

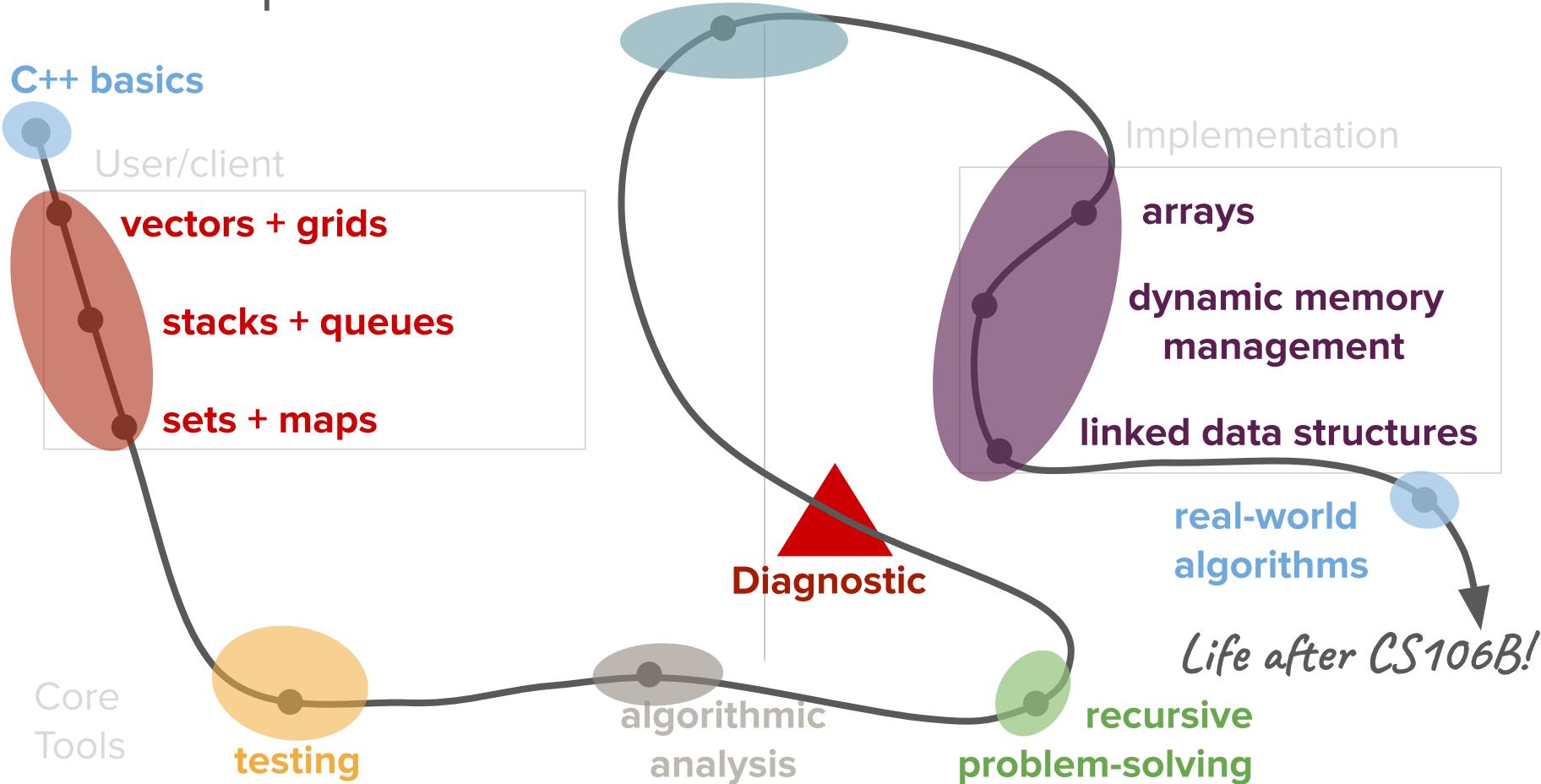
# Priority Queues and Heaps

**What is one area for growth that you identified as a takeaway from completing the diagnostic?**  
(put your answers in the chat)



# Roadmap

## Object-Oriented Programming



# Roadmap

## Object-Oriented Programming

C++ basics

User/client

vectors + grids

stacks + queues

sets + maps

Core Tools

testing

algorithmic analysis

recursive problem-solving

Diagnostic

*Life after CS106B!*

Implementation

arrays

dynamic memory management

linked data structures

real-world algorithms



# Today's question

How can we make use of multiple levels of abstraction in our data storage techniques to build better ADTs?



# Today's topics

1. Review (**OurVector**)
2. Priority Queues
3. Binary Heaps



# Review

[implementing **OurVector**]



# What is OurVector?

- Goal: Implement own version of the Stanford C++ Vector
- Scope Constraints:
  - We will only implement a subset of the functionality that the Stanford Vector provides.
  - OurVector can **only store integers** and is not be configurable to store other types
  - When we left off on Monday, OurVector was limited to **storing a fixed number of elements**. For now, if we run out space we just throw an error.



# OurVector Header File

```
class OurVector {
public:
    OurVector();
    ~OurVector();
    void add(int value);
    void insert(int index, int value);
    int get(int index);
    void remove(int index);
    int size();
    bool isEmpty();
private:
    int* elements;
    int allocatedCapacity;
    int numItems;
};
```

# OurVector Member Variables

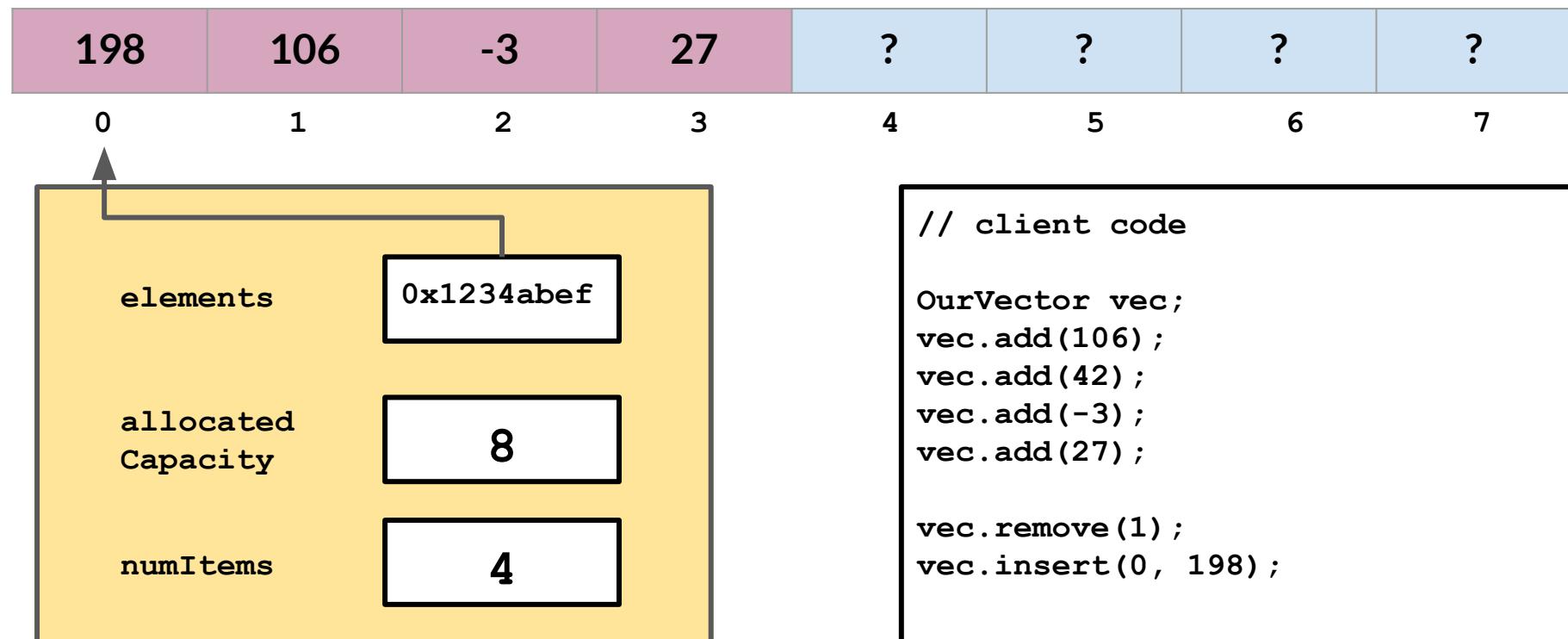
- **int\* elements;**
  - A pointer to an array of integers, which will act as our underlying data storage mechanism.
- **int allocatedCapacity;**
  - An integer that stores the size of the allocated elements array. Remember, arrays don't have any conception/knowledge of their own size, so we must manually track this!
- **int numItems;**
  - An integer that stores the number of elements currently stored in the vector.



# Review: Constructors and Destructors

- The **constructor** is the special method that gets called when a new instance of a class is declared. In this method, we initialize all of our member variables to the appropriate values, including allocating any necessary memory.
  - The constructor for a class named **ClassName** has signature  
**ClassName(args) ;**
- The **destructor** is the special method that gets called when an instance of a class goes out of scope and thus is destroyed. In this method, we most often are responsible for freeing any dynamically allocated memory used by the instance.
  - The destructor for a class named **ClassName** has signature  
**~ClassName() ;**

# Review: OurVector internal state





# Running Out of Space

- Our current implementation very quickly runs out of space to store elements.
- What should we do when this happens?
  - Currently, we just throw an error. That doesn't seem quite right.  
What if all data structures we used were limited to hold only 8 items?
  - Instead, we need a way to **dynamically resize (grow)** our internal data storage mechanism.

# Dynamic Array Growth





# A Day in the Life of a Hermit Crab

- Hermit crabs are interesting animals. They live in scavenged shells that they find on the seafloor. Once in a shell, this is their lifestyle (with a bit of poetic license):
  - Grow until they have outgrown their current shell. Then, follow these 5 steps.
    - Find another, larger shell.
    - Move all their stuff into the new shell.
    - Leave the old shell on the seafloor.
    - Update their address with the Hermit Crab Postal Service.
    - Make note of their new shell's spacious capacity by posting on Hermit Crab Instagram.
- While this is purposefully a bit of a silly analogy, this process models almost exactly what we need to do in order to dynamically resize our internal data storage mechanism.

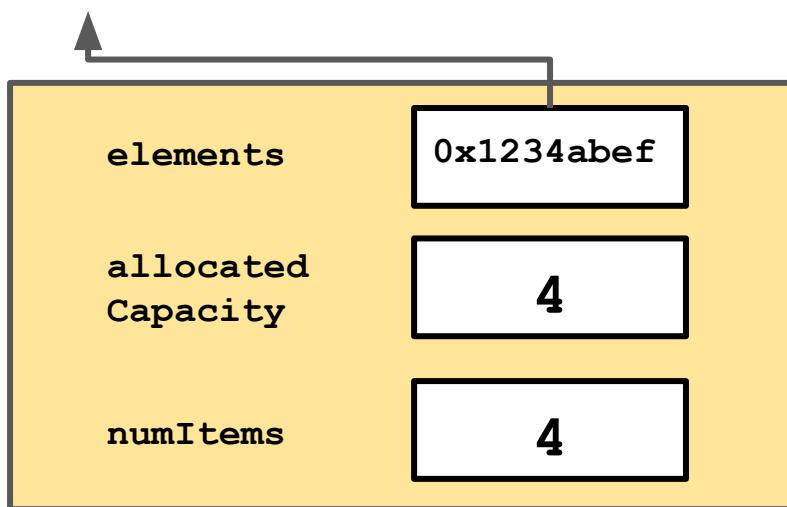


# A Day in the Life of a Growable Array

- In essence, when we run out of space in our array, we want to allocate a new array that is bigger than our old array so we can store the new data and keep growing. These "growable arrays" follow a five-step expansion that mirrors the hermit crab model (with poetic license).
  - Grow the array until we run out of space (how can we tell if we've run out of space?)
    - Create a new, larger array. Usually we choose to **double** the current size.
    - Copy the old array elements to the new array.
    - Delete (free) the old array.
    - Point the old array variable to the new array.
    - Update the associated capacity variable for the array.

?	?	?	?	?	?	?	?
0	1	2	3	4	5	6	7

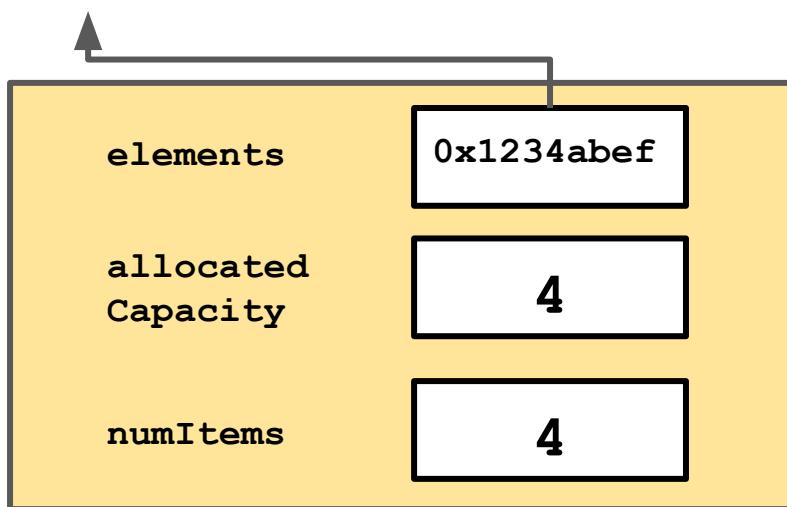
106	42	-3	27
0	1	2	3



1. Create a new, larger array. Usually we choose to double the current size.

106	42	-3	27	?	?	?	?
0	1	2	3	4	5	6	7

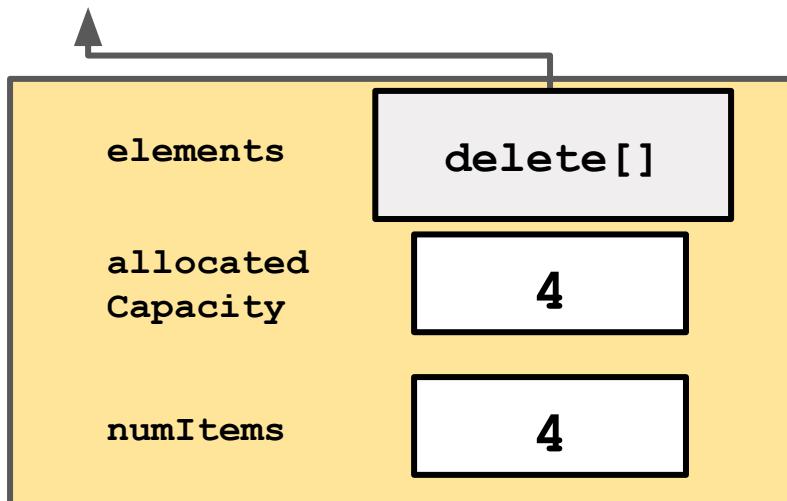
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1. Create a new, larger array. Usually we choose to double the current size.
2. Copy the old array elements to the new array.

