

Recitation-2

Divide & Conquer

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Practice Questions

Question -1

Practice Question 1

Problem: Show that all horses in a set **S** of any size are in the same color !

Practice Question 1

Proof by Induction:

- **Base:** For **S** of size **K=1** the horse is in the same color like
 $\{\text{white}\}$
- **Inductive Hypothesis:** For **S** of size **K=n** we assume
all horses are in the same color like
 $\{\text{white}_1, \text{white}_2, \dots, \text{white}_k\}$
or
 $\{\text{blue}_1, \text{blue}_2, \dots, \text{blue}_k\}$

Practice Question 1

- **Inductive Step:** Partition set **S** of size **K=n+1** into sets **S1** = {1,...n} and **S2**= {2,...n+1} of size k=n.

Since **S1** and **S2** are of size **n** thus **hypothesis** says **S1**'s horses are in same color like **color1** and **S2**'s horses are also in same color like **color2**.

Since **S1** and **S2** overlap thus
color1 = color2

therefore for k=n+1 all are in same color.



Practice Question 1

But the Induction is Wrong

Overlapping assumption doesn't hold for $k = 2$
 $\{1, 2\} = \{1\}, \{2\}$

Question -2

Practice Question 2

Input: Sorted Distinct Integers $A[1..n]$

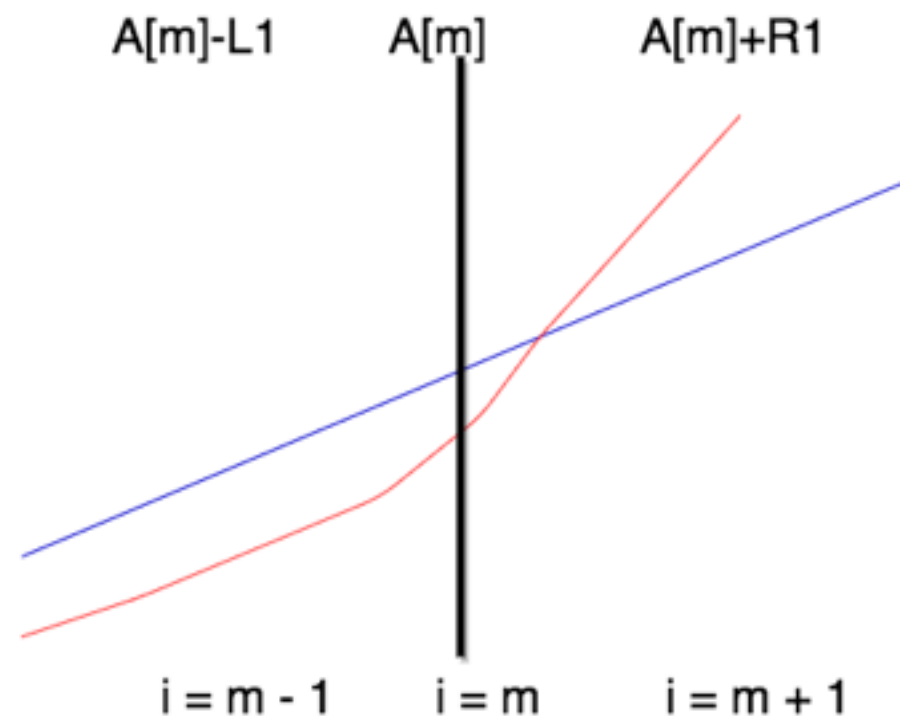
Output: Check if $A[i] = i$ for any i in time $O(\log(n))$

Practice Question 2

Hint:

1. We use properties of array **A**; **sorted**, **distinct** and **integer**
2. Get rid of **almost half** of **A** at constant number of comparisons

Practice Question 2



For any index m

$A[m] = m$ return true

$A[m] > m$ the **right side** is hopeless because the rate of increase for **$A[i]$** is **equal or higher** than **i** ; therefore index **i** never reaches **$A[i]$** at the right side

$A[m] < m$ the **left side** is hopeless because the rate of decrease for **$A[i]$** is **equal or higher** than **i** ; therefore **i** can never reach **$A[i]$** in the left side

Conclusion: We can get rid of one side of **m** with one comparison

Practice Question 2

Set **$m = n/2$** to get **$O(\log(n))$**

$$\mathbf{T(n) = T(n/2) + O(1) = O(\log n)}$$

Practice Question 2

`algo($A[1, \dots, n]$)`

1. *if $n == 1$, return ($A[n] == n$)*
2. *$m = \lceil \frac{n}{2} \rceil$*
3. *if $A[m] = m$ return true*
4. *else if $A[m] > m$, return `algo($A[1, \dots, m - 1]$)`*
5. *else return `algo($A[m + 1, \dots, n]$)`*

Practice Question 2

Proof by Induction:

Base: $n=1$ is correct

Hypothesis: $n=k$ is correct

Inductive Step: $n=k+1$:

1. If $A[n/2] = n/2$ the algorithm finds answer correctly in $O(\log n)$
2. If $A[n/2] > n/2$ then for each $j > n/2$ we have
$$A[j] \geq A[n/2] + (j - n/2) > n/2 + j - n/2 > j$$
3. If $A[n/2] < n/2$ then for each $j < n/2$ we have
$$A[j] \leq A[n/2] - (n/2 - j) < n/2 + j - n/2 < j$$

Question -3

Practice Question 3

Input: $A[1..n]$, $B[1..n]$ **Sorted**

Output: Median of combined A , B with size $2n$
in **$O(\log n)$**

Practice Question 3

Hint: When we like $O(\log n)$, we need to get rid of about $O(n/2)$ at each constant comparisons

Practice Question 3

Definition: Median of an array is a point at position **m** i.e **Med = A[m]** such that almost **half** of A is **less** than **A[m]** and other **half** is **greater** than **A[m]**

Let m_a and m_b be the medians of A and B:

$$A[1 \dots n] = [A_L, m_a, A_R]$$

$$B[1 \dots n] = [B_L, m_b, B_R]$$

Practice Question 3

Observation: We can remove **equal** number of elements from **two sides of the median**

Example:

A = 1, 12, 4, 9, 3, 16, 28, 19, 13, 21, 18, 24, 70

1, 12, 4, 9, 3, 13, 16, 28, 19, 21, 24, 70, 18

12, 4, 9, 16, 19, 24, 70

12, 16, 24

Practice Question 3

$$A_L < m_a < A_R$$

$$B_L < m_b < B_R$$

Practice Question 3

Case 1: $m_a = m_b$

$$\{A_L, B_L\} < \{m_b, m_a\} < \{B_R, A_R\}$$

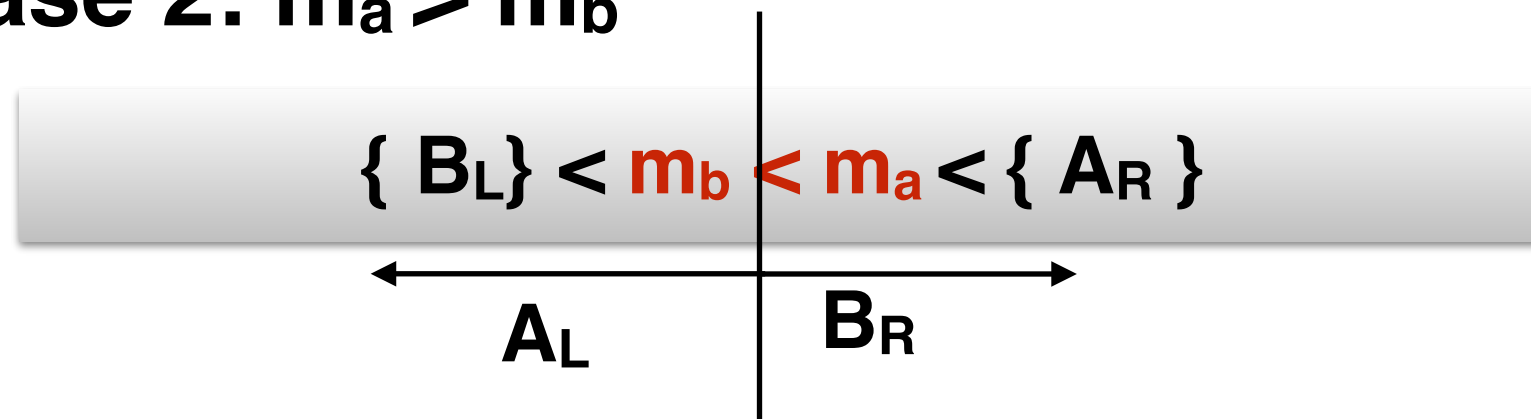
Overall median must be between m_a and m_b since there are $n/2 + 1$ element before m_a and $n/2 + 1$ after m_b .
Thus we can remove equal number of elements from both sides.

$$m_b, m_a$$

Therefore **$m_a = m_b = \text{overall median}$**

Practice Question 3

Case 2: $m_a > m_b$



- **Overall median** must be smaller than m_a
because $|A_L| + |B_L| + 1_{(m_b)} = n/2 + n/2 + 1 = n + 1$
elements are less than m_a
- **Overall median** must be bigger than m_b :
because $|B_R| + |A_R| + 1_{(m_a)} = n/2 + n/2 + 1 = n + 1$
elements are bigger than m_b

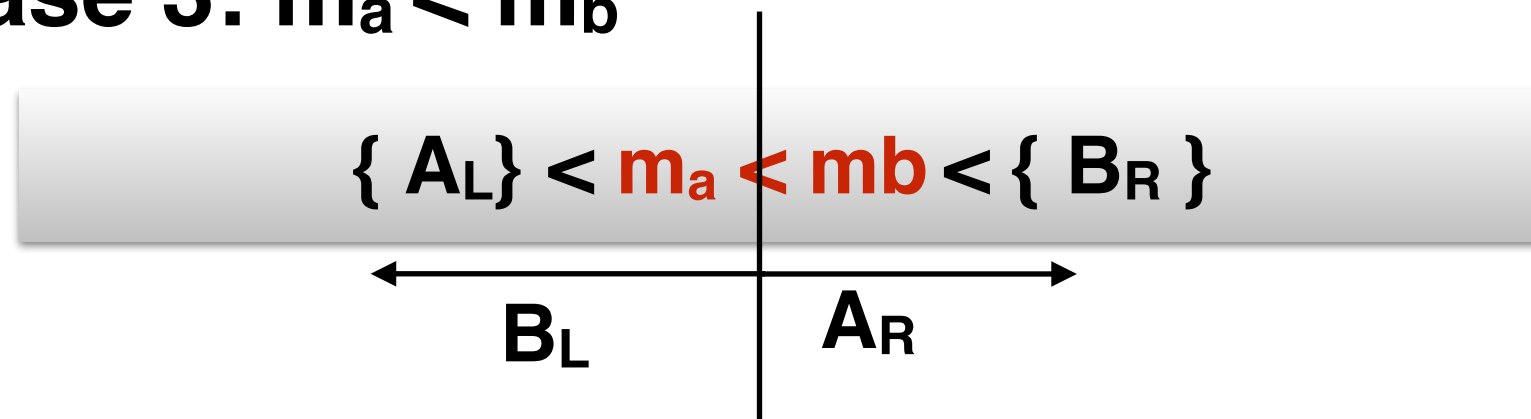
Practice Question 3

Since overall median is between $\mathbf{m_b}$ and $\mathbf{m_a}$
we can remove equal number of elements
from both sides of median
which are $\mathbf{B_L}$, $\mathbf{A_R}$, $\mathbf{m_a}$ and $\mathbf{m_b}$.

Thus: $\text{median}(A, B) = \text{median}(A_L, B_R)$

Practice Question 3

Case 3: $m_a < m_b$



- Overall median must be smaller than m_b
- Overall median must be bigger than m_a

Since overall median is between m_a and m_b , we can remove whatever number of elements from both sides which are A_L , B_R , m_a and m_b .

