

CMPE 180A DSA with Python

Trees: Priority Queues, Heaps, Binary Search Trees
Project introduction, Lab

Sanja Damjanovic

Week 5

8/12/2025

Week 5 Outline

- At 5.30pm Midterm (90 minutes)
- At 7pm: Lecture
- Trees: Priority queues, Heaps, Binary Search Trees
- Project introduction
- Scientific Python packages
 - NumPy
 - Matplotlib
 - Pandas
 - SciPy

CMPE180A Overview

- Weeks 5, 6, 7: HW 2, 3, 4
- Week 7: Project: selection of the topic and dataset
- Weeks 8, 9, 10: work on project
- Week 10: the final
- Week 11: project presentations, everyone will present

Term Project

Project

- Project assignment will be published on Canvas
 - Exploratory data set analysis + prediction/classification
- Project groups:
 - Randomly generated
 - Group: 2-3 students (5-6 groups)

Project Data Sets - Examples

- NYC Yellow Taxi Trip Data (<https://www.kaggle.com/datasets/elemento/nyc-yellow-taxi-trip-data>)
- IMDB Dataset of 50K Movie Reviews (<https://www.kaggle.com/datasets/lakshmi25npathi/imdb-dataset-of-50k-movie-reviews>)
- Superstore Dataset (<https://www.kaggle.com/datasets/vivek468/superstore-dataset-final>)
- Spotify Tracks DB (<https://www.kaggle.com/datasets/zaheenhamidani/ultimate-spotify-tracks-db>)

Project Deliverables and Deadlines

- Week 7/8: Select a dataset you will be working on (check the project notebook)
- Week 11:
 - Upload project code and slides; write documentation directly in notebook by using text sections
 - Present results in ~ 10 minutes with 5-10 slides:
 - Slides:
 - 1st: The title slide should contain the title of your project and the names of the team members
 - 2nd slide: introduction with the dataset and list of the done
 - 3rd: dataset description
 - 4th-nth: steps in analysis and results
 - the last slide: conclusion and the overview of the presented (~ similar to the 2nd slide), and recommendations

Scientific Python

NumPy

Documentation



- numpy.org
- fundamental package for scientific computing in Python
- a Python library that provides:
 - a multidimensional array object
 - various derived objects (such as masked arrays and matrices)
 - routines for fast operations on arrays including:
 - mathematical, logical, shape manipulation, sorting, selecting, I/O, discrete Fourier transforms, basic linear algebra, basic statistical operations, random simulation and much more

NumPy arrays

Python objects:

- high-level number objects: integers, floating point
- containers: lists (costless insertion and append), dictionaries (fast lookup)

NumPy provides:

- extension package to Python for multi-dimensional arrays
- closer to hardware (efficiency)
- designed for scientific computation (convenience)
- Also known as *array oriented computing*



NumPy



- NumPy reference on numpy.org
- Reading:
- <https://lectures.scientific-python.org/intro/numpy/index.html>
- 1.3. NumPy: creating and manipulating numerical data:
 - **1.3.1. The NumPy array object**
 - **1.3.2. Numerical operations on arrays**
 - **1.3.3. More elaborate arrays**
 - Reading

Matplotlib

Visualization with Python

- <https://matplotlib.org/>
- Matplotlib is a comprehensive library for creating static, animated, and interactive visualizations in Python
- *pyplot* provides a procedural interface to the matplotlib object-oriented plotting library. It is modeled closely after Matlab™
- Matplotlib tutorial: <https://lectures.scientific-python.org/intro/matplotlib/index.html>
 - Reading

Pandas

<https://pandas.pydata.org/>

- a fast, powerful, flexible and easy to use open source data analysis and manipulation tool, built on top of the **Python** programming language
- contains data structures and data manipulation tools designed to make data cleaning and analysis fast and convenient in Python
- used in tandem with numerical computing tools like NumPy and SciPy etc.

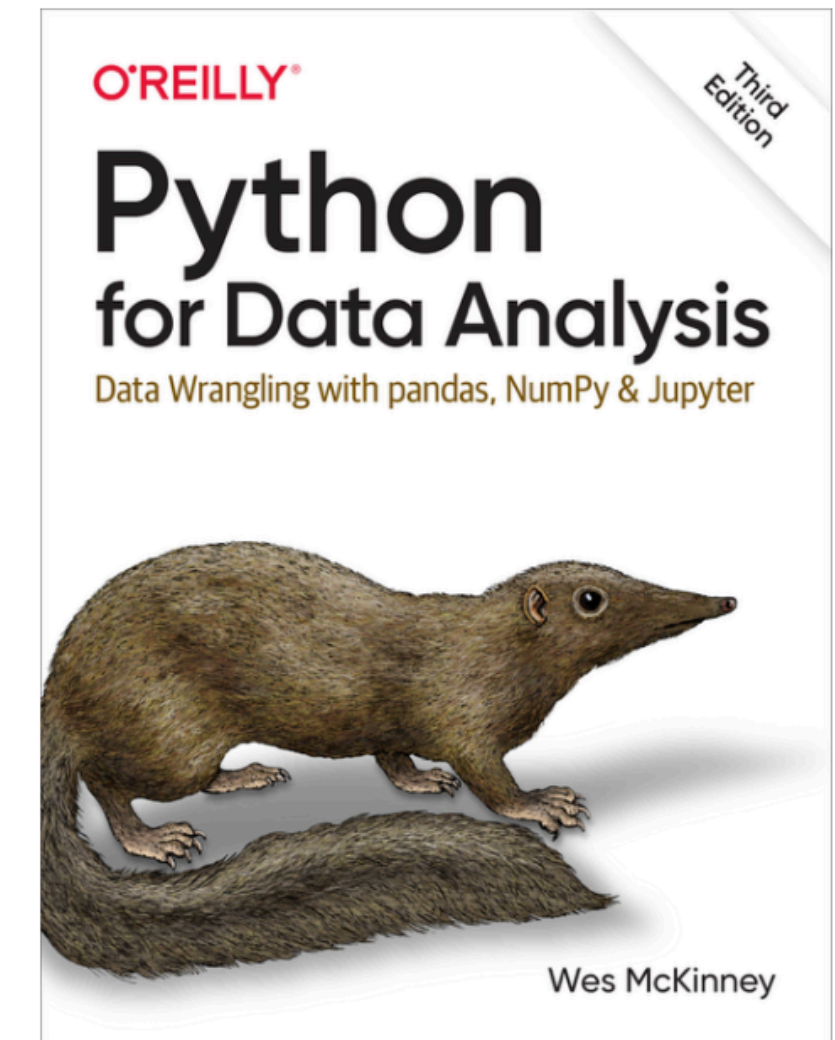
Pandas: Data Structures

- Series
 - a one-dimensional array-like object containing a sequence of values with labels
- DataFrames
 - a rectangular table of data and contains an ordered, named collection of columns, each of which can be a different value type (numeric, string, Boolean, etc.)
 - has both a row and column index

Pandas

Resources

- **Reading**
- Book chapter Chapter 5. Getting Started with pandas
- https://pandas.pydata.org/getting_started.html
- Pandas cheat sheet
- <https://wesmckinney.com/book/>



SciPy

<https://scipy.org/>

- SciPy: high-level scientific computing
- SciPy provides algorithms for optimization, integration, interpolation, eigenvalue problems, algebraic equations, differential equations, statistics and many other classes of problems.
- SciPy tutorial : 1.5.1, 1.5.2, 1.5.3, 1.5.4, 1.5.5, 1.5.6
 - Reading
- User Guide

Video Tutorials

[**https://www.youtube.com/@freecodecamp**](https://www.youtube.com/@freecodecamp)

- Pandas & Python for Data Analysis by Example – Full Course for Beginners <https://youtu.be/gtjxAH8uaP0?si=EUuvel3MiXWOvS0G>
- Data Analysis with Python - Full Course for Beginners (Numpy, Pandas, Matplotlib, Seaborn) <https://youtu.be/r-uOLxNrNk8?si=XgUNnjTtWLII4p4X>
- Python NumPy Tutorial for Beginners <https://youtu.be/QUT1VHiLmml?si=PQr8uv60ObIhJy6>
- Data Analysis with Python: Part 3 of 6 Numerical Computing with Numpy (Live Course) <https://www.youtube.com/live/NIZXAytUeeE?si=8IEcOamBSV51EmRZ>
- Matplotlib Crash Course https://youtu.be/3Xc3CA655Y4?si=u_6gkytDp2yKyYPr

Heaps, Priority Queues, Binary Search Trees

Priority Queues

Priority Queue

- FIFO - “first come, first serve”- policy is not suitable for all queues
- an air-traffic control center that has to decide which flight to clear for landing from among many approaching the airport: plane’s distance from the runway, time spent waiting in a holding pattern, or amount of remaining fuel
- Different priority criteria: flight booking

Priority Queue ADT

- an element and its priority is a key-value pair

P.add(k, v): Insert an item with key k and value v into priority queue P.

P.min(): Return a tuple, (k,v), representing the key and value of an item in priority queue P with minimum key (but do not remove the item); an error occurs if the priority queue is empty.

P.remove_min(): Remove an item with minimum key from priority queue P, and return a tuple, (k,v), representing the key and value of the removed item; an error occurs if the priority queue is empty.

P.is_empty(): Return True if priority queue P does not contain any items.

len(P): Return the number of items in priority queue P.

Priority Queue Example

Q1: What is the last returned value in the ‘Return Value’ column?