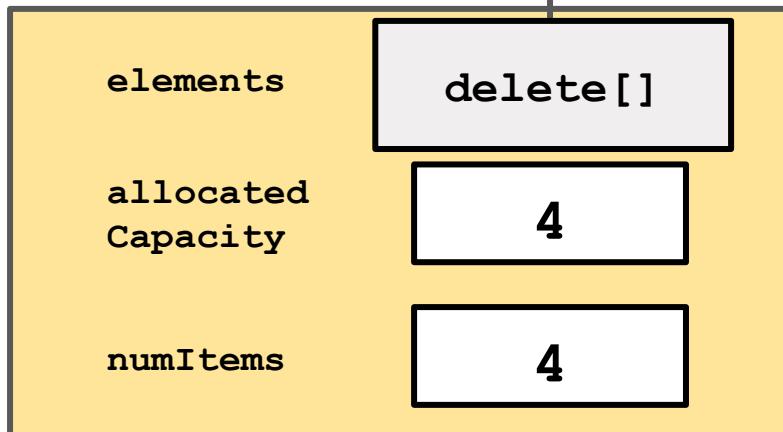
106	42	-3	27	?	?	?	?
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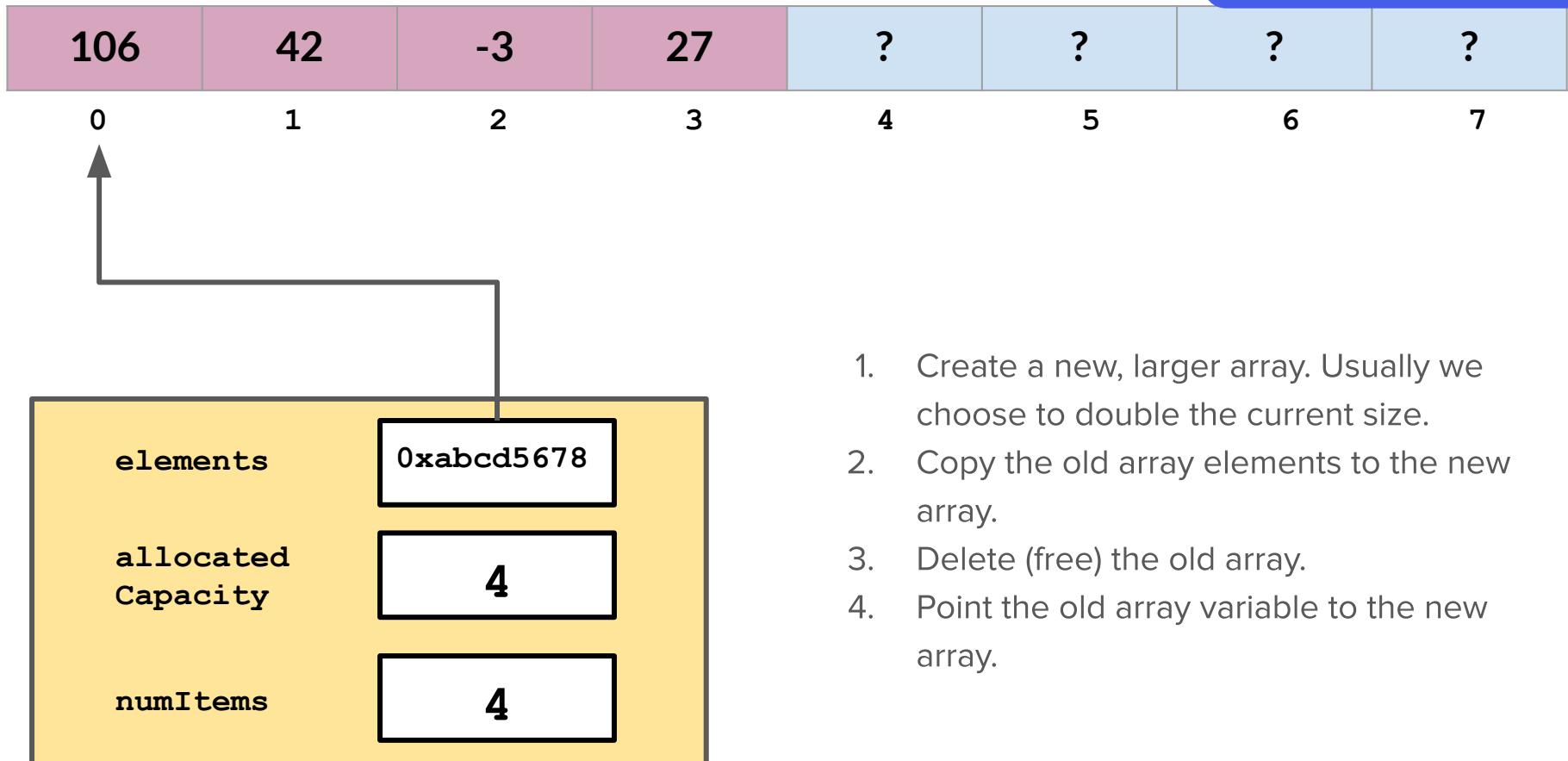


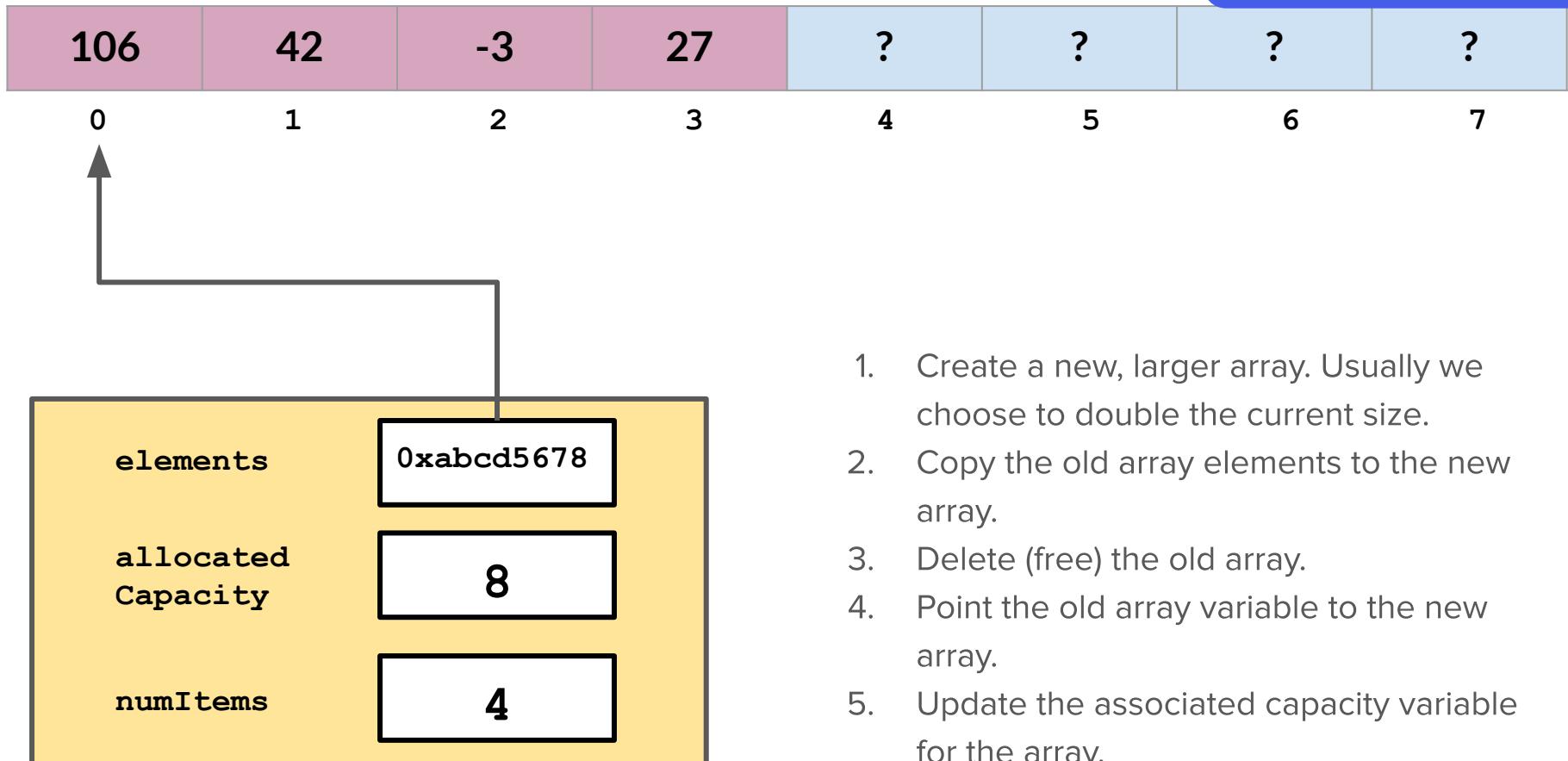
1. Create a new, larger array. Usually we choose to double the current size.
2. Copy the old array elements to the new array.
3. Delete (free) the old array.

106	42	-3	27	?	?	?	?
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# Let's Code It! (Monday wrap-up)

**expand()** private helper function

# Implementing ADT Classes

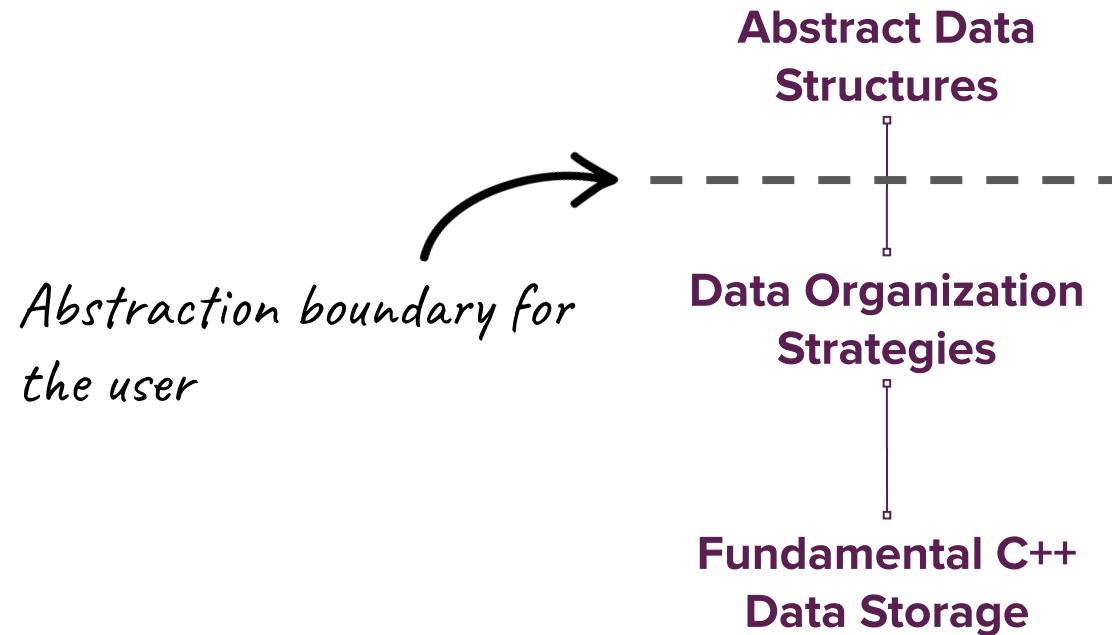
*What about more complex  
ADTs?*

- The first step of implementing an ADT class (as with any class) is answering the three important questions regarding its public interface, private member variables, and initialization procedures.
- Most ADT classes will need to store their data in an underlying array. The **organizational patterns of data** in that array may vary, so it is important to illustrate and visualize the contents and any operations that may be done.
- The paradigm of "growable" arrays allows for fast and flexible containers with dynamic resizing capabilities that enable storage of large amounts of data.



# Multiple Levels of Abstraction

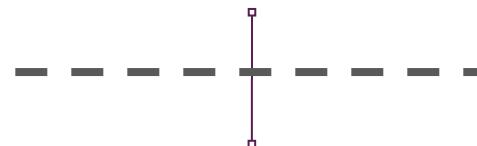
# Levels of abstraction



# Levels of abstraction

What is the interface for the user?  
(Vectors, Sets, Queues, Grids, etc.)

**Abstract Data  
Structures**



**Data Organization  
Strategies**



**Fundamental C++  
Data Storage**

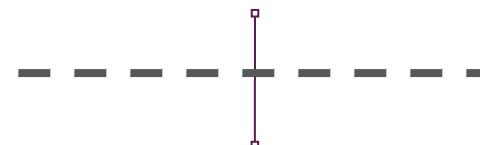
# Levels of abstraction

What is the interface for the user?  
(Priority Queue)

*What you'll focus on  
for Assignment 4*



**Abstract Data  
Structures**



**Data Organization  
Strategies**



**Fundamental C++  
Data Storage**

# Levels of abstraction

What is the interface for the user?  
(Priority Queue)

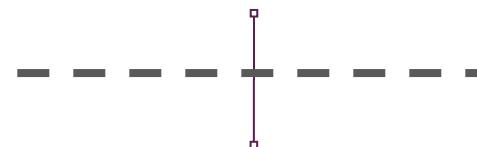


How is our data organized?  
(sorted array, binary heap)



What stores our data?  
(arrays, linked lists, etc.)

**Abstract Data  
Structures**



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**Fundamental C++  
Data Storage**

# Levels of abstraction

What is the interface for the user?  
(Priority Queue)

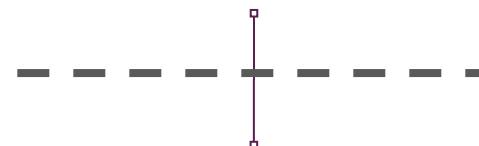


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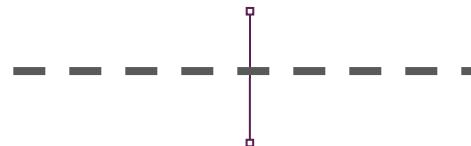
**Data Organization  
Strategies**



**Fundamental C++  
Data Storage**

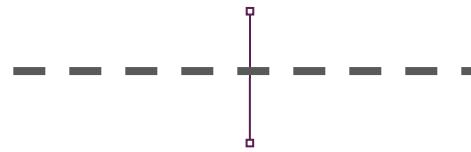
# Levels of abstraction

What is the interface for the user?  
**(Priority Queue)**



**Abstract Data Structures**

How is our data organized?  
(sorted array, **binary heap**)



**Data Organization Strategies**

*What we'll focus on today!* How does our data store? (arrays)



**Fundamental C++ Data Storage**



# Priority Queues



# What is a priority queue?

- A queue that orders its elements based on a provided “priority”
- Like regular queues, you cannot index into them to get an item at a particular position.
- Useful for maintaining data sorted based on priorities
  - Emergency room waiting rooms
  - Different airline boarding groups (**families and first class passengers**, frequent flyers, boarding group A, boarding group B, etc.)

