

CZ 2001 Algorithm Lab Project 1



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Loe Kit Leong Daniel

Brute Force Algorithm Analysis





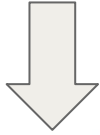
How Brute Force Work

1. Searches from start of string to end
2. Once it matches, goes into inner loop to match substring
3. If mismatch, exits inner loop and continue search from $i + 1$
4. Algorithm continues until it finds a match



How Brute Force Work (Diagram)

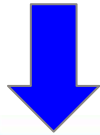
(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

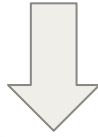
D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

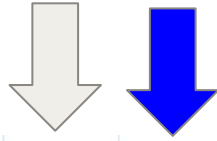
D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

(i)



String

A D D E B D E C D E F G H

(j)



Sub String

D E F

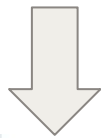
```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

    for j in range (1, substring_length):
        if substring[j] != string[index_counter]:
            break
        index_counter += 1
```



How Brute Force Work (Diagram)

(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

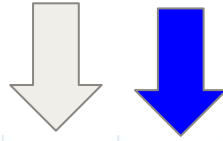
D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

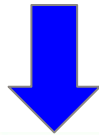
(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

D	E	F
---	---	---

```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

for j in range (1, substring_length):
    if substring[j] != string[index_counter]:
        break
    index_counter += 1
```




How Brute Force Work (Diagram)

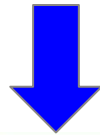
(i)



String

A D D E B D E C D E F G H

(j)



Sub String

D E F

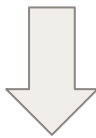
```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

for j in range (1, substring_length):
    if substring[j] != string[index_counter]:
        break
    index_counter += 1
```



How Brute Force Work (Diagram)

(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

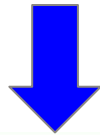
(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

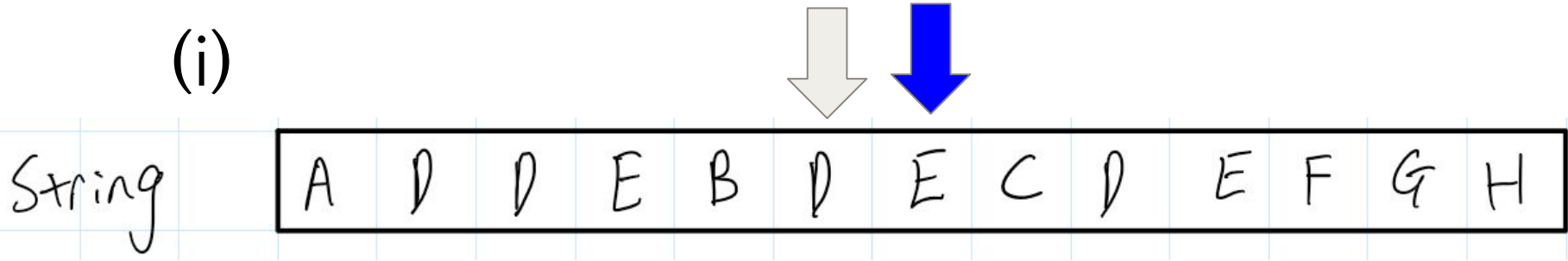
D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

(i)



(j)



Sub String



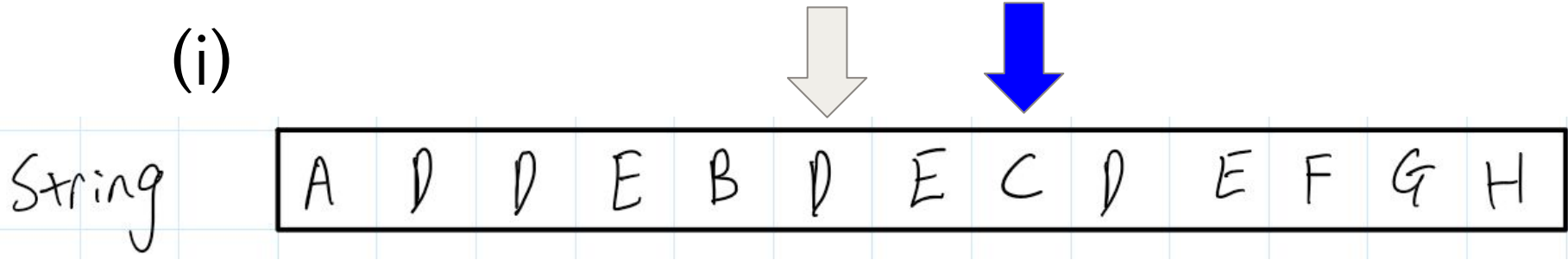
```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

for j in range (1, substring_length):
    if substring[j] != string[index_counter]:
        break
    index_counter += 1
```

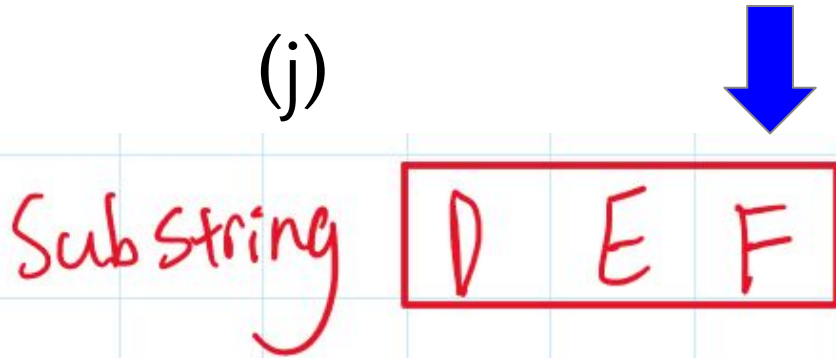


How Brute Force Work (Diagram)

(i)



(j)



```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

for j in range (1, substring_length):
    if substring[j] != string[index_counter]:
        break
    index_counter += 1
```



How Brute Force Work (Diagram)

(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

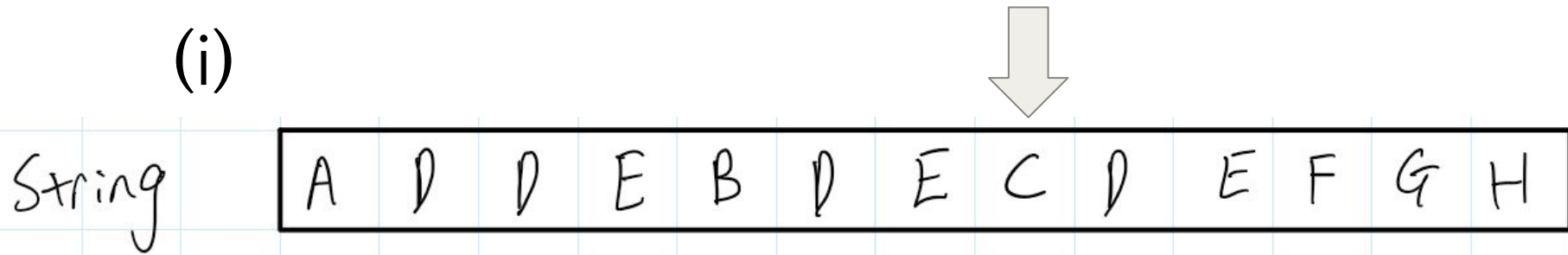
D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

(i)



(j)



Sub string



```
for i in range (len(string)):  
    if string[i] == substring[0]:
```




How Brute Force Work (Diagram)

(i)



String

A	D	D	E	B	D	E	C	D	E	F	G	H
---	---	---	---	---	---	---	---	---	---	---	---	---

(j)



Sub String

D	E	F
---	---	---

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```

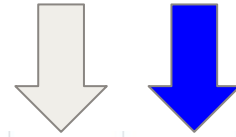


How Brute Force Work (Diagram)

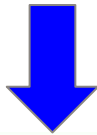
(i)

String

A D D E B D E C D E F G H



(j)



Sub String

D E F

```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

for j in range (1, substring_length):
    if substring[j] != string[index_counter]:
        break
    index_counter += 1
```



How Brute Force Work (Diagram)

Match Found,
return index (i)

(i)

String

A D D E B D E C D E F G H



(j)

Sub String

D E F



```
for i in range (len(string)):
    if string[i] == substring[0]:
        index_counter = i+1

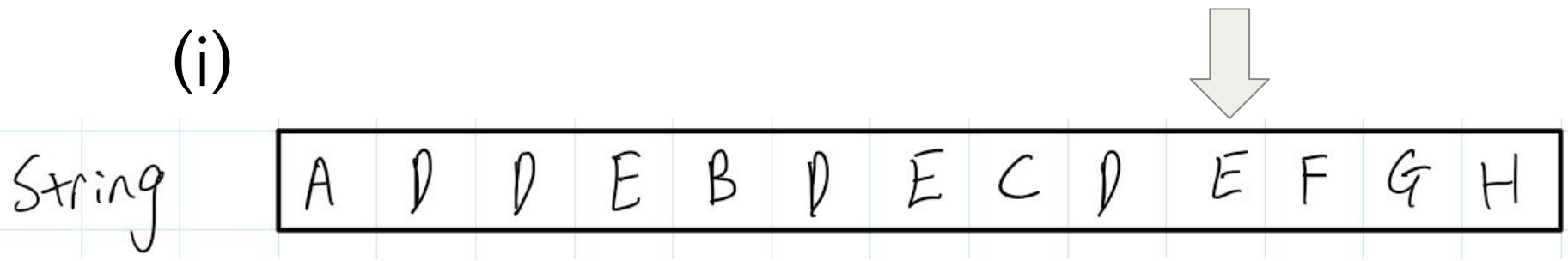
    for j in range (1, substring_length):
        if substring[j] != string[index_counter]:
            break
        index_counter += 1

    if j == substring_length-1:
        substring_index.append(i+1)
```

