



University of  
Pittsburgh

# Algorithms and Data Structures 1

## CS 0445



Fall 2022

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(Slides are adapted from Dr. Ramirez's and Dr. Farnan's CS1501 slides.)

# Announcements

- Upcoming Deadlines:
  - Homework 6: this Friday @ 11:59 pm
  - Lab 5: next Monday @ 11:59 pm
  - Programming Assignment 1: Late Deadline: Wednesday Oct. 12<sup>th</sup>
    - Autograder feedback
- Debugging hints
- If you think you lost points in a lab assignment because of the autograder or because of a simple mistake
  - please reach out to Grader TA over Piazza
- **Student Support Hours** of the teaching team are posted on the Syllabus page

# Previous Lecture ...

- ADT Stack
  - Application: Building a simple parser of Algebraic expressions
  - Application: Runtime stack
- Recursion
  - Definition
  - Basic examples

# Today ...

- Recursion
  - More examples
  - Runtime analysis using proof by induction
- Using recursion to solve hard problems
  - Towers of Hanoi

# Recursively Processing a Linked Chain

- Display data in first node
- Then, (recursively) display data in rest of chain

```
public void display()
{
    displayChain(firstNode);
} // end display
private void displayChain(Node nodeOne)
{
```

# Recursively Processing a Linked Chain

- Display data in first node
- Then, (recursively) display data in rest of chain

```
public void display()
{
    displayChain(firstNode);
} // end display

private void displayChain(Node nodeOne)
{
    if (nodeOne != null)
    {
        System.out.println(nodeOne.getData()); // Display first node
    }
}
```

# Recursively Processing a Linked Chain

- Display data in first node
- Then, (recursively) display data in rest of chain

```
public void display()
{
    displayChain(firstNode);
} // end display

private void displayChain(Node nodeOne)
{
    if (nodeOne != null)
    {
        System.out.println(nodeOne.getData()); // Display first node
        displayChain(nodeOne.getNextNode()); // Display rest of chain
    } // end if
} // end displayChain
```

# Traversing a linked chain *backwards*

Traversing chain of linked nodes in reverse order easier when done recursively.

```
public void displayBackward()
{
    displayChainBackward(firstNode);
} // end displayBackward

private void displayChainBackward(Node nodeOne)
{
```



# Traversing a linked chain *backwards*

- (recursively) display data in rest of chain

```
public void displayBackward()
{
    displayChainBackward(firstNode);
} // end displayBackward

private void displayChainBackward(Node nodeOne)
{
    if (nodeOne != null)
    {
        displayChainBackward(nodeOne.getNextNode());
    }
}
```

# Traversing a linked chain *backwards*

- (recursively) display data in rest of chain
- Then, display data in first node

```
public void displayBackward()
{
    displayChainBackward(firstNode);
} // end displayBackward

private void displayChainBackward(Node nodeOne)
{
    if (nodeOne != null)
    {
        displayChainBackward(nodeOne.getNextNode());
        System.out.println(nodeOne.getData());
    } // end if
} // end displayChainBackward
```

# Running Time Analysis of Recursive Algorithms

- Technique #1: Using **proof by induction**
- Assume running time of `countDown` is a function of  $n$ :  $T(n)$
- $T(n) = 1 + 1 + ??$ 
  - What is the running time of `countdown(n-1)`?
  - Can we use the function  $T(n)$ ?
  - Yes! The running time of `countdown(n-1)` is  $T(n-1)$
- $T(n) = 2 + T(n-1)$
- $= T(n-1) + O(1)$
- $T(1) = O(1)$

```
public static void countdown(int n)
{
    System.out.println(n);
    if (n > 1)
        countdown(n - 1);
} // end countdown
```

# Running Time Analysis of Recursive Algorithms

- $T(1) = 1$  ... (1)
- $T(n) = T(n-1) + 1$  for  $n > 1$  ... (2)
  - The above equation is called a Recurrence Relation
- $T(2) = T(1) + 1 = 2$
- $T(3) = T(2) + 1 = 2 + 1 = 3$
- $T(4) = T(3) + 1 = 3 + 1 = 4$
- ...
- We have an intuition that the running time is linear
  - $T(n) = n$  ... (3)
  - Let's prove (3) by induction
- Base Case:
  - From (1):  $T(1) = 1$
  - From (3):  $T(1) = 1$
  - (3) applies to the base case

# Running Time Analysis of Recursive Algorithms

- Inductive Step:

- Assume that (3) is true for *all values*  $< k$  and prove that it is true for  $k$
- Inductive hypothesis:  $T(n) = n$  for all  $n < k$  ... (4)
- We want to prove that  $T(k) = k$
- From (2),  $T(k) = T(k-1) + 1$
- From (4),  $T(k) = (k-1) + 1 = k$
- **End of Proof that  $T(n) = n$**
- So, running time of countdown is  $O(n)$

$$T(1) = 1 \quad \dots (1)$$

$$T(n) = T(n-1) + 1 \text{ for } n > 1 \quad \dots (2)$$

```
public static void countdown(int n)
{
    System.out.println(n);
    if (n > 1)
        countdown(n - 1);
} // end countdown
```

# Computing $x^n$

- Using iteration

```
public static int powerIterative(int x, int n){  
    assert(n >= 0);  
    int result = 1;  
    for(int i=0; i<n; i++){  
        result *= x;  
    }  
    return result;  
}
```

# Computing $x^n$

- What is the running time of powerIterative?
  - $O(n)$

```
public static int powerIterative(int x, int n){  
    assert(n >= 0);  
    int result = 1;  
    for(int i=0; i<n; i++){  
        result *= x;  
    }  
    return result;  
}
```