个别数据点

*Individual data points can have the same priority!*

# What is a priority queue?

- A queue that orders its elements based on a provided “priority”
- Like regular queues, you cannot index into them to get an item at a particular position.
- Useful for maintaining data sorted based on priorities
  - Emergency room waiting rooms
  - Different airline boarding groups (families and first class passengers, frequent flyers, boarding group A, boarding group B, etc.)
  - Filtering data to get the top X results (e.g. most popular Google searches or fastest times for the Women’s 800m freestyle swimming event)



# Three fundamental operations

- **enqueue(priority, elem)**: inserts **elem** with given **priority**
- **dequeue()**: removes the element with the highest priority from the queue
- **peek()**: returns the element with the highest priority in the queue without removing it



# Less fundamental operations

- **size()**: returns the number of elements in the queue
- **isEmpty()**: returns true if there are no elements in the queue, false otherwise
- **clear()**: empties the queue

# How do we design **PriorityQueue**?

1. **Member functions:** *What public interface should **PriorityQueue** support? What functions might a client want to call?*
2. Member variables: *What private information will we need to store in order to keep track of the data stored in **PriorityQueue**?*
3. Constructor: *How are the member variables initialized when a new instance of **PriorityQueue** is created?*

*We'll provide the public interface...*



# How do we design **PriorityQueue**?

1. Member functions: *What public interface should PriorityQueue support? What functions might a client want to call?*
2. **Member variables:** *What private information will we need to store in order to keep track of the data stored in PriorityQueue?*
3. **Constructor:** *How are the member variables initialized when a new instance of PriorityQueue is created?*

*You get to decide on the implementation details!*

# How do we implement PriorityQueue?

- We want to be able to access the element that has the highest priority in constant-time (i.e. `peek()`).
- **Idea:** We can keep a sorted array where the elements are in order of their priority (highest priority is at the end of the array)!
  - Dequeue will be fast – just get the last element in the array.
  - But every time we **enqueue** something, we have to adjust the entire array...



*You'll get to implement this  
on the assignment!*



# How do we implement PriorityQueue?

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  - Dequeue will be fast – just get the last element in the array.
  - But every time we enqueue something, we have to adjust the entire array...
- Can we do better? (yes!)

*There are multiple possible implementations for the same ADT!*

# Levels of abstraction

What is the interface for the user?  
(Priority Queue)

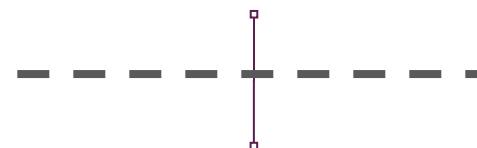


How is our data organized?  
(sorted array, **binary heap**)



What stores our data?  
(arrays)

**Abstract Data  
Structures**



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**Fundamental C++  
Data Storage**



# Announcements



# Announcements

- Assignment 4 was released yesterday afternoon and is due next **Monday, July 27 at 11:59pm PDT.**
- Trip's Assignment 4 YEAH session will be **tonight at 6pm PDT.**
- The final project guidelines were posted on the website yesterday afternoon. Read them and start thinking about what you want to do your project on!
- Be judicious with your use of private posts on Ed! If you're asking a general question that all students would benefit from, make it public! Private posts should only be used if your post includes portions of your assignment code.
- Make sure you're reading and applying your assignment feedback!



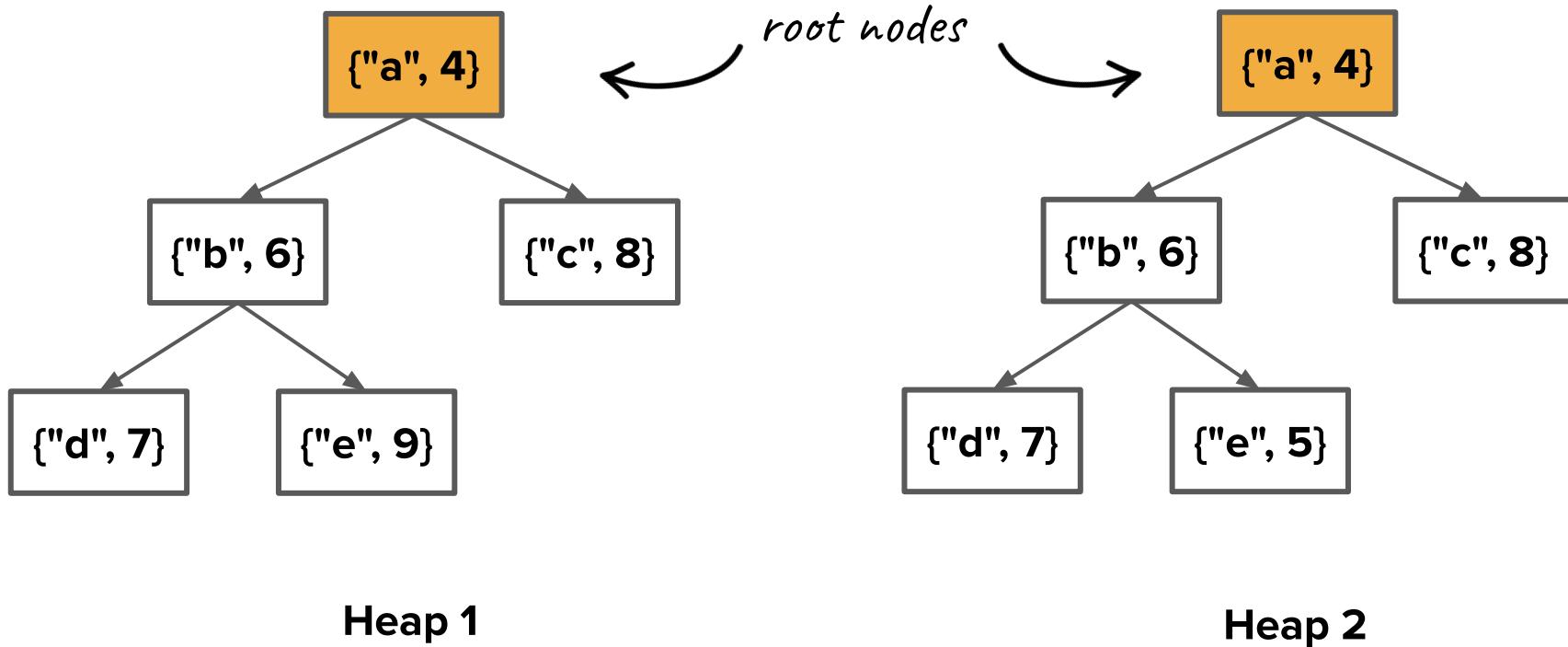
# Binary Heaps



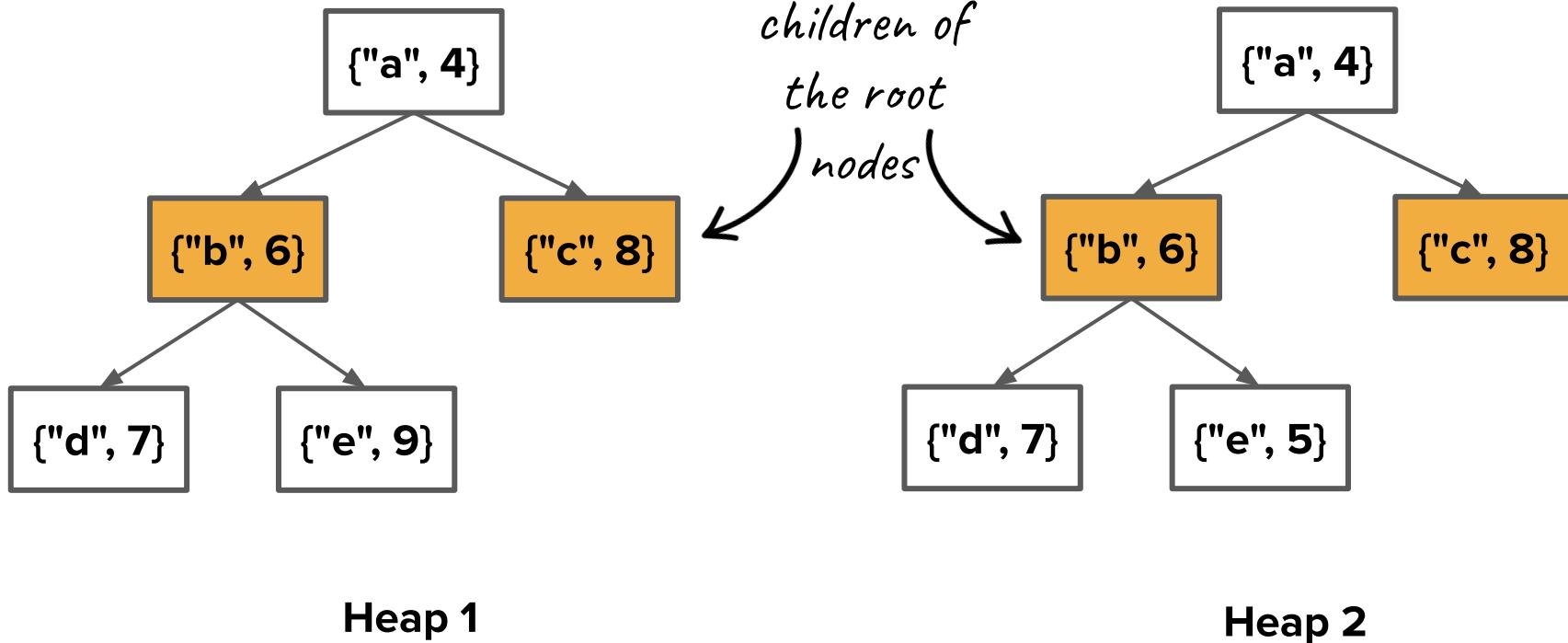
# What is a binary heap?

- A heap is a tree-based structure that satisfies the *heap property* that **parents have a higher priority than any of their children**.
- Additional properties
  - **Binary**: Two children per parent (but no implied orderings between siblings)
  - **Completely filled** (each parent must have 2 children) except for the bottom level, which gets populated from **left to right**
- Two types → which we use depends on what we define as a “higher” priority
  - **Min-heap**: smaller numbers = higher priority (closer to the root)
  - Max-heap: larger numbers = higher priority (closer to the root)

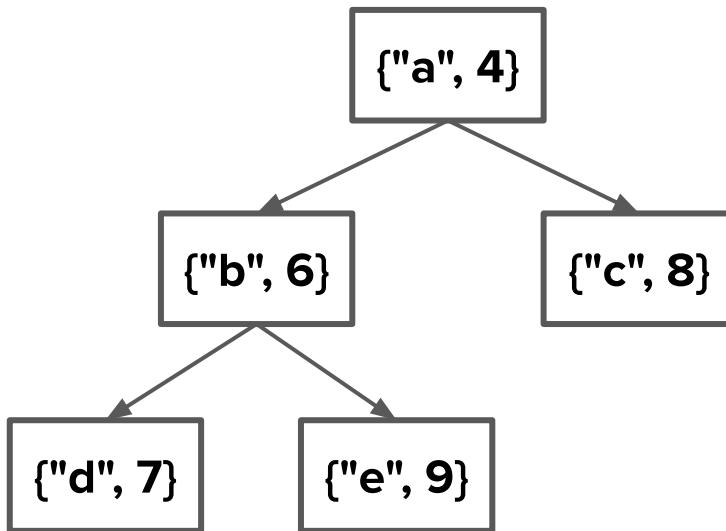
# Spot the Valid Min-Heap



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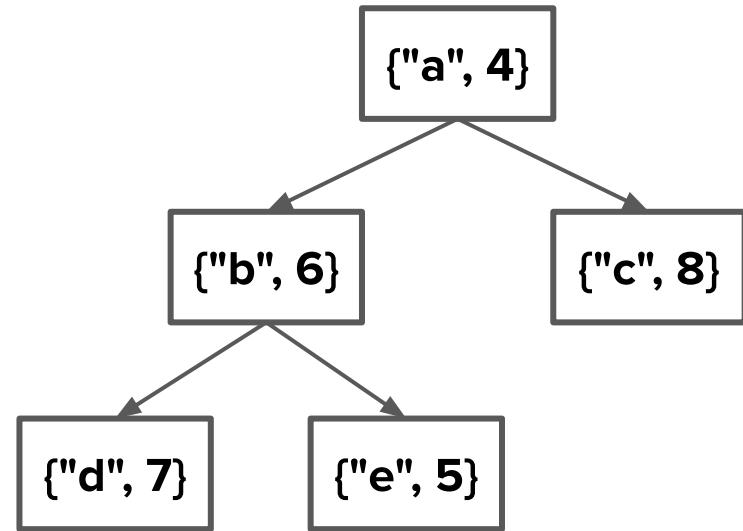


# Spot the Valid Min-Heap



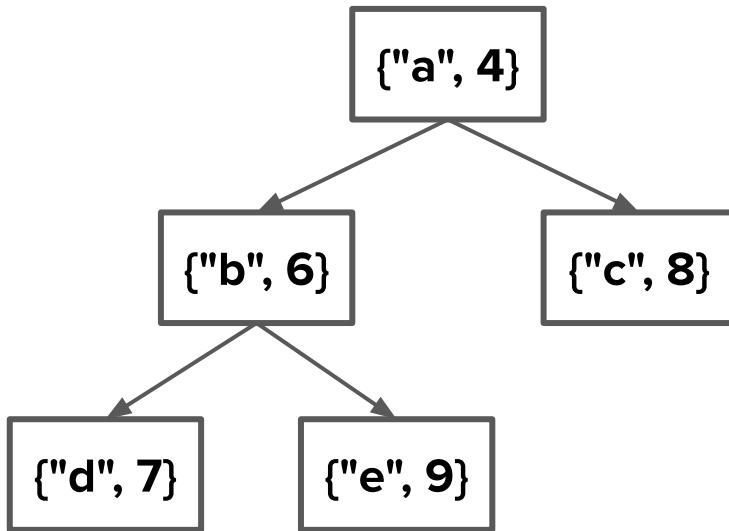
Heap 1

Poll: Which of these heap is a valid min-heap?