Operation	Return Value	Priority Queue
P.add(5,A)		{(5,A)}
P.add(9,C)		{(5,A), (9,C)}
P.add(3,B)		
P.add(7,D)		
P.min()		
P.remove_min()		
P.remove_min()		
len(P)		
P.remove_min()		
P.remove_min()		
P.is_empty()		
P.remove_min()		

Priority Queue Example

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P.is_empty()		
P.remove_min()		

Priority Queue implementation using List

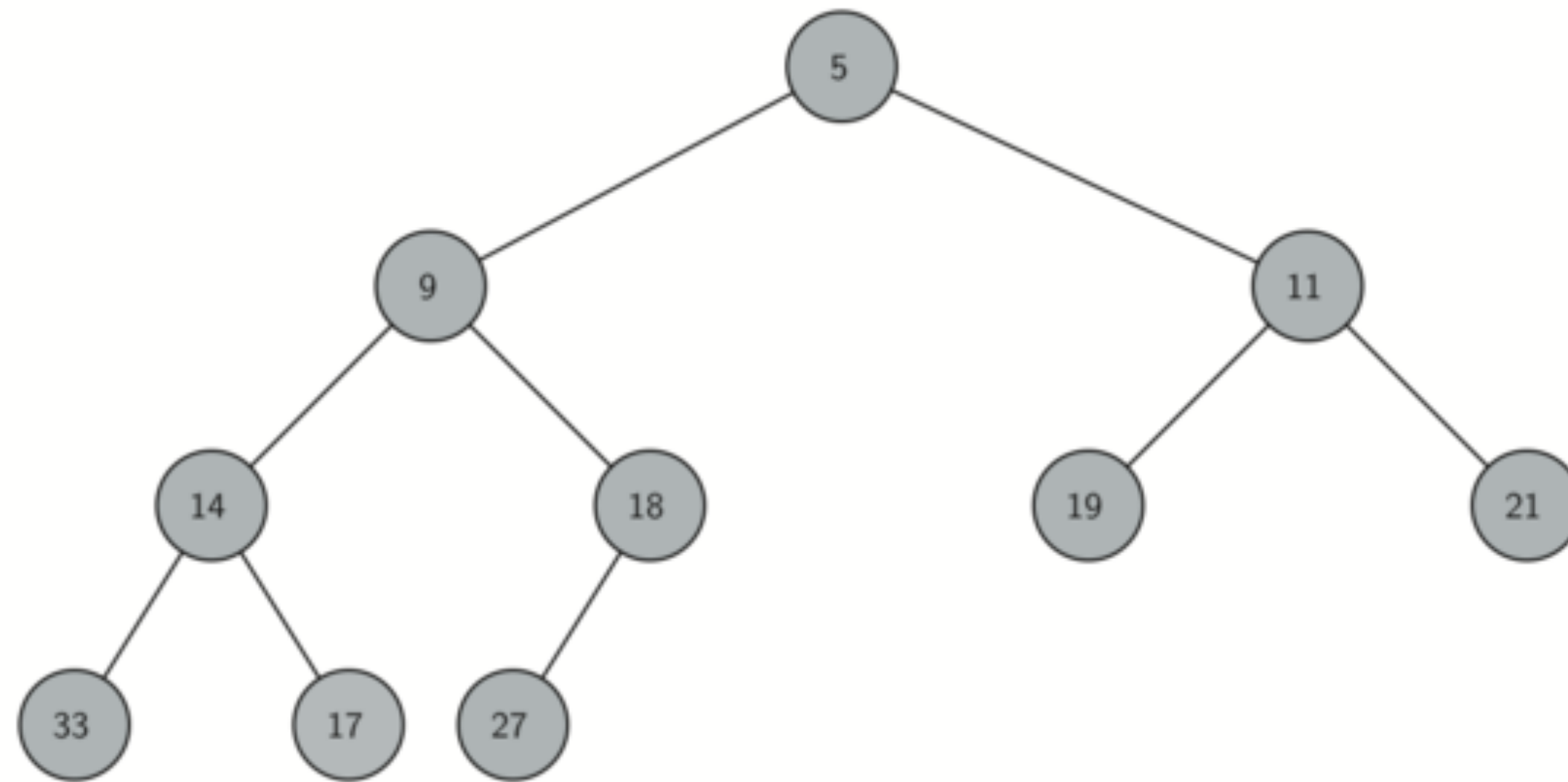
- Insertion into the list $O(n)$
- Sorting $O(n \cdot \log(n))$

Heaps

Heap

Min-heap: the root node holds the minimum value

- A heap is a binary tree storing keys at its nodes and satisfying the following properties:
- **Heap-Order Property:** for every internal node v other than the root, $key(v) \geq key(parent(v))$



Max-heap: The root node holds the minimum value

Priority Queue implementation using Tree

Min-heap (or max-heap)

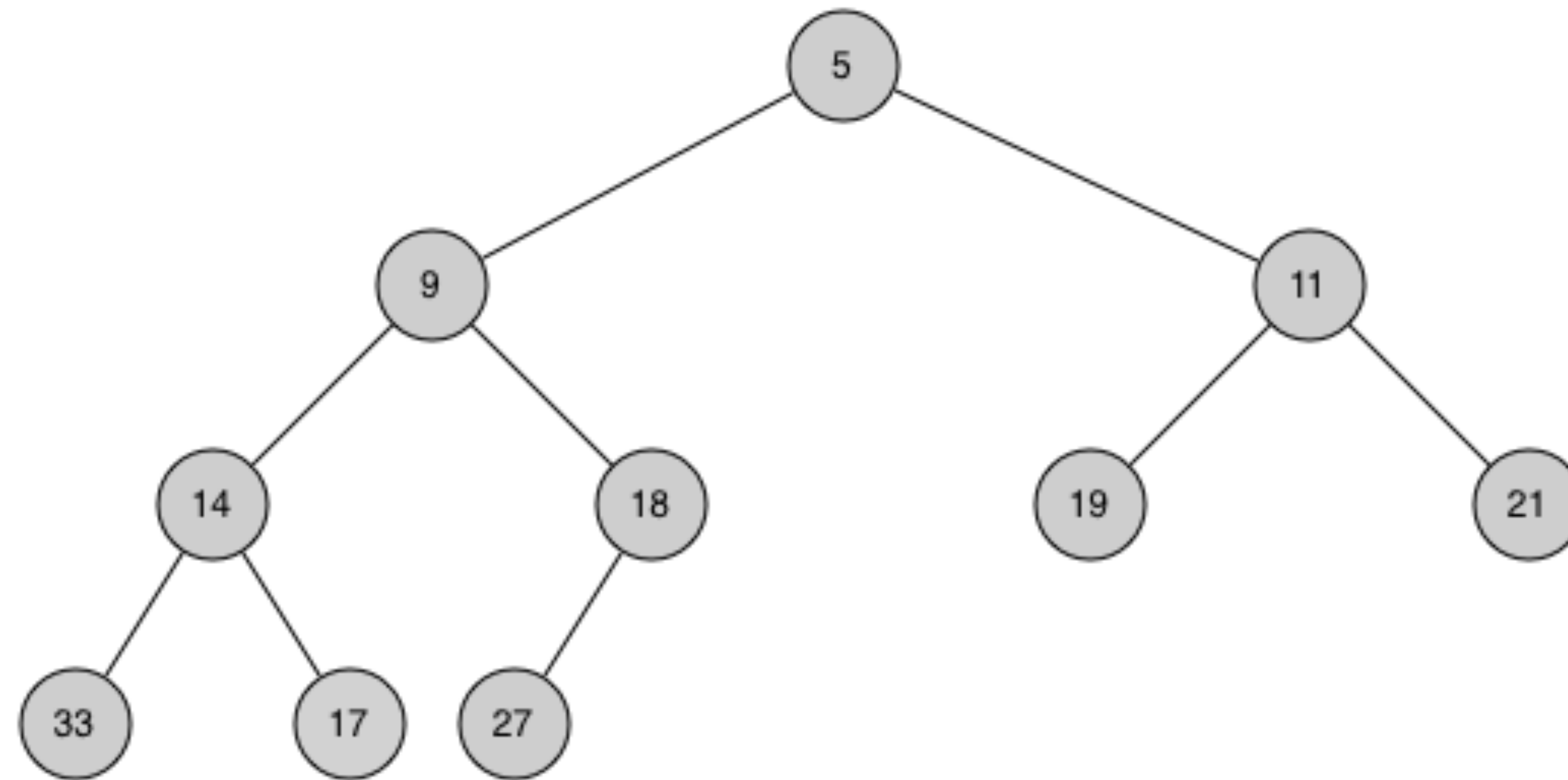
- Insertion into a min-heap (or max-heap): $O(\log(n))$
- Lookup for the min (or max) element: $O(1)$
- Deletion: $O(\log(n))$

Heap Application

- Sequence of information (strings, integers) presented in 'streaming' fashion:
 - Sequence is of the unknown length or $\text{length} > k$
 - Computer the k longest strings in the sequence seen so far:
 - Min-heap: find-min, remove-min, insert

The Heap Order Property

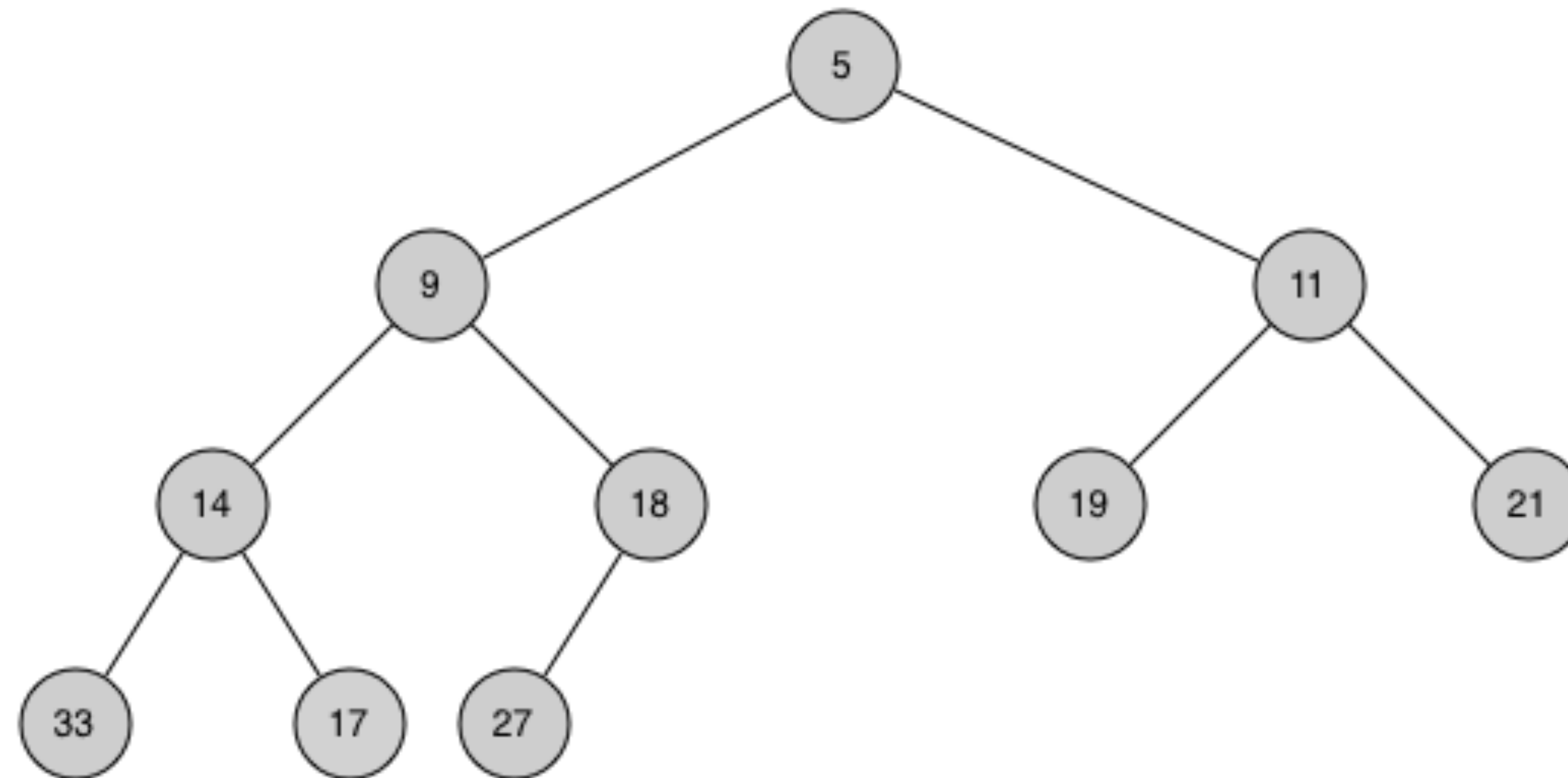
A Complete Binary Tree



Q2: What is a list representation of this tree?