# Computing $x^n$

- Using recursion
- How?
  - Let's start with recursive mathematical definition
- $x^n = (x^{n/2})^2$ 
  - when  $n$  is even and positive
- $x^n = x(x^{n/2})^2$ 
  - when  $n$  is odd and positive
  - $n/2$  is integer division
- base case or non-recursive case
  - $x^0 = 1$



# Computing $x^n$

- Using recursion

```
public static int power(int x, int n){  
    int result = 1;  
    if(n > 0){  
        int temp = power(x, n/2);
```

# Computing $x^n$

- Using recursion

```
public static int power(int x, int n){  
    int result = 1;  
    if(n > 0){  
        int temp = power(x, n/2);  
        result = temp * temp;  
    }  
}
```

# Computing $x^n$

- Using recursion

```
public static int power(int x, int n){  
    int result = 1;  
    if(n > 0){  
        int temp = power(x, n/2);  
        result = temp * temp;  
        if(n%2 == 1){ //is n odd?  
            result = x * result;  
        }  
    }  
}
```

# Computing $x^n$

- Using recursion

```
public static int power(int x, int n){  
    int result = 1;  
    if(n > 0){  
        int temp = power(x, n/2);  
        result = temp * temp;  
        if(n%2 == 1){ //is n odd?  
            result = x * result;  
        }  
    }  
    return result;  
}
```

# Running Time Analysis of Recursive Algorithms

- Technique #1: Using **proof by induction**
- Assume running time of recursive power is a function of  $n$ :  $T(n)$
- $T(n) = O(1) + ??$ 
  - What is the running time of  $\text{power}(x, n/2)$ ?
  - Can we use the function  $T(n)$ ?
  - Yes! The running time of  $\text{power}(x, n/2)$  is  $T(n/2)$
- $T(n) = T(n/2) + O(1)$
- $T(1) = O(1)$

```
public static int power(int x, int n){  
    int result = 1;  
    if(n > 0){  
        int temp = power(x, n/2);  
        result = temp * temp;  
        if(n%2 == 1){ //is n odd?  
            result = x * result;  
        }  
    }  
    return result;  
}
```

# Running Time Analysis of Recursive Algorithms

- $T(1) = 1 \quad \dots (1)$
- $T(n) = T(n/2) + 1$  for  $n > 1 \quad \dots (2)$ 
  - The above equation is called a Recurrence Relation
- $T(2) = T(1) + 1 = 2$
- $T(4) = T(2) + 1 = 2 + 1 = 3$
- $T(8) = T(4) + 1 = 3 + 1 = 4$
- $T(16) = T(8) + 1 = 4 + 1 = 5$
- When  $n$  doubles  $\rightarrow T(n)$  increases by 1
- We have an intuition that the running time is logarithmic
  - $T(n) = \log(n) + 1 \quad \dots (3)$
  - Let's prove (3) by induction
- Base Case:
  - From (1):  $T(1) = 1$
  - From (3):  $T(1) = \log(1) + 1 = 0 + 1 = 1$
  - (3) applies to the base case

# Running Time Analysis of Recursive Algorithms

- Inductive Step:

- Assume that (3) is true for all  $n < k$  and prove that it is true for  $k$
- Inductive hypothesis:  $T(n) = \log(n) + 1$  for all  $n < k$  ... (4)
- We want to prove that  $T(k) = \log(k) + 1$
- From (2),  $T(k) = T(k/2) + 1$
- From (4),  $T(k/2) = \log(k/2) + 1$
- Then,  $T(k) = \log(k/2) + 1 + 1$
- $= \log(k/2) + 2$
- $= \log(k/2) + \log 4$
- $= \log(4k/2) = \log(2k)$
- $= \log k + \log 2$
- $= \log k + 1$
- **End of Proof that  $T(n) = \log(n) + 1$**
- So, running time of recursive power is  $O(\log n)$

$$T(1) = 1 \quad \dots (1)$$

$$T(n) = T(n/2) + 1 \text{ for } n > 1 \quad \dots (2)$$

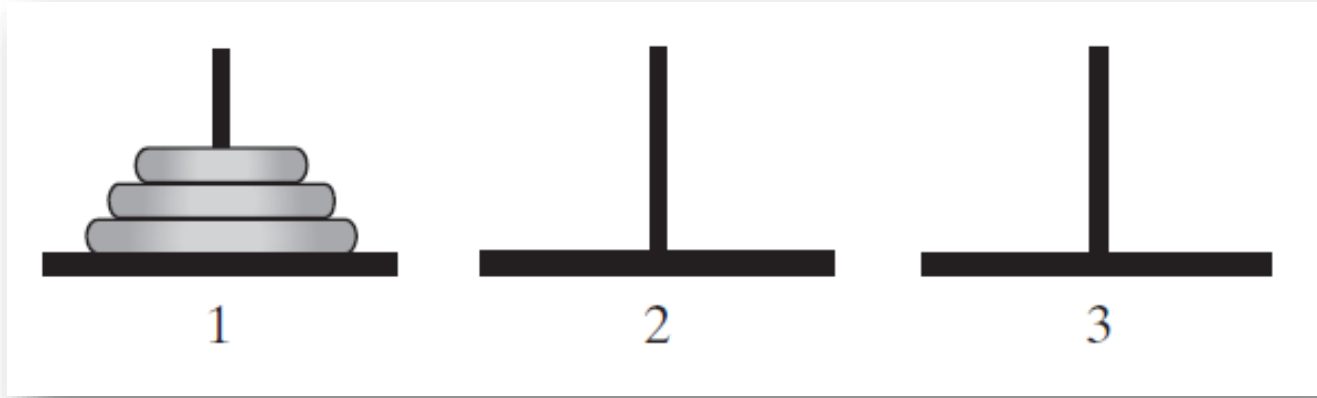
# Note on input size

- Our goal is to model running time in terms of input size
- The input size is the number of bits needed to represent the input
- For the power function, the exponent  $n$  is represented using how many bits?
  - $\log n$  bits
  - So, the input size of the exponentiation problem is not  $n$ , the exponent value
  - The input size is  $\log n$
- So, the recursive power function has linear running time
  - $O(\log n)$  is linear in  $\log n$ , the input size