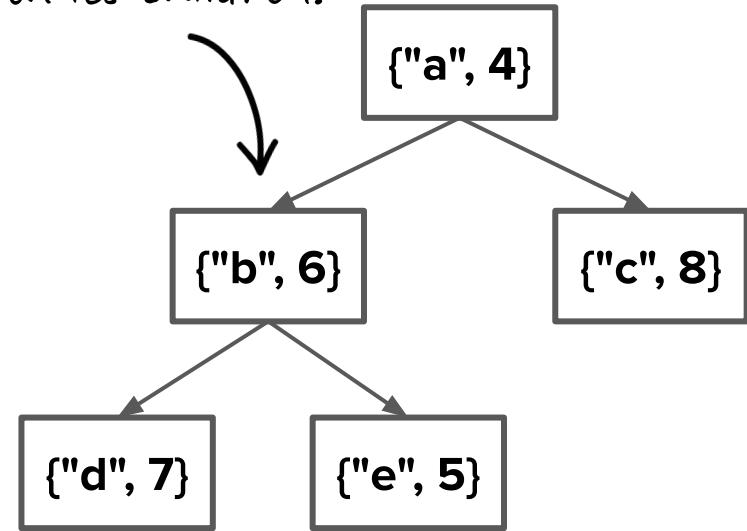
Heap 2

# Spot the Valid Min-Heap



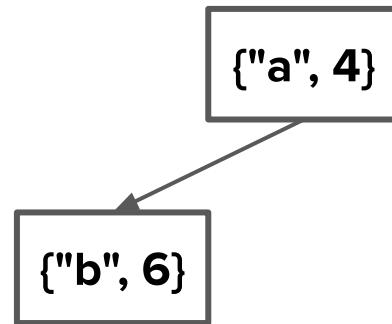
Heap 1

*This element is  
not smaller than  
both its children!*

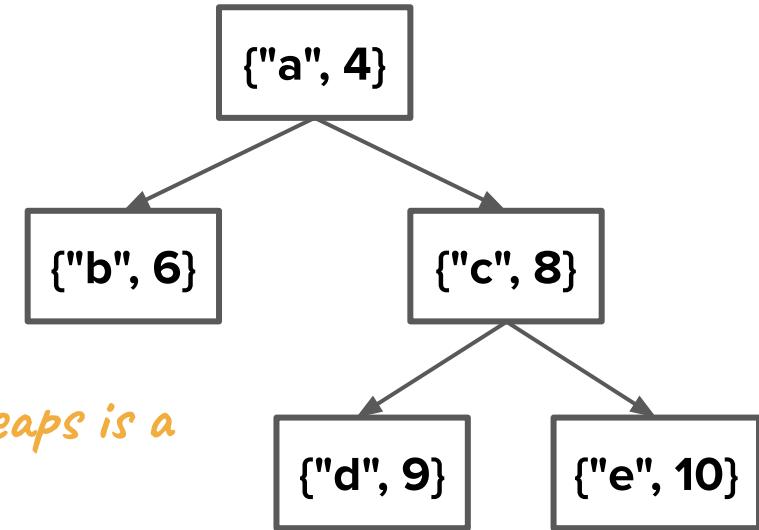


Heap 2

# Spot the Valid Min-Heap (Round 2)



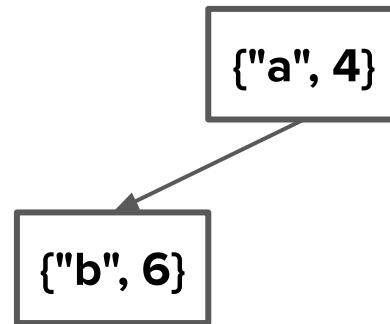
**Heap 1**



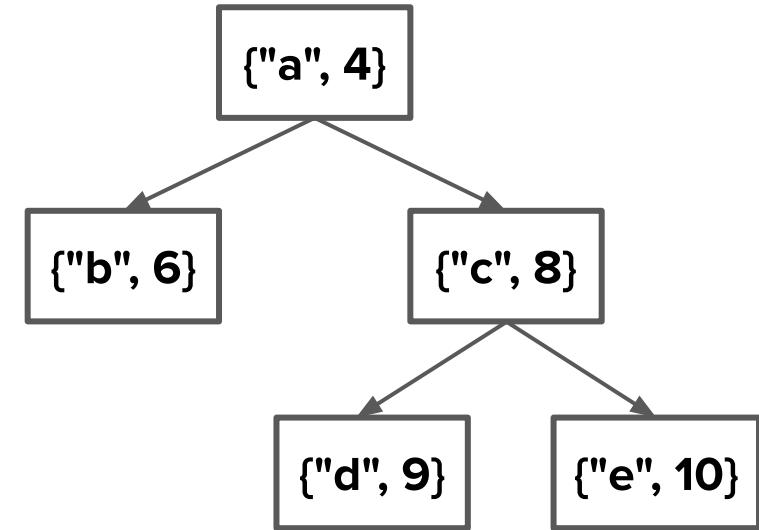
**Heap 2**

*Poll: Which of these heaps is a valid min-heap?*

# Spot the Valid Min-Heap (Round 2)

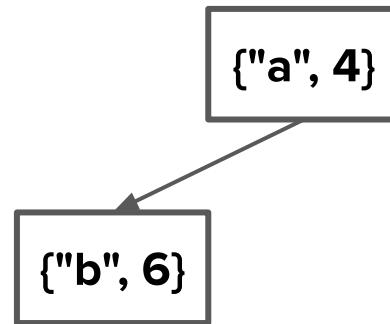


Heap 1

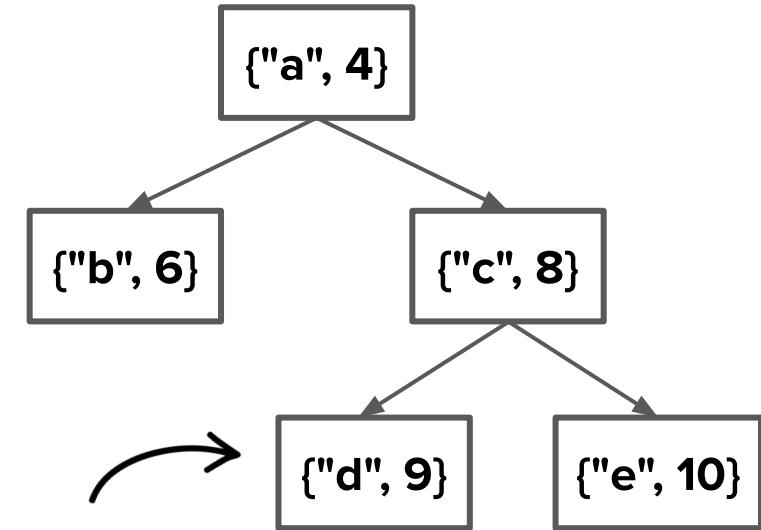


Heap 2

# Spot the Valid Min-Heap (Round 2)



Heap 1



*This level of the  
heap is not  
complete*

Heap 2



# Binary heaps and implementation

# Binary heaps and implementation

What is the interface for the user?  
(Priority Queue)

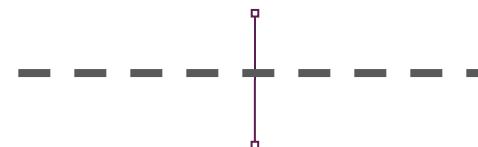


How is our data organized?  
(sorted array, **binary heap**)



What stores our data?  
(arrays)

**Abstract Data  
Structures**



**Data Organization  
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**Fundamental C++  
Data Storage**

# Binary heaps and implementation

What is the interface for the user?  
(Priority Queue)

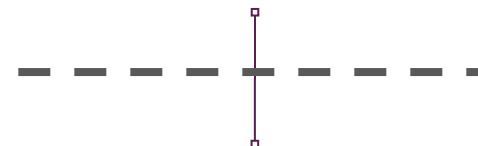


How is our data organized?  
**(binary heap)**



What stores our data?  
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# Binary heaps + implementation

- Binary heaps are both another way to implement **PriorityQueue** and also an abstraction on top of arrays!
- Later, we will see a different approach to storing tree structures, but for heaps (which look like trees), the best solution is actually a simple array.
  - The reason for this is because of the **complete** nature of the structure, with all levels filled from left to right.

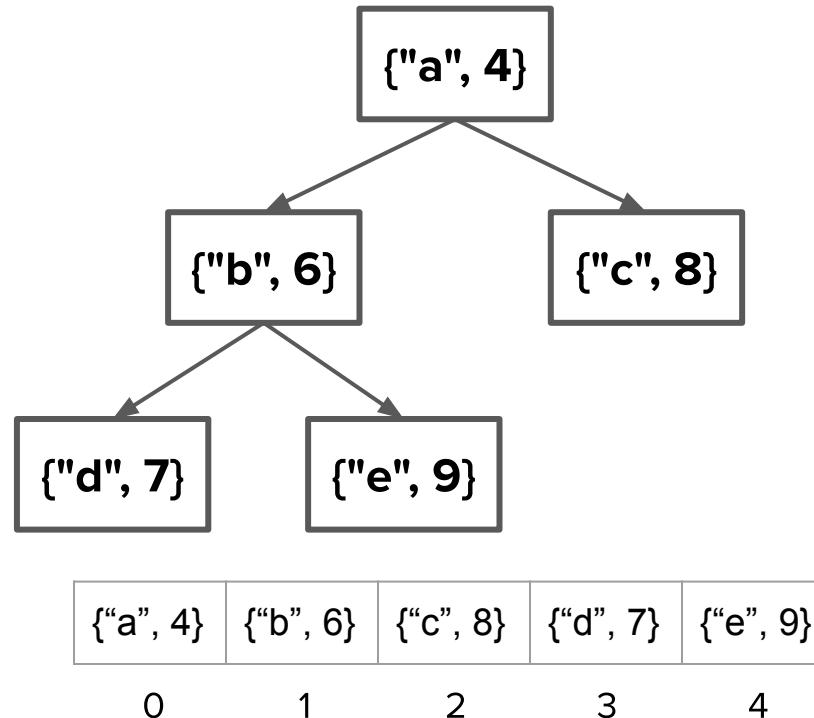
*How are parents and children in the tree related in the array?*

# Binary heaps + implementation

**Parent: i**

Left child:  $2*i + 1$

Right child:  $2*i + 2$



**Parent index: 0**

Left child: 1

Right child: 2

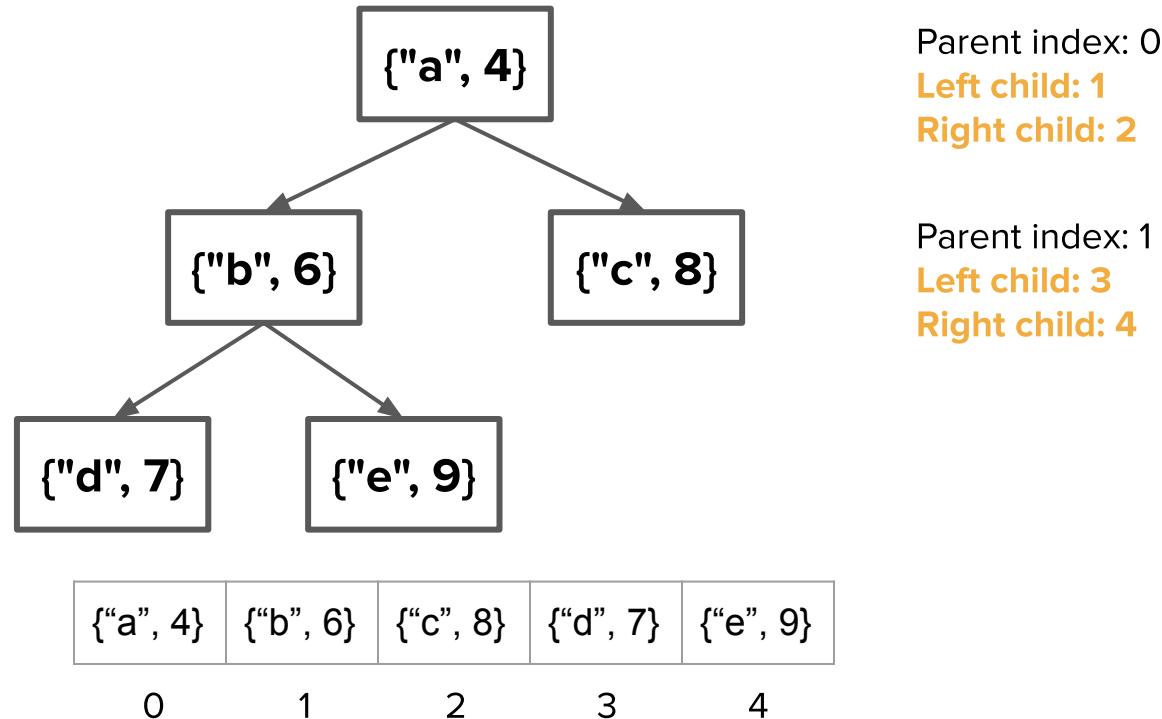
**Parent index: 1**

Left child: 3

Right child: 4

# Binary heaps + implementation

Parent:  $(i-1) / 2$   
**Child:**  $i$



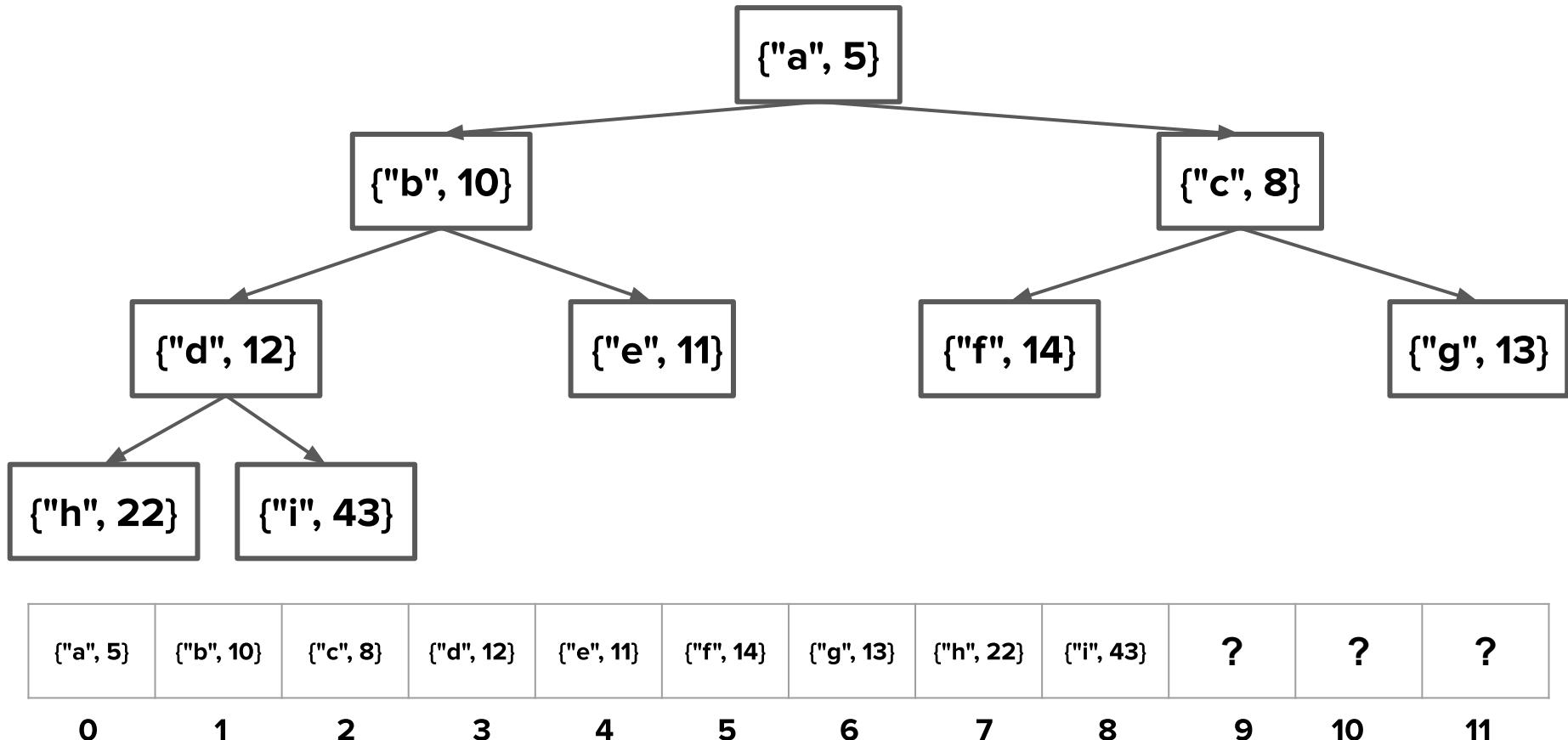


# Manipulating heap contents

# Heap operations

There are three important operations in a heap:

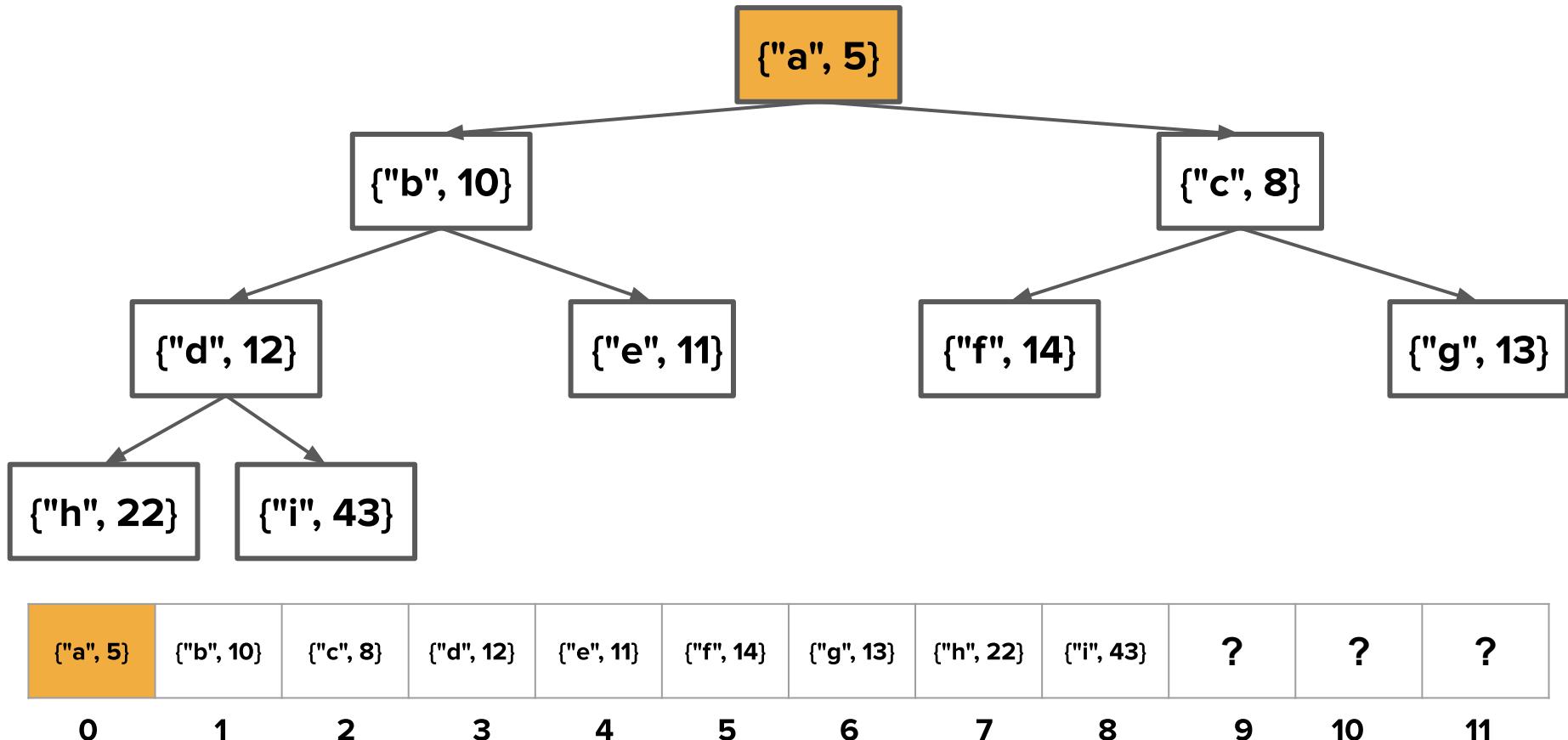
- **peek()**: return the element with the highest priority (lowest number for a min-heap). This operation does not change the state of the heap at all.
- **enqueue(e)**: insert an element **e** into the heap. Insertion of this element must result in a heap that still retains the heap property! Accomplishing this will require some clever manipulation.
- **dequeue()**: remove the highest priority (smallest element for a min-heap) from the heap. This changes the state of the heap, and thus we have to do work to restore the heap property.





# peek()

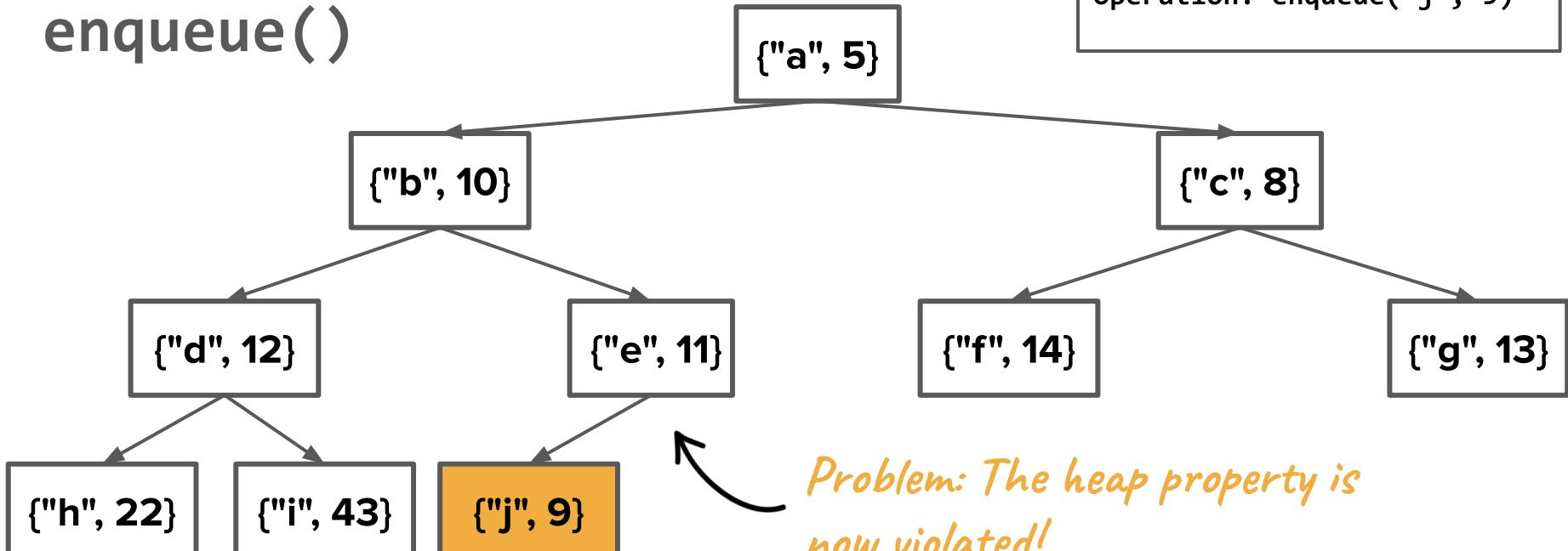
- Look at the root of the tree (position 0 in your array)
- $O(1)$



# enqueue()

- How might we go about inserting into a binary heap?
- Example: What if we called `enqueue({"j", 9})` into the heap from before?
- The key is to understand how heaps are built: it is critical that we fill each level from left to right.
- So, we start by putting the element into the first empty slot at the bottom level. Similar to how we did with the `OurVector` class, we can say something along the lines of `heap[heapSize] = newElement;`

# enqueue()



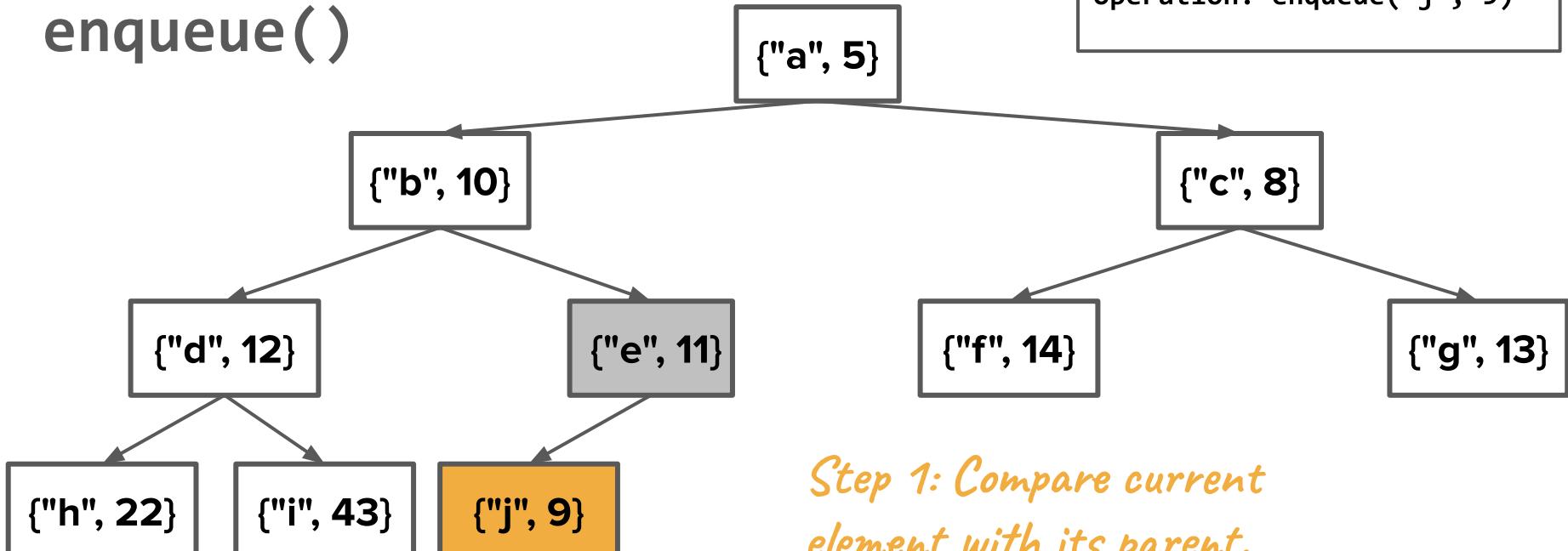
{"a", 5}	{"b", 10}	{"c", 8}	{"d", 12}	{"e", 11}	{"f", 14}	{"g", 13}	{"h", 22}	{"i", 43}	{>highlighted{j", 9}</>}	?	?
0	1	2	3	4	5	6	7	8	9	10	11



# enqueue()

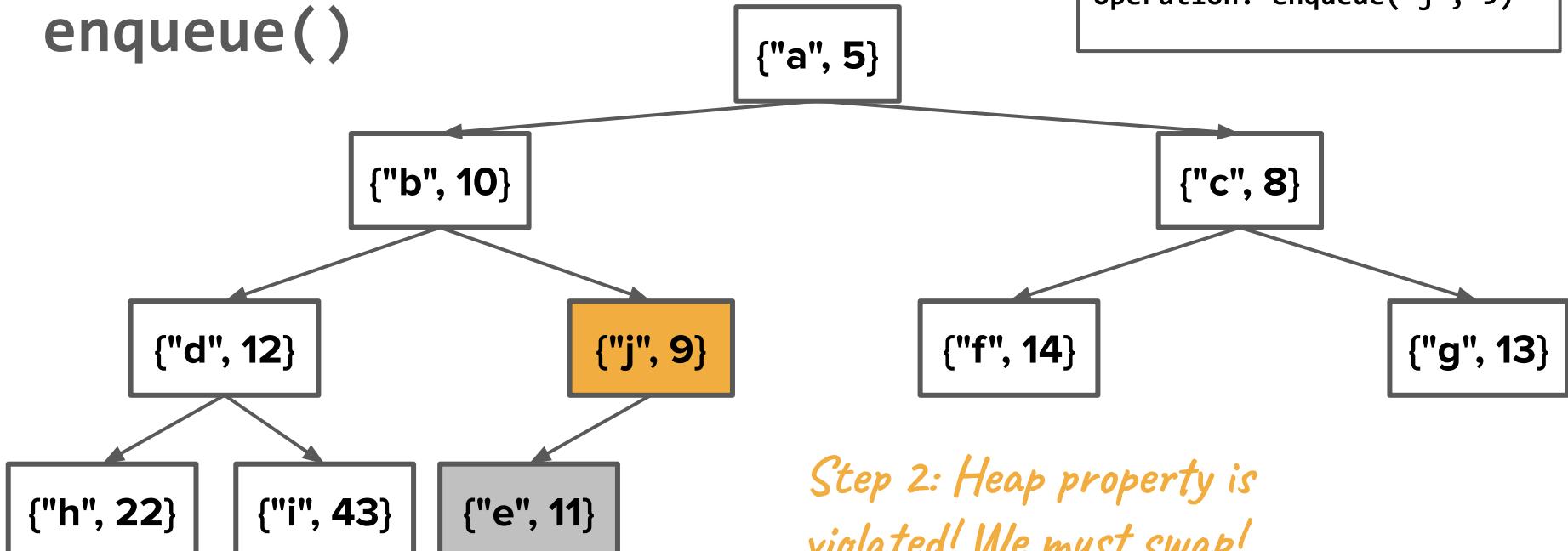
- Inserting our new element into the first empty slot destroyed the heap property – it is now our job to "fix things up" and restore the heap property.
- To do so, we "**bubble up**" the new element into a spot in the heap that is more fitting of its priority.
  - Look at the newly added element and its parent. Do they have a proper min-heap relationship (that is, is the parent smaller than the child element)?
    - If yes, then we're done, terminate the bubble up process.
    - If not, **swap the newly added element with its parent.**
  - Repeat the above steps until the process terminates or until the newly added element becomes the root of the heap.