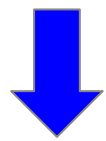


How Brute Force Work (Diagram)

(i)



(j)



Sub string



```
for i in range (len(string)):  
    if string[i] == substring[0]:
```

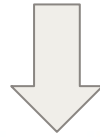


How Brute Force Work (Diagram)

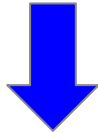
(i)

String

A D D E B D E C D E F G H



(j)



Sub String

D E F

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```

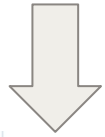


How Brute Force Work (Diagram)

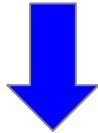
(i)

String

A D D E B D E C D E F G H



(j)



Sub String

D E F

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



How Brute Force Work (Diagram)

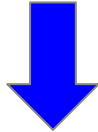
(i)

String

A D D E B D E C D E F G H



(j)



Sub string

D E F

```
for i in range (len(string)):  
    if string[i] == substring[0]:
```



Brute Force Time Complexity

If String = n elements

Substring = m elements

It will compare all elements in String with Substring hence

Best Case: $O(n)$

Worst Case: $O(n*m)$

Brute Force Time Complexity (Best Case)

```
def brute_force(substring, string):
    substring_index = []
    string_length = len(string)
    substring_length = len(substring)

    for i in range(string_length):
        substring_occurrence_complete = True
        if substring[0] == string[i]:

            for j in range(0, substring_length):
                if i+j >= string_length:
                    substring_occurrence_complete = False
                elif substring[j] != string[i+j]:
                    substring_occurrence_complete = False
                    break
            if substring_occurrence_complete:
                substring_index.append(i+1)

    return substring_index
```

#1 → C
#2 → C
#3 → C
#4 → n
#5 → n
#6 → n
#7 → nm
#8 → nm
#9 → nm
#10 → nm
#11 → nm
#12 → n
#13 → n

Best case

Every character in String does not match
with first character of sub-string.

Codes from #7 to #13 will not run

$$\begin{aligned}\text{Time complexity} &= 3C + 3n \\ &= O(n)\end{aligned}$$



Brute Force Time Complexity (Worst Case)

```
def brute_force(substring, string):  
    substring_index = []  
    string_length = len(string)  
    substring_length = len(substring)
```

#1 → C
#2 → C
#3 → C

```
    for i in range(string_length):  
        substring_occurrence_complete = True  
        if substring[0] == string[i]:
```

#4 → n
#5 → n
#6 → n

```
            for j in range(0, substring_length):  
                if i+j >= string_length:  
                    substring_occurrence_complete = False  
                elif substring[j] != string[i+j]:  
                    substring_occurrence_complete = False  
                    break
```

#7 → nm
#8 → nm
#9 → nm
#10 → nm
#11 → nm

```
            if substring_occurrence_complete:  
                substring_index.append(i+1)
```

#12 → n
#13 → n

```
    return substring_index
```

Worst Case

$$\begin{aligned}\text{Time Complexity} &= 3C + n + n + n + (nm) + (nm) + (nm) + (nm) + n + n \\ &= 3C + 5n + \underline{\underline{5nm}} \\ &= O(nm)\end{aligned}$$

Knuth–Morris–Pratt (KMP) Algorithm





How KMP Works

1. Uses the idea of prefix and suffix to skip unnecessary checks (LPS Table)
2. Still searches from start of string to end
3. When it encounters a mismatch, it will search the matched substring for a common prefix and suffix
4. Uses the prefix and suffix to skip checks



KMP Largest Prefix Suffix (LPS) Table

	i	j							
	↓	↓							
SubString	A	T	Y	R	B	A	T	Y	Z
	0	0							



KMP Largest Prefix Suffix (LPS) Table

			i		j					
			↓		↓					
SubString			A	T	Y	R	B	A	T	Y Z
			0	0	0					



KMP Largest Prefix Suffix (LPS) Table

			i		j						
			↓		↓						
SubString			A	T	Y	R	B	A	T	Y	Z
			0	0	0	0					



KMP Largest Prefix Suffix (LPS) Table

	i				j				
	↓				↓				
SubString	A	T	Y	R	B	A	T	Y	Z
	0	0	0	0	0				



KMP Largest Prefix Suffix (LPS) Table

			i				j			
			↓				↓			
SubString			A	T	Y	R	B	A	T	Y Z
			0	0	0	0	0	1		



KMP Largest Prefix Suffix (LPS) Table

			i				j		
			↓				↓		
SubString	A	T	Y	R	B	A	T	Y	Z
	0	0	0	0	0	1	2		



KMP Largest Prefix Suffix (LPS) Table

				i				j	
				↓				↓	
SubString	A	T	Y	R	B	A	T	Y	Z
	0	0	0	0	0	1	2	3	



KMP Largest Prefix Suffix (LPS) Table

				i				j	
				↓				↓	
SubString	A	T	Y	R	B	A	T	Y	Z
	0	0	0	0	0	1	2	3	0

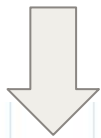


KMP Largest Prefix Suffix (LPS) Table

SubString	A	T	Y	R	B	A	T	Y	Z
	0	0	0	0	0	1	2	3	0

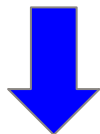


How KMP Works (Diagram)



String

B	A	T	Y	R	B	A	T	E	A	T	Y	R	B	A	T	Y	⌕
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

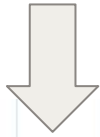


Substring

A	T	Y	R	B	A	T	Y	⌕
---	---	---	---	---	---	---	---	---

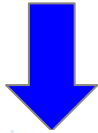
0	0	0	0	0	1	2	3	0
---	---	---	---	---	---	---	---	---

● How KMP Works (Diagram)



String

B	A	T	Y	R	B	A	T	E	A	T	Y	R	B	A	T	Y	⌵
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---