# Simple Solution to a Difficult Problem

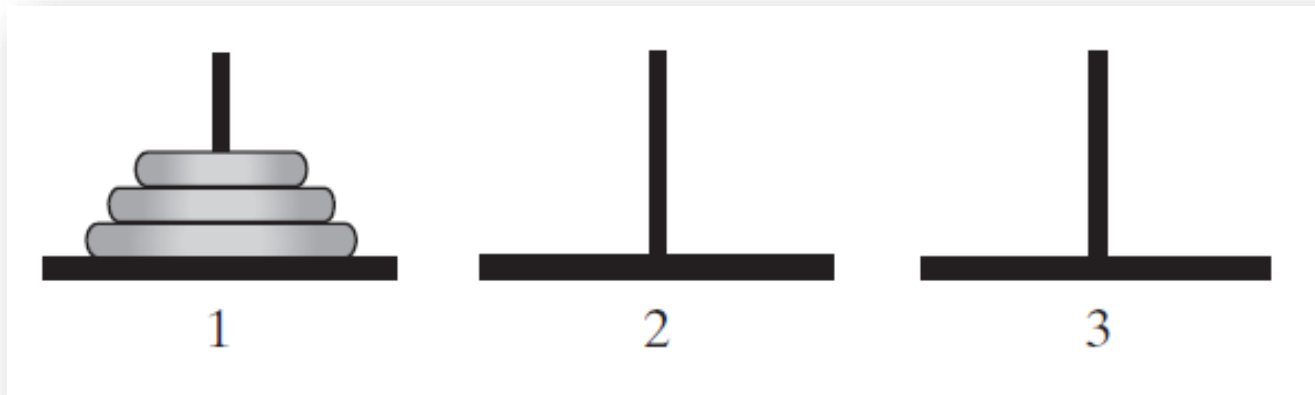
The initial configuration of the  
**Towers of Hanoi** for three disks.



# Towers of Hanoi Problem

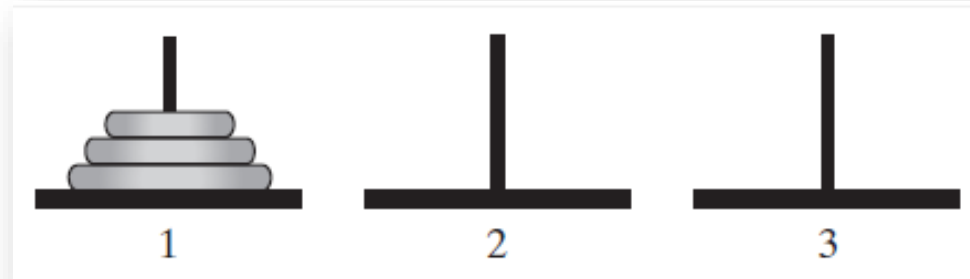
Rules:

1. Move one disk at a time.
2. Disk moved must be topmost disk in its pole
3. No disk may rest on top of a disk smaller than itself
4. You can store disks on the second pole temporarily



