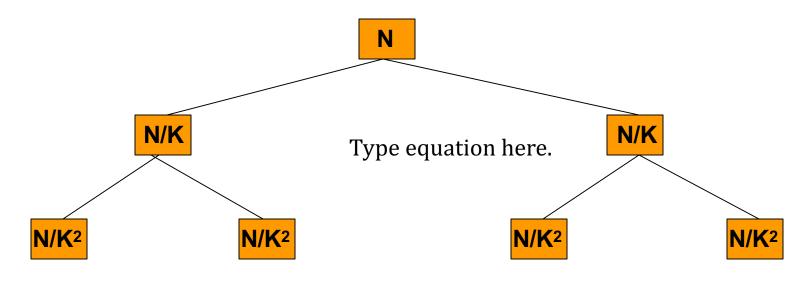
• •	5	12	
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3	9	

10	16	
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**5** 7

# Running time: O(N log<sub>2</sub>K log<sub>k</sub>N)



$$N \log_2 K \log_K N = N \log_2 K \frac{\log_2 N}{\log_2 K} = N \log_2 N$$

Final complexity is:  $O(N \log_2 N)$ !

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# Running time: O(N log<sub>2</sub>K log<sub>k</sub>N)

By changing the base, we getO(N log<sub>2</sub> N)

- It is not really an improvement over 2-way merge sort.
- But it has real applications.

#### **End of Mix and Match**

