

String Matching: Boyer-Moore algorithm

Madhavan Mukund

<https://www.cmi.ac.in/~madhavan>

Programming, Data Structures and Algorithms using Python

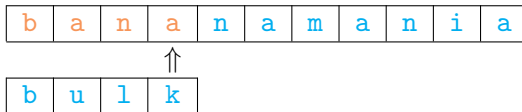
Week 10

Speeding up the brute force algorithm

- Text t , pattern p of lengths n , m
- For each starting position i in t ,
compare $t[i:i+m]$ with p
 - Scan $t[i:i+m]$ right to left

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 - $t = \text{bananmania}$, $p = \text{bulk}$



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 - Scan $t[i:i+m]$ right to left
- While matching, we find a letter in t that does not appear in p
 - $t = \text{bananamania}$, $p = \text{bulk}$
- Shift the next scan to position after mismatched letter
- What if the mismatched letter does appear in p ?

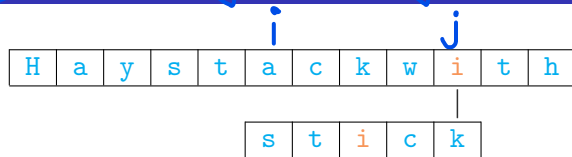
b	a	n	a	n	a	m	a	n	i	a
---	---	---	---	---	---	---	---	---	---	---

b	u	l	k
---	---	---	---

Sliding the search

- Suppose $c = t[i+j] \neq p[j]$, but c does occur somewhere in $p[j]$

i - index of text
 j - index of pattern

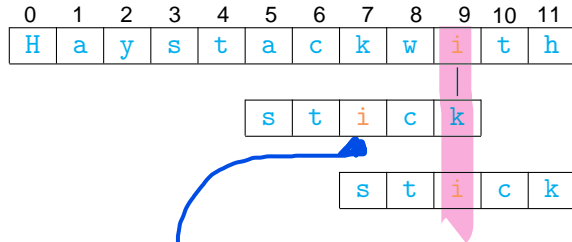


1. We find "i" \neq "k"
2. But "i" is present in pattern (p)
3. So, shifting slice by one does not make sense as we want to get "i" (in p) aligned with "i" (in t)

Sliding the search

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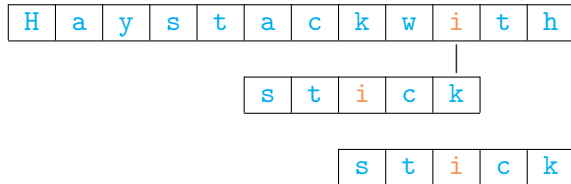
- Align rightmost occurrence of c in p with $t[i+j]$



1. Here $t[i+j] = \text{"i"}$
2. Rightmost occurrence of "i" in p
3. $i = 5, j = 4$

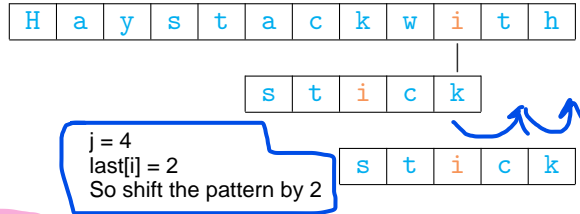
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- Scan this substring of t next



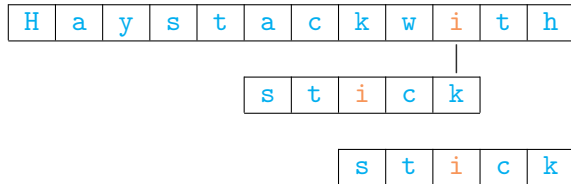
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- Use a dictionary `last`
 - For each c in p , `last[c]` records right most position of c in p
 - Shift pattern by $j - \text{last}[c]$



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 - For each c in p , `last[c]` records right most position of c in p
 - Shift pattern by $j - \text{last}[c]$
- If c not in p , shift pattern by $j+1$



We saw this case in last lecture where "a" was not present in p "bulk" so we shifted the pattern by 4

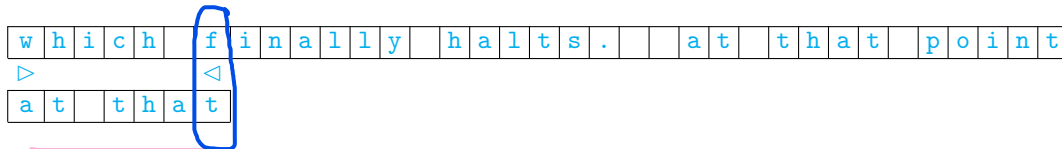
Example [Boyer, Moore 1977]