Thus: $\text{median}(A, B) = \text{median}(A_R, B_L)$

Practice Question 3

```
function median2( $a, b$ )  
  if  $n \leq 2$   
    explicitly find the median and return it  
  compute the median of  $a$  and  $b$ :  $m_1$  and  $m_2$  respectively  
  if  $m_1 == m_2$ :  
    return  $m_1$   
  else if  $m_1 > m_2$ :  
    return median2( $a_L, b_R$ )  
  else:  
    return median2( $a_R, b_L$ )
```

$$T(n) = T(n/2) + O(1) = O(\log n)$$

Question -4

Practice Question 4

Input: $A[1..n]$ **Unimodal**

Output: Find index p in $[1..n]$ which is the modality point with complexity **$O(\log n)$**

For **$[1,2,5,9,7,3]$** the modality point is **$p = 4$**

Hint: Again for **$O(\log n)$** we need to get rid of half of array at each constant comparisons

Practice Question 4

For each point at index **m** there are three cases:

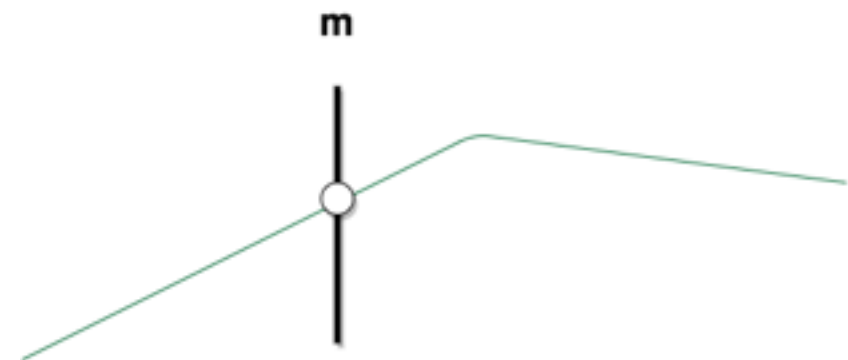
- **$A[m+1] < A[m]$:**

Turning point **t** is between **[1, m]**



- **$A[m+1] > A[m]$:**

Turning point is between **(m, n]**



- **$|A| = 1$ return $A[1]$**

Practice Question 4

`algo($A[1, \dots, n]$)`

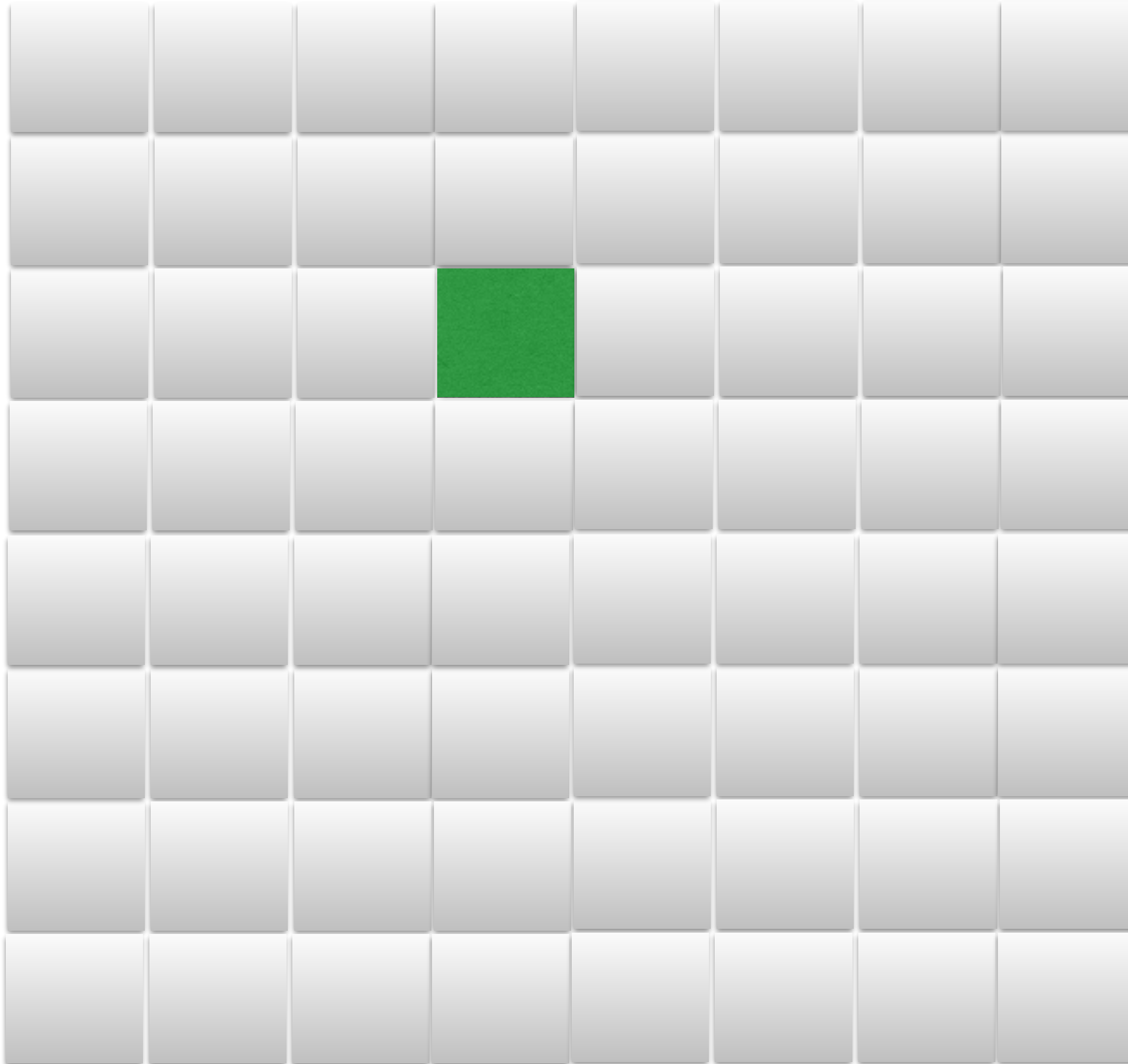
1. *if $n == 1$, return **A[n]***
2. *$m = \frac{n}{2}$*
3. *if $A[m] < A[m + 1]$ return `algo($A[m + 1, \dots, n]$)`*
5. *else return `algo($A[1, \dots, m]$)`*

We choose **$m = n/2$** to get **$O(\log n)$**

Question -5

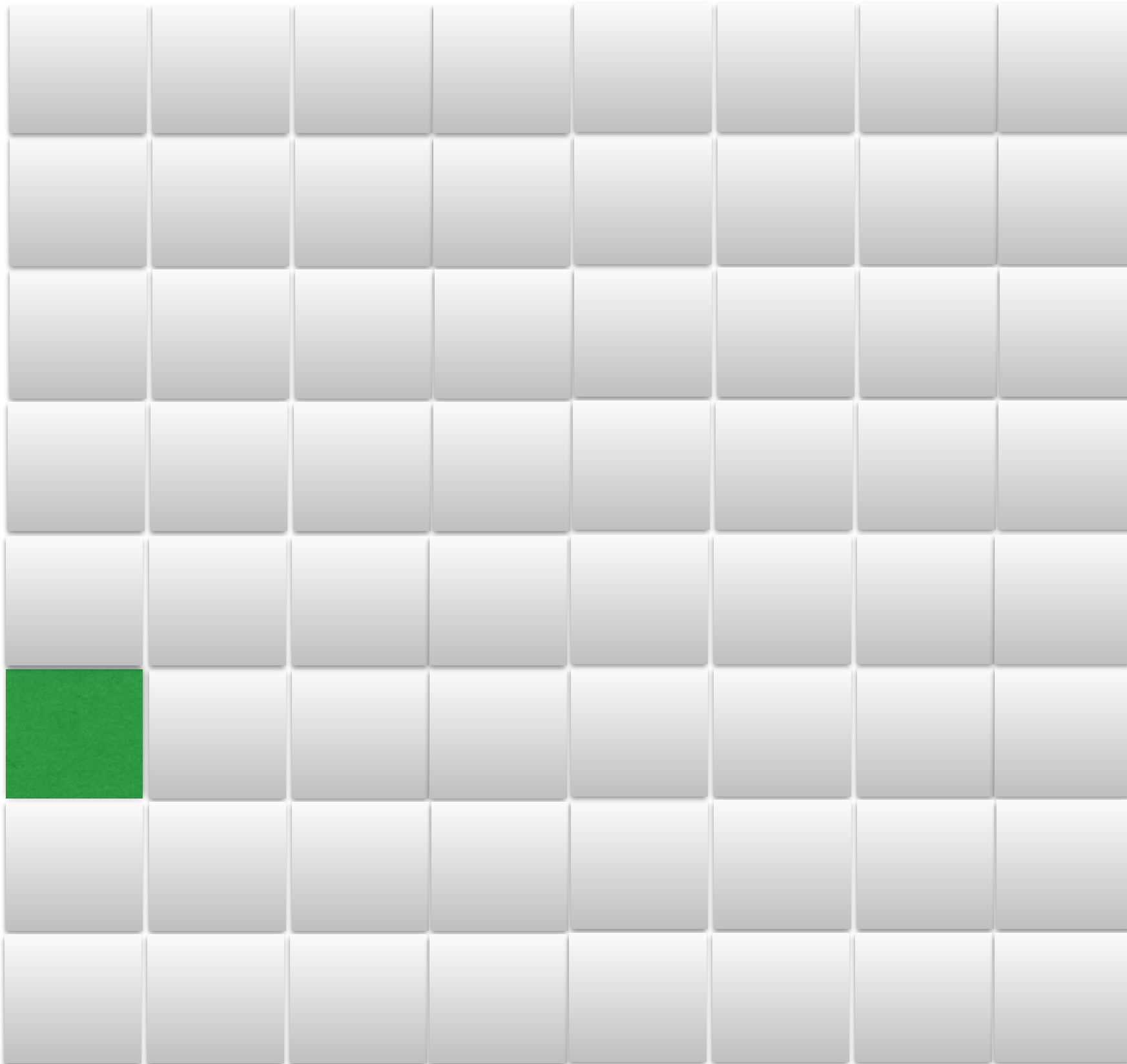
Practice Question 5

Tromino Puzzle : For a board of $2^{n+1} \times 2^{n+1}$ with **one missing** square **at optional position**, fill the board with **L** tiles.



Practice Question 5

Missing square can be anywhere

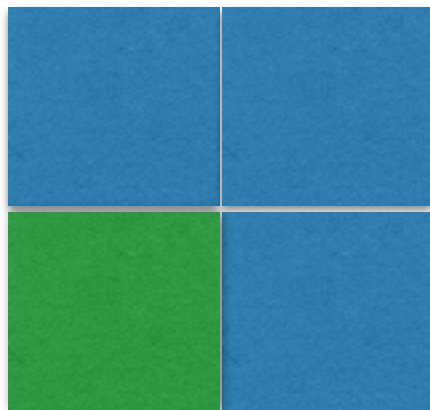
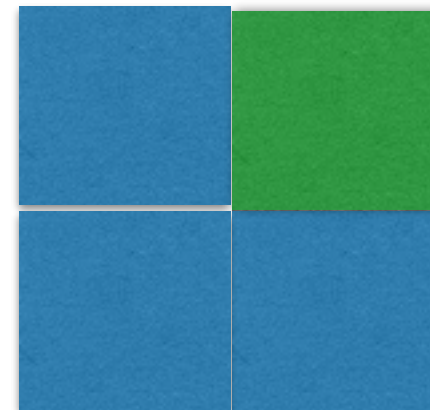
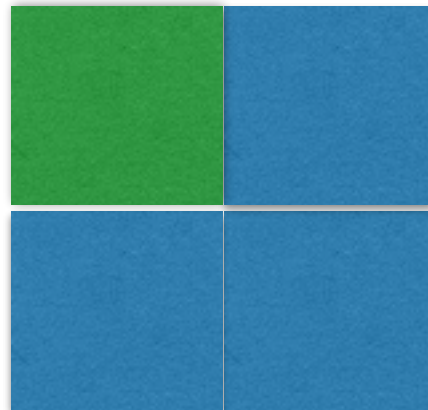
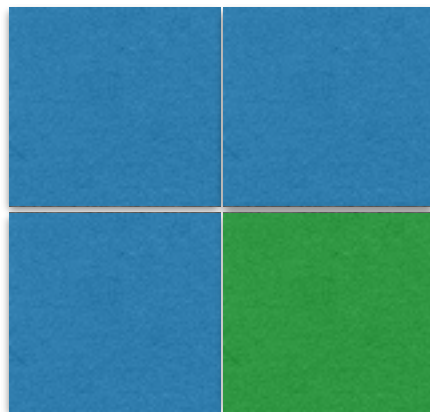


Practice Question 5

Divide & conquer solution

Practice Question 5

Base Case : For board of $2^1 * 2^1$ we can solve regardless of the missing square