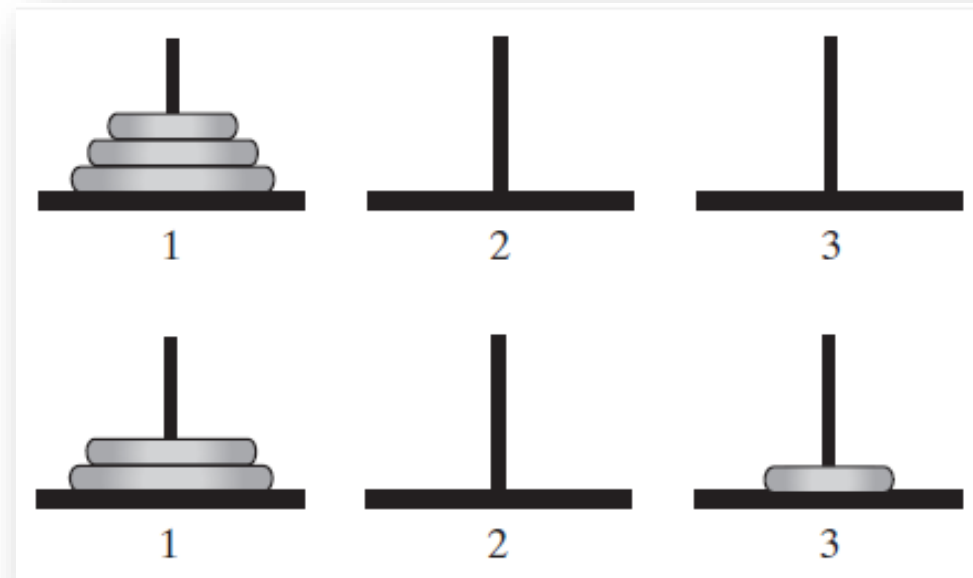
# Solutions

The sequence of moves for solving the Towers of Hanoi problem with three disks



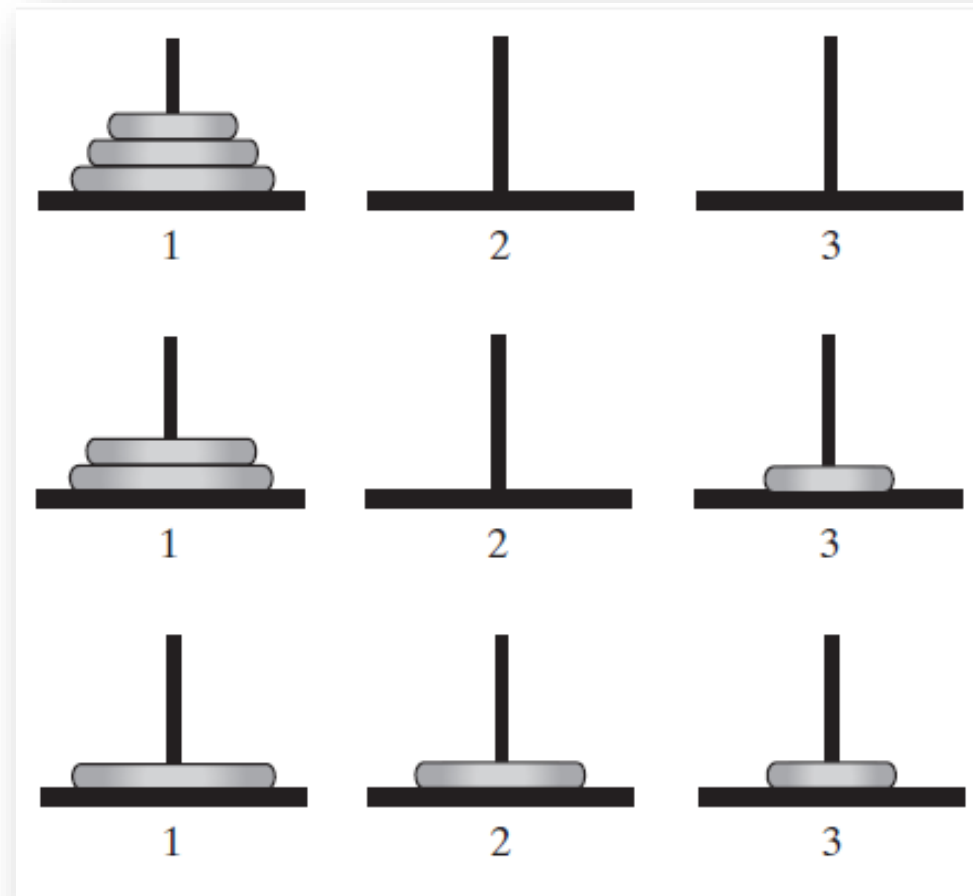
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The sequence of moves for solving the Towers of Hanoi problem with three disks



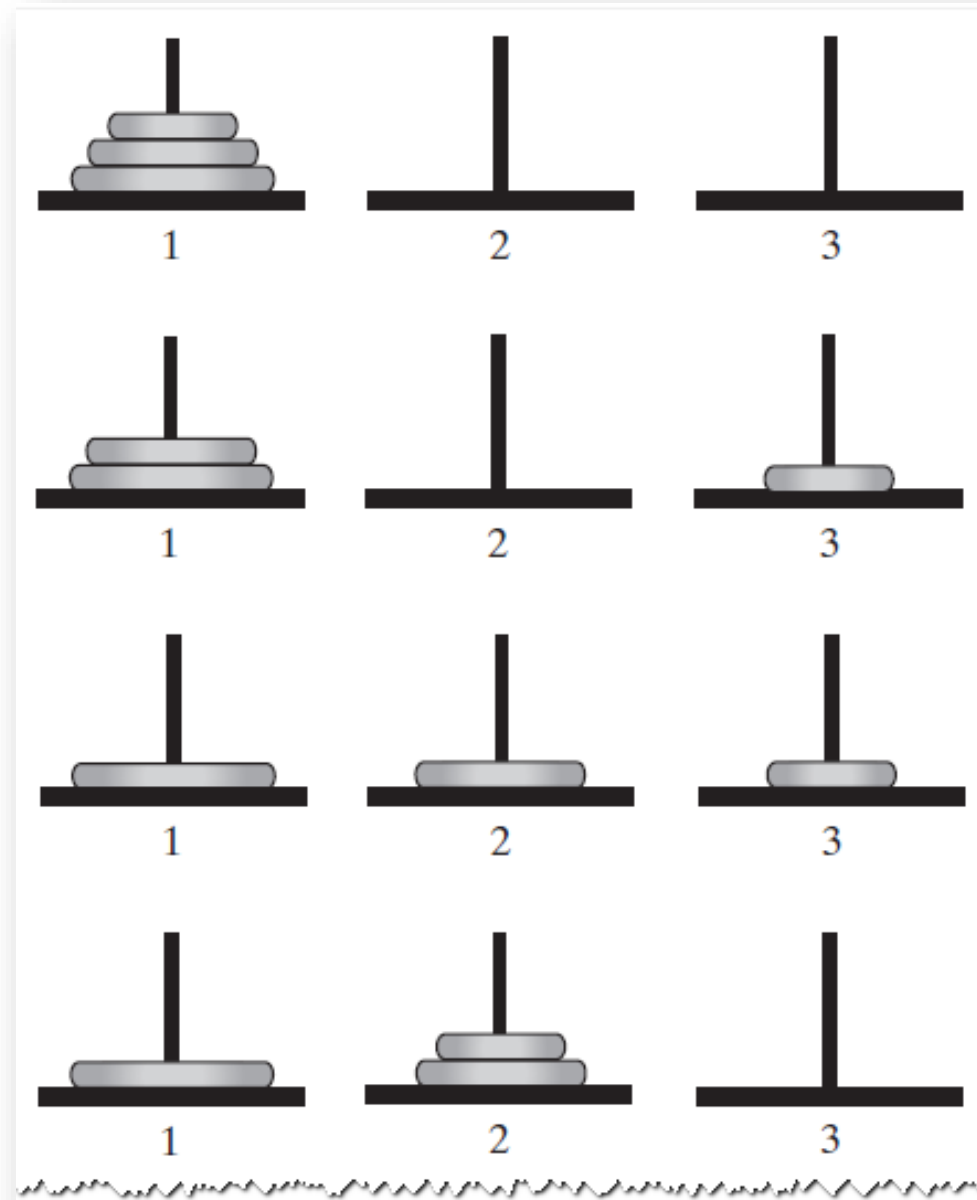
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The sequence of moves for solving the Towers of Hanoi problem with three disks