The Heap Order Property

A Complete Binary Tree



List Representation:

Binary Heap

- A specialized binary tree:
 - A **complete** binary tree (every level - except the last one- is completely filled, and all nodes are as far left as possible)
 - Max-heap: the children of the node at index l are at $2 \cdot l + 1$ and $2 \cdot l + 2$ indices
 - **Max-heap** supports **$O(\log(n))$ insertion** and **$O(1)$ time look up** for the max element and $O(\log(n))$ deletion of max element
 - **Search** for any key is **$O(n)$**
 - **Min-heap**: supports **$O(1)$ lookup** for the minimum element

Heap Operation

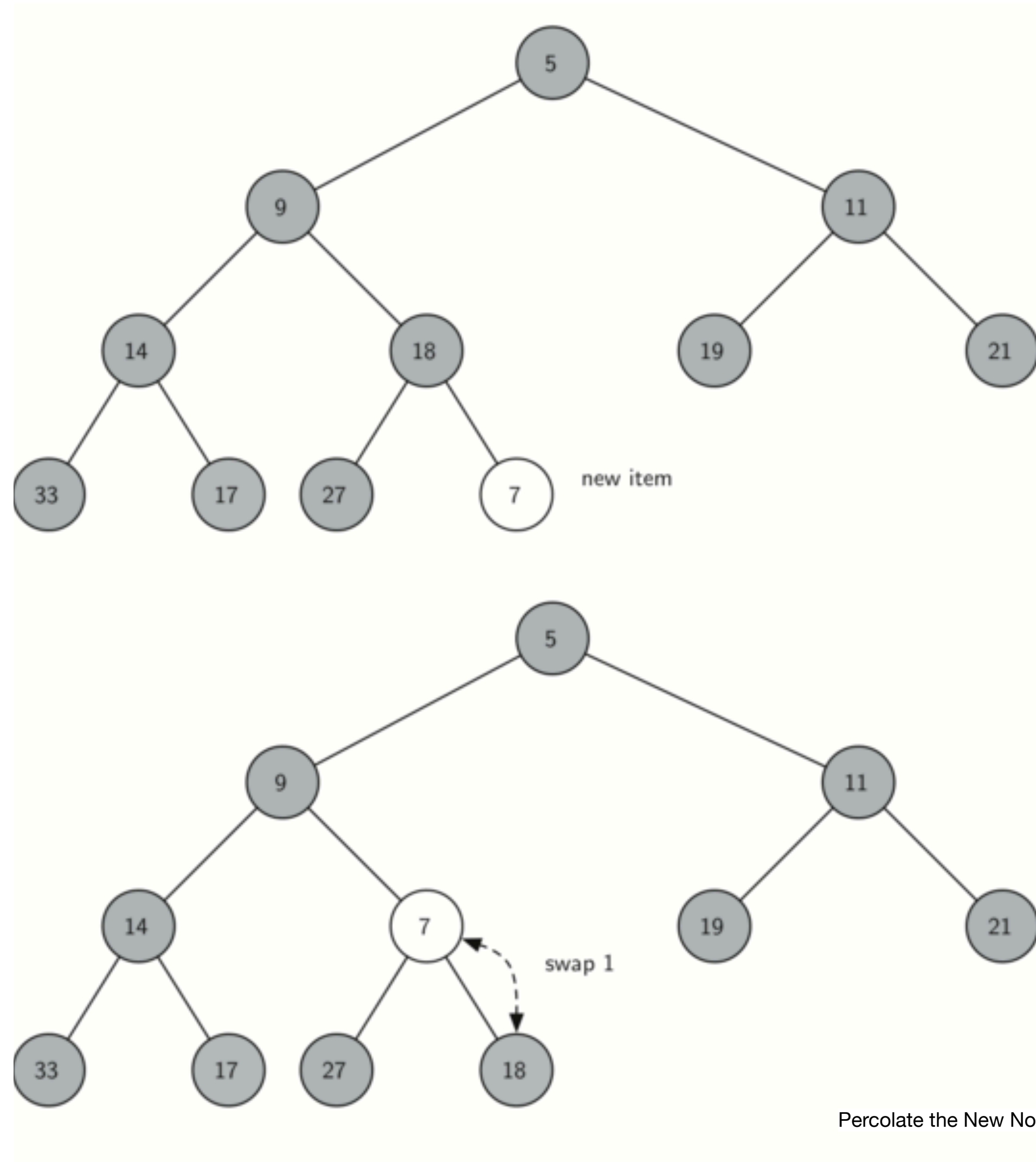
- `BinaryHeap()` creates a new empty binary heap.
- `insert(k)` adds a new item to the heap.
- `get_min()` returns the item with the minimum key value, leaving the item in the heap.
- `delete()` returns the item with the minimum key value, removing the item from the heap.
- `is_empty()` returns `True` if the heap is empty, `False` otherwise.
- `size()` returns the number of items in the heap.
- `heapify(list)` builds a new heap from a list of keys.

Heap in Python

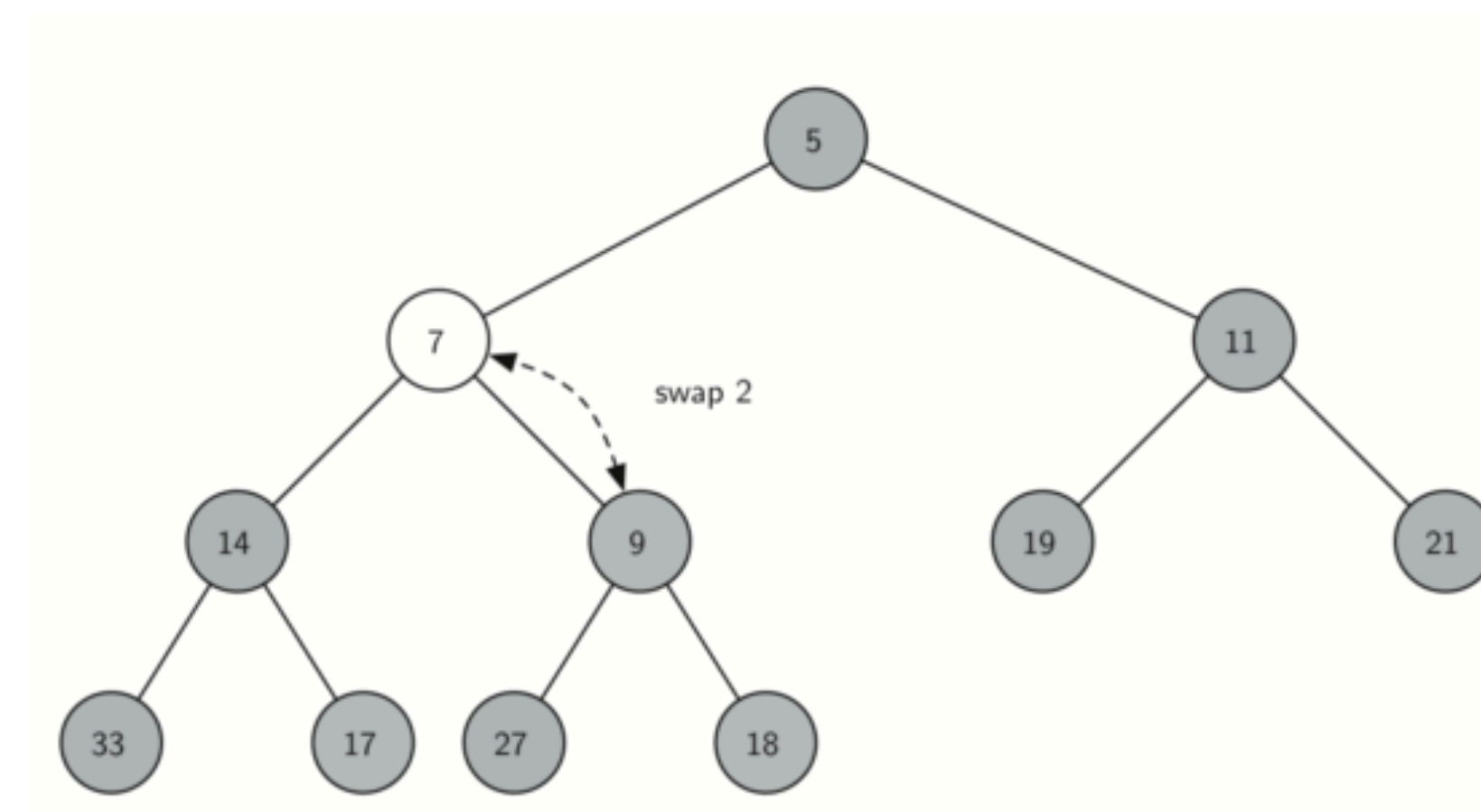
`import heapq`

- <https://docs.python.org/3/library/heapq.html#basic-examples>
-
- **Heapq** module
 - `heapq.heapify(L)` : transforms elements of L into a min-heap in-place
 - `heapq.nlargest(k,L)`, `heapq.nsmallest(k,L)` : returns k largest/smallest elements
 - `heapq.heappush(h,e)`
 - `heapq.heappop(h)`
 - `heapq.heappushpop(h,a)`
 - `e=h[0]`: returns the smallest element