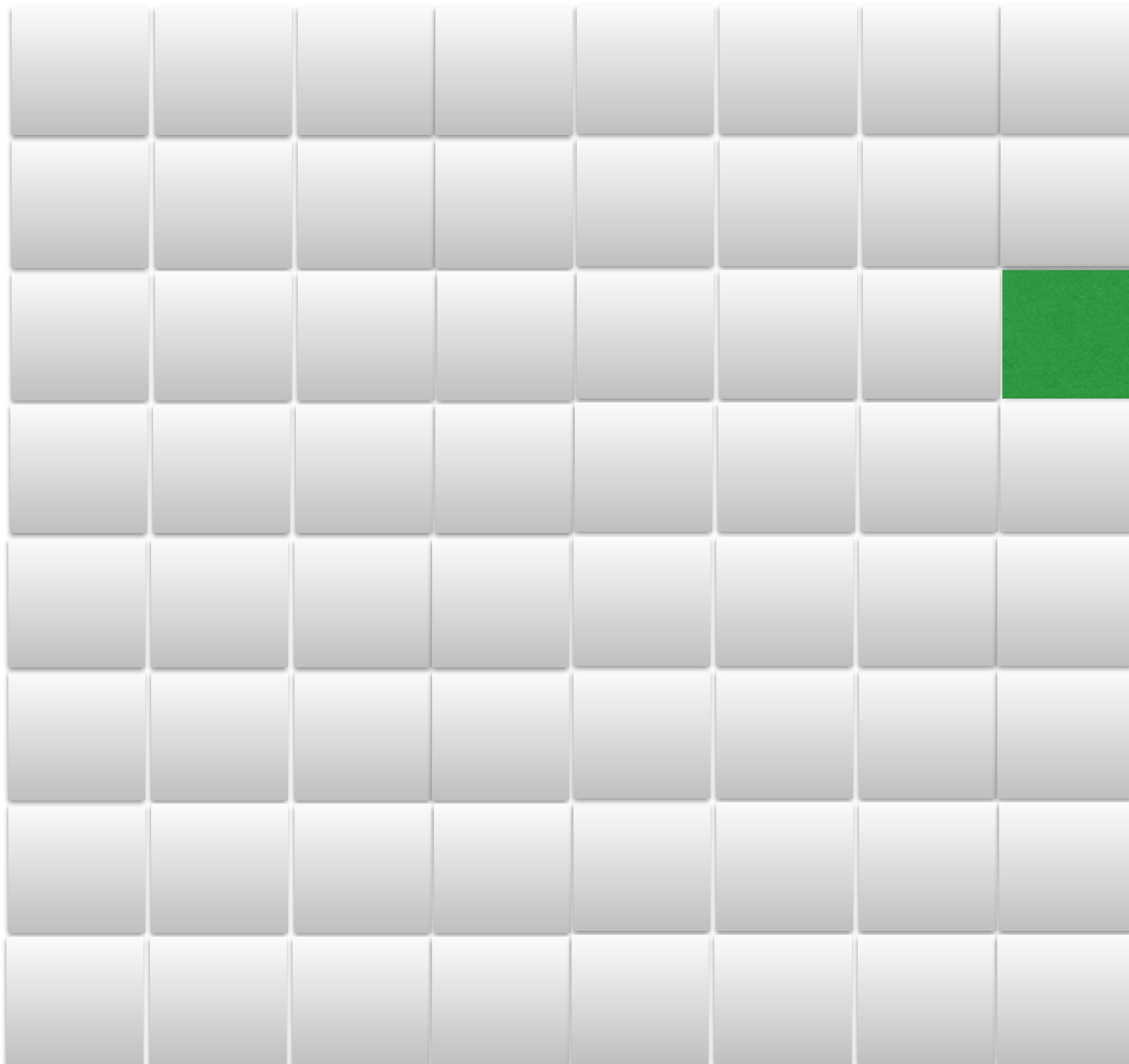


Practice Question 5

Hypothesis : We can solve for $2^n * 2^n$ with any optional missing square

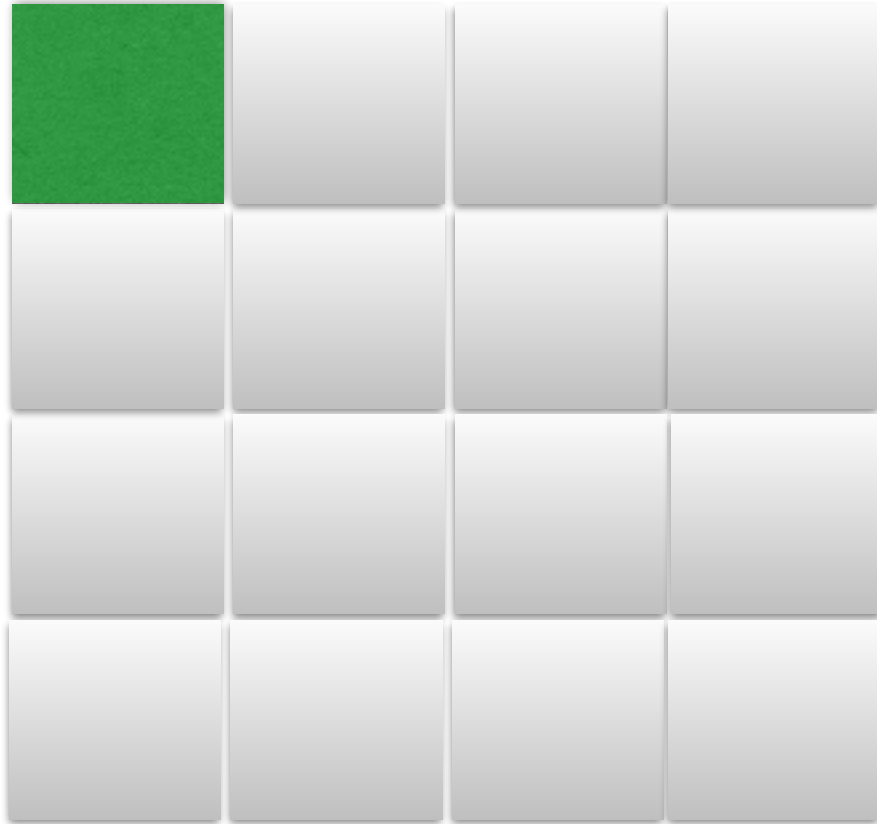
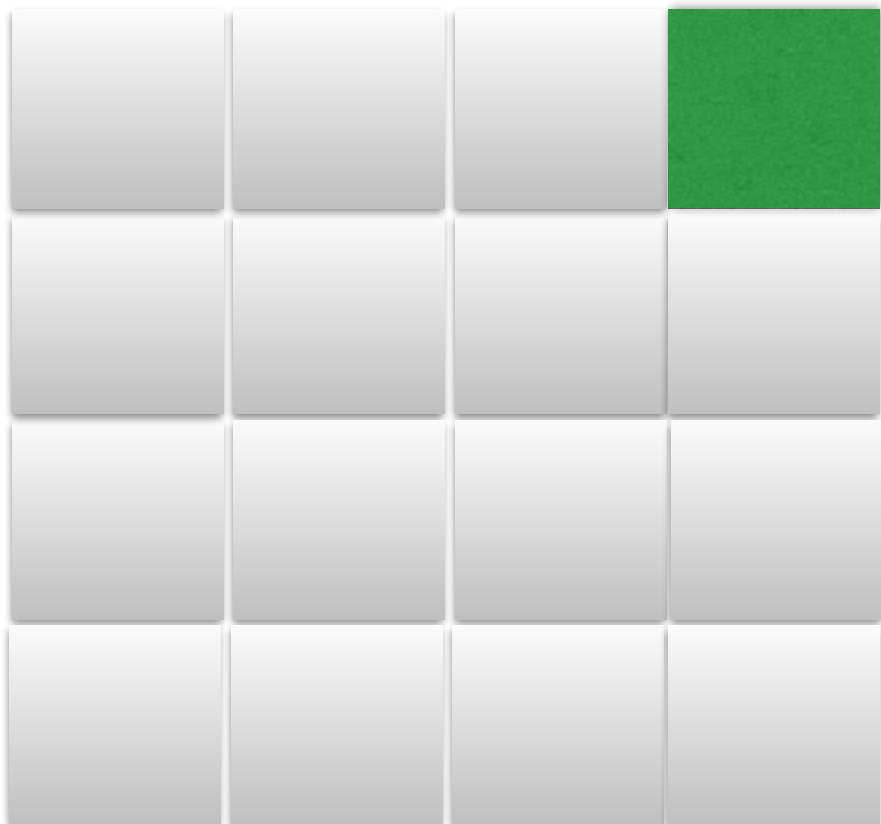
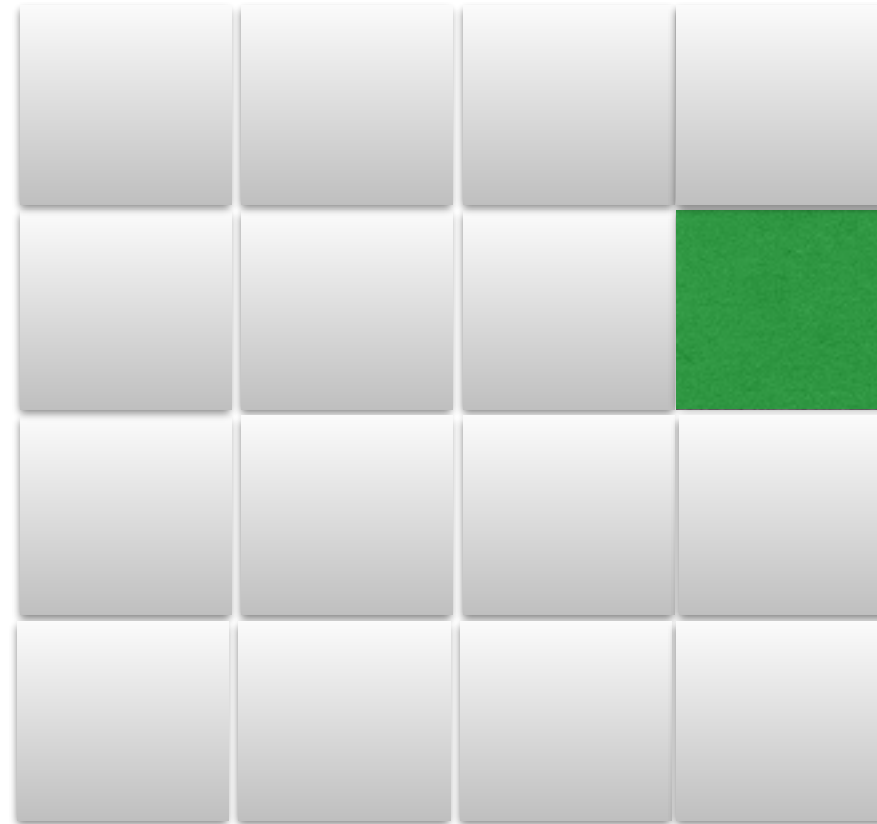
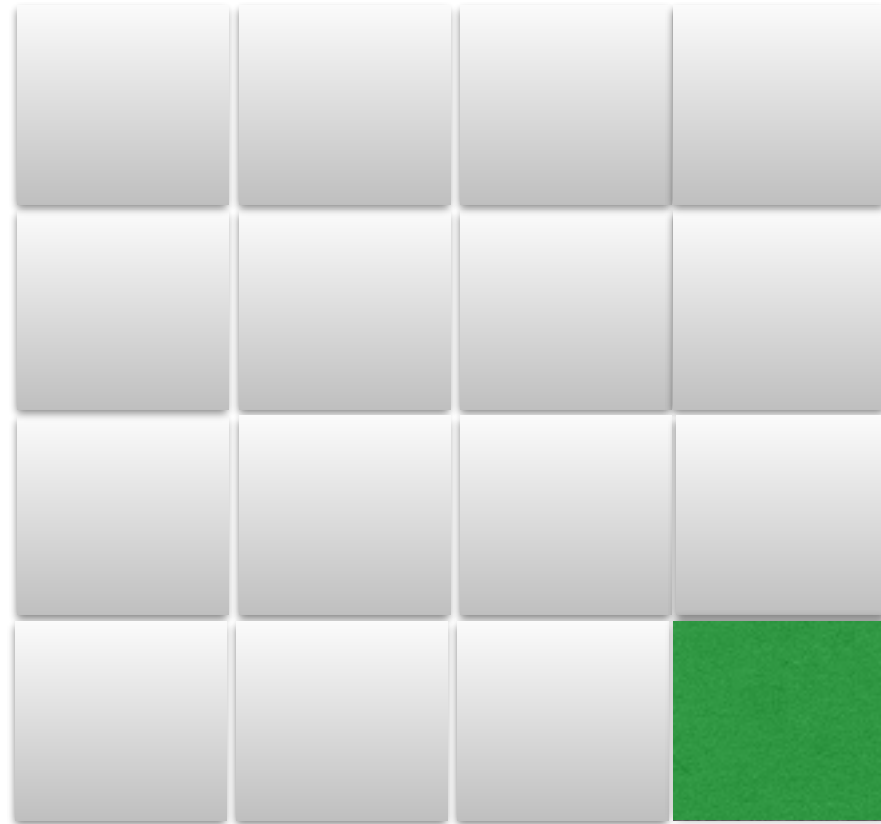
Practice Question 5