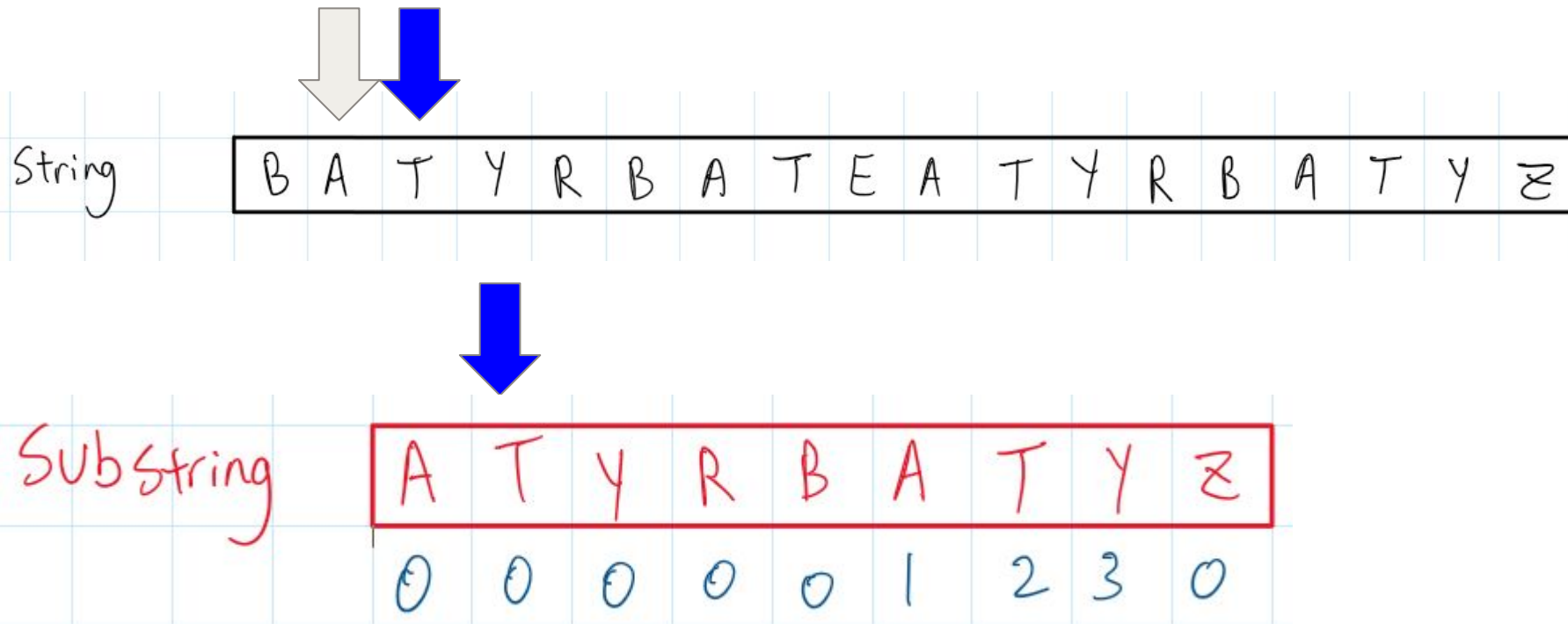
Substring

A	T	Y	R	B	A	T	Y	⌵
---	---	---	---	---	---	---	---	---

0	0	0	0	0	1	2	3	0
---	---	---	---	---	---	---	---	---

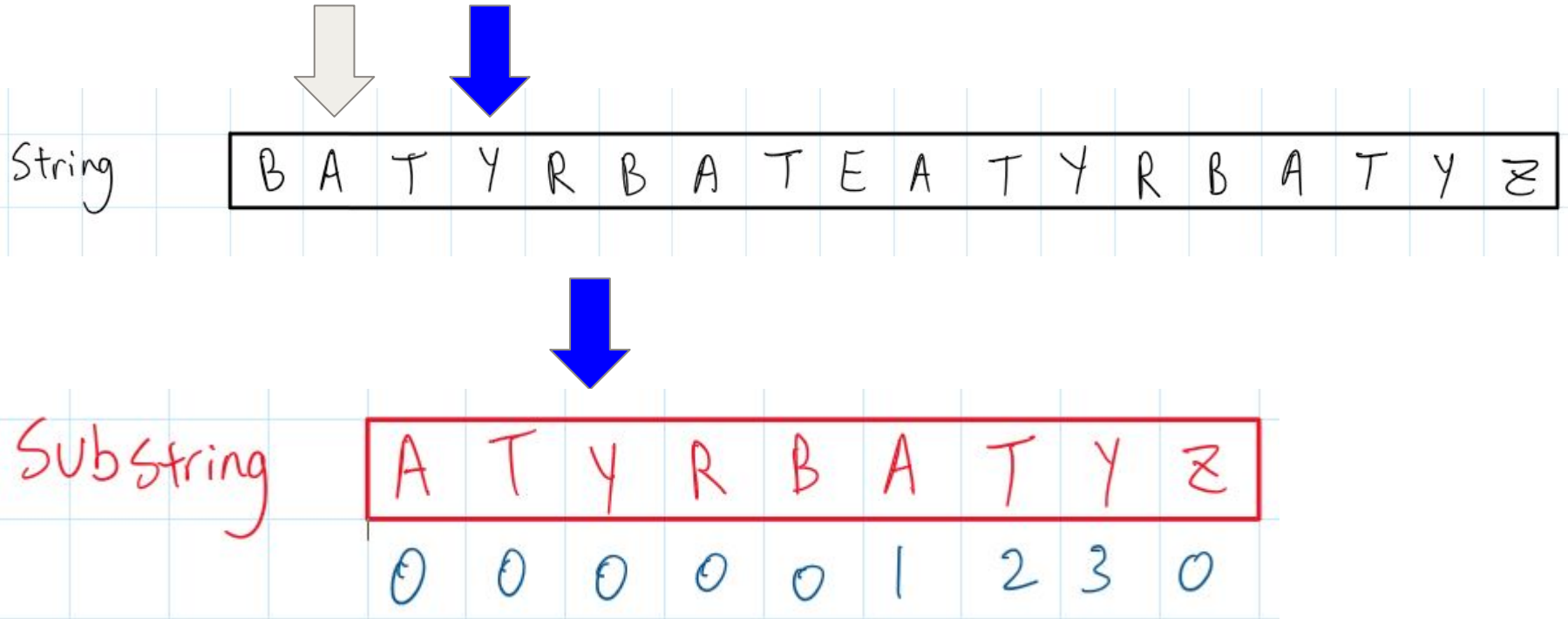


How KMP Works (Diagram)



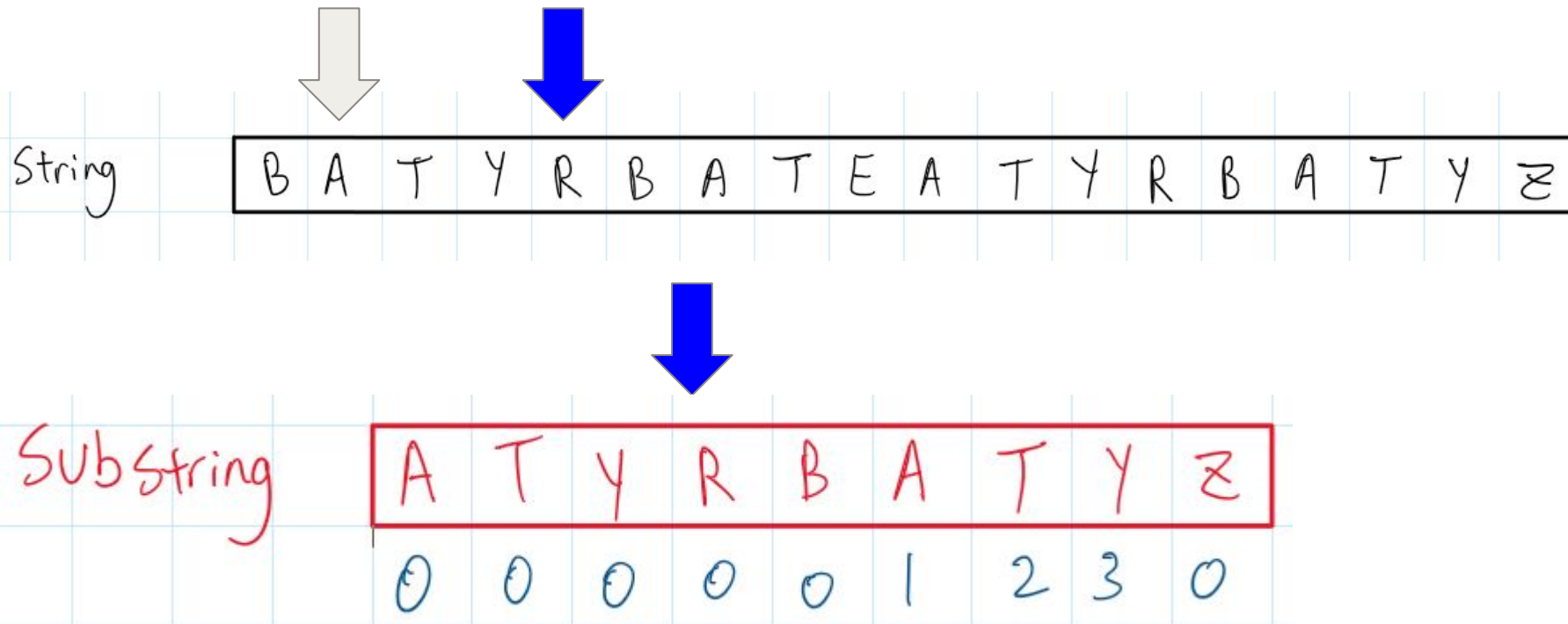


How KMP Works (Diagram)



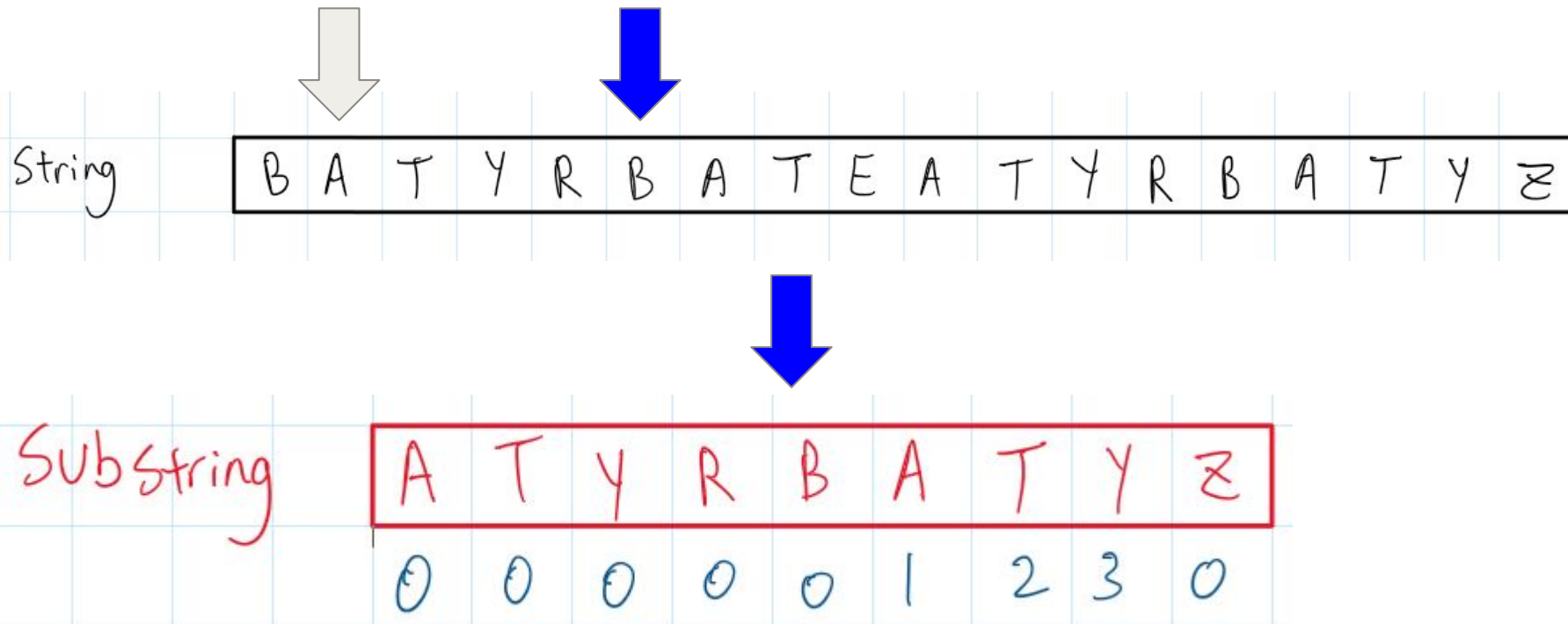


How KMP Works (Diagram)