# enqueue()



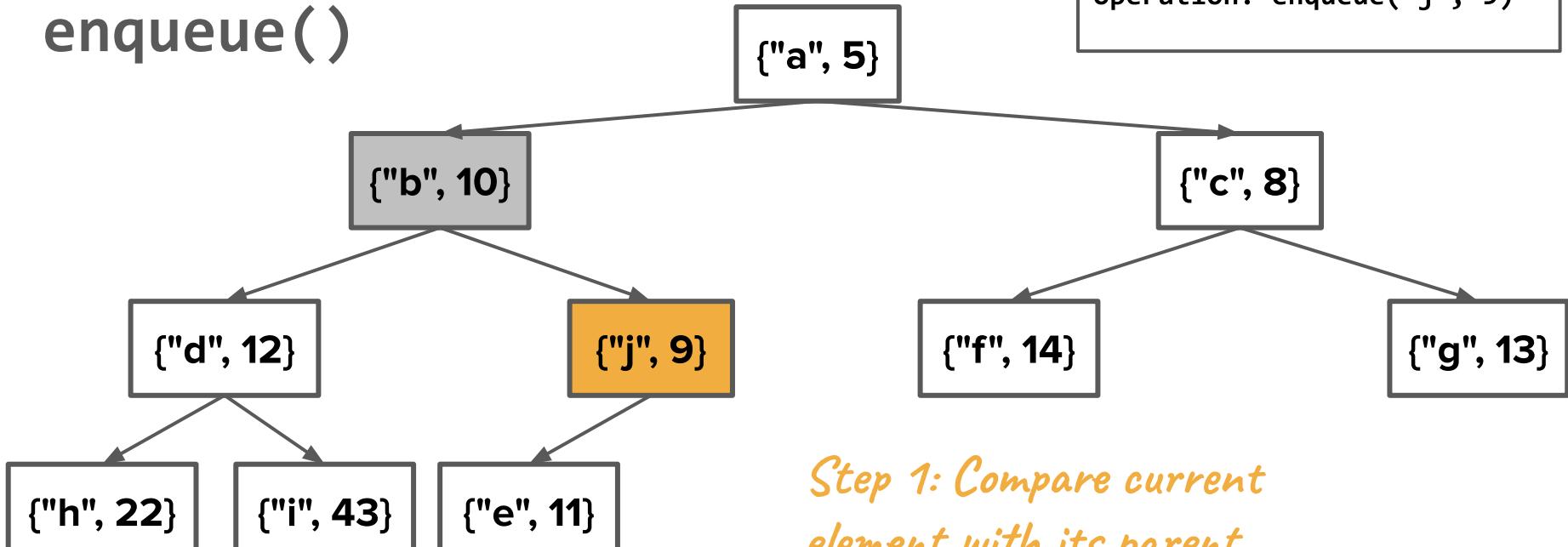
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0	1	2	3	4	5	6	7	8	9	10	11

# enqueue()



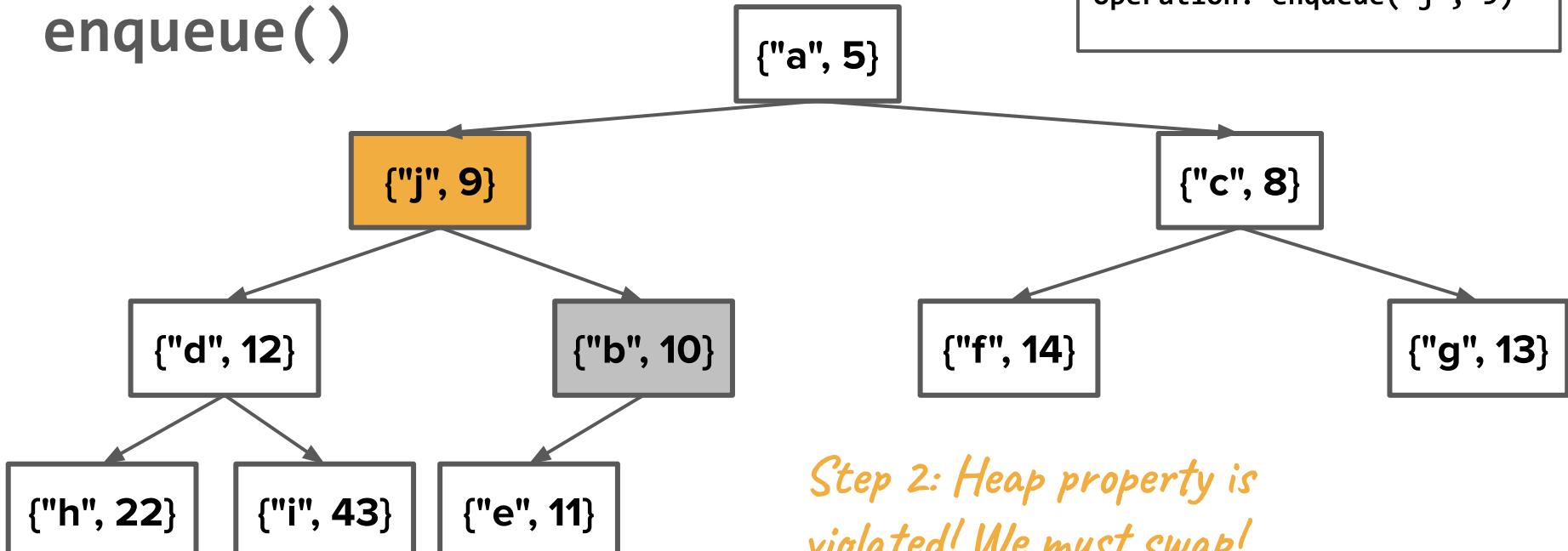
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0	1	2	3	4	5	6	7	8	9	10	11

# enqueue()



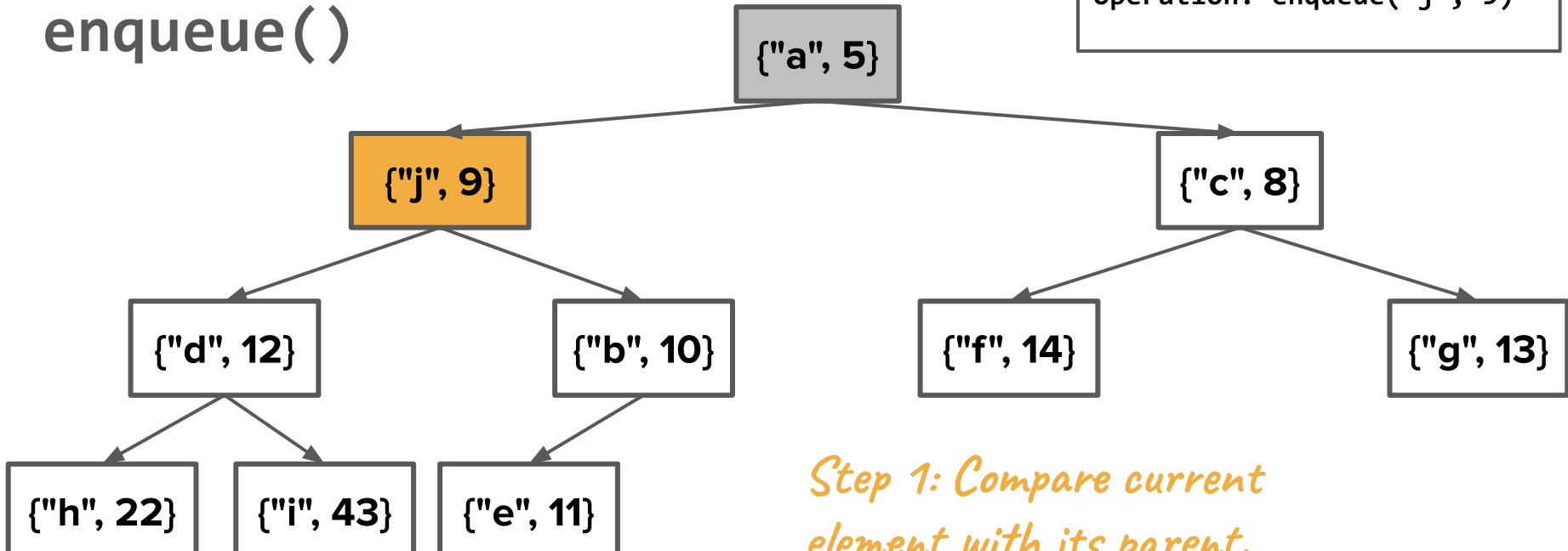
{"a", 5}	{ "b", 10}	{"c", 8}	{"d", 12}	{ "j", 9}	{"f", 14}	{"g", 13}	{"h", 22}	{"i", 43}	{"e", 11}	?	?
0	1	2	3	4	5	6	7	8	9	10	11

# enqueue()



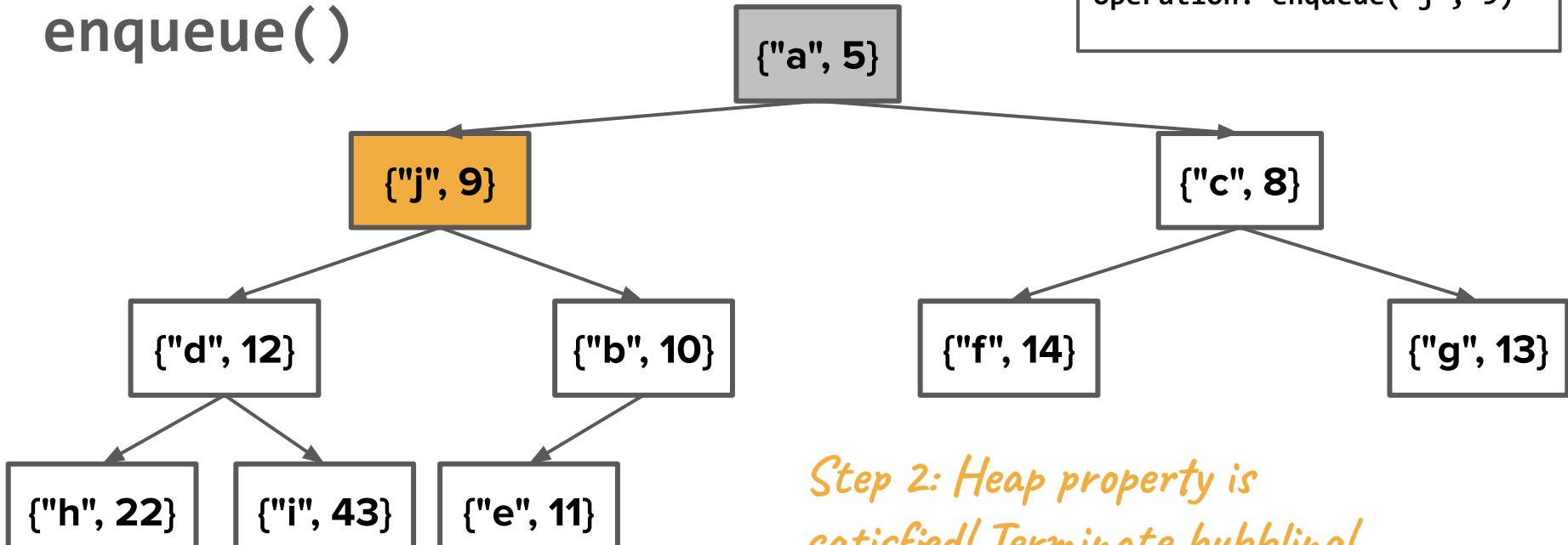
{"a", 5}	{"j", 9}	{"c", 8}	{"d", 12}	{"b", 10}	{"f", 14}	{"g", 13}	{"h", 22}	{"i", 43}	{"e", 11}	?	?
0	1	2	3	4	5	6	7	8	9	10	11

# enqueue()



{"a", 5}	{"j", 9}	{"c", 8}	{"d", 12}	{"b", 10}	{"f", 14}	{"g", 13}	{"h", 22}	{"i", 43}	{"e", 11}	?	?
0	1	2	3	4	5	6	7	8	9	10	11

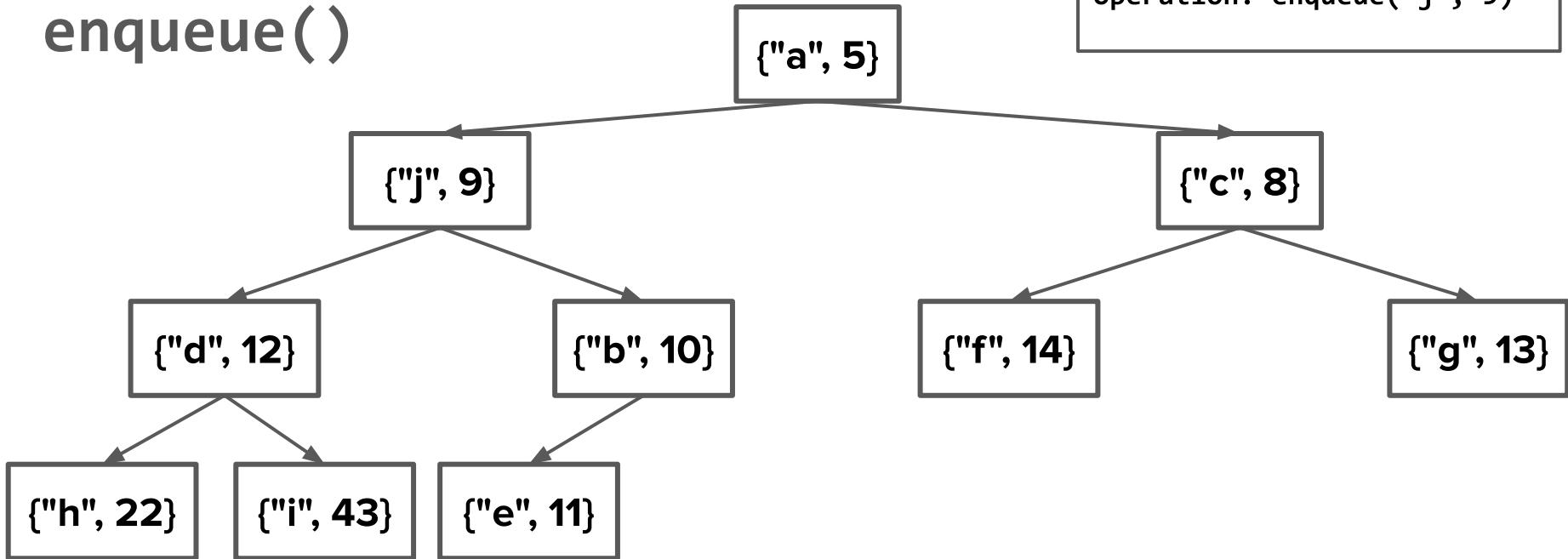
# enqueue()



Step 2: Heap property is satisfied! Terminate bubbling!