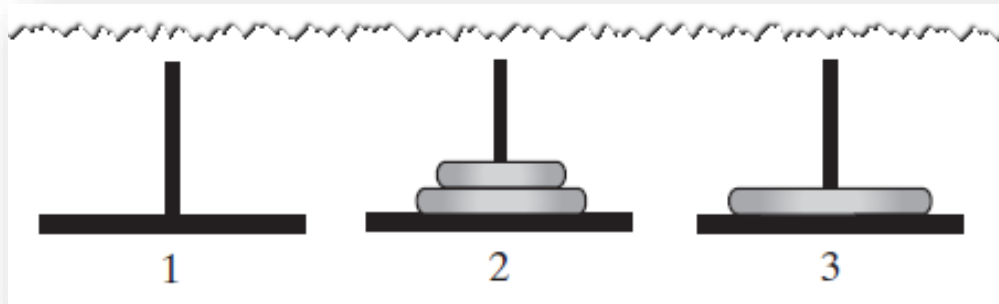
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The sequence of moves for solving the Towers of Hanoi problem with three disks



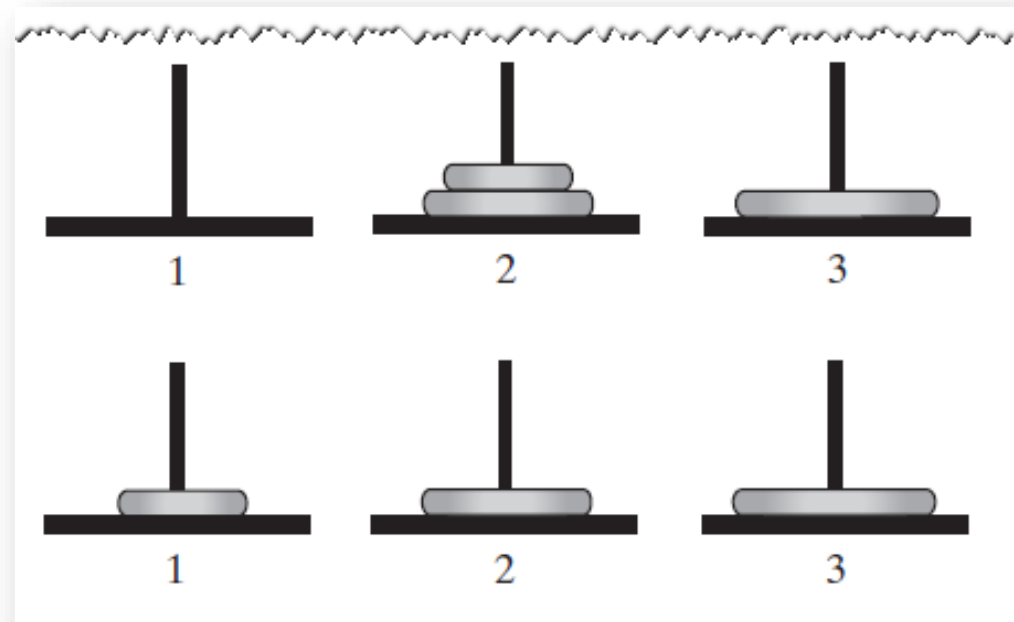
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# Solutions