Let the missing square be



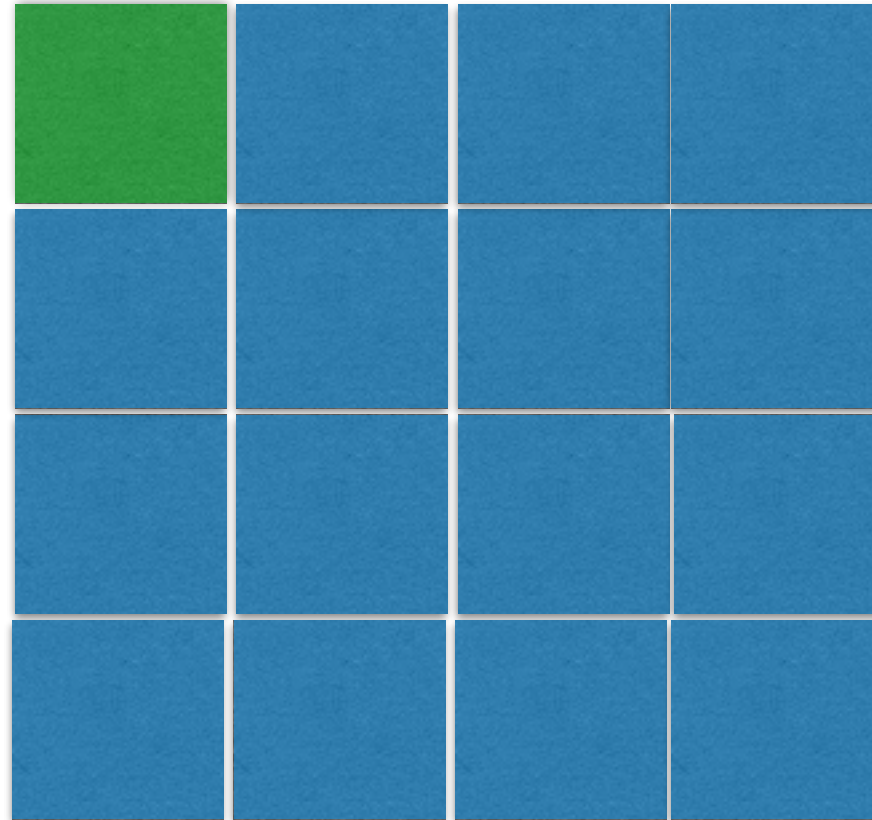
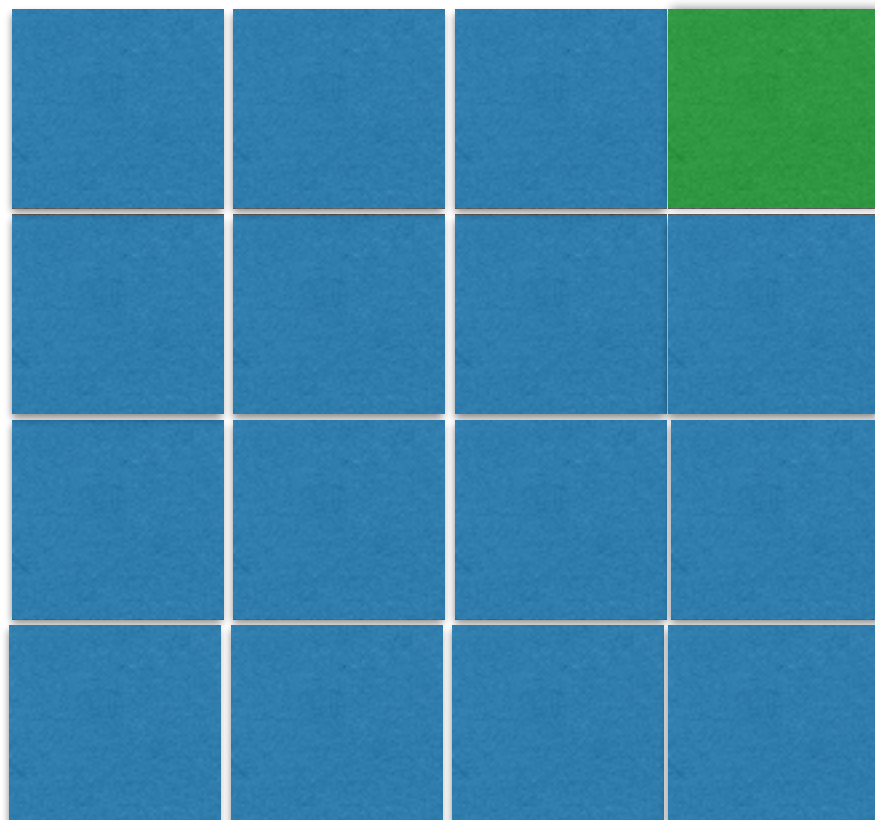
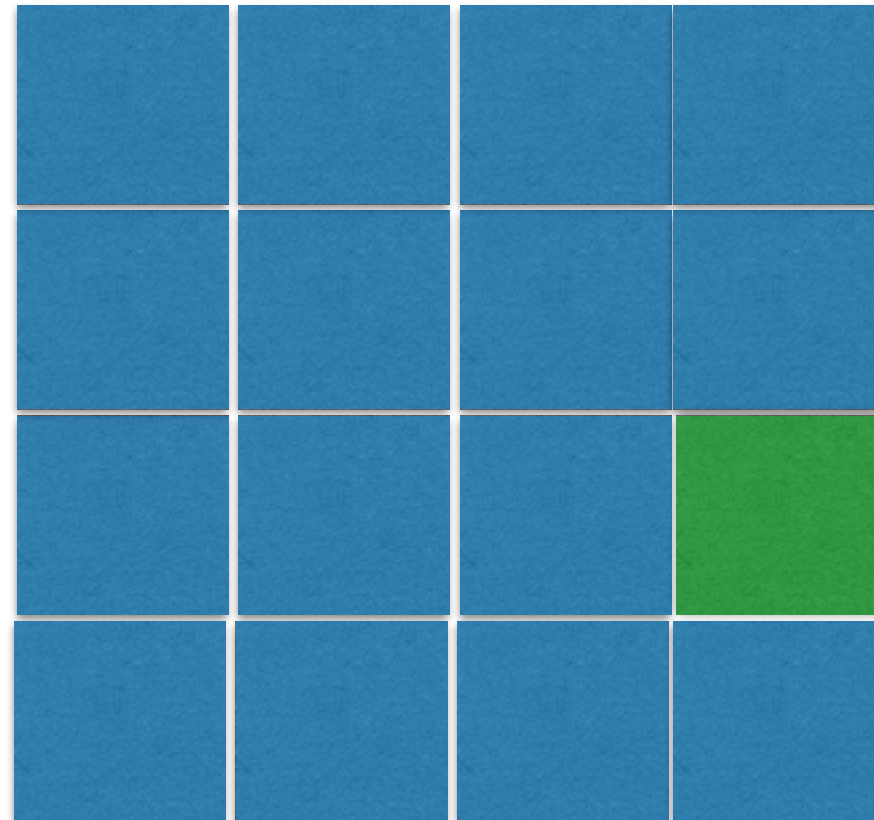
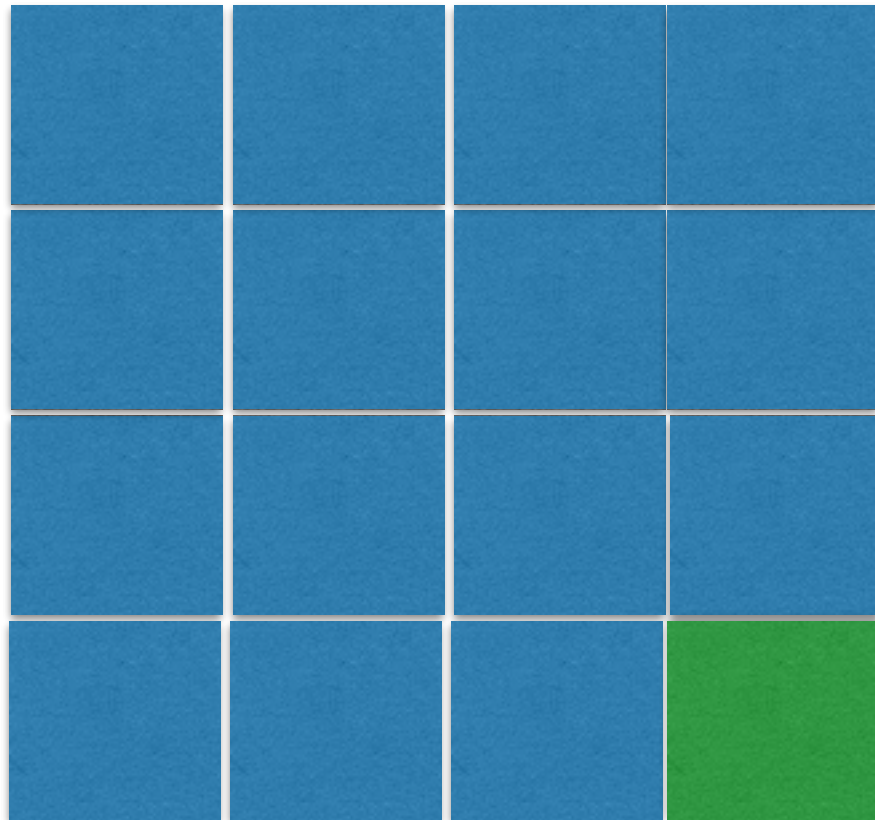
Practice Question 5

Induction Step: For $2^{n+1} \times 2^{n+1}$ generate 4 quartiles of $2^n \times 2^n$ as subproblems