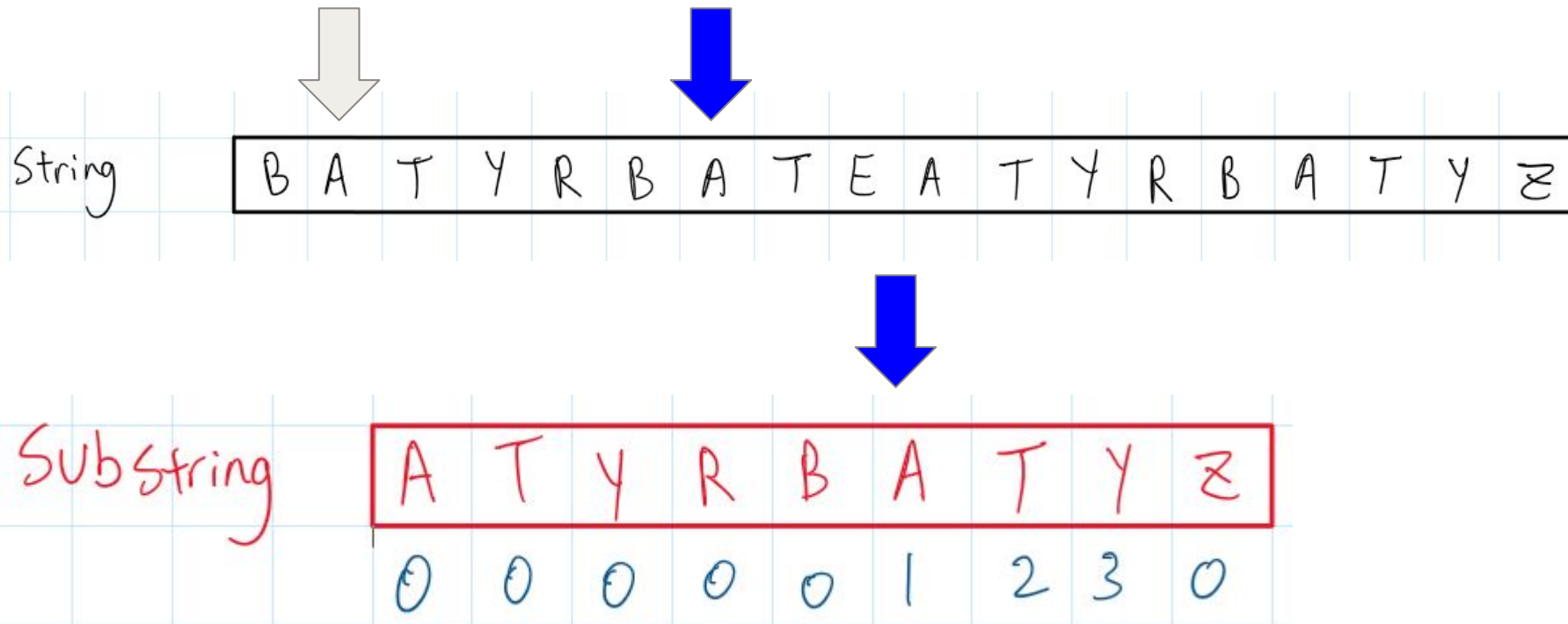


How KMP Works (Diagram)

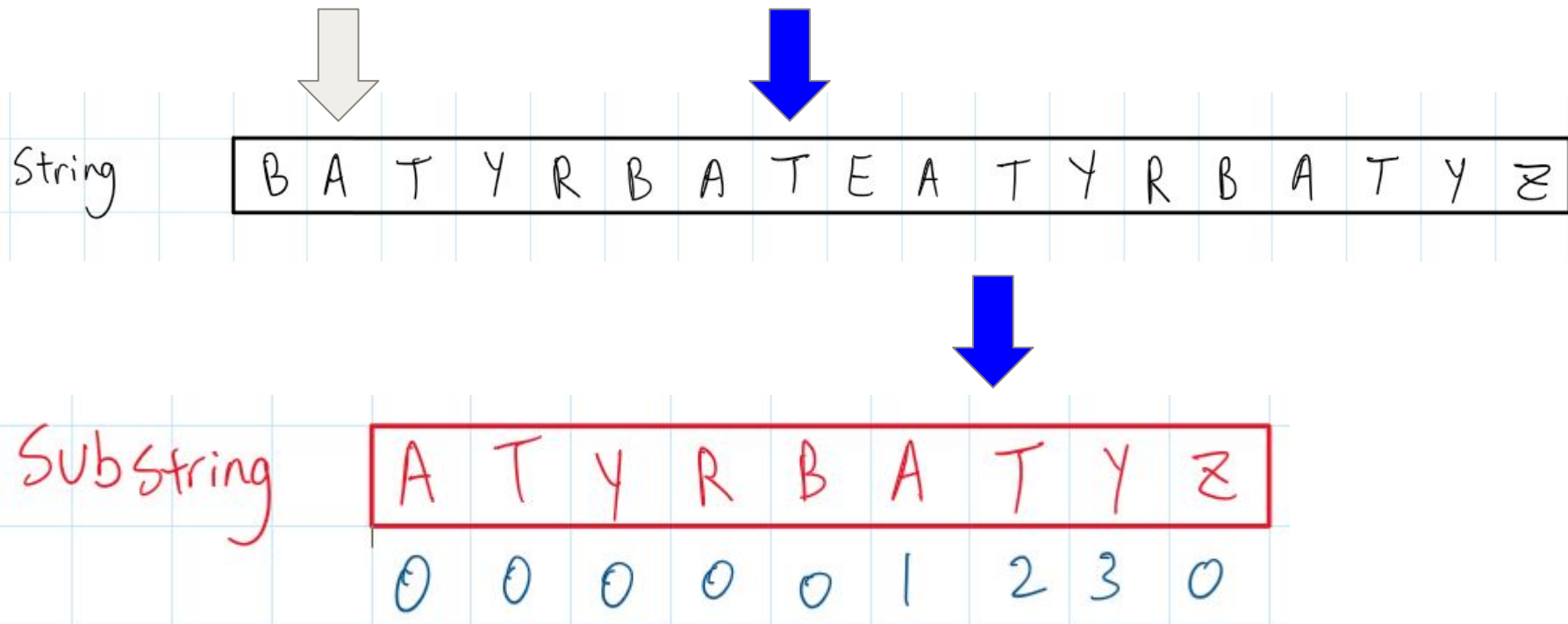




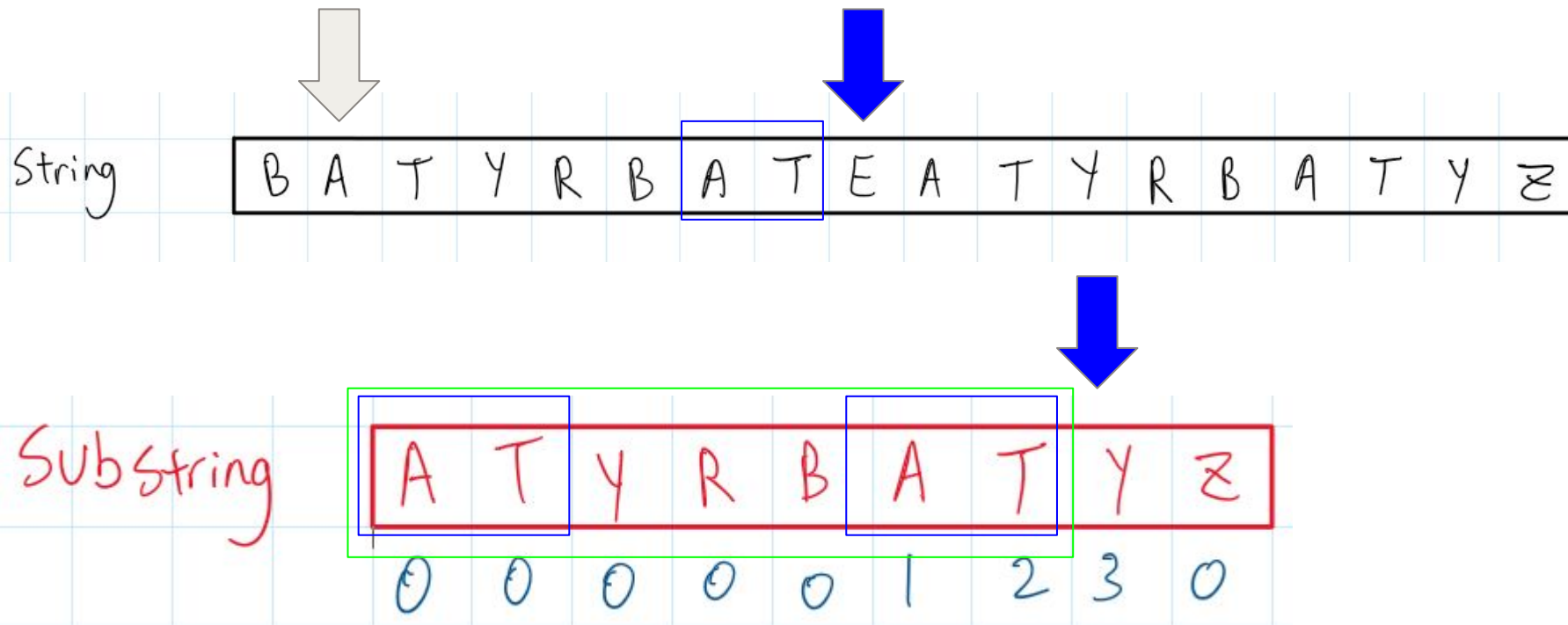
How KMP Works (Diagram)



● How KMP Works (Diagram)



● How KMP Works (Diagram)



● How KMP Works (Diagram)