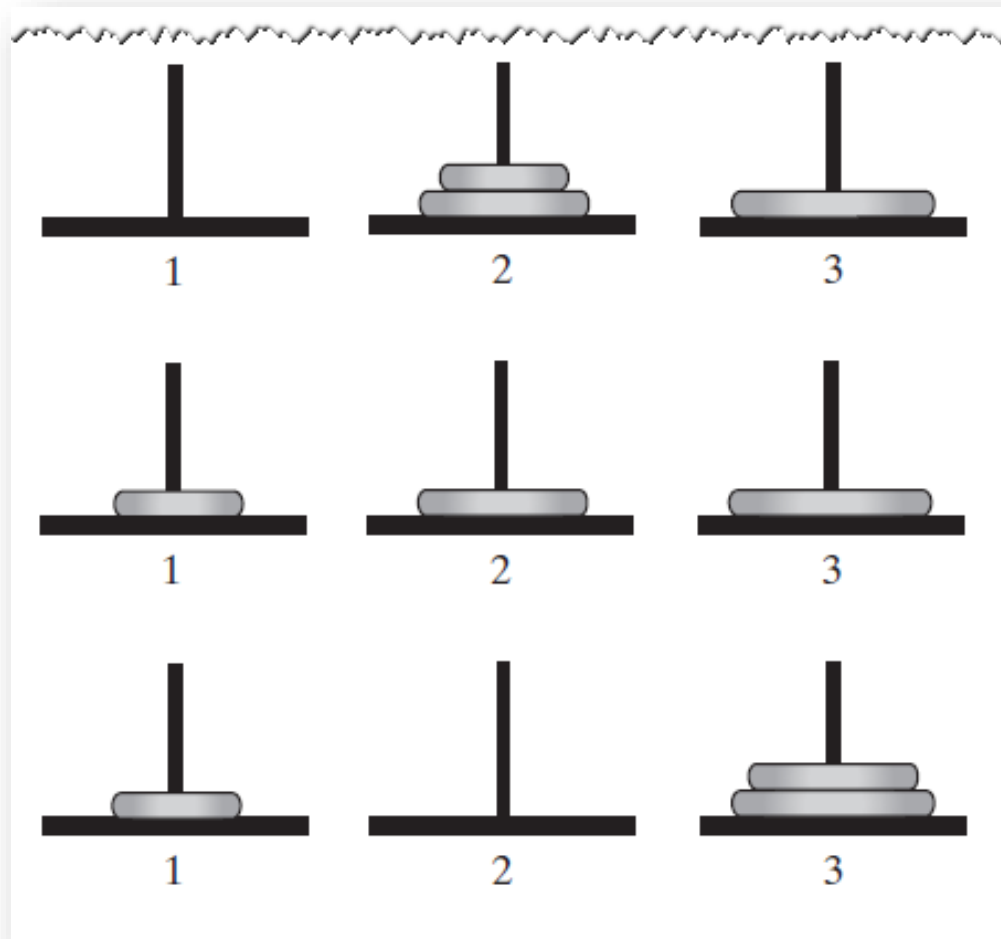
The sequence of moves for solving the Towers of Hanoi problem with three disks





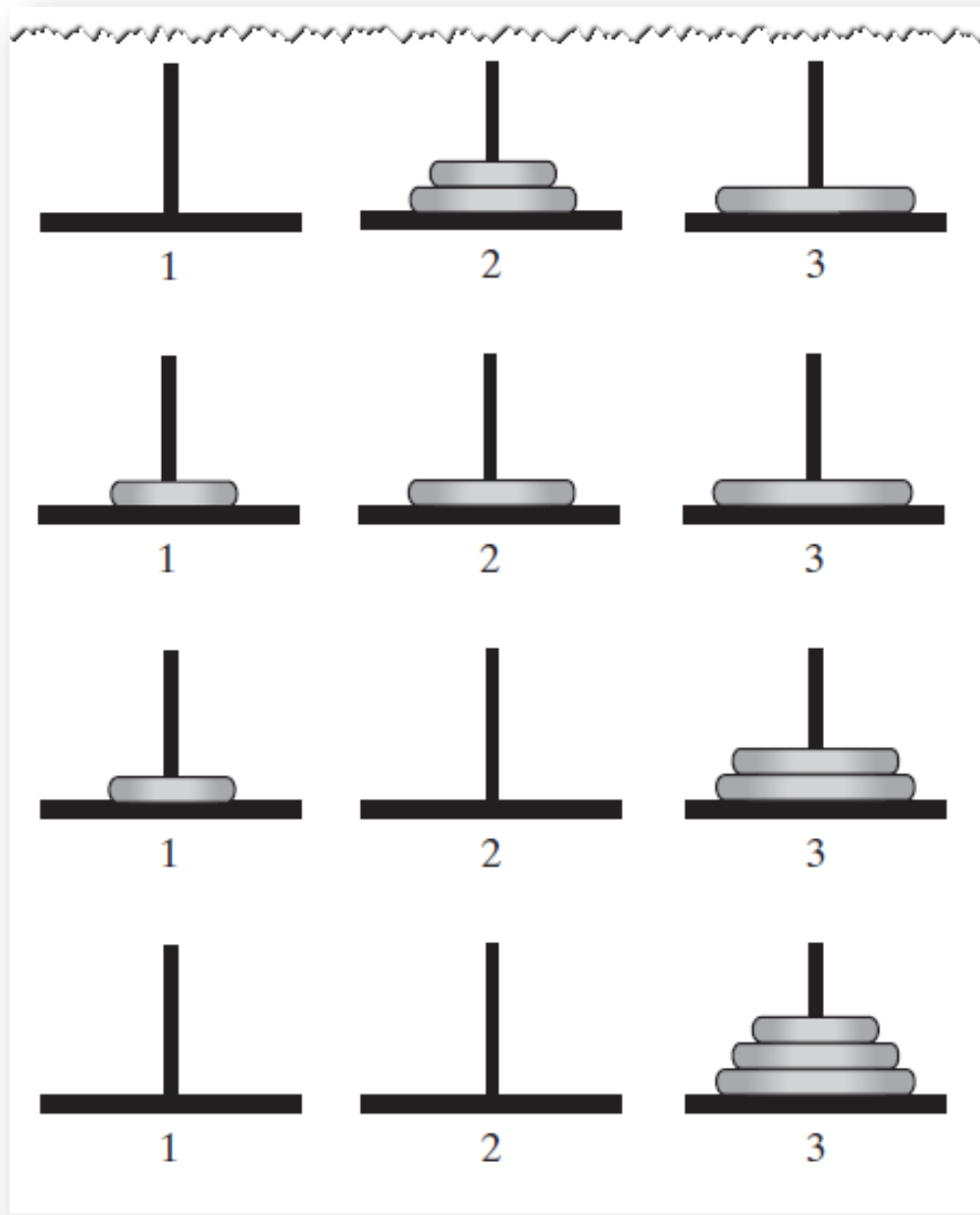
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The sequence of moves for solving the Towers of Hanoi problem with three disks