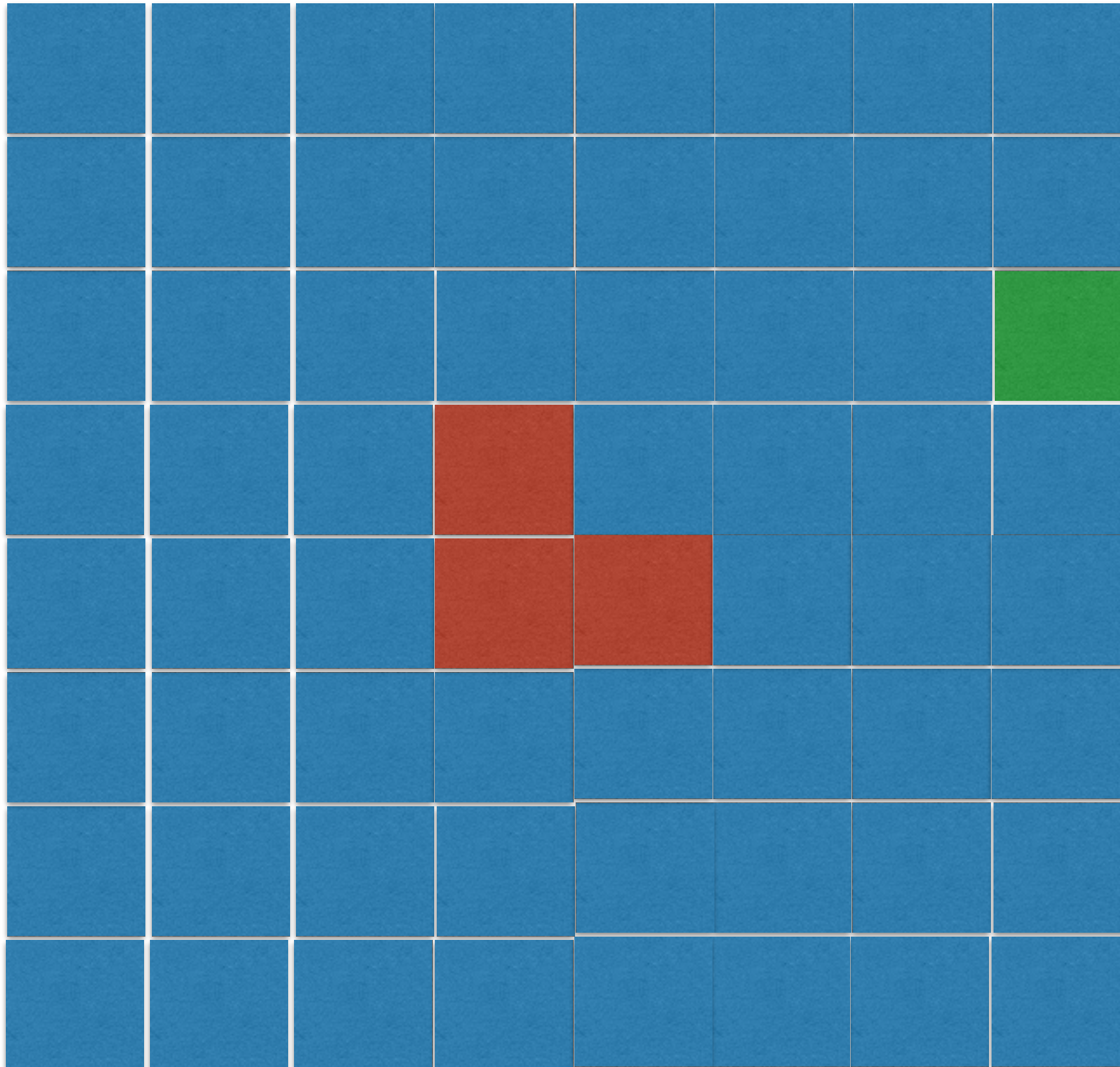
Practice Question 5

Step 2: Solve subproblems



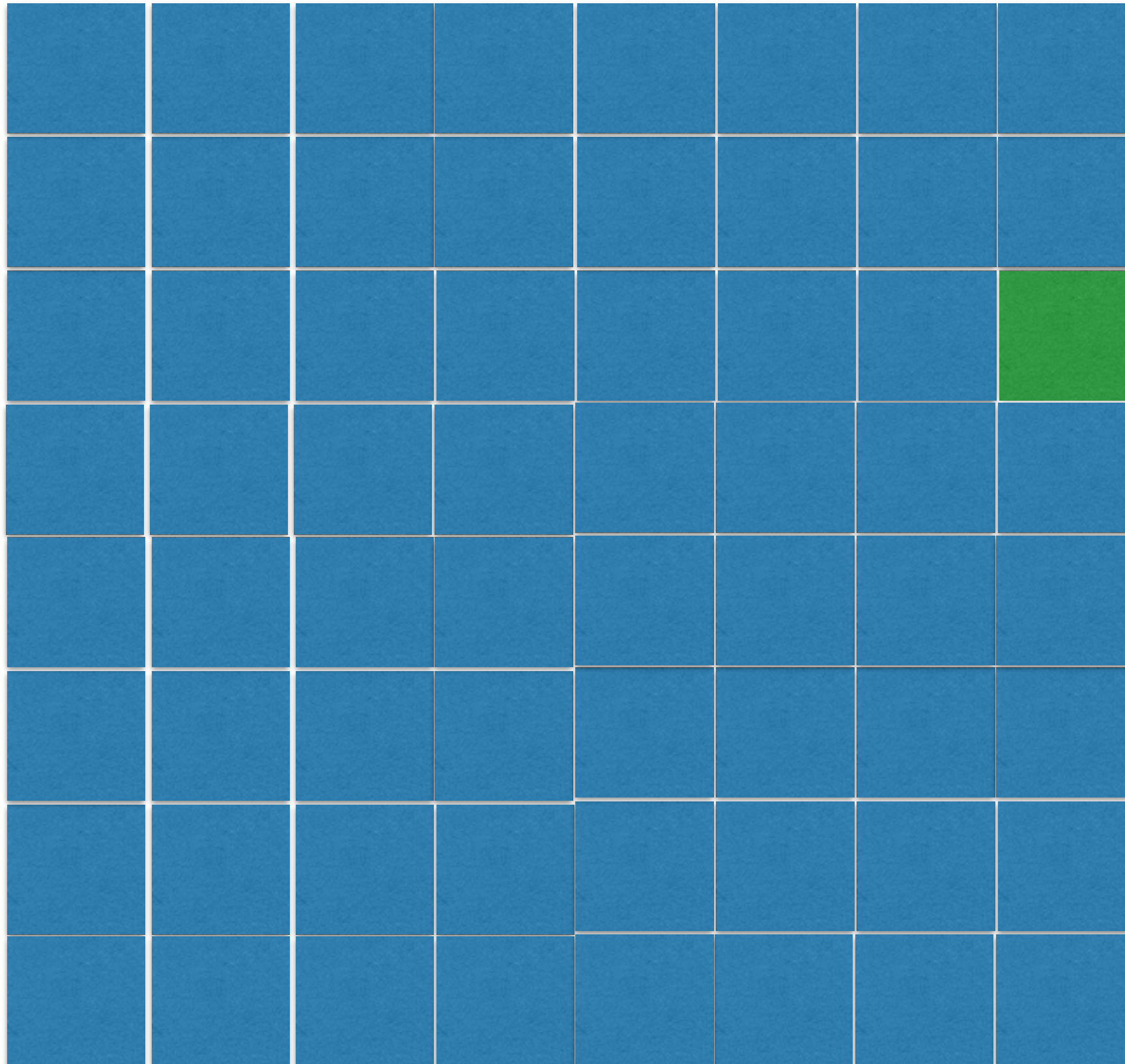
Practice Question 5

Step 3: Put a tile **L** as follows



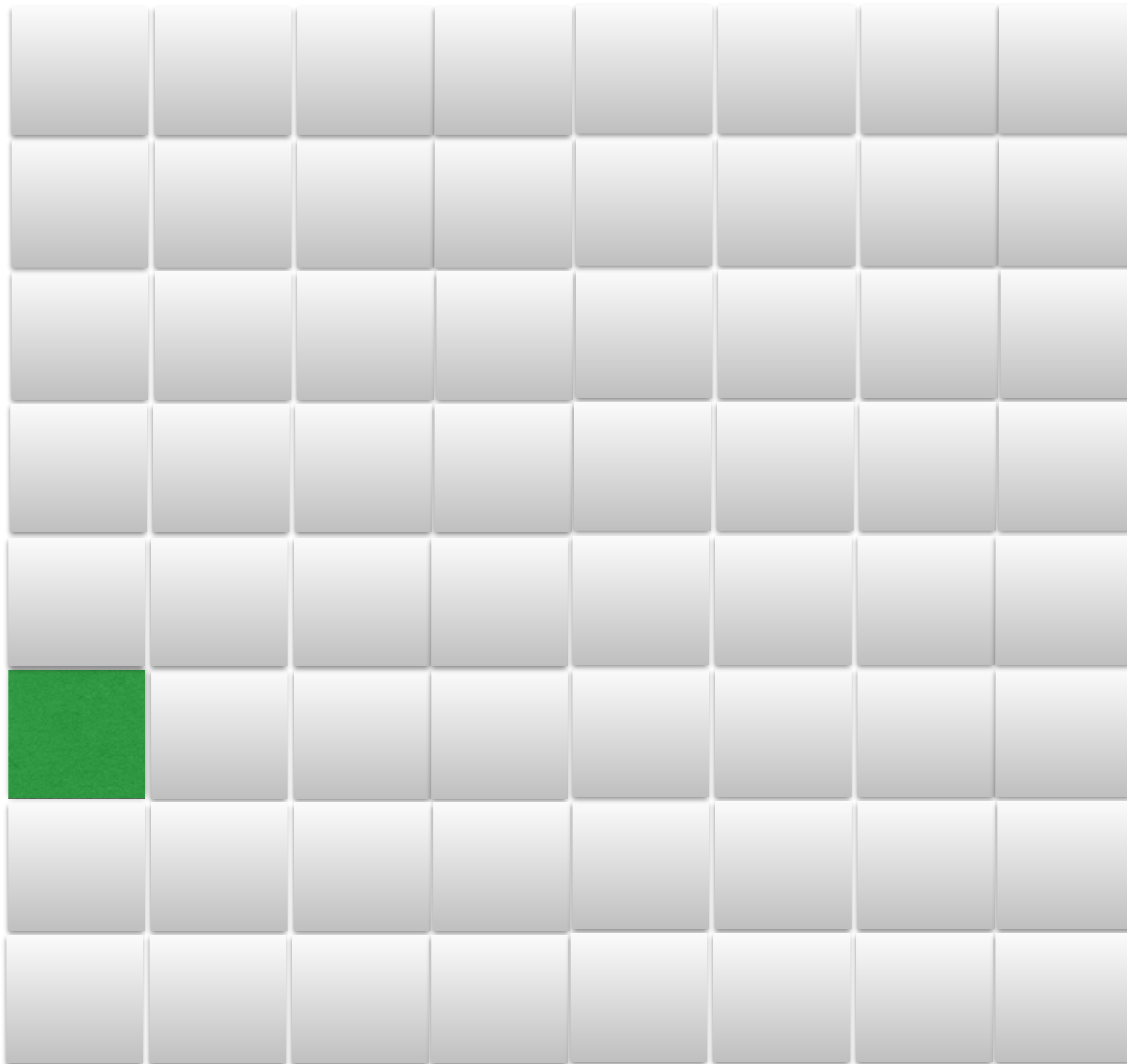
Practice Question 5

Step 4: return



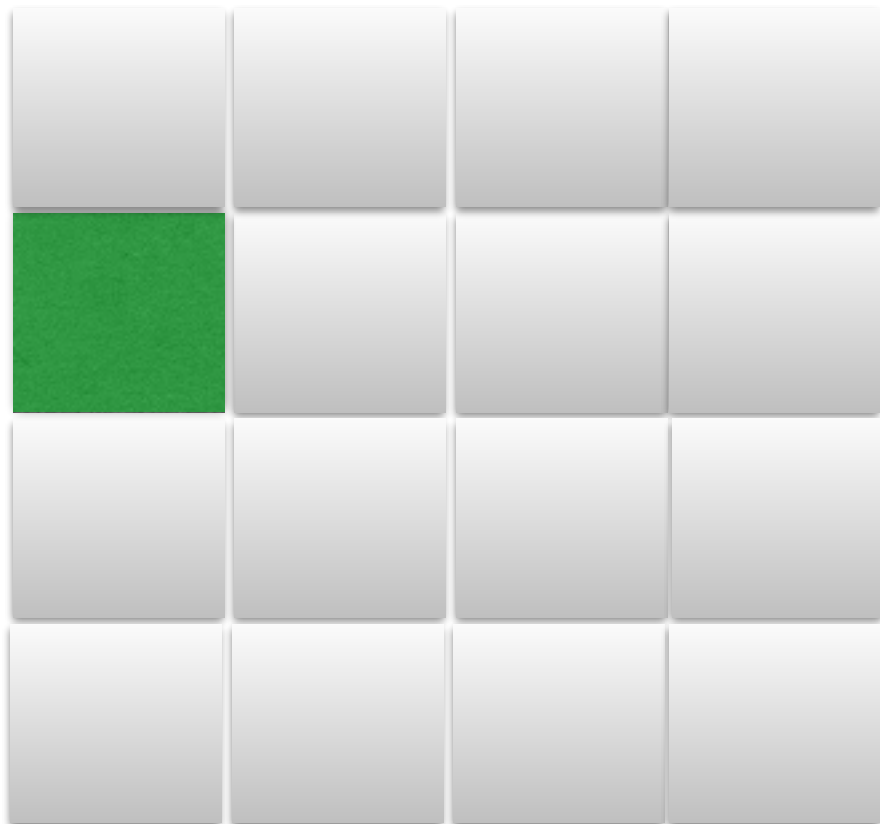
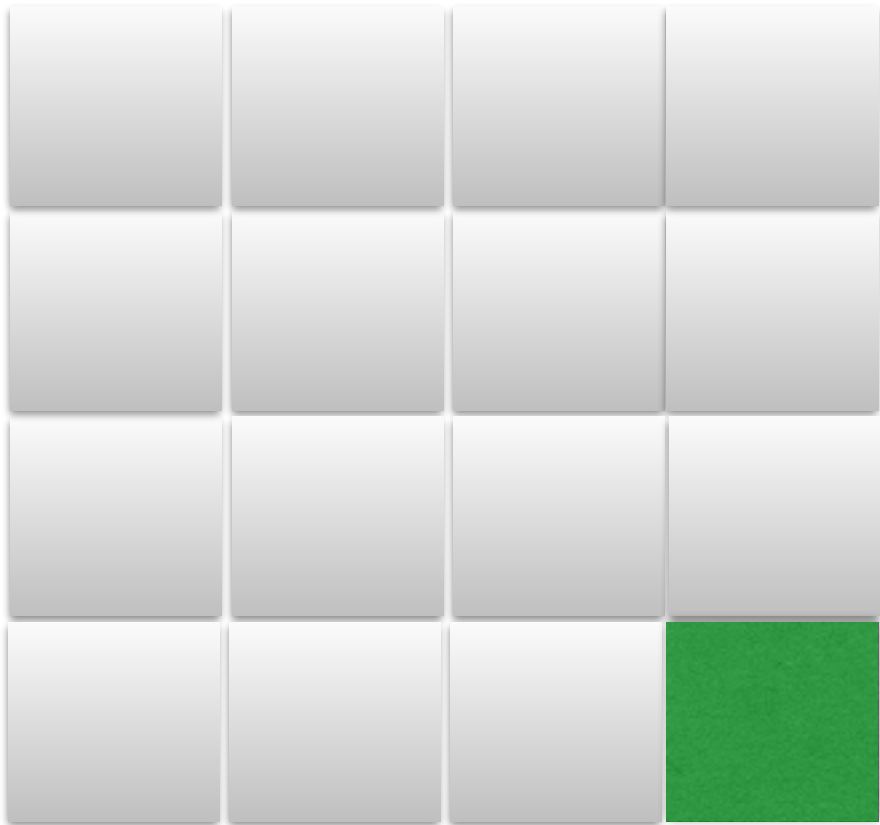
Practice Question 5

