

1 (text) Recurrence [10 points] Solve the following recurrence relation using repeated substitution.

$$T(n) = 3T(n/4) + 4n$$

Then solve it by using the Master Method, showing in detail which rule applies

Note: Show your work. You will get 4 points if you identify the pattern, 3 points if you do the proof work necessary to show what it resolves to, and 3 points for solving it using the master theorem.

$$\text{We have } T(n) = 3T(n/4) + 4n$$

$$\frac{n}{4} = \frac{n}{16}$$

$$\begin{aligned} \text{Substitute } T(n/4) \text{ to get: } T(n/4) &= 3T(n/16) + \frac{4n}{4} \\ &= 3T(n/16) + \frac{4n}{4} \end{aligned}$$

$$\begin{aligned} T(n) &= 3 \left[3T(n/16) + \frac{4n}{4} \right] + 4n \\ &= 9T(n/16) + 3n + 4n \end{aligned}$$

$$\begin{aligned} \text{Next, } T(n/16) &= 3T(n/64) + \frac{4n}{16} \\ &= 3T(n/64) + \frac{4n}{16} \end{aligned}$$

$$T(n) \text{ then be: } 9 \left[3T(n/64) + \frac{n}{4} \right] + 3n + 4n$$

$$\text{The pattern becomes } 3^K T(n/4^K) + \underbrace{\sum_{i=0}^{K-1} \left(\frac{3}{4} \right)^i \cdot 4n}_{\text{Geometric Series}}$$

$$\begin{aligned} \text{Geometric Series} \rightarrow S &= \frac{1 - r^K}{1 - r} \\ S &= \frac{1 - (3/4)^K}{1 - 3/4} = \underbrace{\left[4 \left(1 - \left(\frac{3}{4} \right)^K \right) \right]}_{\text{Substitute this back } T(n)} \end{aligned}$$

$$T(n) = 3^K T(n/4^K) + 4n \cdot \left[1 - \left(\frac{3}{4} \right)^K \right]$$

$$\text{As } n \text{ goes to } \infty \Rightarrow n/4^K = 0 \Rightarrow 3^K \cdot 0 = 0$$

$$\text{Now we only have } 4n \cdot \left[1 - \left(\frac{3}{4} \right)^K \right]$$

now this becomes $O(n)$ because as n is our input, as n increase, the time also increase.

$$\text{Master Thm: } T(n) = aT(n/b) + f(n)$$

IF $f(n) = \Theta(n^d)$, where $d \geq 0$, then

$$1. \quad T(n) = \Theta(n^d) \text{ if } a < b^d$$

$$2. \quad T(n) = \Theta(n^d \log n) \text{ if } a = b^d$$

$$3. \quad T(n) = \Theta(n^{\log_b a}) \text{ if } a > b^d$$

$$T(n) = 3T(n/4) + 4n$$

$$a = 3, b = 4 \Rightarrow a < b \Rightarrow 3 < 4^1 \Rightarrow \text{Case 1:}$$

$$\boxed{\Theta(n)}$$

2 (text) Master Theorem [20 points] Apply the Master method to solve each of the following recurrences, or state that the Master method does not apply. Justify your answers. Note that the Master method covers all the cases

- a. $T(n) = 3T\left(\frac{n}{5}\right) + n^2$
- b. $T(n) = 4T\left(\frac{n}{3}\right) + 7n$
- c. $T(n) = 5T\left(\frac{n}{4}\right) + 10$
- d. $T(n) = 9T\left(\frac{n}{3}\right) + n^4$
- e. $T(n) = 6T\left(\frac{n}{8}\right) + n^3$

$$a. T(n) = 3T\left(\frac{n}{5}\right) + n^2$$

$$a=3, b=5, d=2$$

$$b^d = 5^2 > 3 \Rightarrow \text{Case 1: } a < b^d \Rightarrow \Theta(n^2)$$

Master Thm: $T(n) = aT(n/b) + f(n)$
 If $f(n) = \Theta(n^d)$, where $d \geq 0$, then
 1. $T(n) = \Theta(n^d)$ if $a < b^d$
 2. $T(n) = \Theta(n^d \log n)$ if $a = b^d$
 3. $T(n) = \Theta(n^{\log_b a})$ if $a > b^d$

$$b. 4T\left(\frac{n}{3}\right) + 7n$$

$$a=4, b=3, d=1$$

$$b^d = 3^1 < 4 \Rightarrow \text{Case 3: } a > b^d \Rightarrow \Theta(n^{\log_3 4})$$