Insertion

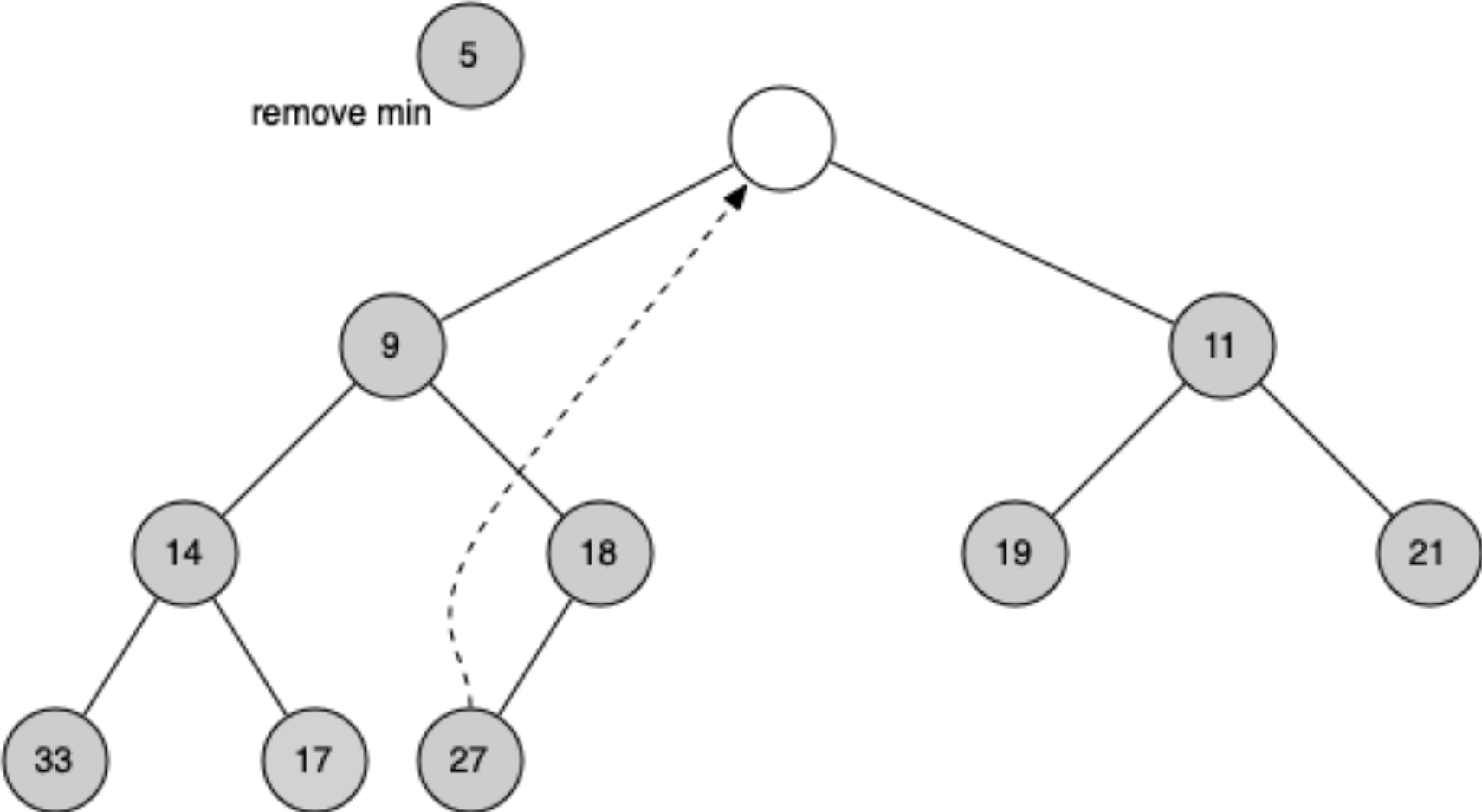


```
class BinaryHeap:  
    def __init__(self):  
        self._heap = []
```

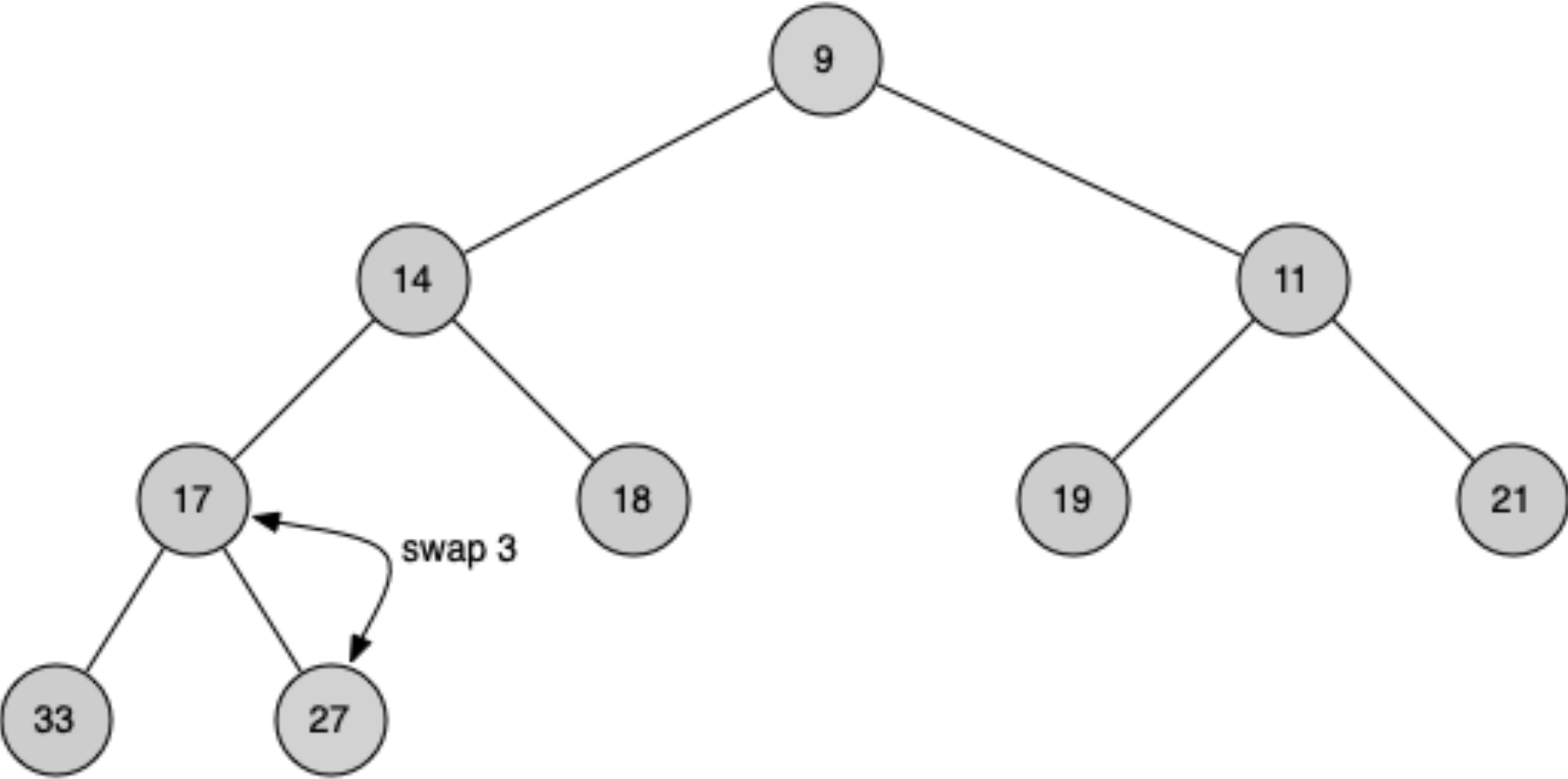
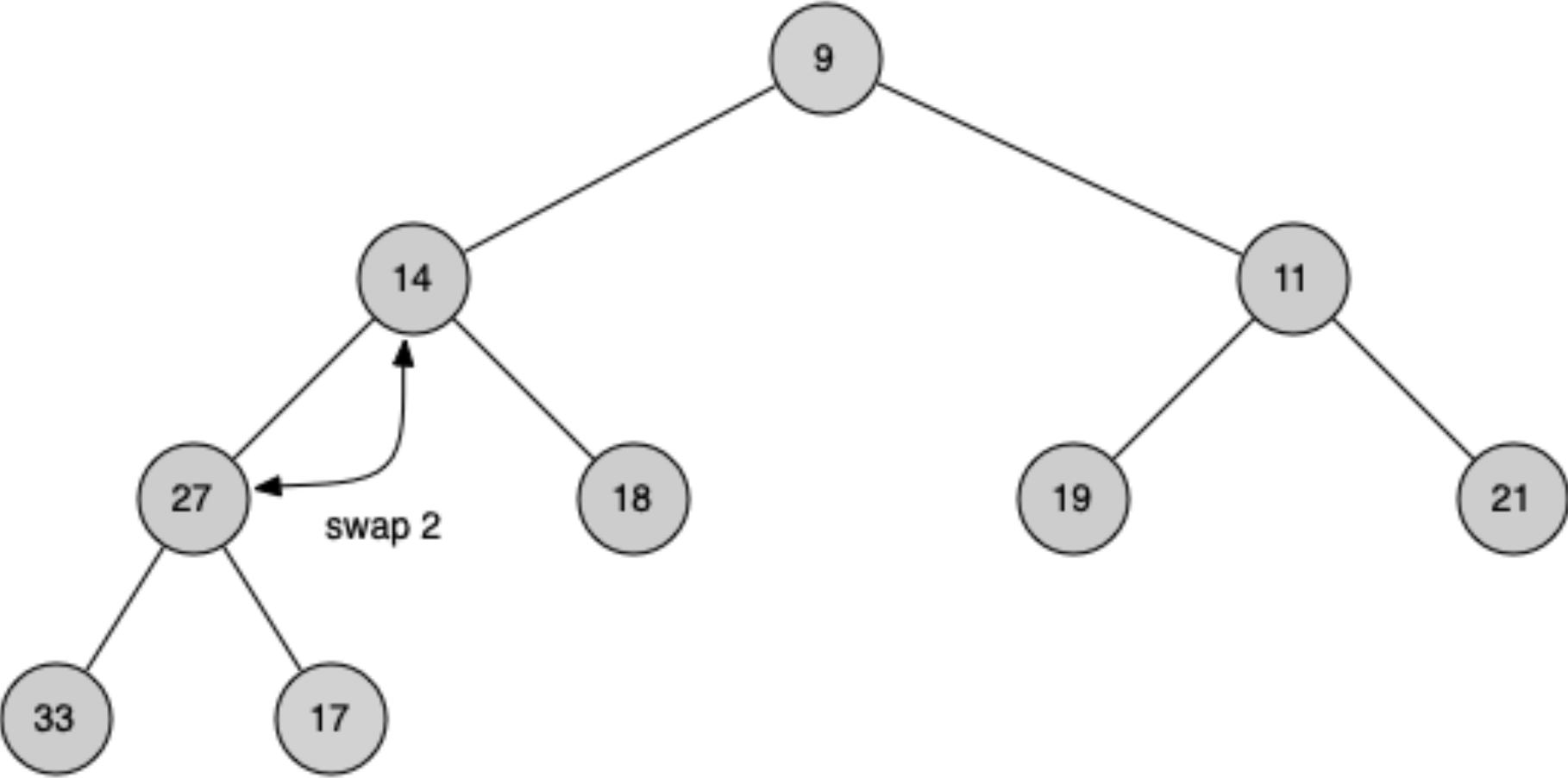
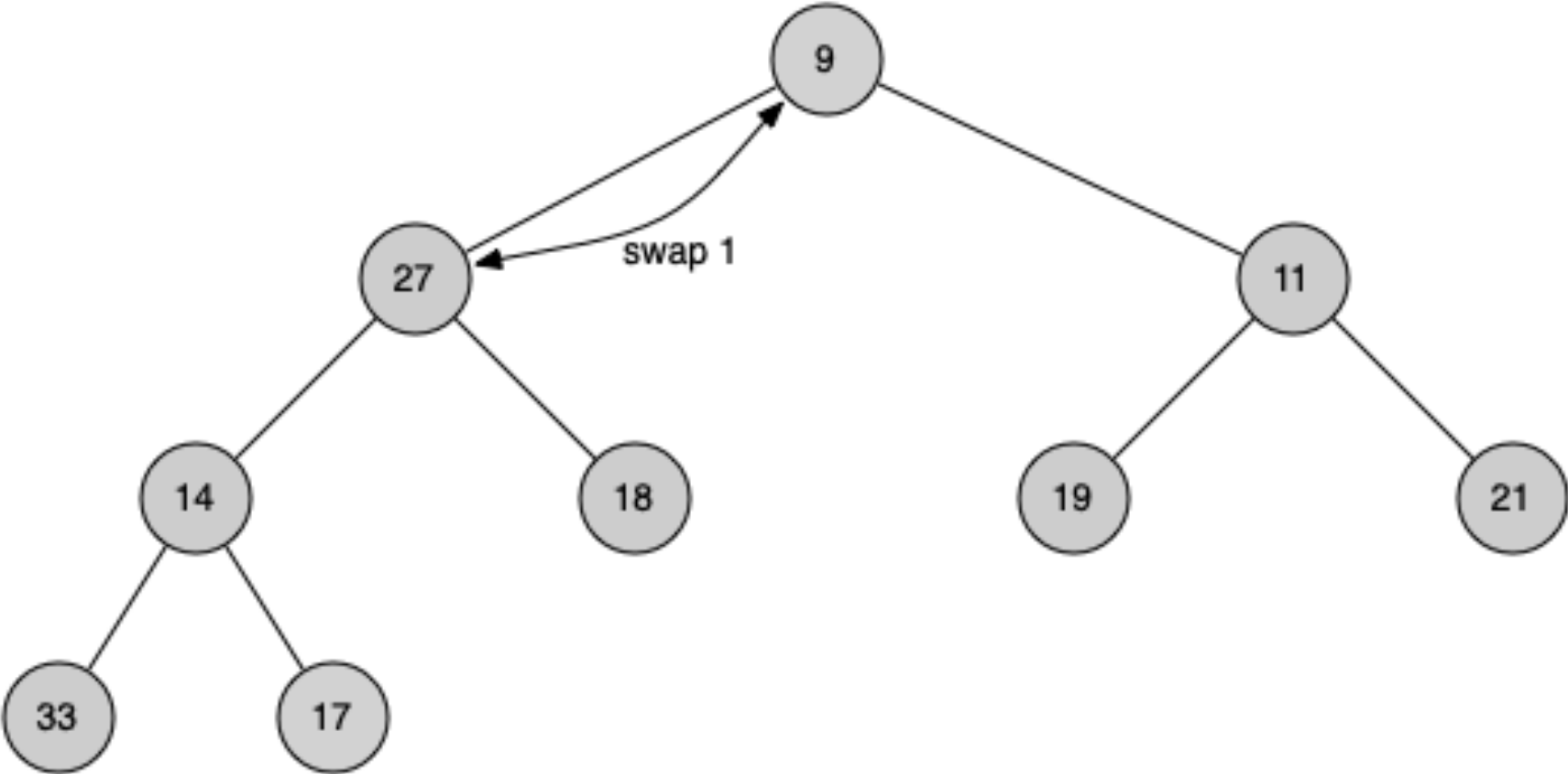