Another example



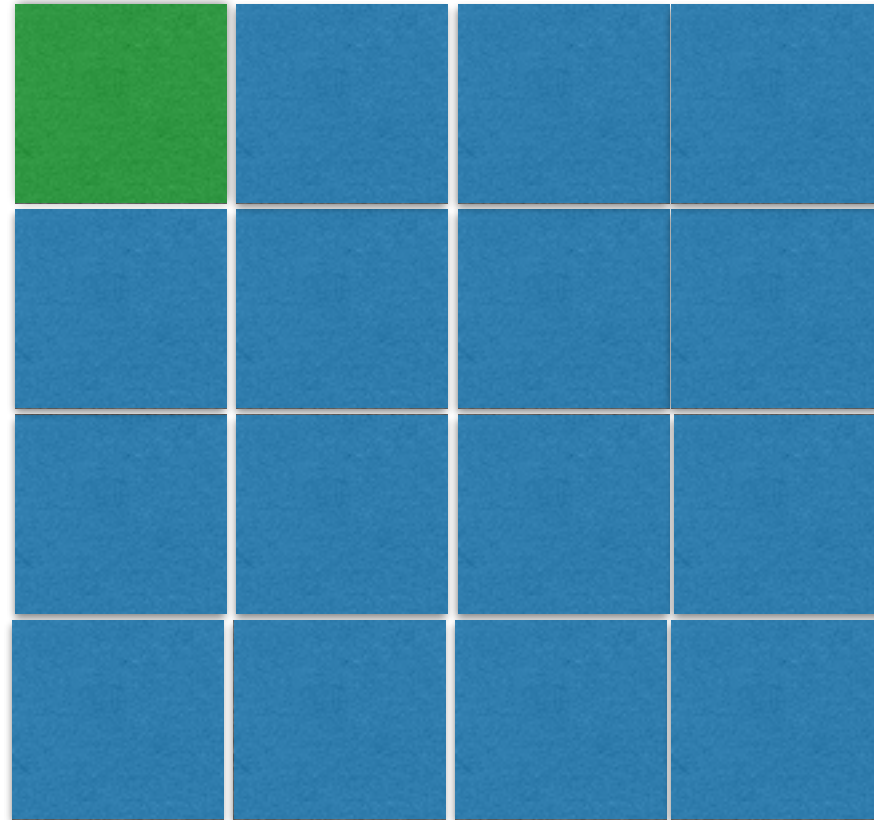
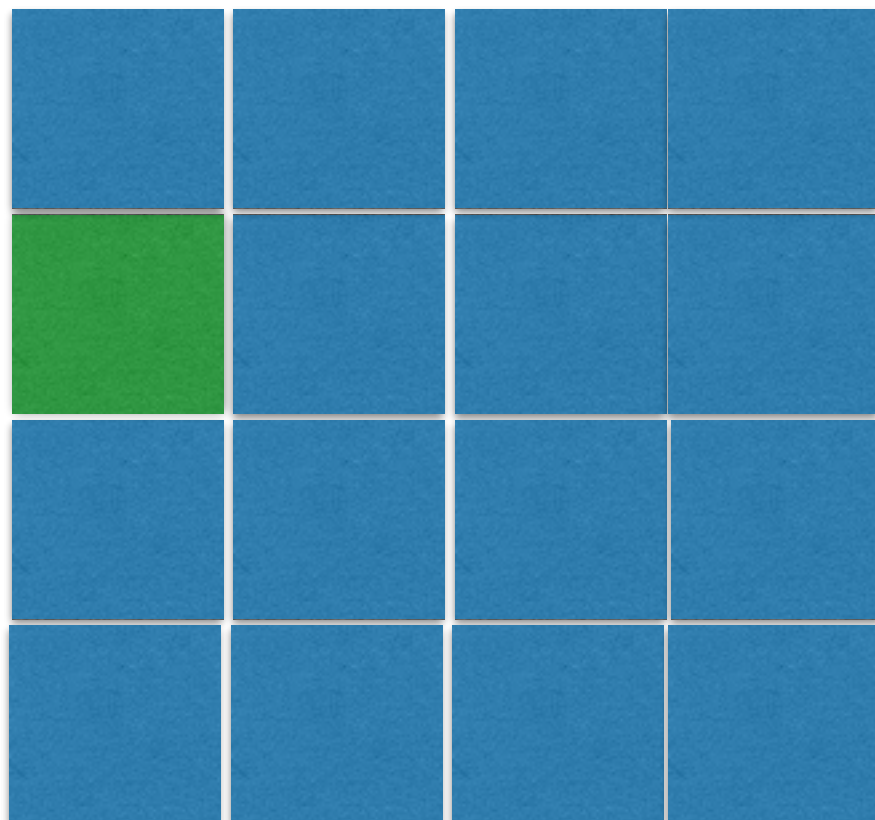
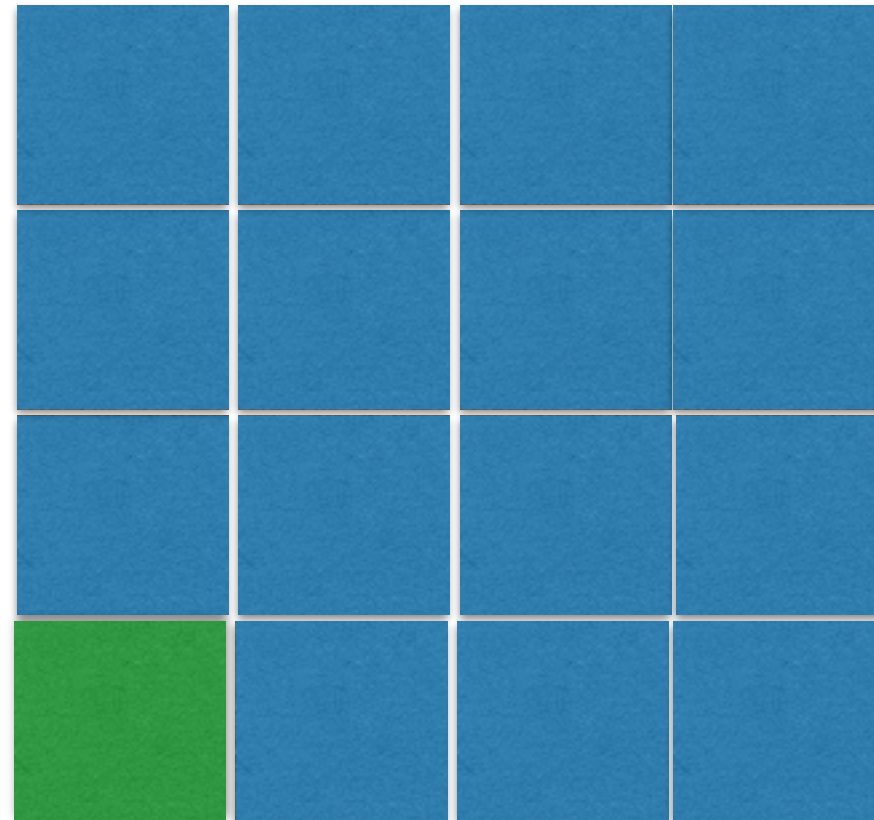
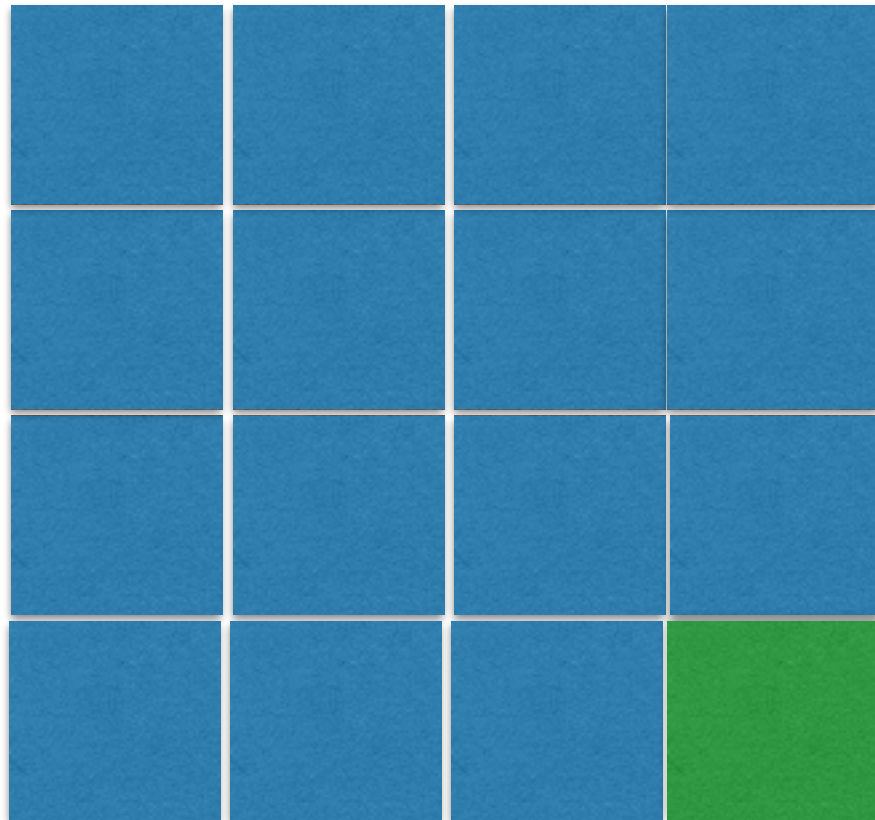
Practice Question 5