$$c. T(n) = 5T\left(\frac{n}{4}\right) + 10$$

$$a=5, b=4, d=0 \\ b^d = 4^0 = 1 < 5 \Rightarrow \text{Case 3: } a > b^d \Rightarrow \Theta(n^{\log_4 5})$$

$$d. T(n) = 9T\left(\frac{n}{3}\right) + n^4$$

$$a=9, b=3, d=4$$

$$b^d = 3^4 = 81 > 9 \Rightarrow \text{Case 1: } a < b^d \Rightarrow \Theta(n^4)$$

$$e. 6T\left(\frac{n}{8}\right) + n^3$$

$$a=6, b=8, d=3$$

$$b^d = 8^3 = 512 > 6 \Rightarrow \text{Case 1: } a < b^d \Rightarrow \Theta(n^3)$$

3 (text) Radix Sort [10 points] Lexicographical ordering means order of the dictionaries to sequences of ordered symbols therefore ($a < b < c < d < e < f < \dots < m < n < o < \dots < y < z$). The same logic applies to Uppercase letters.

Illustrate the operation of Radix-Sort on the following list of strings using lexicographic ordering.

CAP, COL, USD, SUN, JPY, VEE, ROW, JOB, COX, LOL, RAT, WOW, DOD, CAR, FIG, PIG, VIS, LOW, LOX, VEA, CAD, DOG, TSL

1st (3rd char)	2nd (2nd char)	3rd (1st char)
A: VEA	A: CAD, CAP, CAR, RAT	A:
B: JOB	B:	B:
C: N/A	C:	C: CAD, CAP, CAR, COL, COX
D: USD, DOD, CAD	D:	D: DOD, DOG,
E: VEE	E: VEA, VEE	E: .
F:	F:	F: FIG
G: FIG, PIG, DOG	G:	G:
H:	H:	H:
I:	I: FIG, PIG, VIS	I:
J:	J:	J: JOB, JPY
K:	K:	K:
L: COL, LOL, TSL	L:	L: LOL, LOW, LOX
M:	M:	M:
N: SUN	N:	N:
O:	O: JOB, DOD, DOG, COL,	O:
P: CAP	P: LOL, ROW, WOW, LOW, COX, LOX	P: PIG
Q:	Q: JPY	Q:
R: CAR	R:	R: RAT, ROW
S: VIS	R:	S: SUN
T: RAT	S: USD, TSL	T: TSL
U:	T: N/A	U: USD
V:	U: SUN	V: VEA, VEE, VIS
W: ROW, WOW, LOW	V: .	W: WOW
X: COX, LOX	W:	X:
Y: JPY	X:	Y:
Z:	Y:	Z:
	Z:	

After 3 iterations, the sorted array is :

[CAD, CAP, CAR, COL, COX, DOD, DOG, FIG, JOB, JPY, LOL, LOW, LOX, PIG, RAT, ROW, SUN, TSL, USD, VEA, VEE, VIS, WOW]

4 (text) Double Hashing [15 points] Consider a hash table consisting of $M = 13$ slots, and suppose nonnegative integer key values are hashed into the table using the hash function $h1()$ and that collisions are resolved by using double hashing with the secondary hash function $\text{Reverse}(\text{value})$, which reverses the digits of v and returns that value; for example, $\text{Reverse}(3652) = 2563$.

```
int h1 (int key) {
    int x = (key + 19) * (key + 11);
    x = x / 15;
    x = x + key;
    x = x % M;
    return x;
```

Add the following items [25, 14, 9, 7, 5, 3, 0, 21, 6, 33, 25, 42, 24, 107] to the HashTable in order.

For each key being inserted to the HashTable, show:

- (1) The home slot (the initial hashed slot)
- (2) The number of collisions and the probe sequence (if collisions occur)
- (3) The final contents of the hash table

Hint: You will have to re-size and rehash once

$$(25+19) * (25+11) = 1584 / 15 = 105.6 + 25 = 130.6 \% 13 = 0$$

0: 25

1: 24

2: 21

3: 33

4: 14

$$12/14 = 0.85 > 0.7$$

Resize

$$(14+19) * (14+11) = 625 / 15 = 55 + 14 = 69 \% 13 = 4$$

5:

6: 107

7: 9

8: 6

9: 5

10: 3

11: 42

12: 7

$$(9+19) * (9+11) = 560 / 15 = 37.3 + 9 = 46.3 \% 13 = 7$$

$$(7+19) * (7+11) = 468 / 15 = 31.2 + 7 = 38.2 \% 13 = 12$$

$$(5+19) * (5+11) = 384 / 15 = 25.6 + 5 = 30.6 \% 13 = 4 \boxed{\text{Collision}}$$