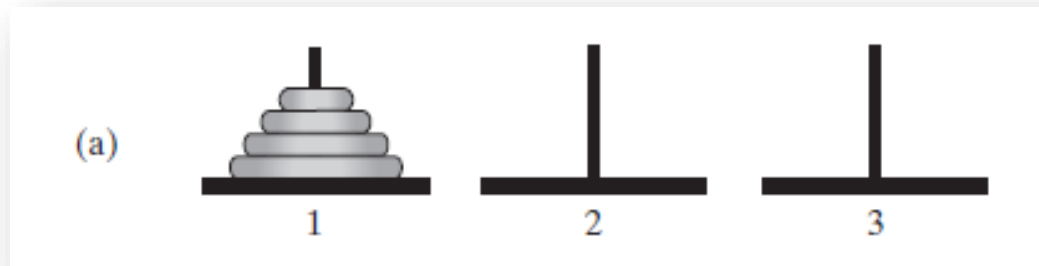
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The sequence of moves for solving the Towers of Hanoi problem with three disks



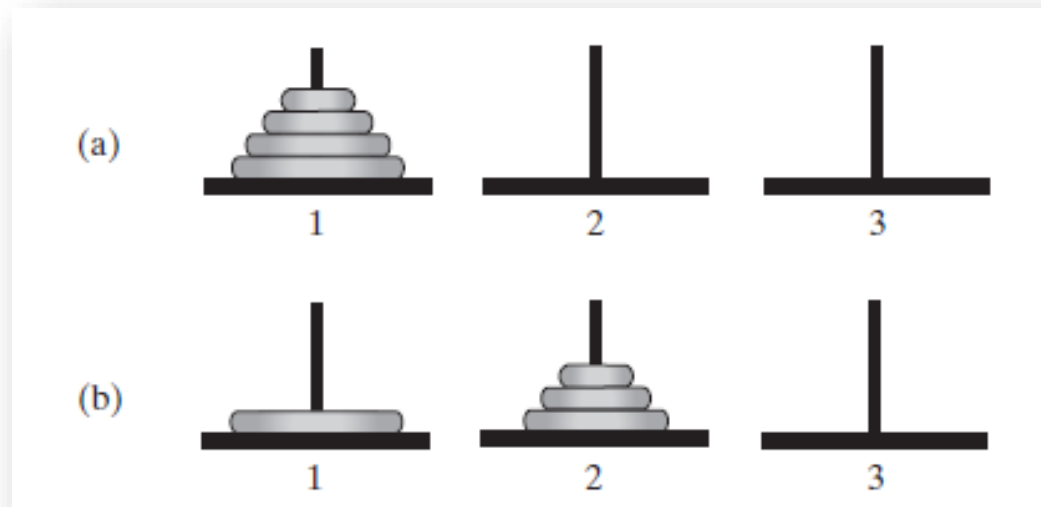
# Solutions

The smaller problems in a recursive solution for four disks



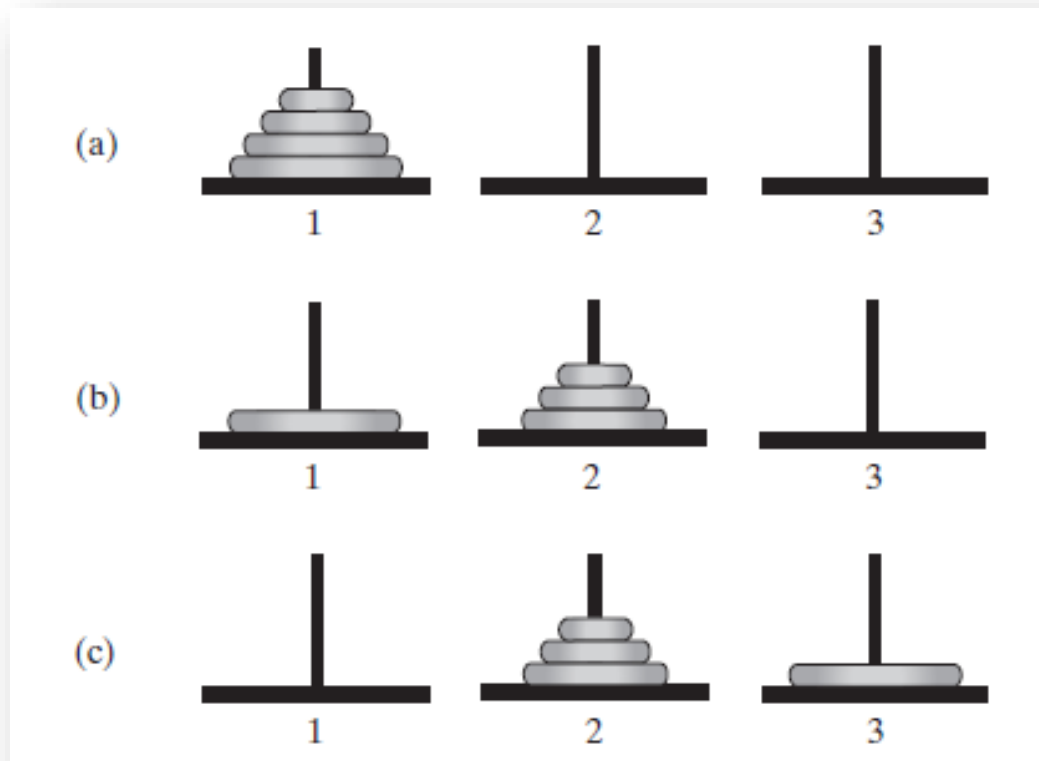
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The smaller problems in a recursive solution for four disks