Percolate the New Node up to Its Proper Position

Min removal



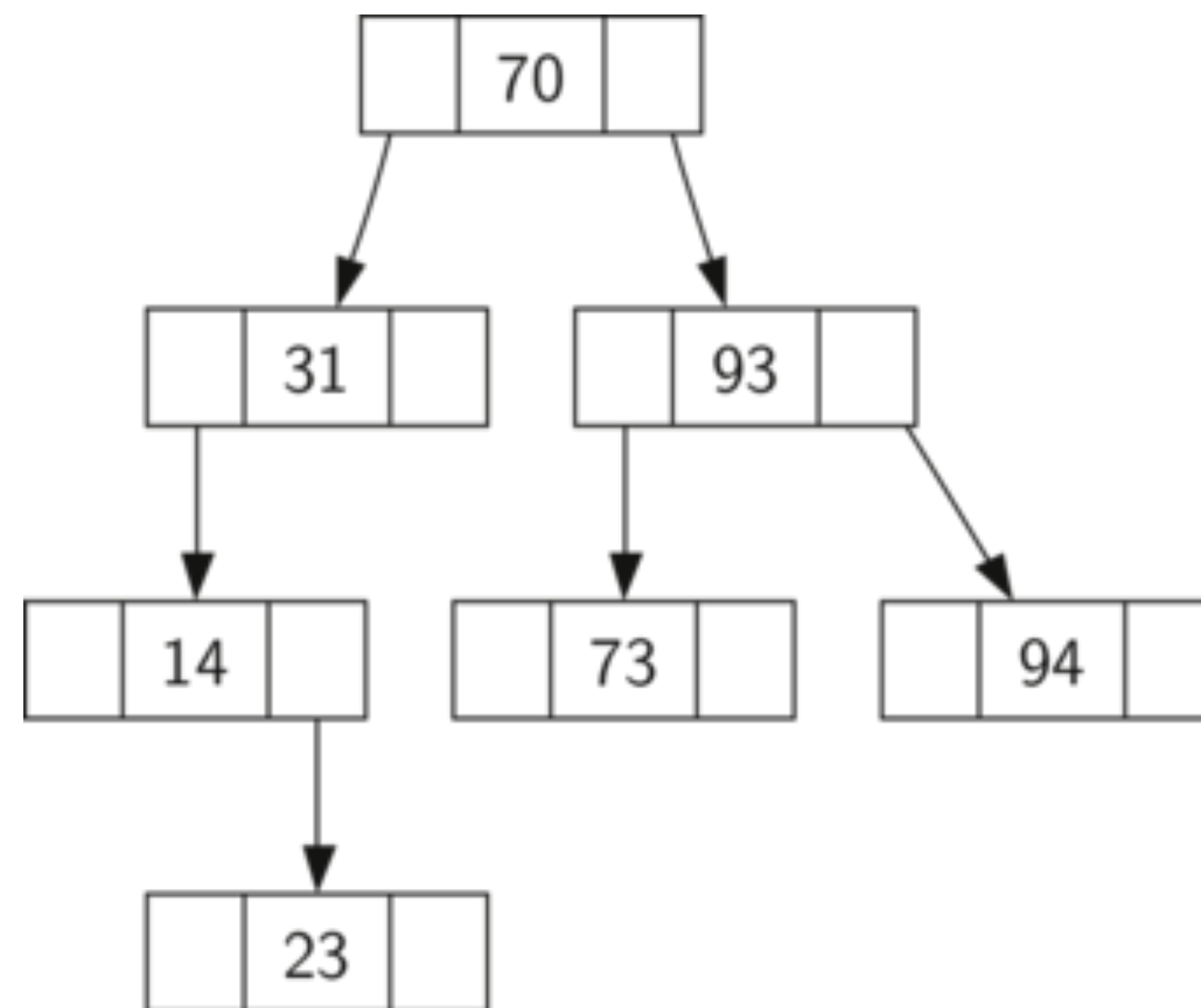
Percolating the Root Node down the Tree



Binary Search Tree

Binary Search Tree (BST) Property

- Keys that are less than the parent are found in the left subtree, and keys that are greater than the parent are found in the right subtree
- Showing **keys** only