{"a", 5}	{"j", 9}	{"c", 8}	{"d", 12}	{"b", 10}	{"f", 14}	{"g", 13}	{"h", 22}	{"i", 43}	{"e", 11}	?	?
0	1	2	3	4	5	6	7	8	9	10	11

# enqueue()



{"a", 5}	{"j", 9}	{"c", 8}	{"d", 12}	{"b", 10}	{"f", 14}	{"g", 13}	{"h", 22}	{"i", 43}	{"e", 11}	?	?
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0 1 2 3 4 5 6 7 8 9 10 11



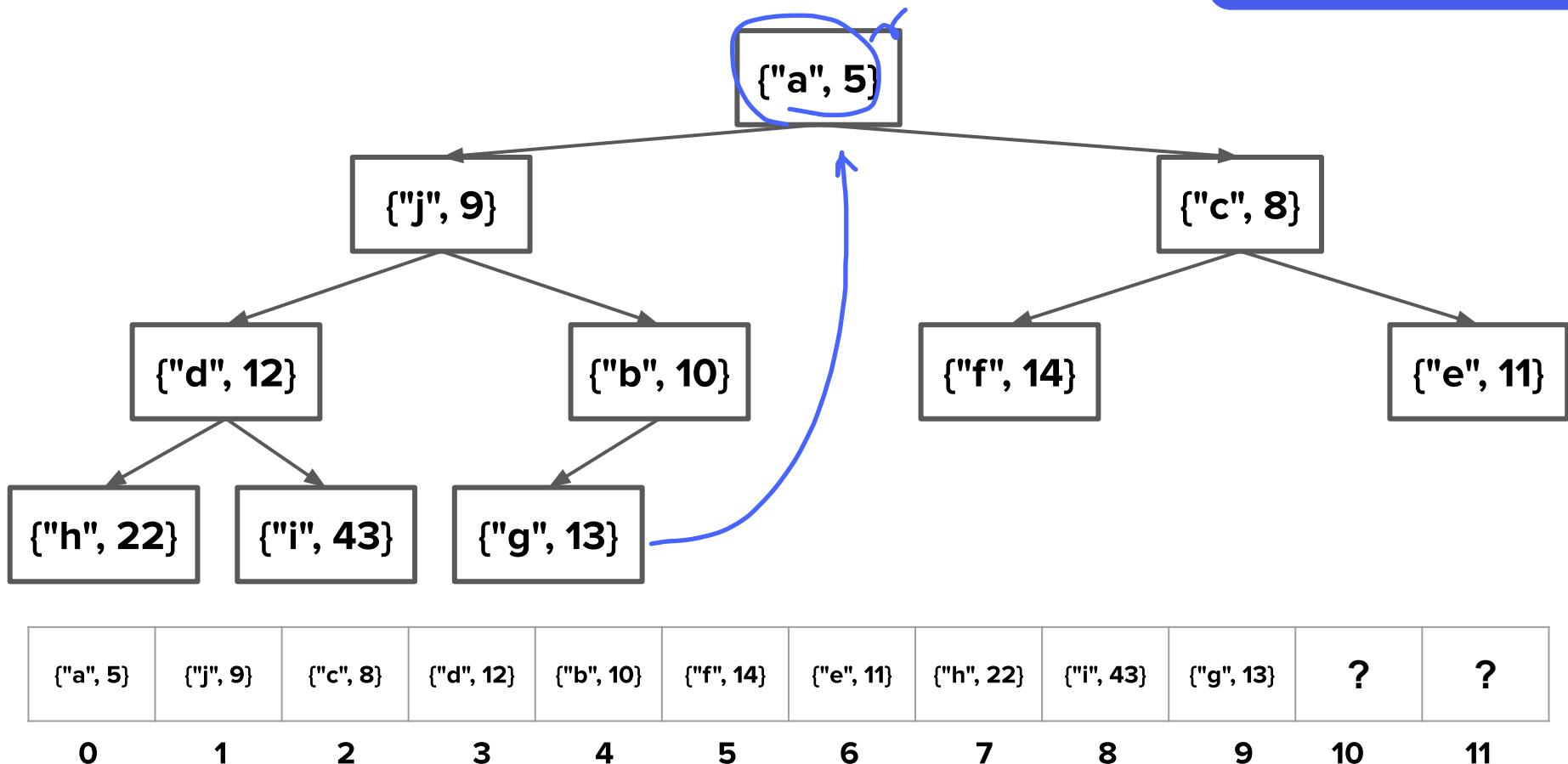
# enqueue()

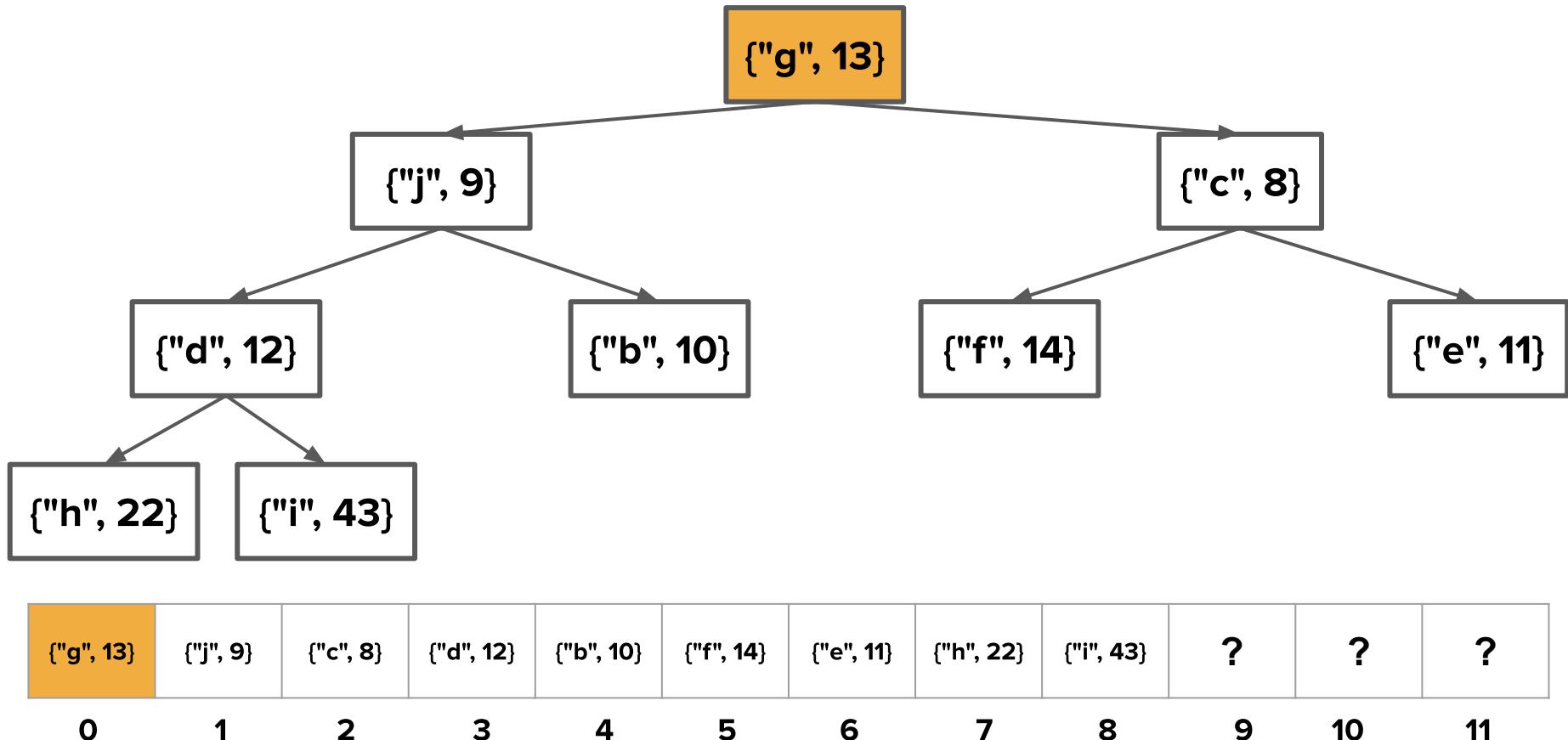
- After our "bubble up" process completes, the heap is in a proper state again. Yay! We have now successfully inserted a new element into the heap.
- For a cool animation of this process across many **enqueue** operations, check out this cool [online heap animation](#).
- What is the runtime complexity of the **enqueue** operation?
  - In the worst case scenario, we have to bubble up the new element all the way up to the root position.
  - Since there are  $n$  total elements, the tree will have  $\log n$  levels, which means we would do  $\log n$  comparisons and  $\log n$  swaps along the way.
  - The overall complexity is  $O(\log n)$ , which we know is blazingly fast! How cool!



# dequeue()

- Remove the minimum element: the root of the tree.
- Replace the root with the “last” element in our tree (last level, farthest right) since we know that location will end up empty.
- Bubble down to regain the *heap property*!