13: 10

$$(3+19) * (3+11) = 308 / 15 = 20.53 + 3 = 23.53 \% 13 = 10$$

14: 12

$$(0+19) * (0+11) = 209 / 15 = 13.93 + 0 = 13.93 \% 13 = 0 \boxed{\text{Collision}} \text{ infinite}$$

15: 11

$$(21+19) * (21+11) = 1280 / 15 = 85.3 + 21 = 106.3 \% 13 = 2$$

16: 7

Hash Table

$$(6+19) * (6+11) = 425 / 15 = 28.3 + 6 = 34.3 \% 13 = 8$$

17: 3

$$(33+19) * (33+11) = 2288 / 15 = 152.53 + 33 = 185.53 \% 13 = 3$$

18: 10

$$(25+19) * (25+11) = 1584 / 15 = 105.6 + 25 = 130.6 \% 13 = 0 \boxed{\text{Collision}} \text{ infinite}$$

19: 12

$$(42+19) * (42+11) = 3233 / 15 = 215.53 + 42 = 257.53 \% 13 = 10 \boxed{\text{Collision}}$$

20: 11

$$(24+19) * (24+11) = 1505 / 15 = 100.3 + 24 = 124.3 \% 13 = 7 \text{ Collision} \rightarrow (7+1 \cdot \text{Reverse}(24)) \% 13 = 3$$

21: 13

$$(107+19) * (107+11) = 14868 / 15 = 981.2 + 107 = 1088.2 \% 13 = 6 \rightarrow (7+2 \cdot \text{Reverse}(24)) \% 13 = 0$$

22: 14

23: 15

Collision at 5 \Rightarrow Home slot: 4 \Rightarrow $(4+1 \cdot \text{Reverse}(5)) \% 13 = 9$

Collision at 0 \Rightarrow Home slot: 0 \Rightarrow $(0+1 \cdot \text{Reverse}(0)) \% 13 = 0$ Collision }

0 \Rightarrow Home slot: 0 \Rightarrow $(0+2 \cdot \text{Reverse}(0)) \% 13 = 0$ Collision }

$\underbrace{\hspace{1cm}}_{\sim} \sim \sim \sim : 0 \Rightarrow (0+3 \cdot \text{Reverse}(0)) \% 13 = 0$ Collision }

$\underbrace{\hspace{1cm}}_{\sim} \sim \sim \sim : 0 \Rightarrow (0+4 \cdot \text{Reverse}(0)) \% 13 = 0$ Collision }

∞ infinite probing

Collision at 25 \Rightarrow Home slot: 0 \Rightarrow $(0+1 \cdot \text{Reverse}(25)) \% 13 = 0$ Collision, Probe = 2

Collision at 0 \Rightarrow Home slot: 0 \Rightarrow $(0+2 \cdot \text{Reverse}(25)) \% 13 = 0$ Collision, Probe = 3 }

Collision at 0 \Rightarrow Home slot: 0 \Rightarrow $(0+3 \cdot \text{Reverse}(25)) \% 13 = 0$ Collision, Probe = 4 }

∞ infinite Prob

$$\begin{aligned}
 \text{Collision at } 42 = \text{Home slot: } 10 &\Rightarrow (10 + 1 \cdot \text{Reverse}(42)) \% 13 = 8 \text{ Collision, Probe = 2} \\
 \text{Collision at } 42 &\Rightarrow (10 + 2 \cdot \text{Reverse}(42)) \% 13 = 6 \text{ Collision, Probe = 3} \\
 \text{Collision at } 42: &\Rightarrow (10 + 3 \cdot \text{Reverse}(42)) \% 13 = 4 \text{ Collision, Probe = 4} \\
 &\Rightarrow (10 + 4 \cdot 24) \% 13 = 2 \text{ Collision, Probe = 5} \\
 &\Rightarrow (10 + 5 \cdot 24) \% 13 = 0 \text{ Collision, Probe = 6} \\
 &\Rightarrow (10 + 6 \cdot 24) \% 13 = 11 \quad \checkmark
 \end{aligned}$$

Since our hash table is too full \Rightarrow resize

$$2 \times 13 = 26 \rightarrow \text{The next prime number} = 29$$

Key	Rehash $h_1(\text{key}) \bmod 29$	New home slot
25	$h_1(25) \% 29$	14
14	$h_1(14) \% 29$	11
9	$h_1(9) \% 29$	17
7	$h_1(7) \% 29$	9
5	$h_1(5) \% 29$	1
3	$h_1(3) \% 29$	23
0	$h_1(0) \% 29$	13
21	$h_1(21) \% 29$	19
6	$h_1(6) \% 29$	5
33	$h_1(33) \% 29$	11
25	\sim	14
42	\sim	25
24	\sim	8
107	\sim	25