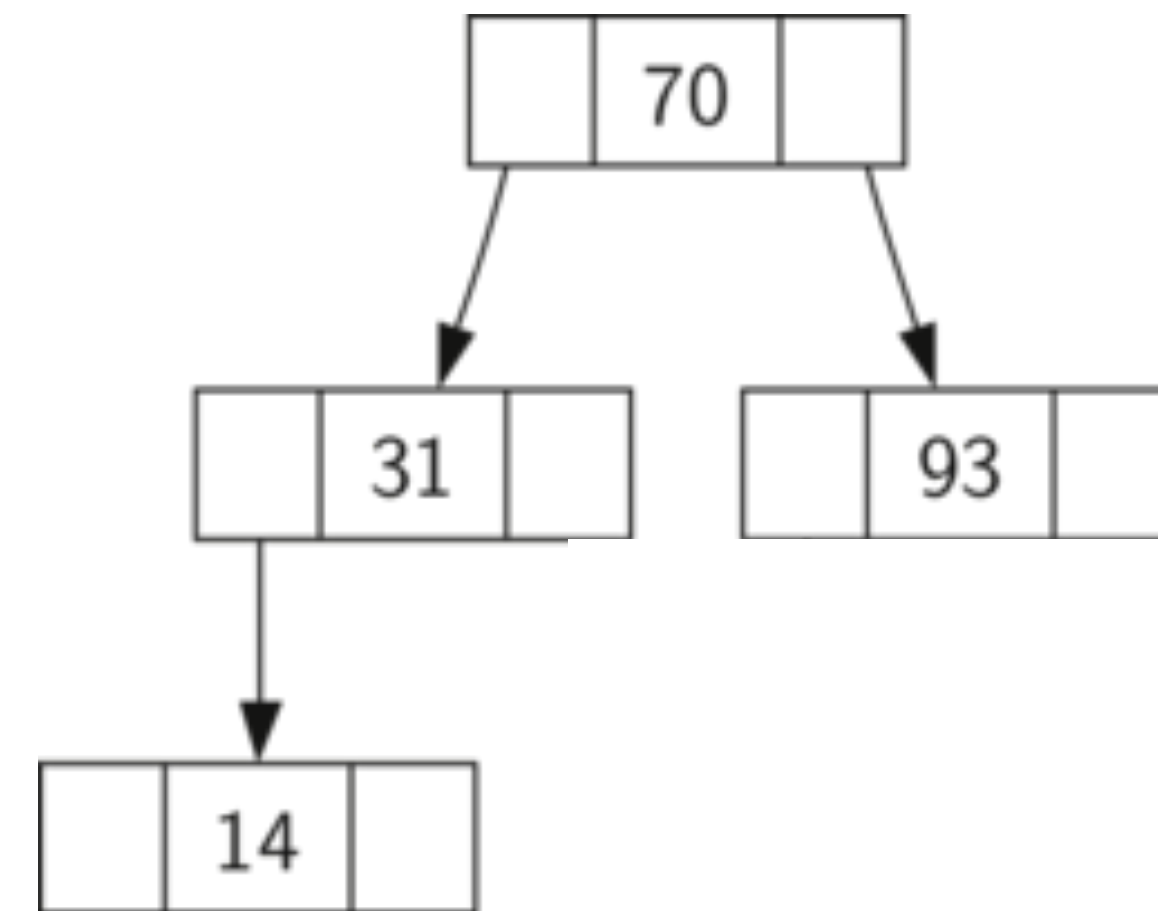
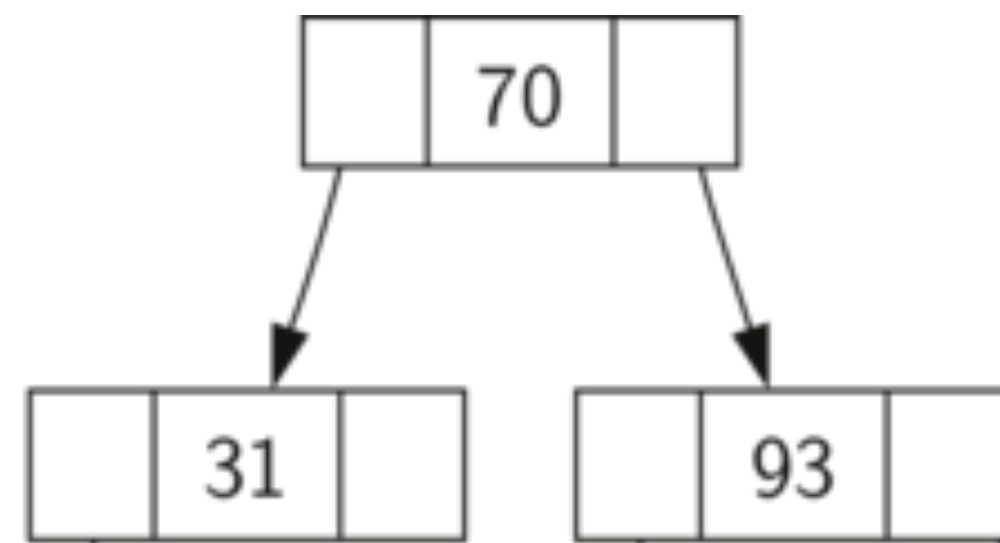
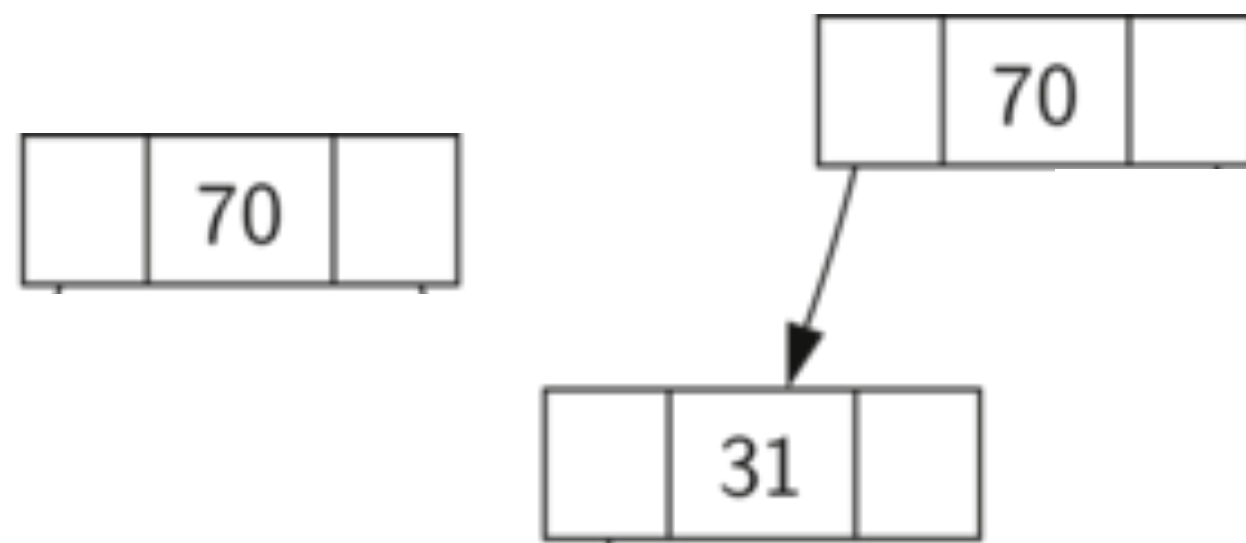