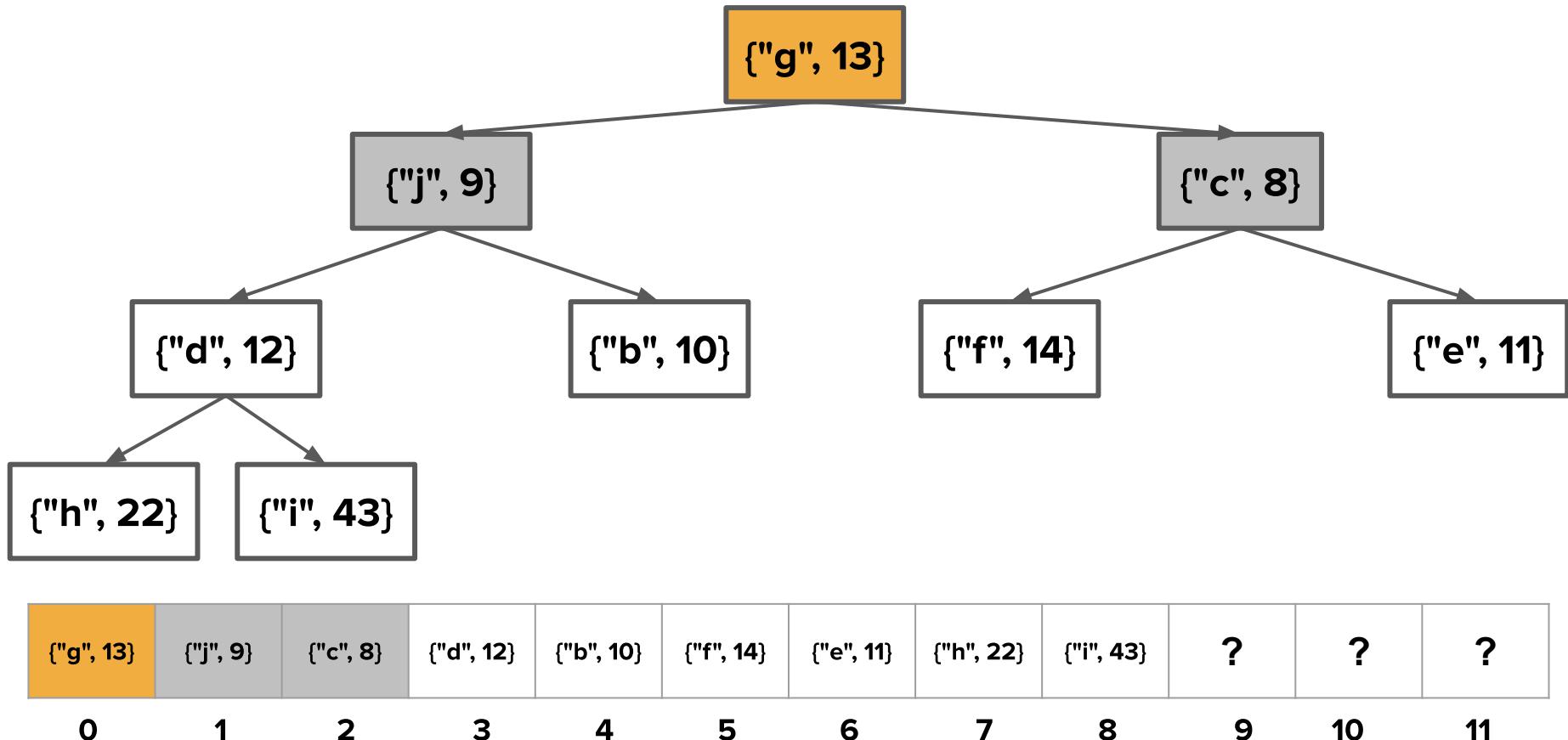


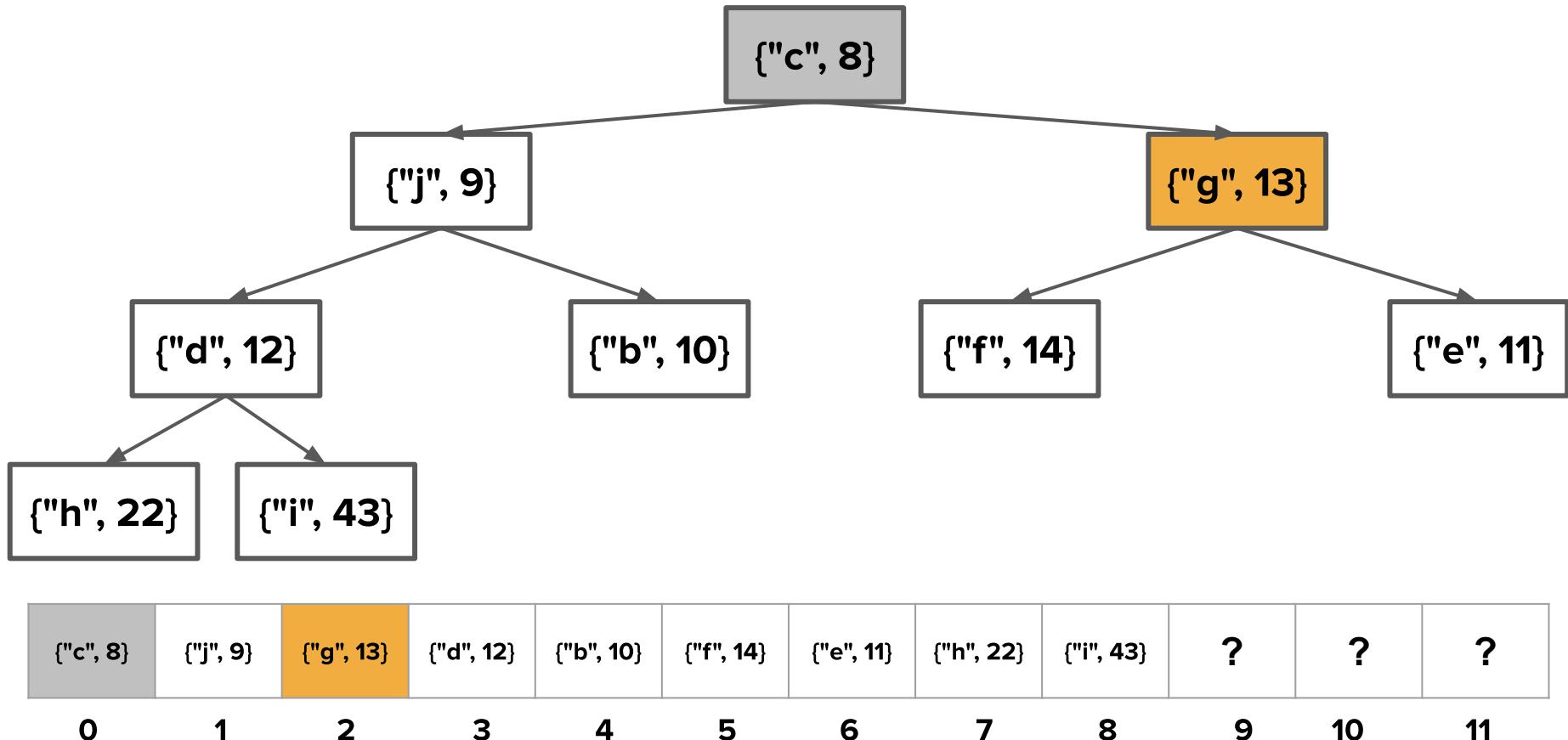


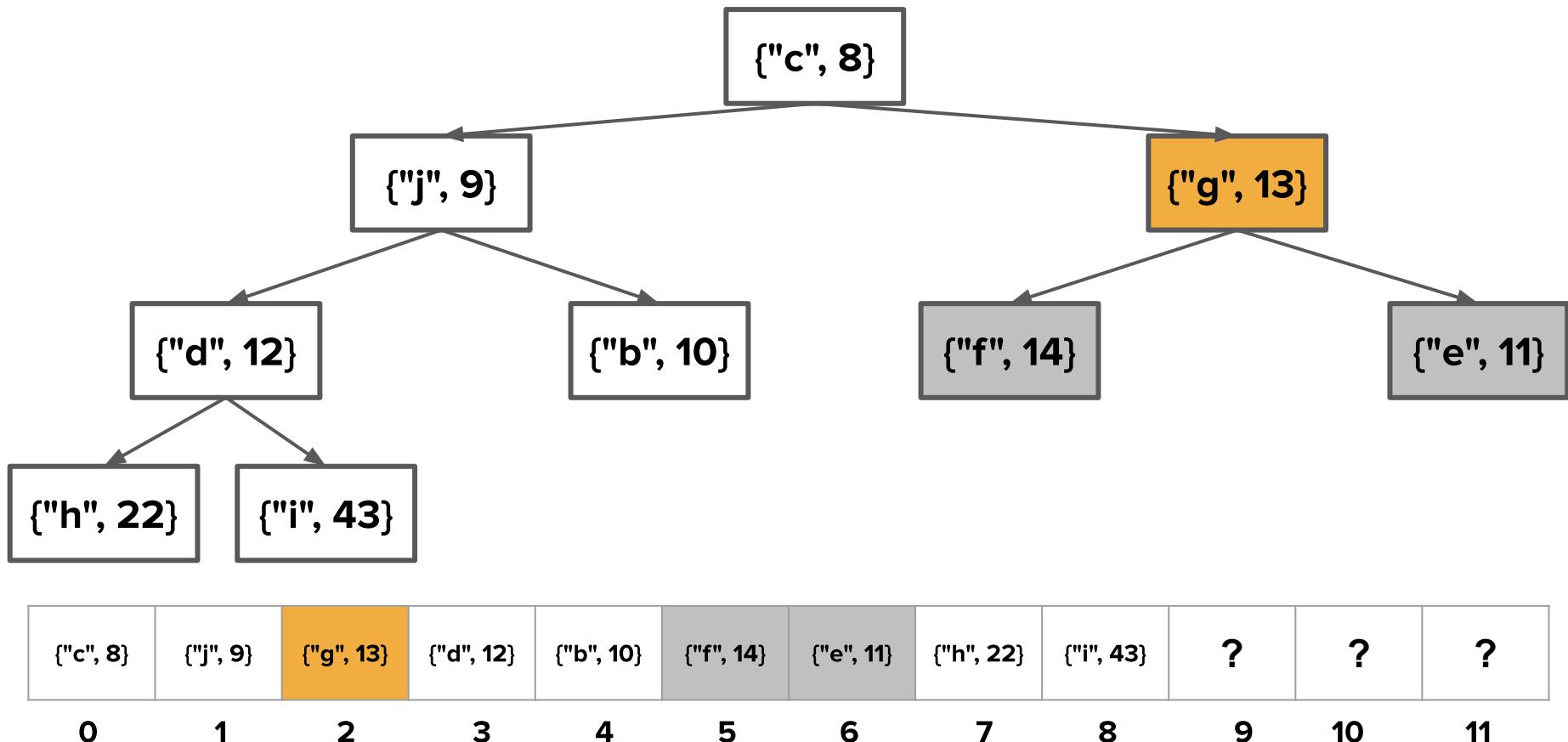


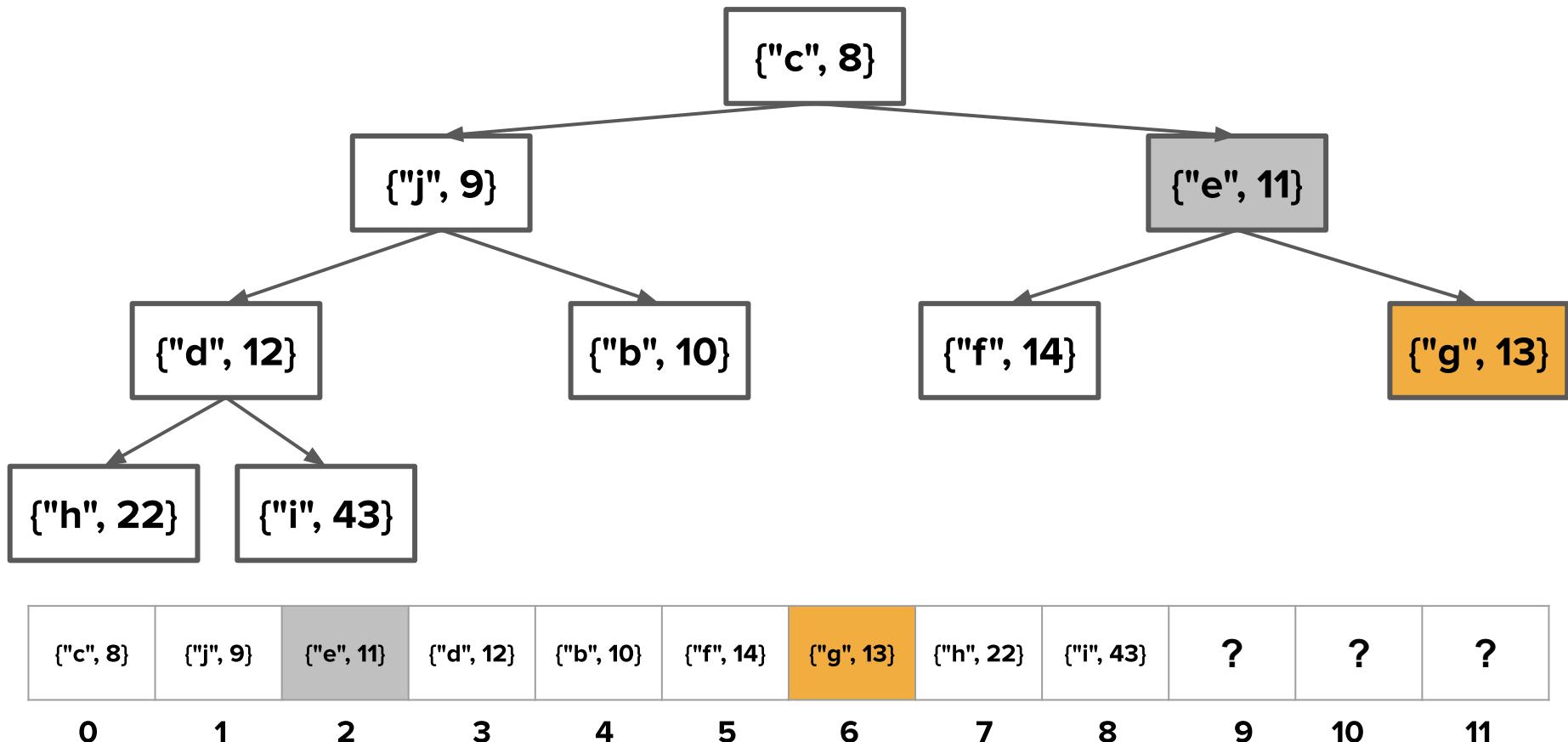
# dequeue()

- Remove the minimum element: the root of the tree.
- Replace the root with the “last” element in our tree (last level, farthest right) since we know that location will end up empty.
- **Bubble down** to regain the *heap property*!
  - Compare the moved element to its new children.
    - If one of the two children is smaller, swap with that child.
    - If both of the children are smaller, swap with the one that’s smaller.
  - Repeat until you no longer bubble down or there are no more children to compare against.











# dequeue()

- Remove the minimum element: the root of the tree.
- Replace the root with the “last” element in our tree (last level, farthest right) since we know that location will end up empty.
- Bubble down to regain the *heap property*!
- **O(log n)**: At worst, you do one comparison at each level of the tree.

*We have a data structure with only O(log n) and O(1) operations!*



# Summary

# Levels of abstraction

What is the interface for the user?  
(Priority Queue)

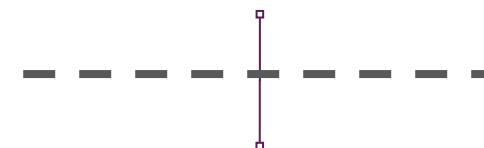


How is our data organized?  
(sorted array, binary heap)



What stores our data?  
(arrays)

**Abstract Data  
Structures**



**Data Organization  
Strategies**



**Fundamental C++  
Data Storage**



# Summary

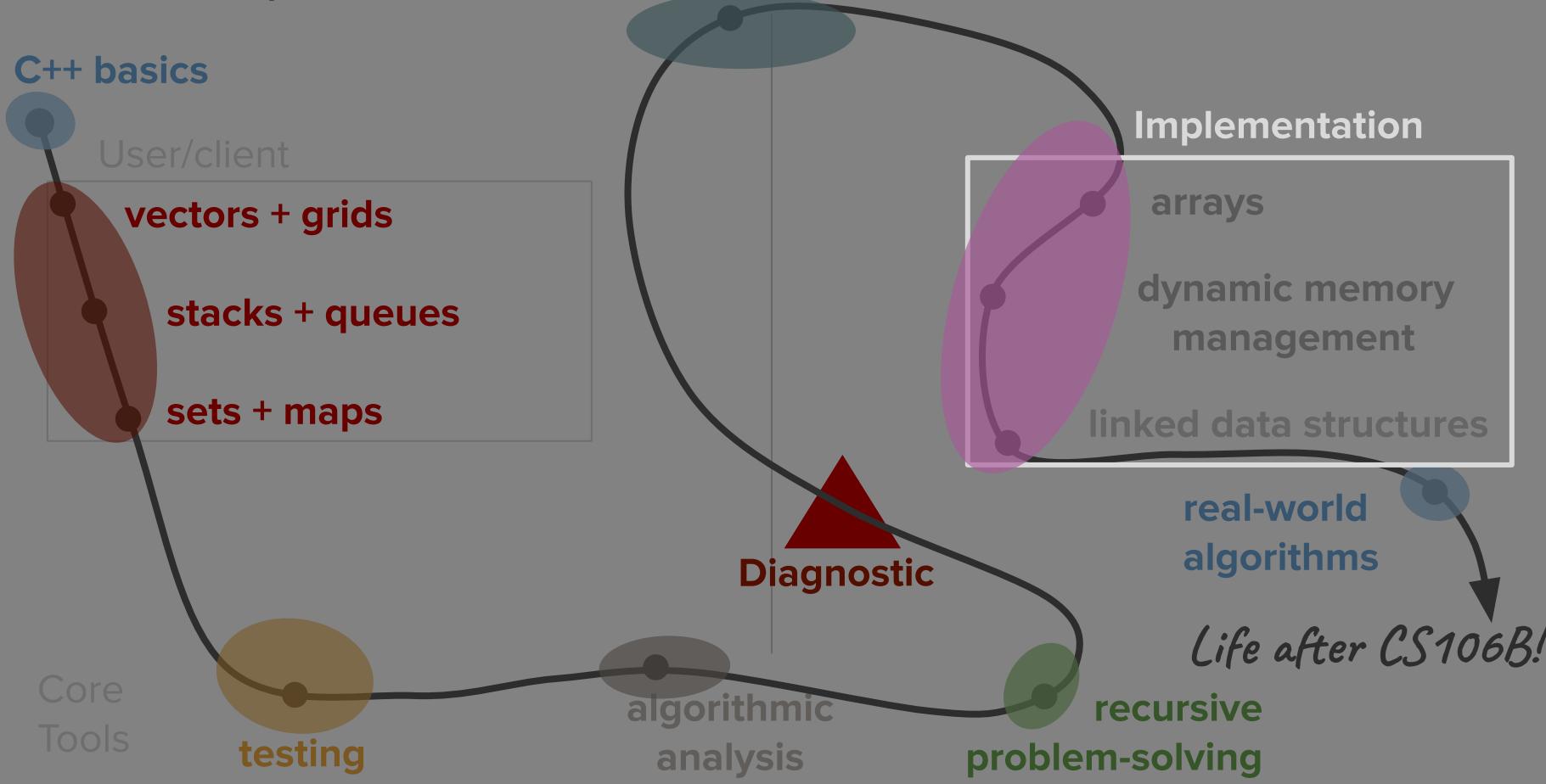
- **Priority queues** are queues ordered by **priority** of their elements, where the **highest priority** elements get dequeued first.
- **Binary heaps** are a good way of organizing data when creating a priority queue.
  - Use a min-heap when a smaller number = higher priority (what you'll use on the assignment) and a max-heap when a larger number = higher priority.
- There can be multiple ways to implement the same abstraction! For both ways of implementing our priority queues, we'll use **arrays** for data storage.



# What's next?

# Roadmap

## Object-Oriented Programming



# Memory and Pointers