We have skipped the orange part

String

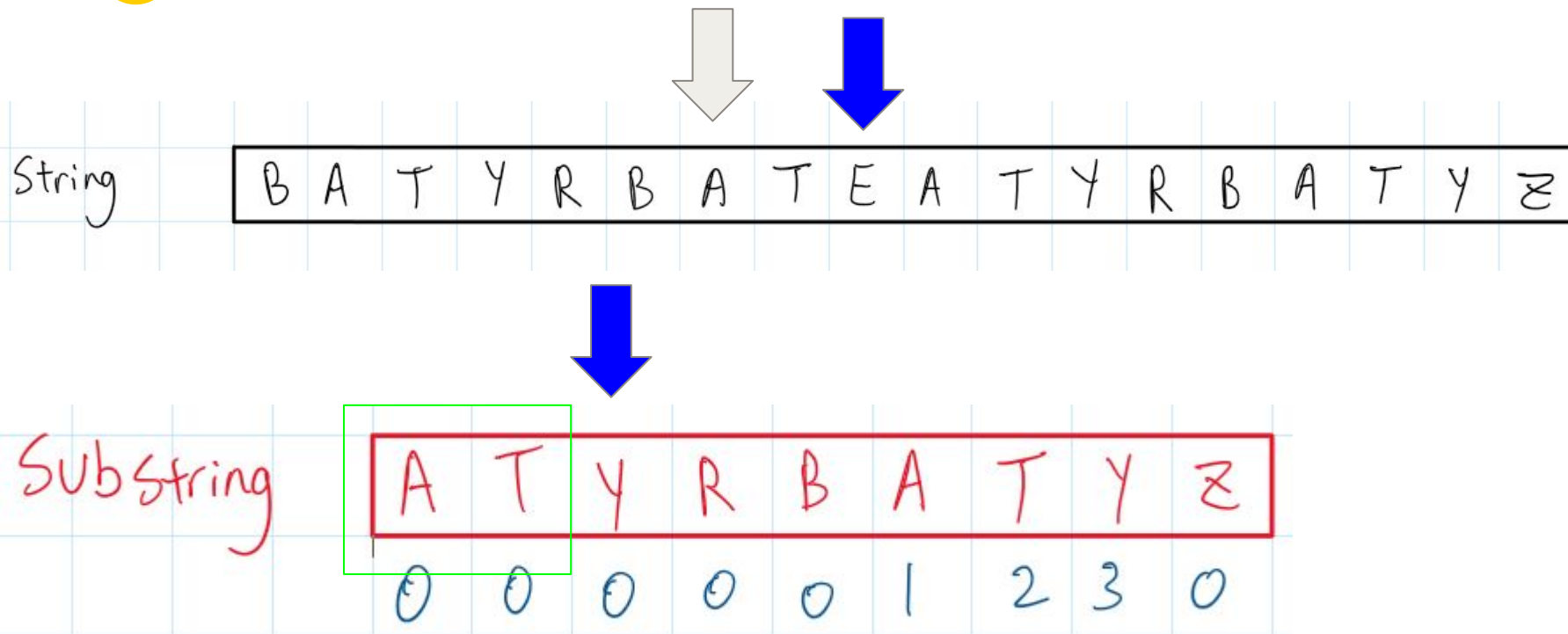
B	A	T	Y	R	B	A	T	E	A	T	Y	R	B	A	T	Y	⌵
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

Substring

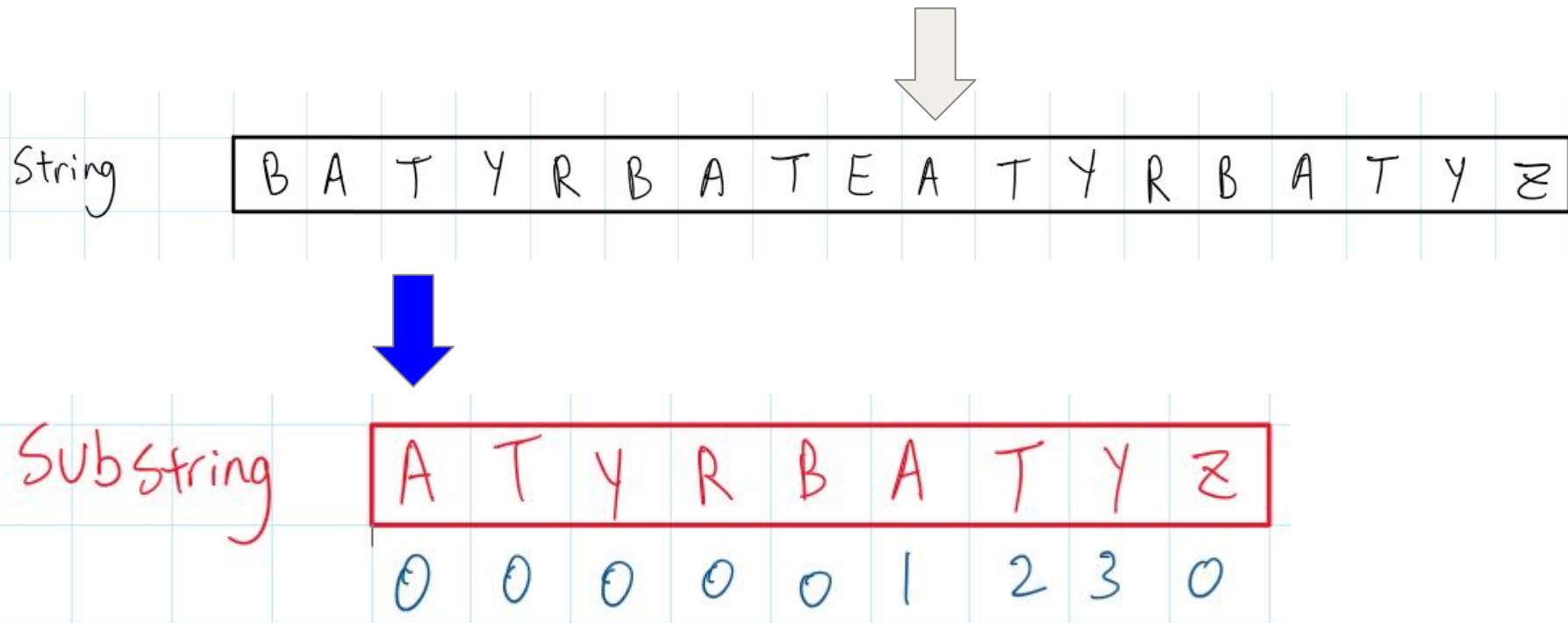
A	T	Y	R	B	A	T	Y	⌵
0	0	0	0	0	1	2	3	0



How KMP Works (Diagram)

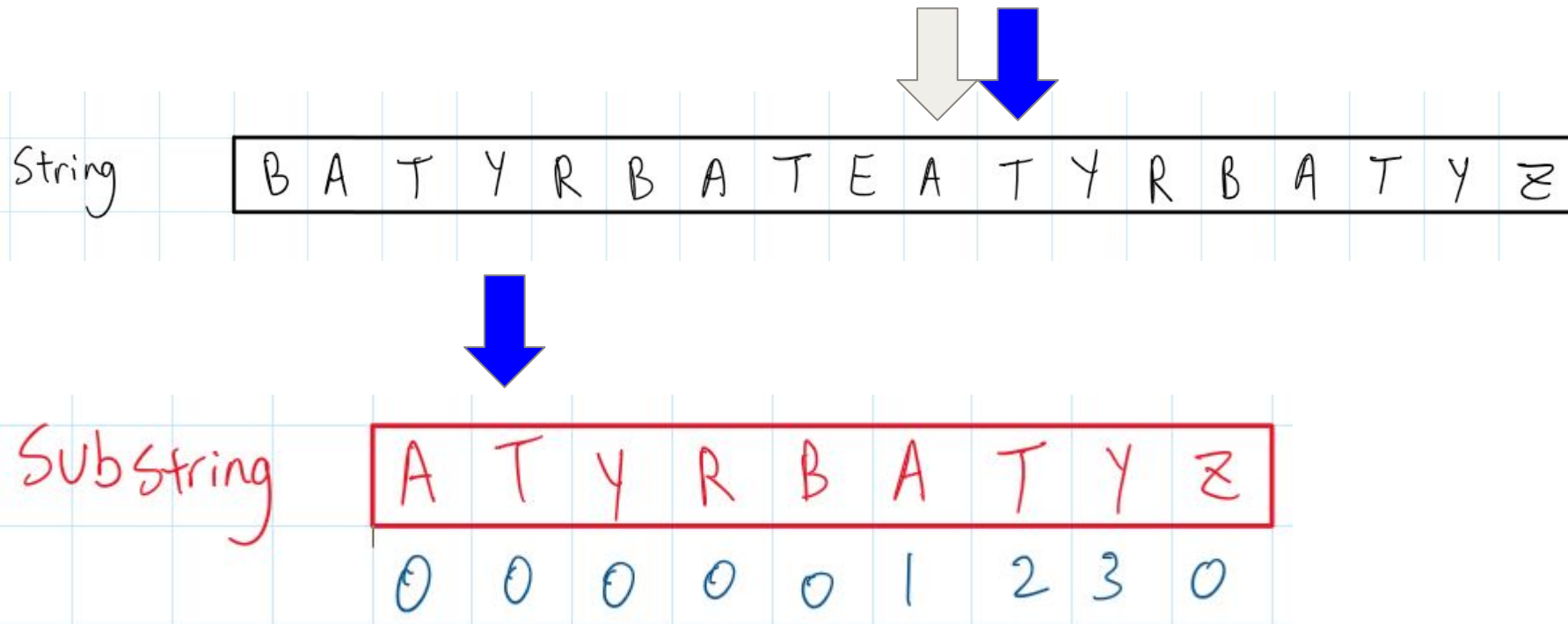


● How KMP Works (Diagram)