generate 4 subproblems



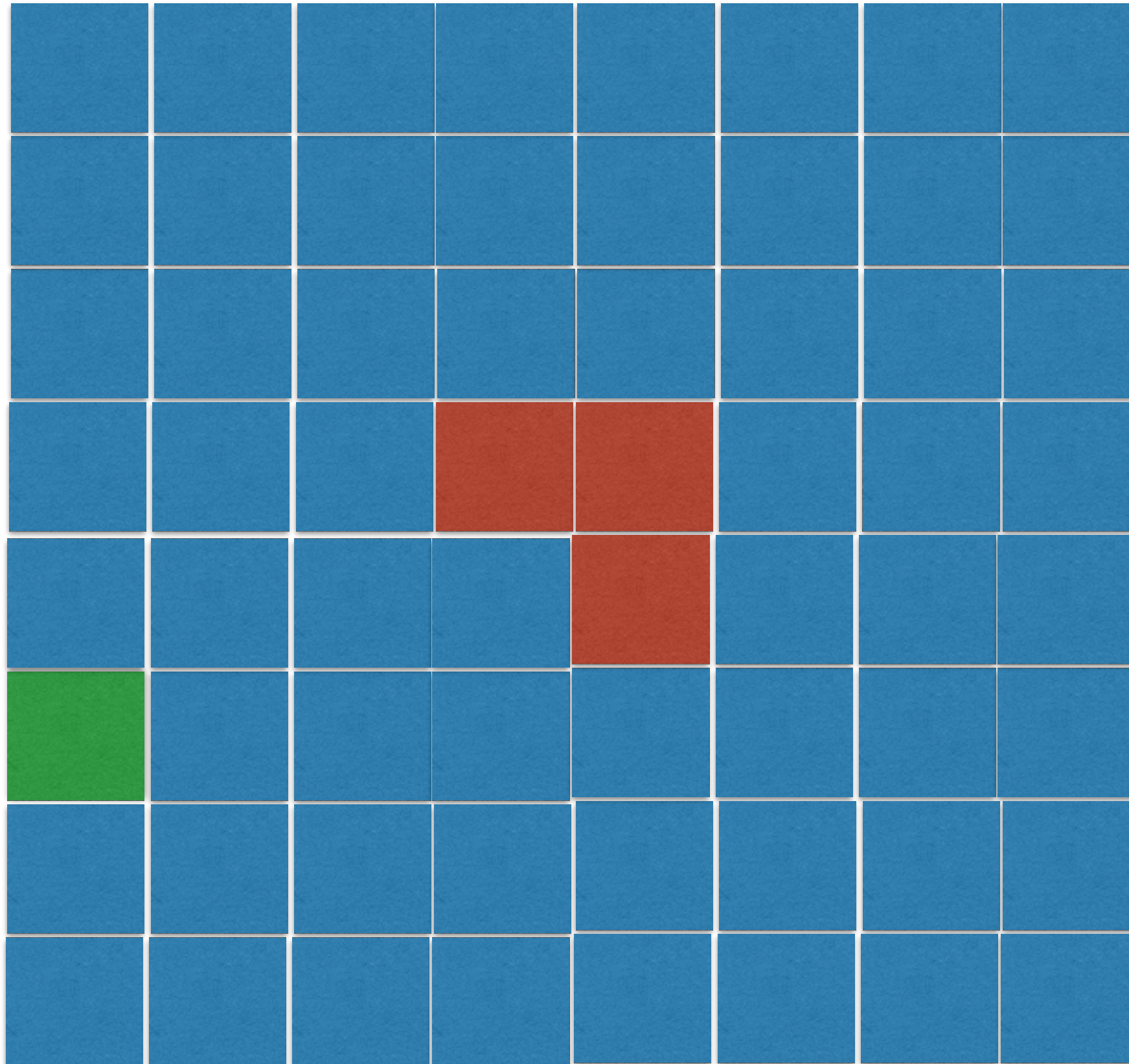
Practice Question 5

Solve subproblems

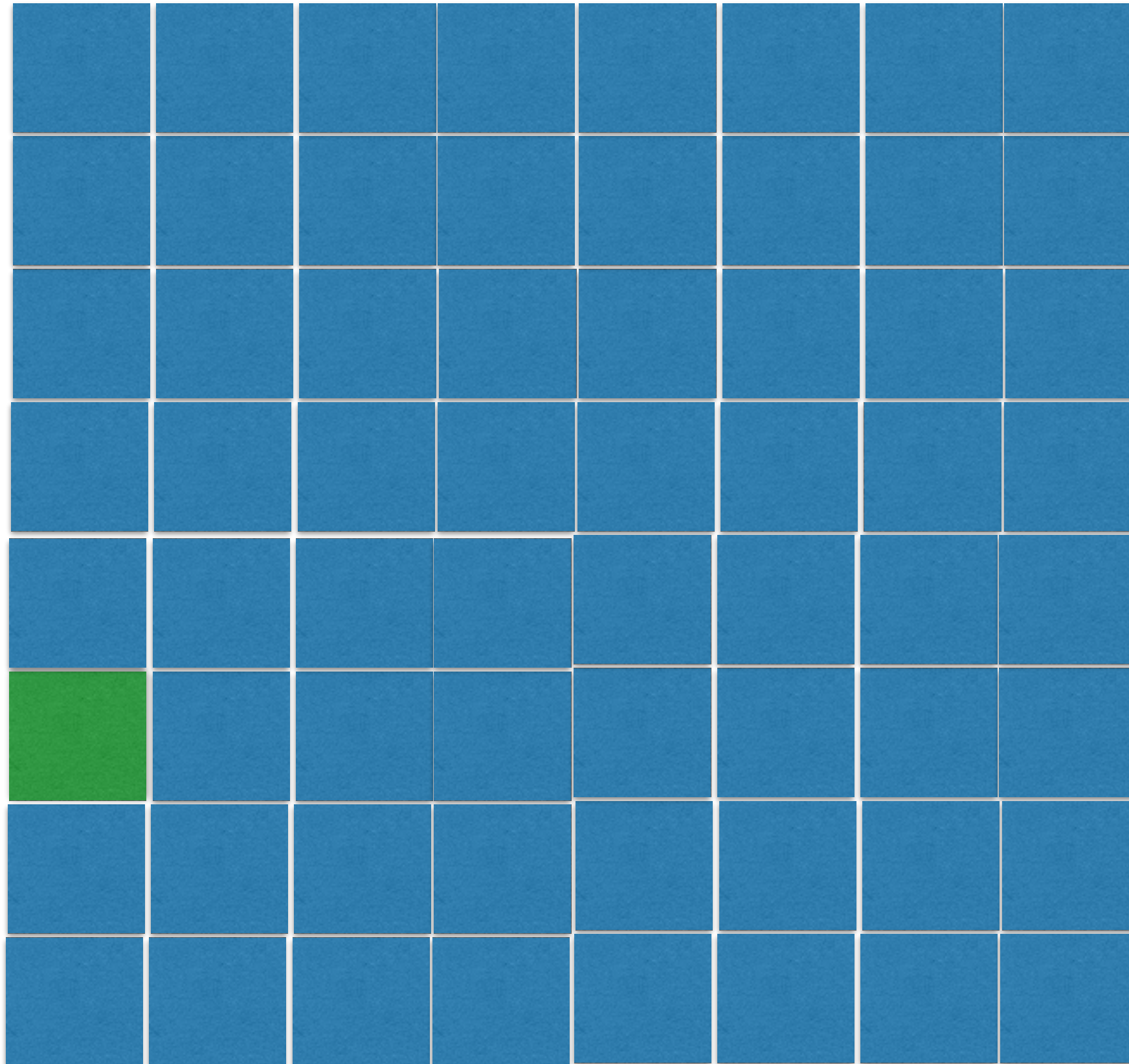


Practice Question 5

Add new L tile



Practice Question 5

return

**The position of new tile
with respect to the missing
square is important**

$$T(n) = 4 T(n/4) + O(1)$$

Other Materials

Example: Merge Sort

Merge(x):

if **len(x) = 1**:

 return x

 y1 = **Merge**(x[1..n/2])

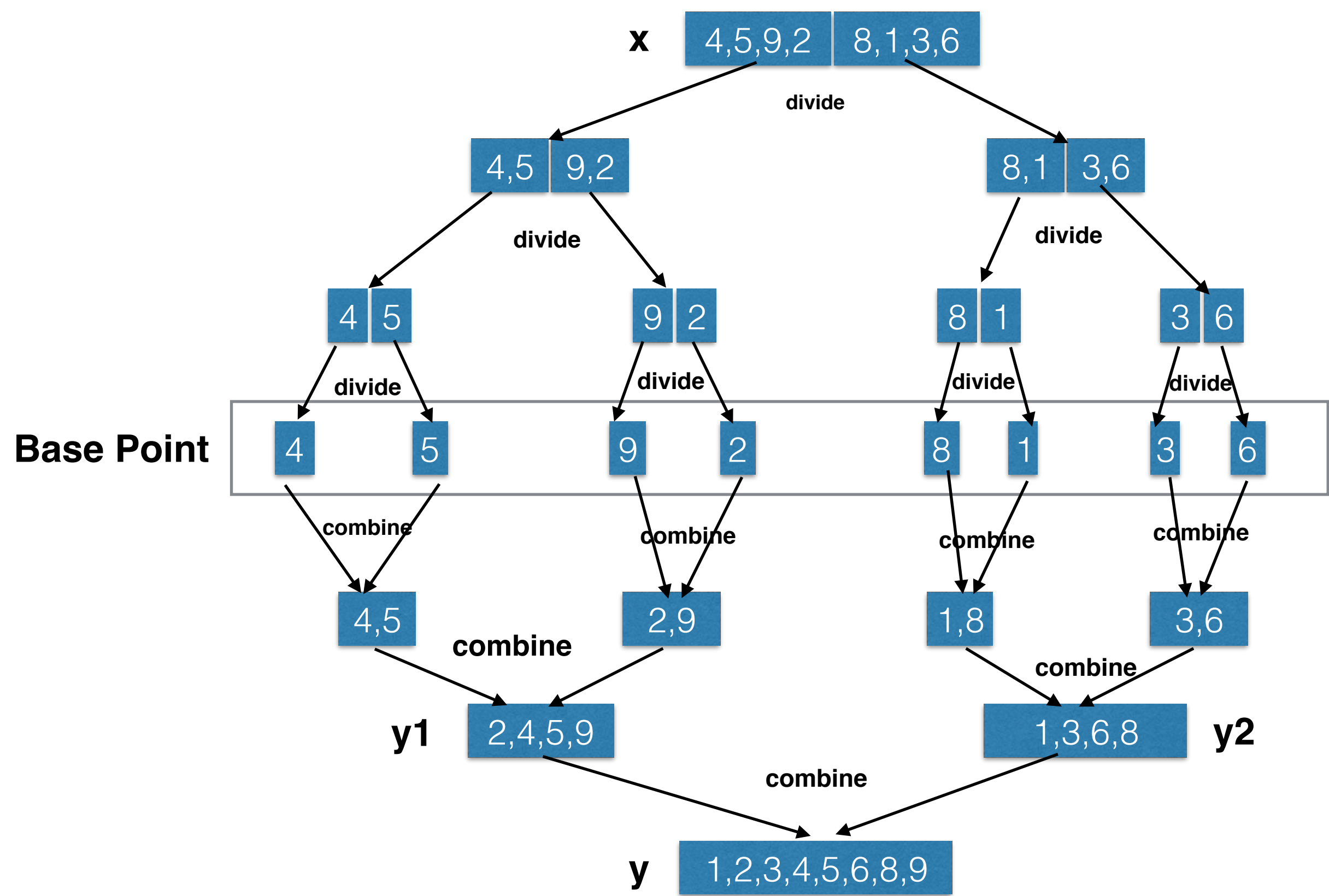
 y2 = **Merge**(x[n/2+1,...n])

 y = **Combine**(y1, y2)

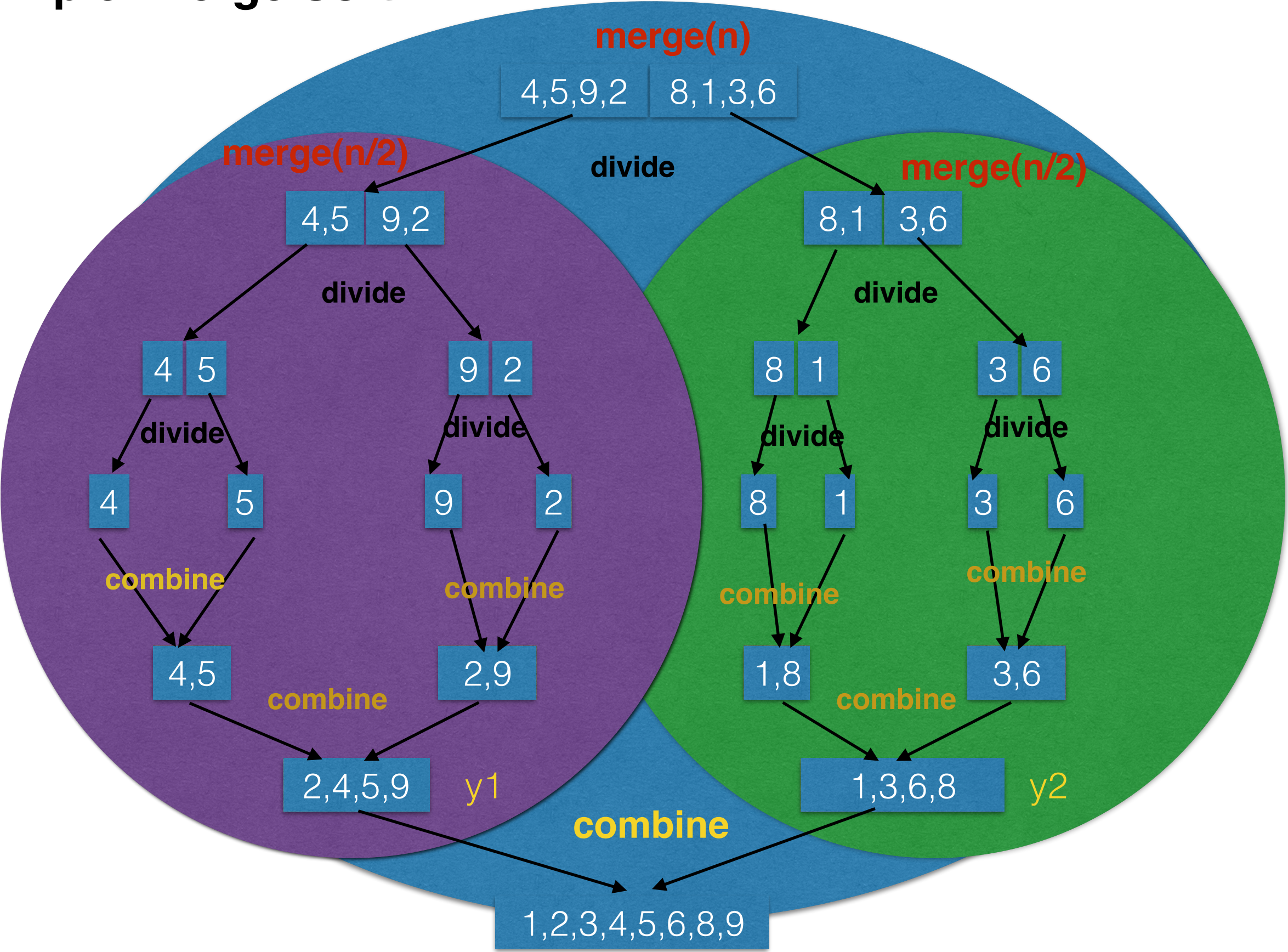
 return y

$$T(n) = 2 T(n/2) + O(n)$$

Example: Merge Sort



Example: Merge Sort



Merge Sort: Time Complexity:

$$T(n) = T(n/2) + T(n/2) + T(\text{combine}_n)$$

=

$$T(n/4) + T(n/4) + T(\text{combine}_{n/2})$$

+

$$T(n/4) + T(n/4) + T(\text{combine}_{n/2})$$

+

$$T(\text{combine}_n)$$

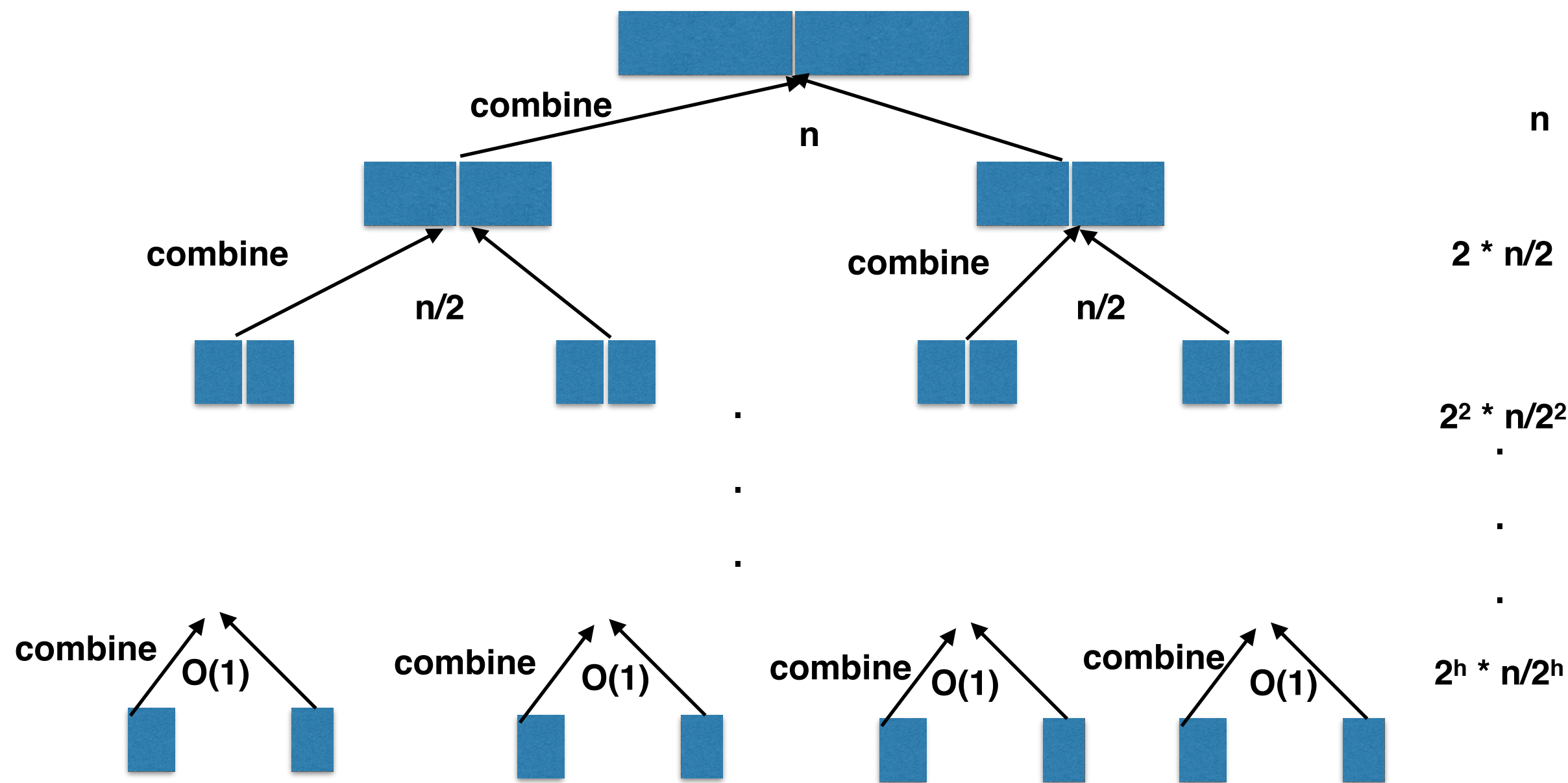
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$$= \text{Sum}(T(\text{internal combines}))$$

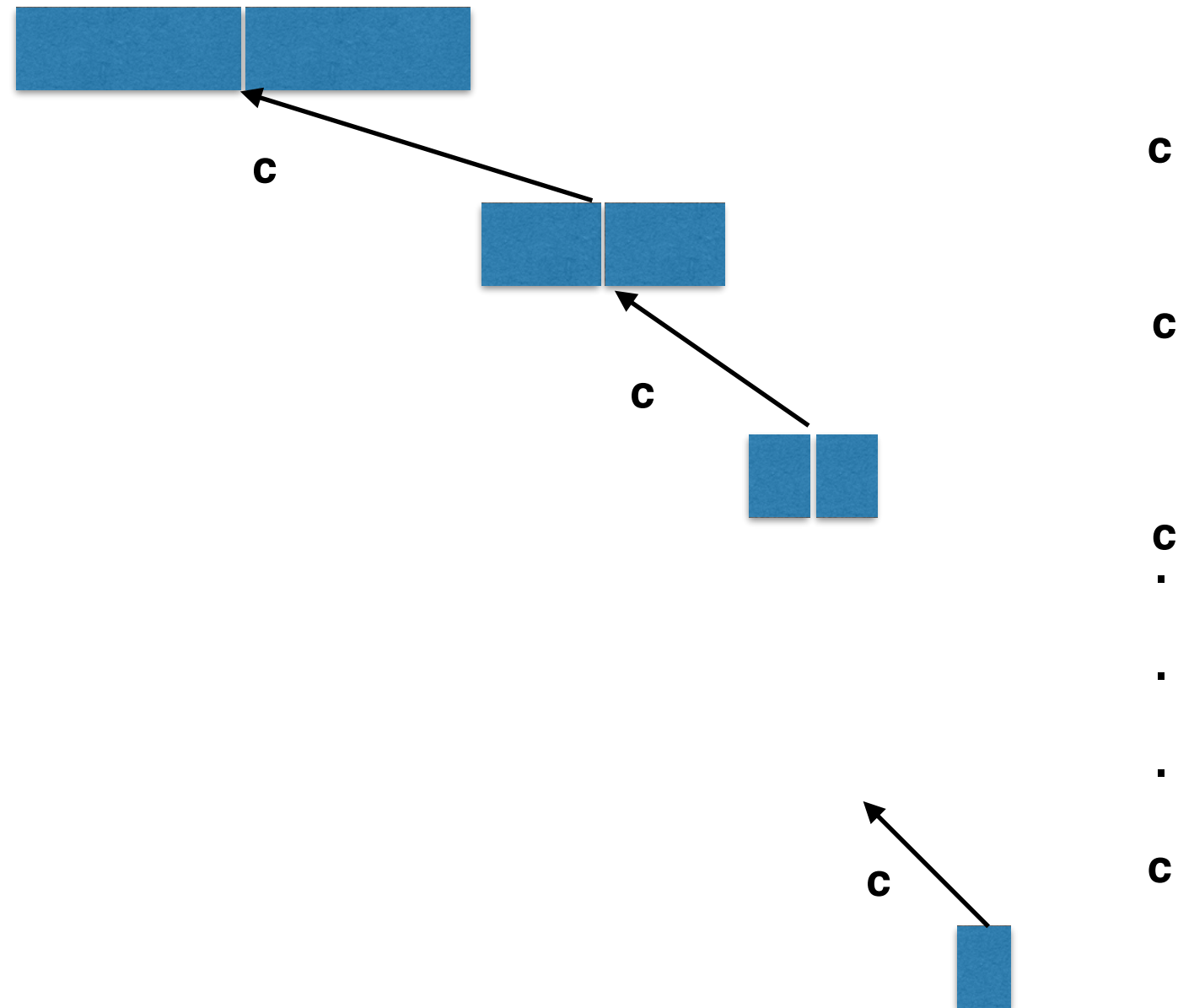
$$T(n) = 2 T(n/2) + O(n)$$



$$n/2^h = 1 \text{ therefore } h = \log_2 n$$

$$\text{sum(internal combines)} = n + 2 \ n/2 + 2^2 \ n/2^2 + \dots \ 2^h \ n/2^h = n \ h = n \log n$$

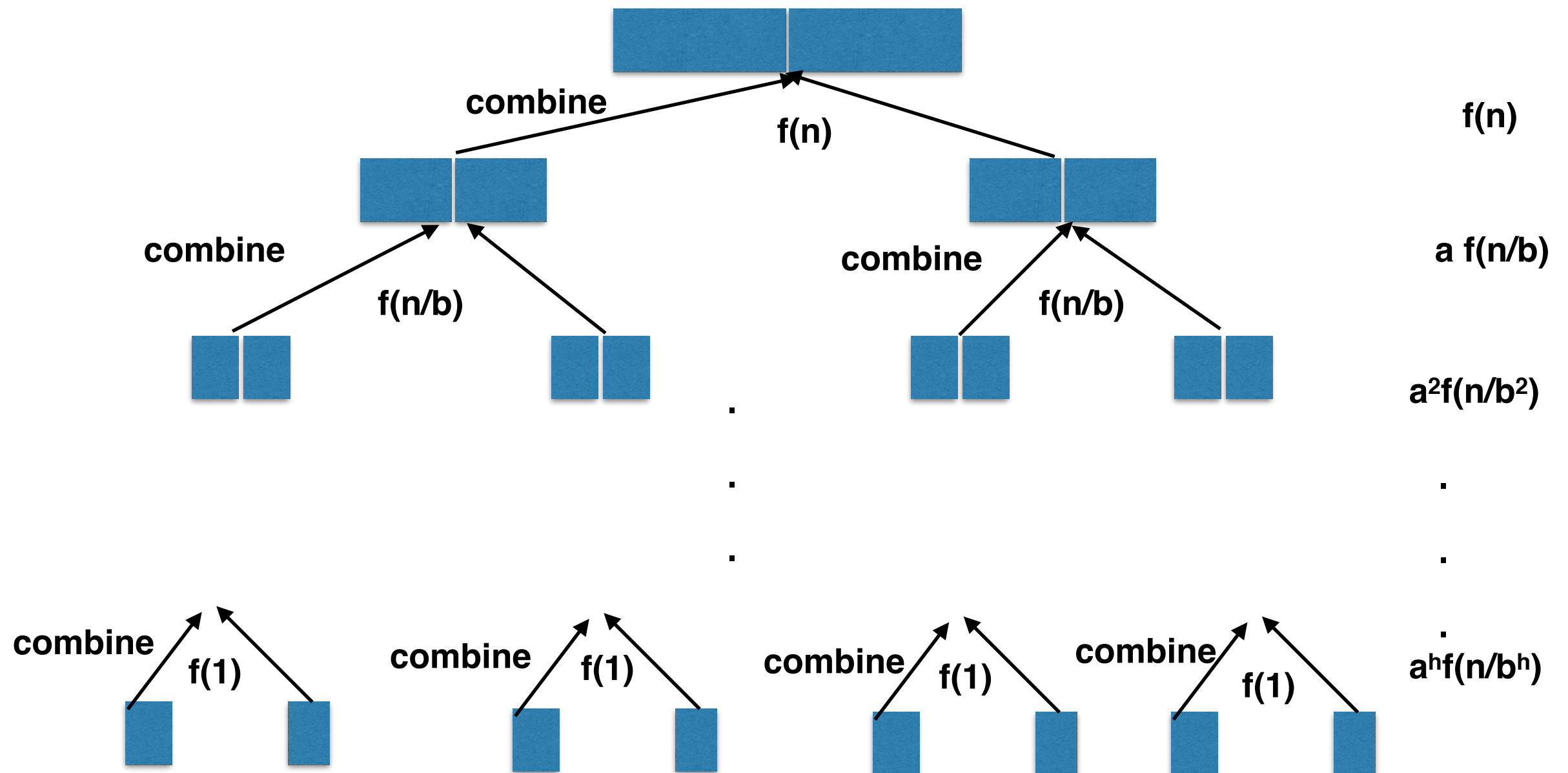
$$T(n) = T(n/2) + c$$



$$n/2^h = 1 \text{ therefore } h = \log_2 n$$

$$\text{sum(internal combines)} = c + c + c + \dots c = c h = c \log n$$

$$T(n) = aT(n/b) + f(n)$$



$$\begin{aligned} \text{sum(internal combines)} &= \\ &f(n) + af(n/b) + a^2f(n/b^2) + \dots a^hf(n/b^h) = \\ &f(n) + af(n/b) + a^2f(n/b^2) + \dots a^{\log_b n} f(n / b^{\log_b n}) \end{aligned}$$

$$T(n) = aT(n/b) + f(n)$$

$$T(n) =$$

$$f(n) + af(n/b) + a^2f(n/b^2) + \dots a^{\log_b n} f(n / b^{\log_b n}) =$$

$$f(n) + af(n/b) + a^2f(n/b^2) + \dots n^{\log_b a} f(n / n^{\log_b b}) =$$

$$f(n) + af(n/b) + a^2f(n/b^2) + \dots n^{\log_b a}$$



$$T(n) = f(n) + af(n/b) + a^2f(n/b^2) + \dots n^{\log_b a}$$

Master Theorem

1. **Root Dominant:** $f(n)$ is dominant then $T(n) = f(n)$
2. **Leave Dominant:** Term $n^{\log_b a}$ is the dominant therefore $T(n) = n^{\log_b a}$
3. **Even Terms:** $f(n) = \theta(n^{\log_b a})$ therefore
 $T(n) = \text{number of terms} * f(n) = \log_b n * f(n)$

$$T(n) = a T(n/b) + c n^d$$

1. **root term** = $f(n) = c n^d$

2. **leave term** = $n^{\log_b a}$

3. **number of terms** = $\log_b n$



Master Theorem

1. **Root Dominant:** $O(c n^d)$ if leave = $O(\text{root})$ which is $d > \log_b a$
2. **Leave Dominant:** $O(n^{\log_b a})$ if root = $O(\text{leave})$ which is $d < \log_b a$
3. **Even Terms:** if $d = \log_b a$ therefore
 $T(n) = \text{number of terms} * f(n) = \log_b n * f(n)$