Note: Play Slideshow

BST creation

70, 31, 93, 14, 23, 73, 94

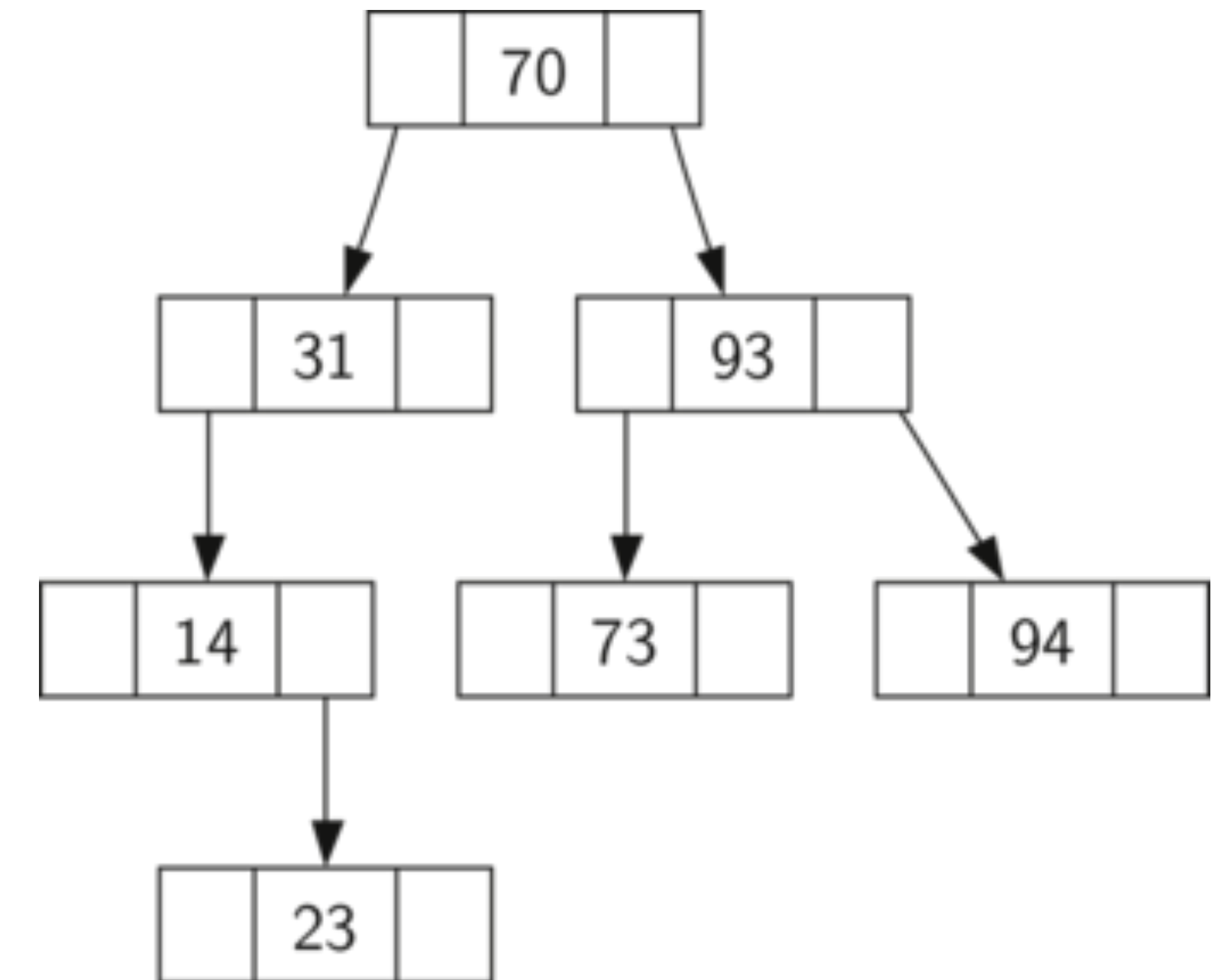
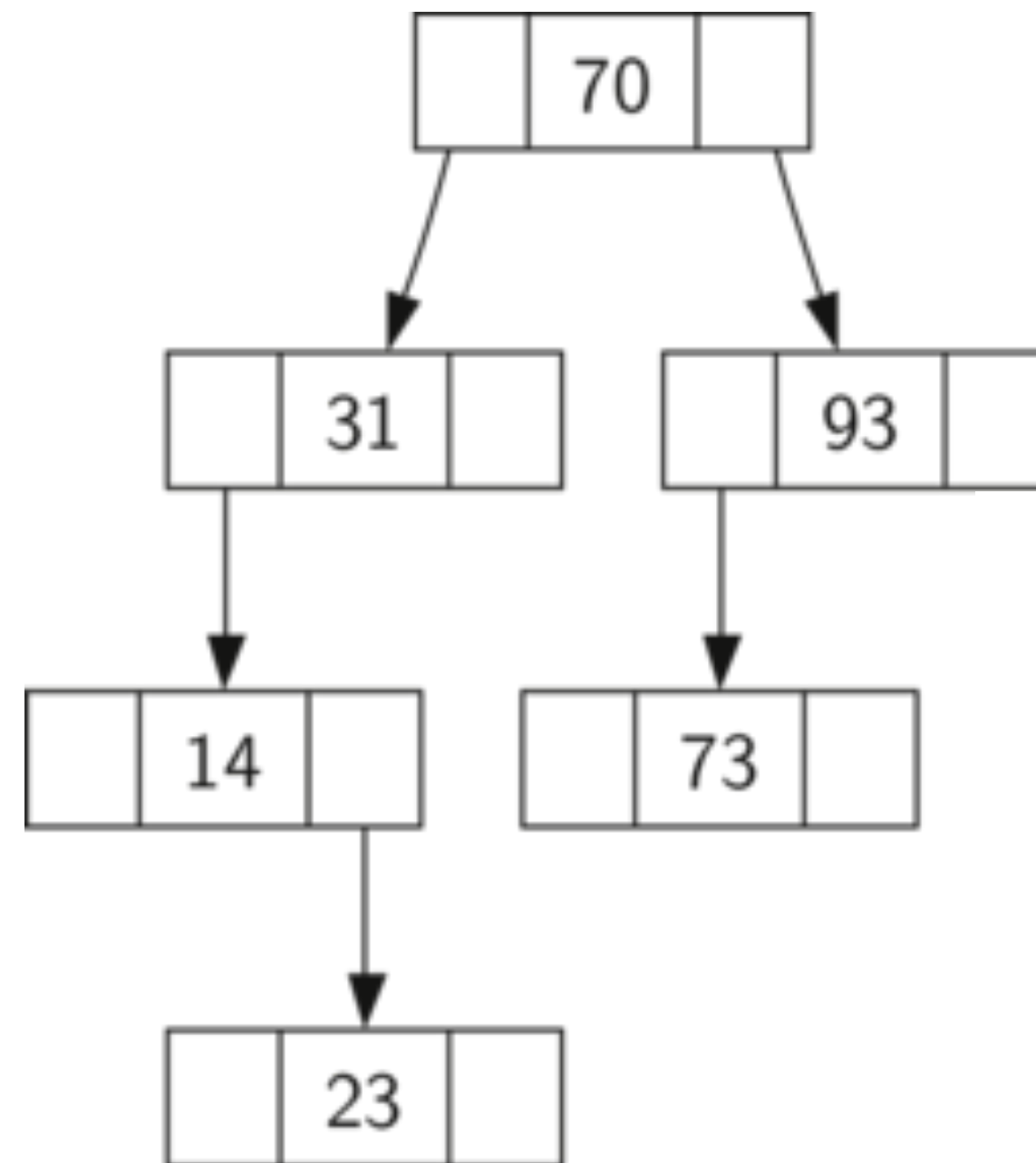
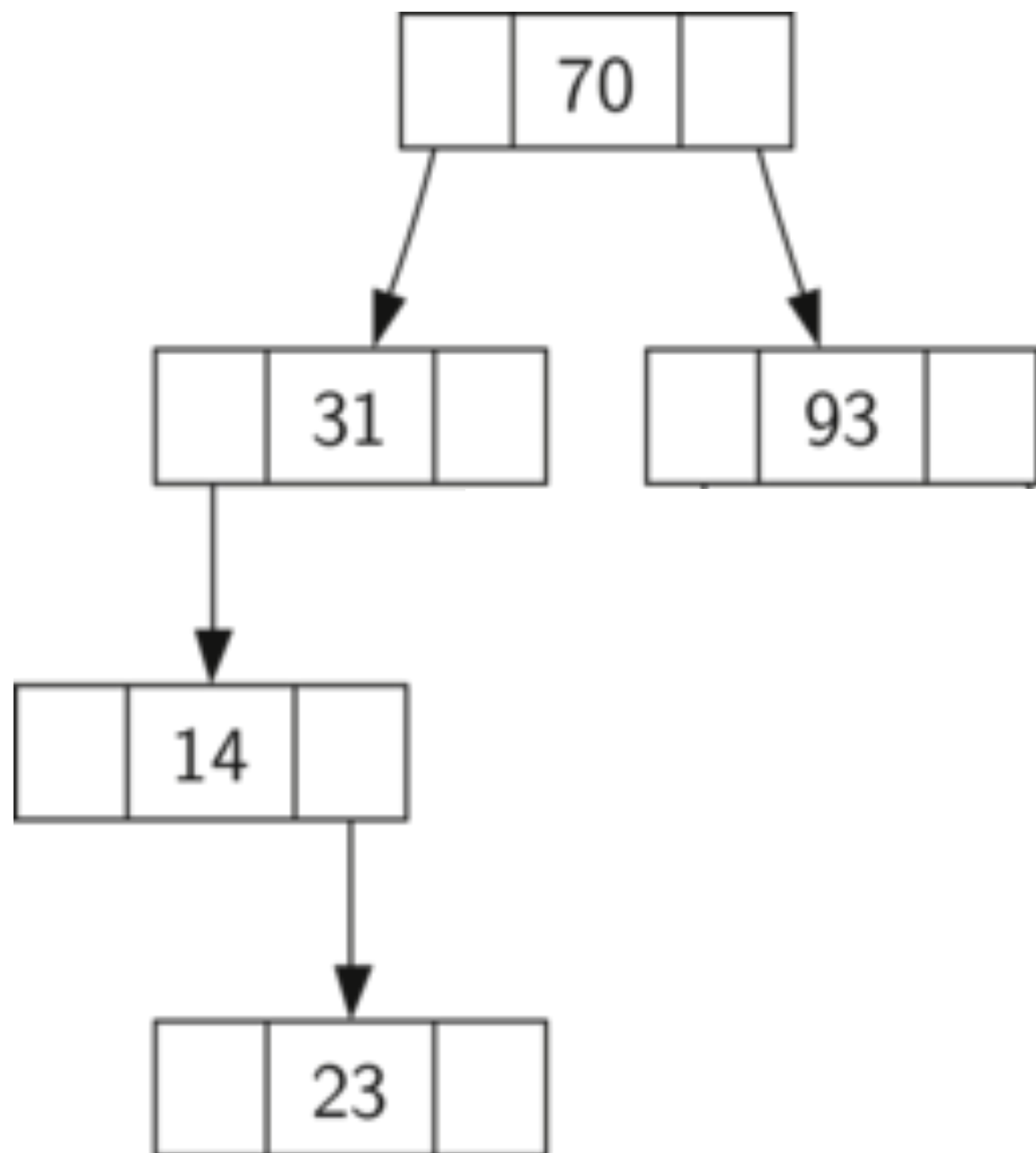
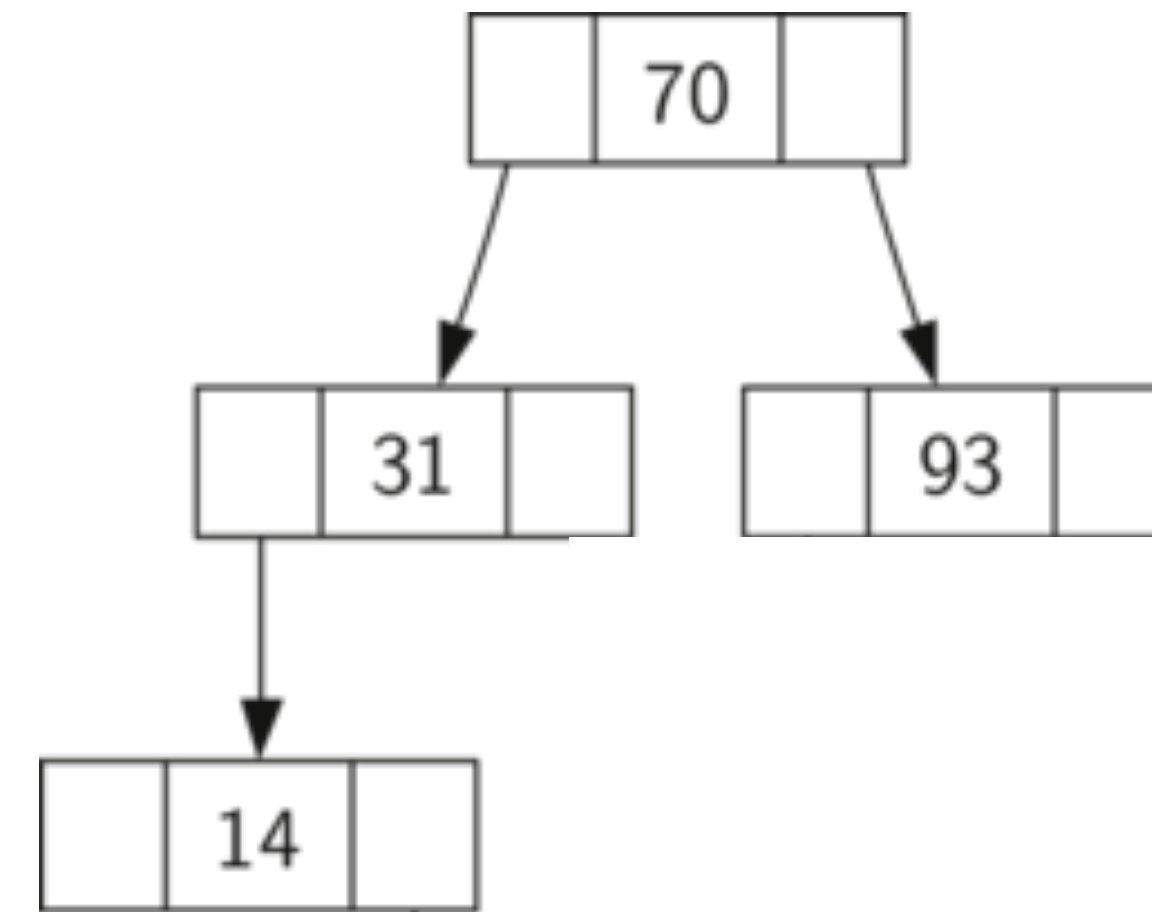
- Inserting nodes one by one:



BST creation

70, 31, 93, 14, 23, 73, 94

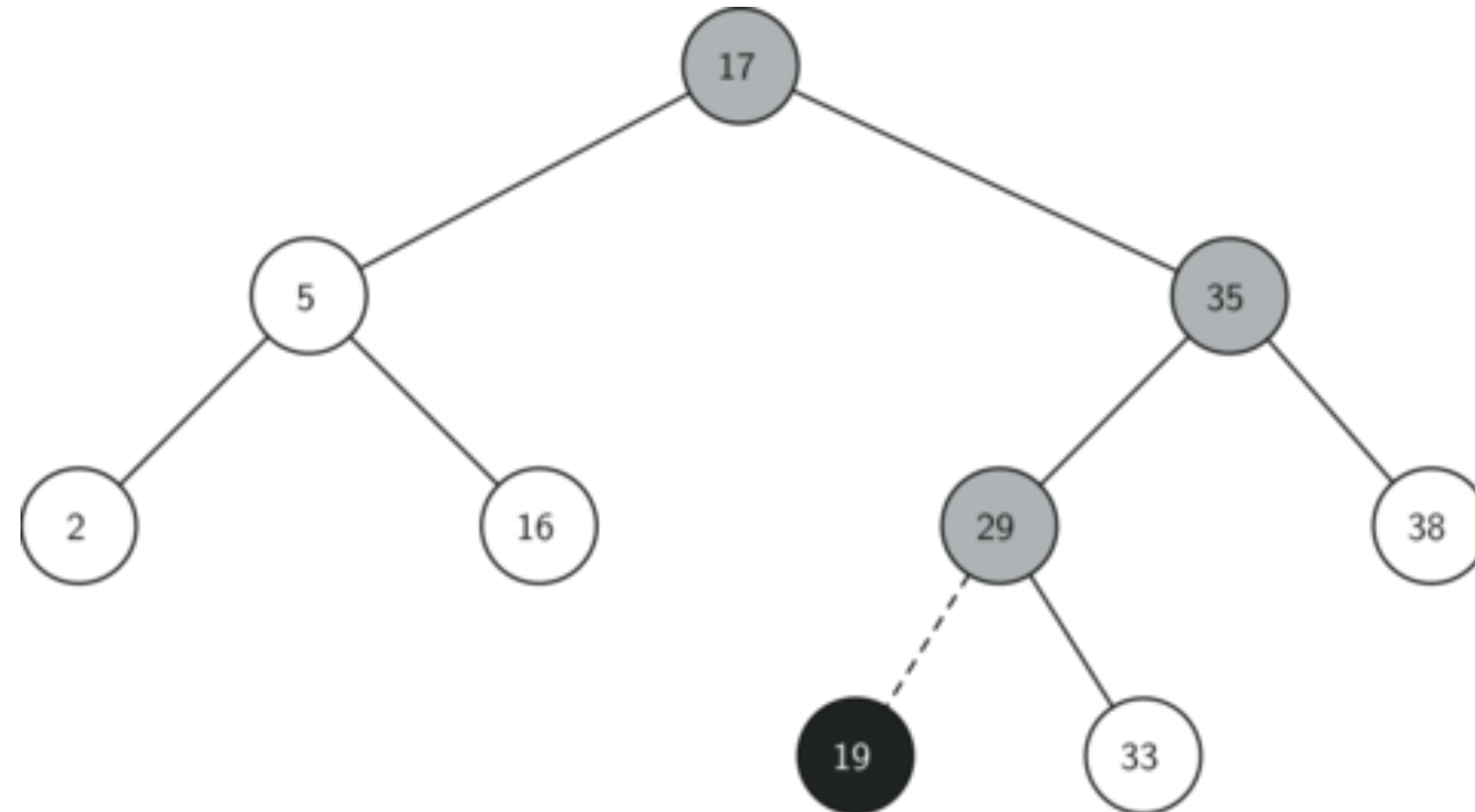
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Search Tree Operations

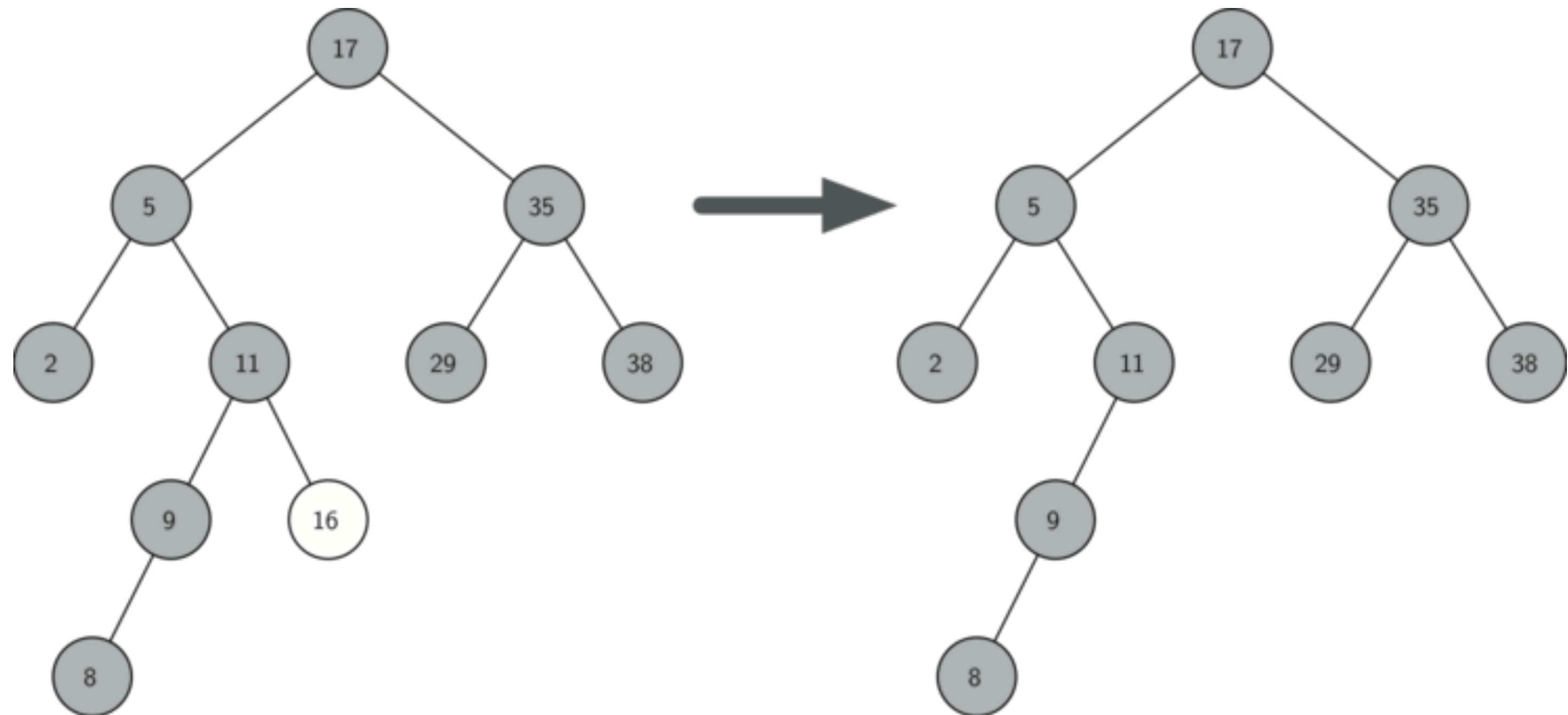
- `Map()` Create a new, empty map.
- `put(key, val)` Add a new key-value pair to the map. If the key is already in the map then replace the old value with the new value.
- `get(key)` Given a key, return the value stored in the map or `None` otherwise.
- `del` Delete the key-value pair from the map using a statement of the form `del map[key]`.
- `len()` Return the number of key-value pairs stored in the map.
- `in` Return `True` for a statement of the form `key in map`, if the given key is in the map.

Inserting a Node with Key = 19

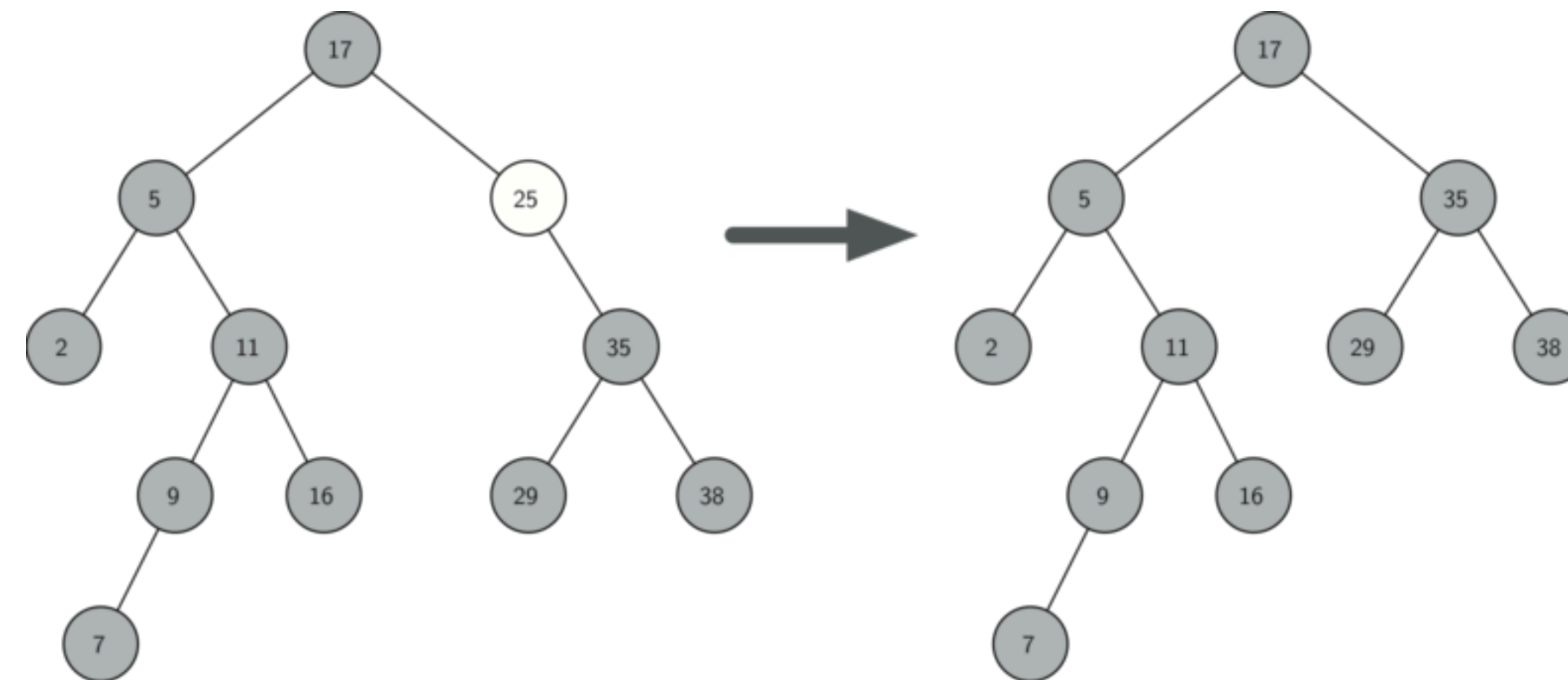


Deleting Node 16, a Node without Children

-



Deleting Node 25, a Node That Has a Single Child



Deleting Node 5, a Node with Two Children

- Replace the node with the smallest element from the right subtree (or the largest element from the left subtree)