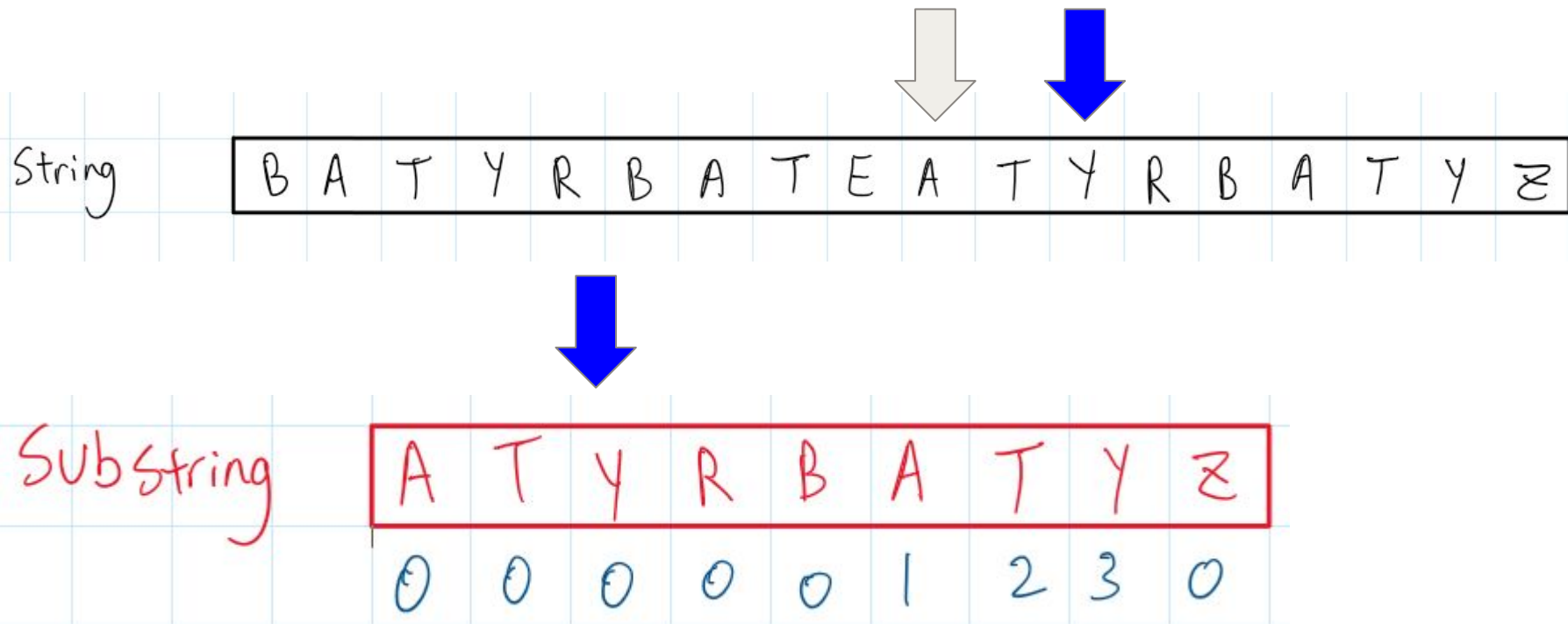




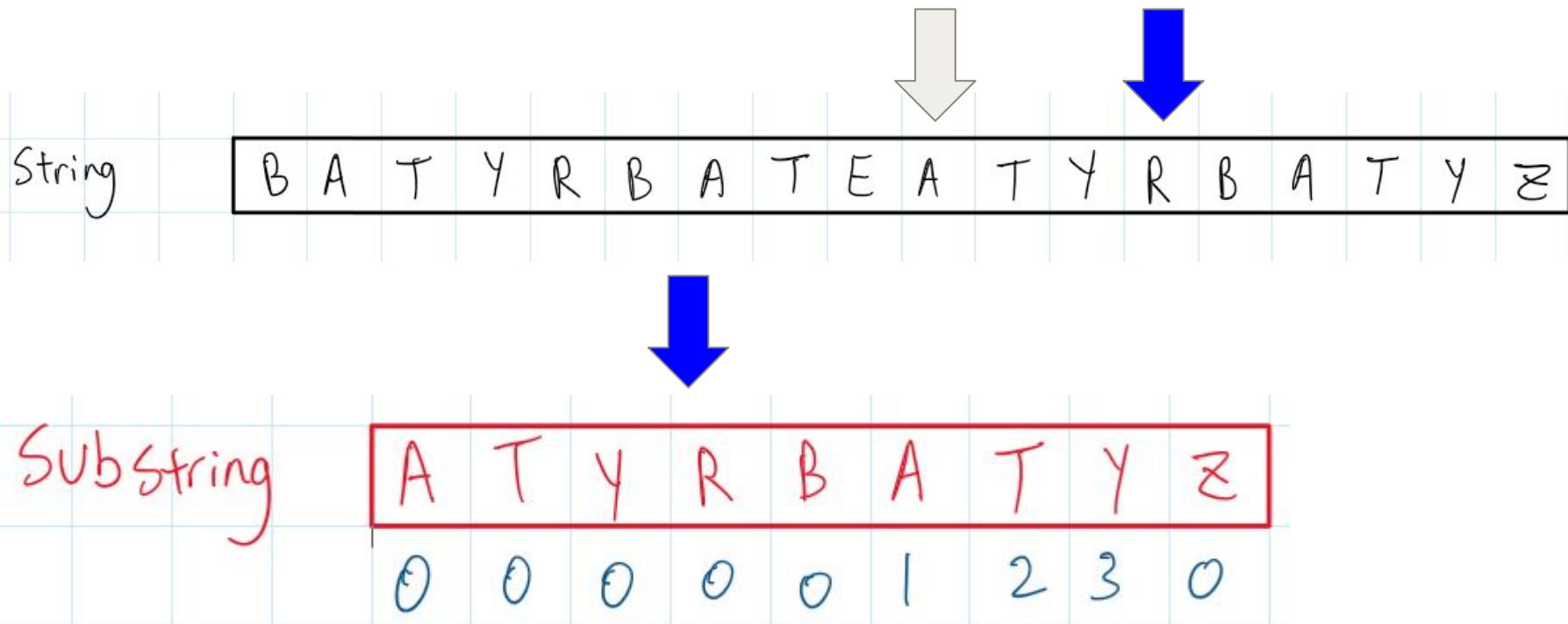
How KMP Works (Diagram)



● How KMP Works (Diagram)

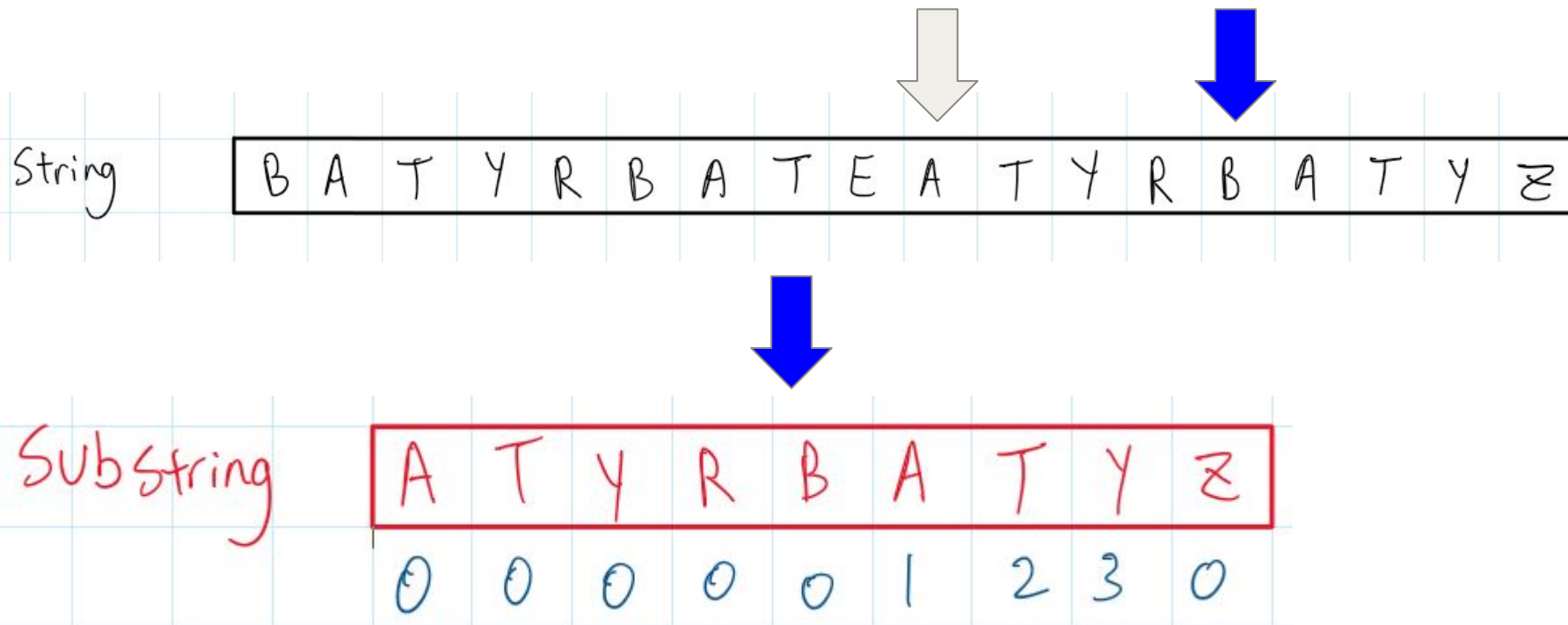


● How KMP Works (Diagram)