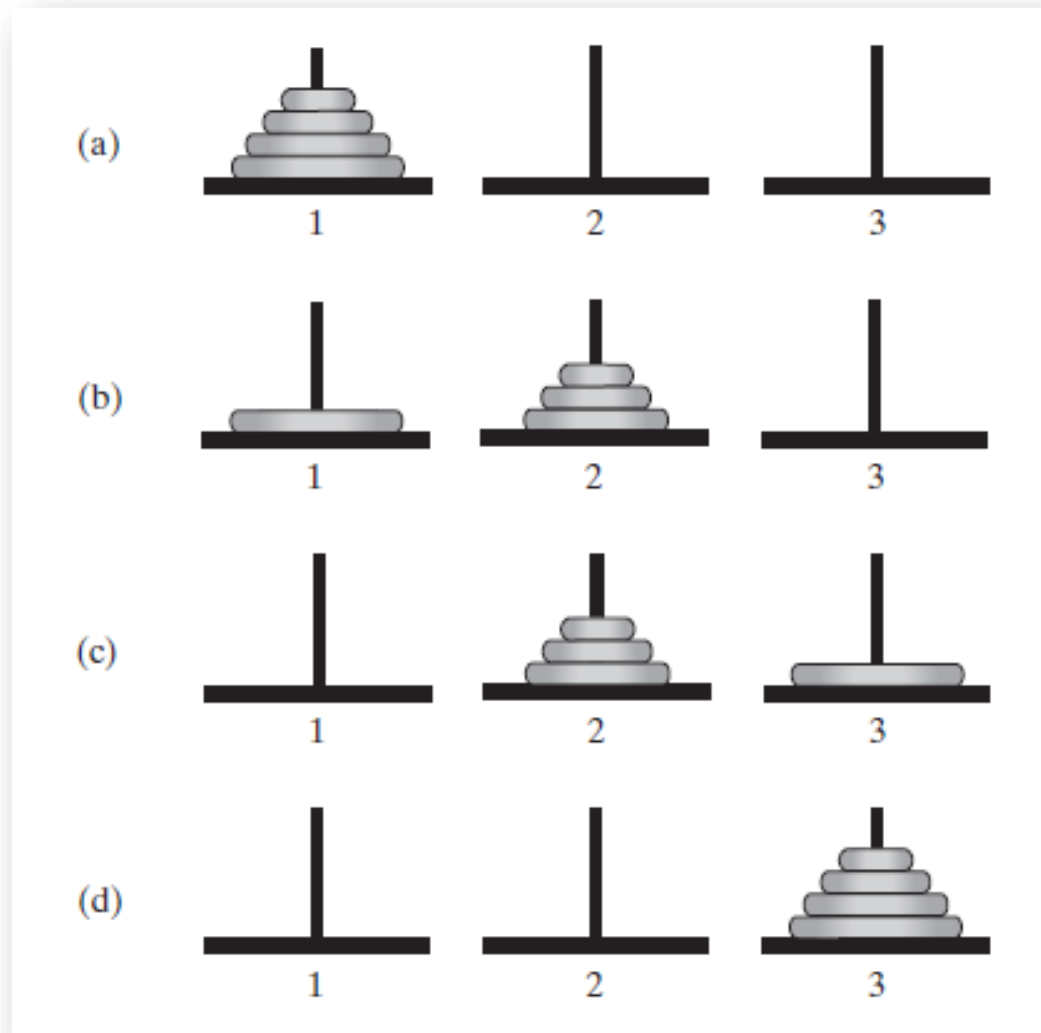
# Solutions

The smaller problems in a recursive solution for four disks



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The smaller problems in a recursive solution for four disks



# Solutions

- Recursive algorithm to solve any number of disks.

*Algorithm* solveTowers(numberOfDisks, startPole, tempPole, endPole)

# Solutions

- Recursive algorithm to solve any number of disks.

```
Algorithm solveTowers(numberOfDisks, startPole, tempPole, endPole)
  if (numberOfDisks == 1)
    Move disk from startPole to endPole
```



# Solutions

- Recursive algorithm to solve any number of disks.

```
Algorithm solveTowers(numberOfDisks, startPole, tempPole, endPole)
if (numberOfDisks == 1)
    Move disk from startPole to endPole
else
{
    solveTowers(numberOfDisks - 1, startPole, endPole, tempPole)
```

# Solutions

- Recursive algorithm to solve any number of disks.

```
Algorithm solveTowers(numberOfDisks, startPole, tempPole, endPole)
if (numberOfDisks == 1)
    Move disk from startPole to endPole
else
{
    solveTowers(numberOfDisks - 1, startPole, endPole, tempPole)
    Move disk from startPole to endPole
}
```

# Solutions

- Recursive algorithm to solve any number of disks.

```
Algorithm solveTowers(numberOfDisks, startPole, tempPole, endPole)
if (numberOfDisks == 1)
    Move disk from startPole to endPole
else
{
    solveTowers(numberOfDisks - 1, startPole, endPole, tempPole)
    Move disk from startPole to endPole
    solveTowers(numberOfDisks - 1, tempPole, startPole, endPole)
}
```

# Exercise

- Prove that the running time of solveTowers is  $2^n - 1$
- *Hint: use proof by induction*