Collision $\Rightarrow (14 + 1 \cdot 5) \% 29 = 8 \quad \checkmark$
 Collision $\Rightarrow (8 + 1 \cdot 42) \% 29 = 17$
 $\Rightarrow (8 + 2 \cdot 42) \% 29 = 5$
 $\Rightarrow (8 + 3 \cdot 42) \% 29 = 18 \quad \checkmark$

7 (text) Algorithm Analysis [5 points]

For each of the algorithms you wrote for problems 4-6, explain their time complexity and space complexity using Big-O notation. Explain how you arrived at your answer.

```
public void radixSort(String[] arr) { 3 usages ▲ Peter
    int maxLength = getMaxStringLength(arr);
    for (int pos = maxLength - 1; pos >= 0; pos--) {
        countSort(arr, pos); ↗ O(m)
    }
}
```

Time : $O(m \cdot n)$ where m is the length of the largest word and n is the # strings in the array.

The radix sort loops over the length of the largest string then in the body it runs countSort m-times

→ Therefore, $O(m \cdot n)$

```
private static void countSort(String[] arr, int charIndex) { 1 usage ▲ Peter
    int n = arr.length;
    Map<Integer, List<String>> buckets = new HashMap<>();

    // 53 buckets: 1-26 for A - Z, 27-52 for a-z, 0 for short words.
    for (int i = 0; i < 53; i++) {
        buckets.put(i, new ArrayList<>());
    }

    for (String s : arr) {
        int bucketIndex;
        if (charIndex < s.length()) {
            char ch = s.charAt(charIndex);
            if (Character.isUpperCase(ch)) {
                bucketIndex = ch - 'A' + 1;
            } else if (Character.isLowerCase(ch)) {
                bucketIndex = ch - 'a' + 27;
            } else {
                bucketIndex = 0;
            }
        } else {
            bucketIndex = 0; //this bucket handles the short words.
        }
        buckets.get(bucketIndex).add(s); //add
    }

    int index = 0;
    for (int i = 0; i < 53; i++) {
        List<String> bucket = buckets.get(i);
        for (String word : bucket) {
            arr[index++] = word;
        }
    }
}
```

Space : $O(n)$ where n is the # of strings in the input array. This is because we store strings in buckets of the hash map. Each bucket contains a list of strings, worst case, all n-strings will be stored into the same bucket.

```
private static int getMaxStringLength(String[] arr) { 1 usage ▲ Peter
    int maxLength = 0;
    for (String s : arr) {
        if (s.length() > maxLength) {
            maxLength = s.length(); ↗ O(1)
        }
    }
    return maxLength; ↗ O(1)
}
```

Space Complexity is $O(1)$ since the code doesn't make variables the input size increase.

S.

```

import java.util.HashMap;
import java.util.regex.Pattern;

public class WordPattern { 2 usages ↳ Peter
    public boolean isFollowPattern(String p, char d, String s) { 4 usages ↳ Peter
        String delimiter = String.valueOf(d); //convert d into String
        //To avoid regex pattern error, it quotes the pattern and interprets it as string literals.
        String[] words = s.split(Pattern.quote(delimiter));
        → O(m), m is the length of string s.
        //If the length of the pattern doesn't match the length of the String s "aaa" vs "dog cat" 2 != 3.
        if(words.length != p.length()){
            return false;
        } → O(n), n is the length of string p
        //HashMap to pair a character to s.
        HashMap <Character, String> map = new HashMap<>();
        for (int i = 0; i < p.length(); i++) {
            //Access each character at a time
            char curr_char = p.charAt(i);
            if(map.containsKey(curr_char)){ → O(1)
                if(!map.get(curr_char).equals(words[i])){ → O(1)
                    return false;
                }
            } → O(n)
            else {
                //Checks if the word already a value in the map or is already mapped to another character
                if (map.containsValue(words[i])){
                    return false;
                }
                //Otherwise, put it in the map.
                map.put(curr_char, words[i]);
            }
        }
        return true;
    }
}

```

Time Complexity: $O(m+n^2)$ because the method splits the delimiter, in worst case the entire string s needed to be scanned to know where the delimiter happens.

First for loop runs n -times, where n is length of string p. Then the containsValue takes n -times to scan the entire map.

Space: $O(n)$, where n is the length of string p because the map stores each unique character from pattern p. Which means it can store up to n -Key-Value pairs.

4. Double hashing

Time: $O(n)$, where n is the # of keys to hash

Space: $O(n)$, where n is the # of keys because it stores in HashTable.