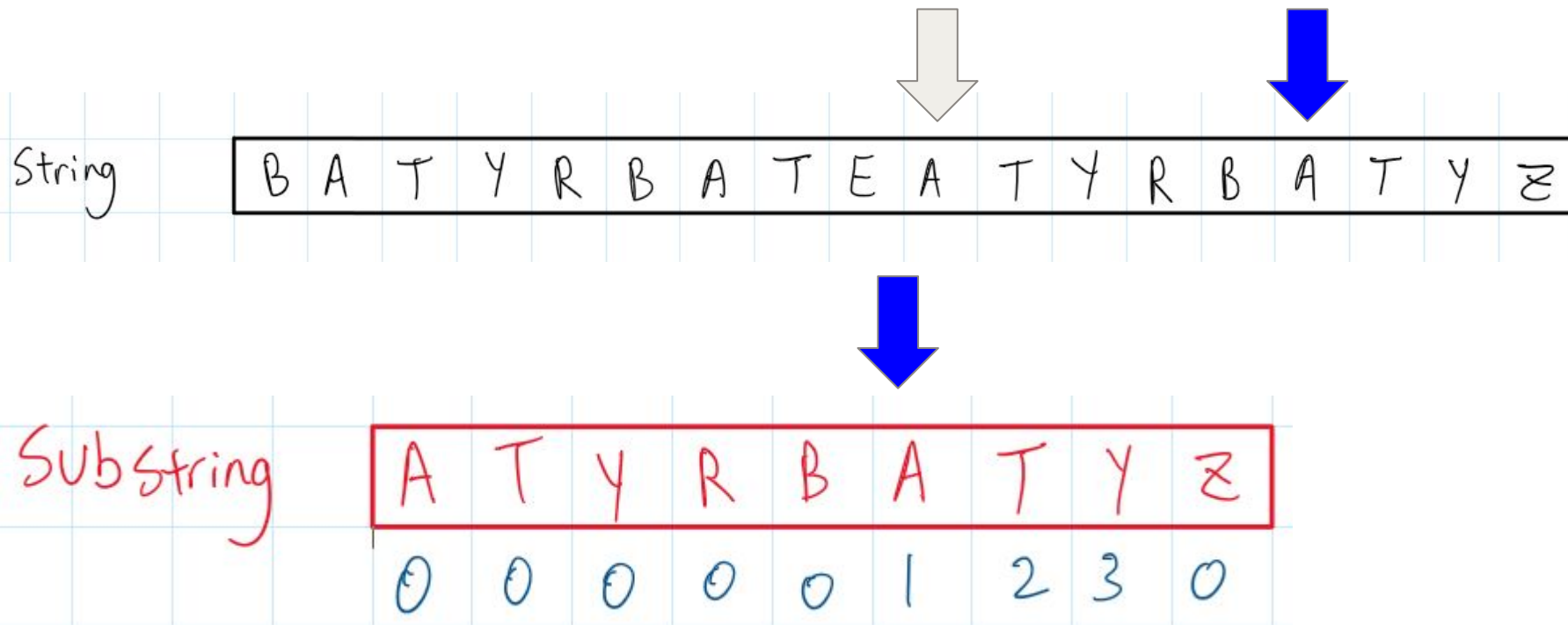


How KMP Works (Diagram)



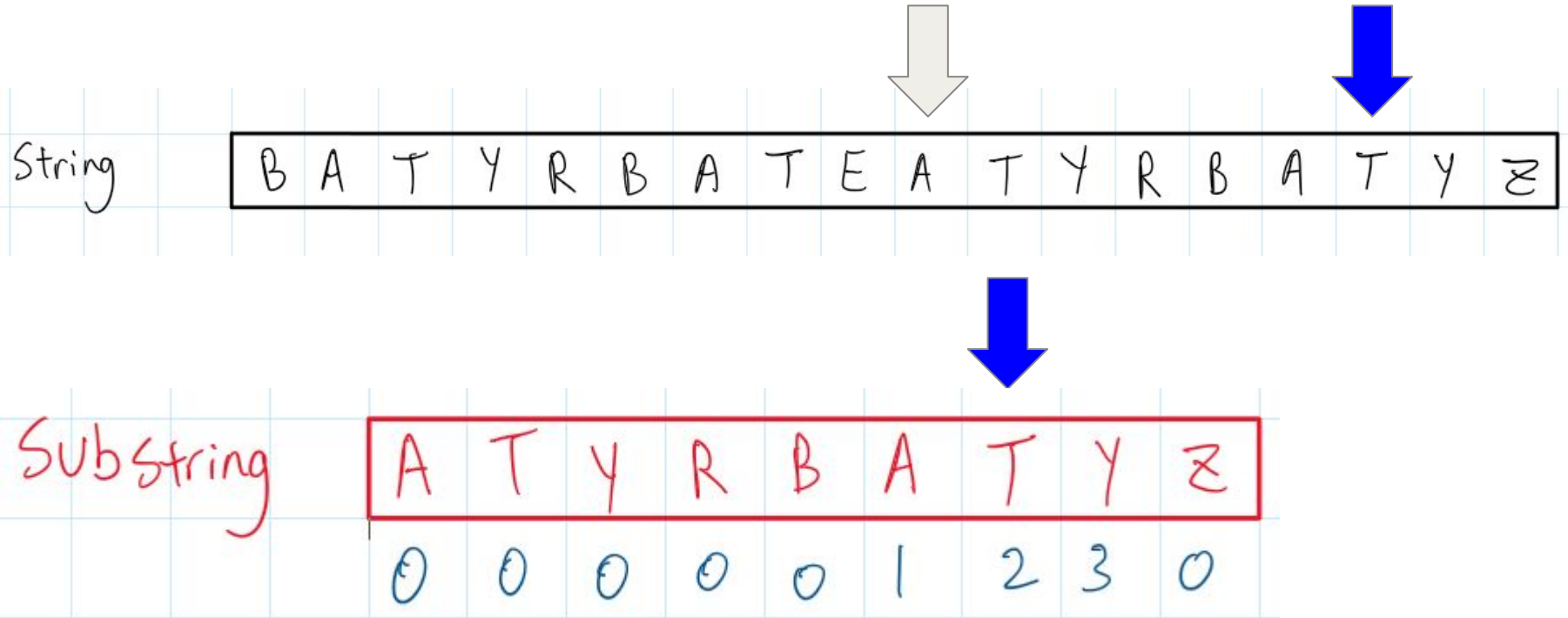


How KMP Works (Diagram)



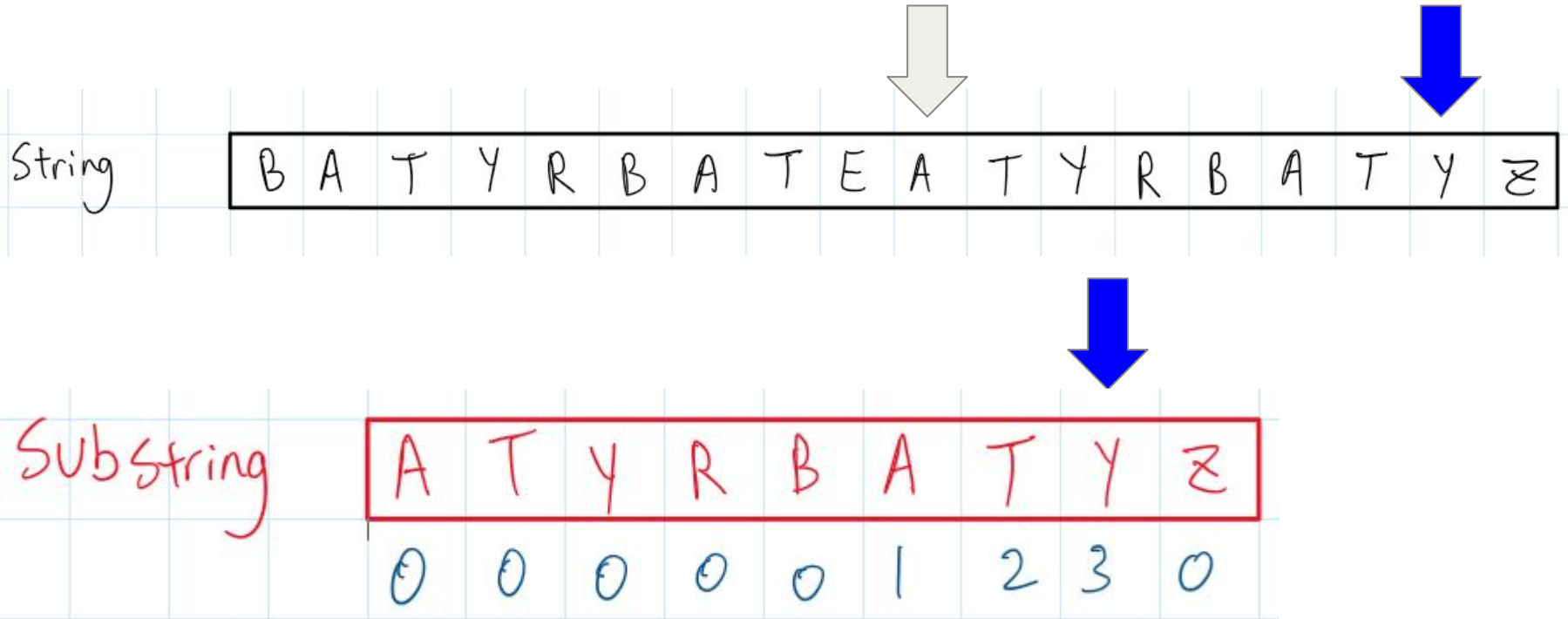


How KMP Works (Diagram)



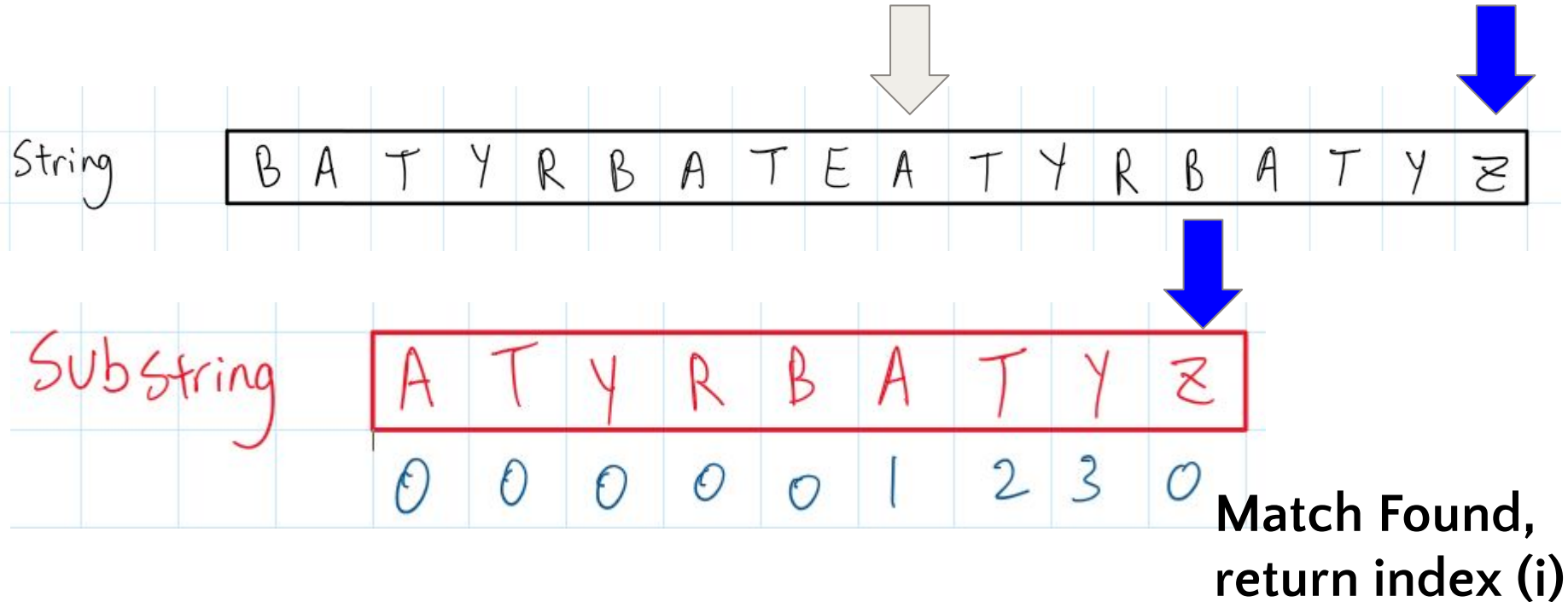


How KMP Works (Diagram)





How KMP Works (Diagram)





Analysis for KMP Time Complexity

If String = n elements

Substring = m elements

It will compare all elements in String with Substring hence

Best Case: $O(n)$

Worst Case: $O(n+m)$

KMP Preprocess (Generate LPS Table) Time Complexity

```
def KMP_Preprocess(substring, substring_len):
```

```
    latest_lpps_idx = 0
```

```
    lpps = [0]*substring_len
```

```
    i = 1
```

```
    while i < substring_len:
```

```
        if substring[i] == substring[latest_lpps_idx]:
```

```
            latest_lpps_idx += 1
```

```
            lpps[i] = latest_lpps_idx
```

```
            i += 1
```

```
    else:
```

```
        if latest_lpps_idx != 0:
```

```
            latest_lpps_idx = lpps[latest_lpps_idx-1]
```

```
        else:
```

```
            lpps[i] = 0
```

```
            i += 1
```

```
    return lpps
```

1 → C

2 → C

3 → C

4 → m

5 → m

6 → m

7 → m

8 → m

9 → m

10 → m

11 → m

12 → m

$$\begin{aligned}\text{Time complexity} &= 3C + 9m \\ &= O(m)\end{aligned}$$

KMP Search Time Complexity (Best Case)

```
def KMP_Search(string, substring):  
    substring_len = len(substring) # 1 → C  
    string_len = len(string) # 2 → C  
    substring_position = [] # 3 → C  
    j = 0 # 4 → C  
    i = 0 # 5 → C  
    # 6 → m  
    while i < string_len: # 7 → n  
        if substring[j] == string[i]: # 8 → n  
            i += 1 # 9 → n  
            j += 1 # 10 → n  
        if j == substring_len: # 11 → n  
            substring_position.append(i-j+1) # 12 → n  
            j = lps[j-1] # 13 → n  
        elif i < string_len and substring[j] != string[i]: # 14 → 2n  
            if j != 0: # 15 → n  
                j = lps[j-1] # 16 → n  
            else: # 17 → n  
                i += 1  
    return substring_position, lps
```

Best Case

Assuming that LPS Table already exists

[Process to generate LPS table not required]

Code at #6 can be removed

$$\begin{aligned}\text{Time complexity} &= 5C + 12n \\ &= O(n)\end{aligned}$$

KMP Search Time Complexity (Worst Case)

```
def KMP_Search(string, substring):  
    substring_len = len(substring) # 1 → c  
    string_len = len(string) # 2 → c  
    substring_position = [] # 3 → c  
    j = 0 # 4 → c  
    i = 0 # 5 → c  
    lpps = KMP_Preprocess(substring, substring_len) # 6 → m  
  
    while i < string_len: # 7 → n  
        if substring[j] == string[i]: # 8 → n  
            i += 1 # 9 → n  
            j += 1 # 10 → n  
  
        if j == substring_len: # 11 → n  
            substring_position.append(i-j+1) # 12 → n  
            j = lpps[j-1] # 13 → n  
  
        elif i < string_len and substring[j] != string[i]: # 14 → 2n  
            if j != 0: # 15 → n  
                j = lpps[j-1] # 16 → n  
            else: # 17 → n  
                i += 1  
  
    return substring_position, lpps
```

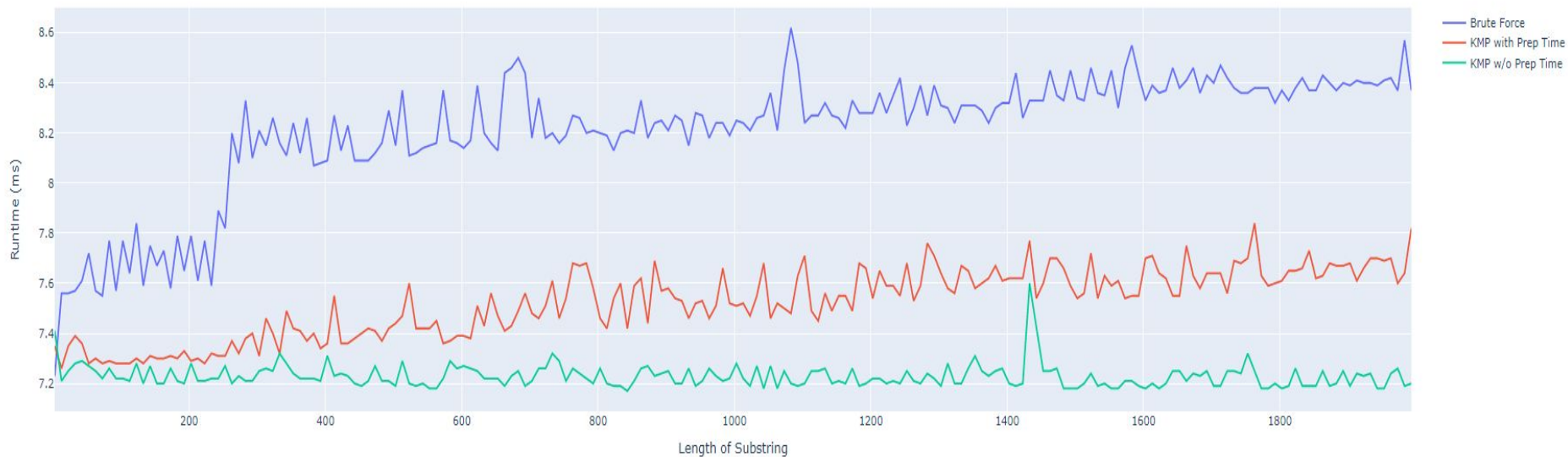
Worst case

$$\begin{aligned}\text{Time complexity} &= 5c + m + 12n \\ &= O(n + m)\end{aligned}$$



Comparisons

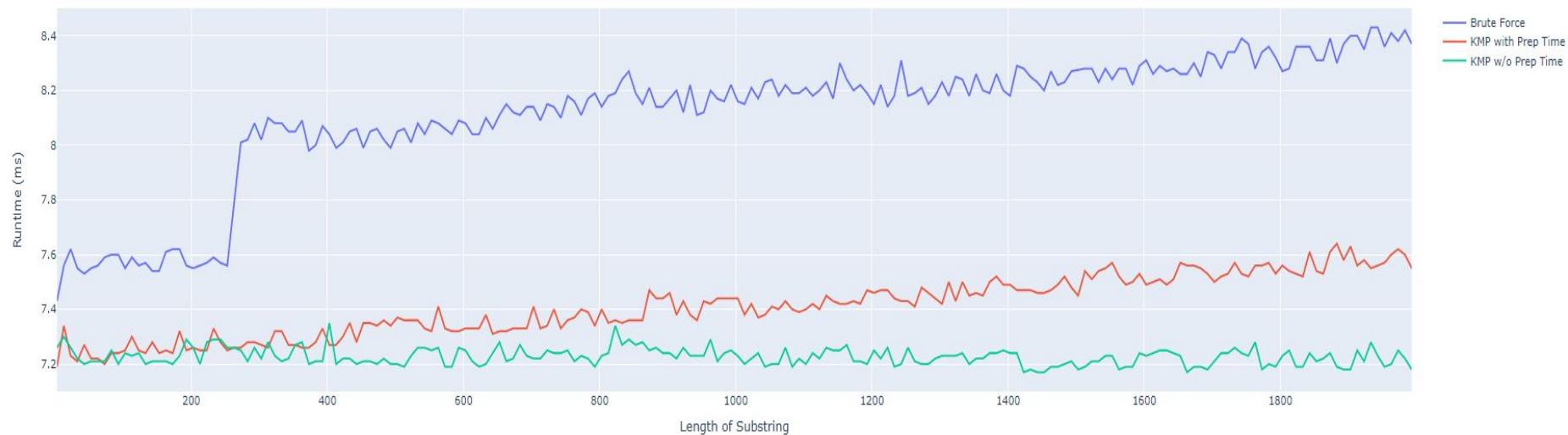
KMP Search vs Brute Force for Existing Substrings





Comparisons

KMP Search vs Brute Force for Nonexistent Substrings





Live Demonstration