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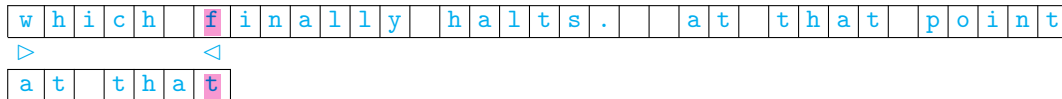
We start comparing from RIGHT to LEFT

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first mis-match



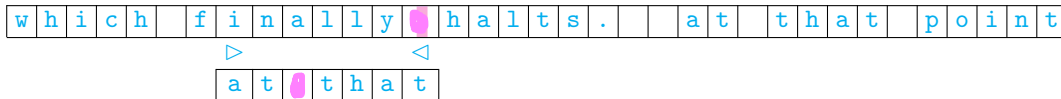
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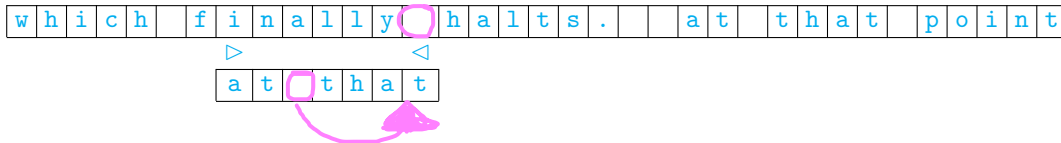
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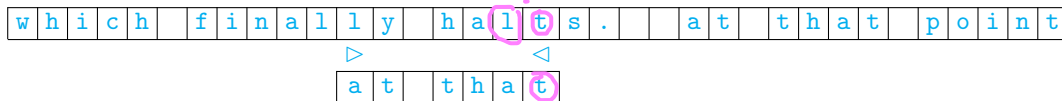
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first mis-match: "l"

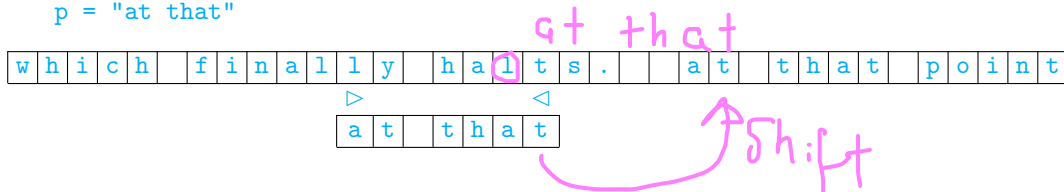


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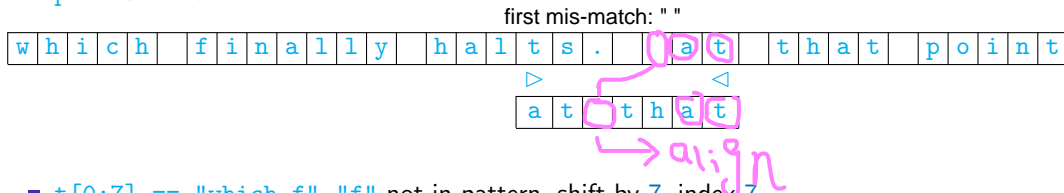
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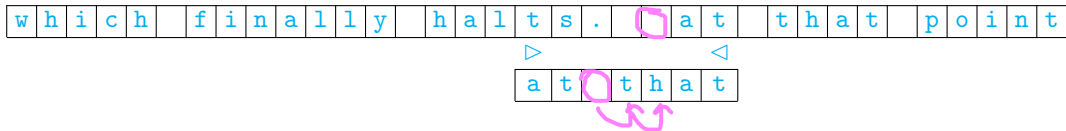
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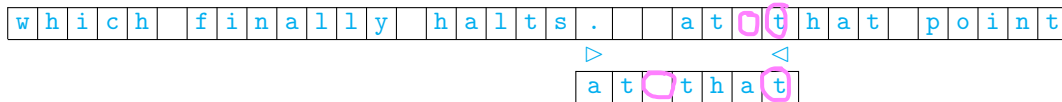
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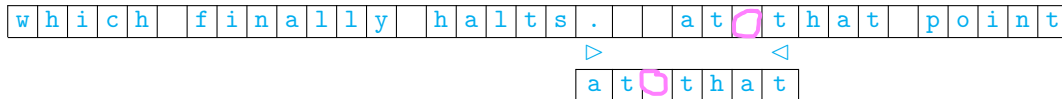
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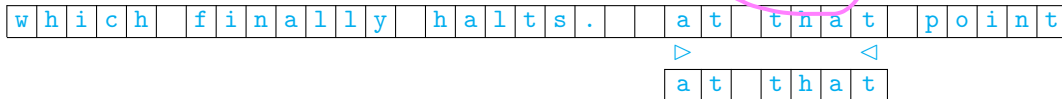
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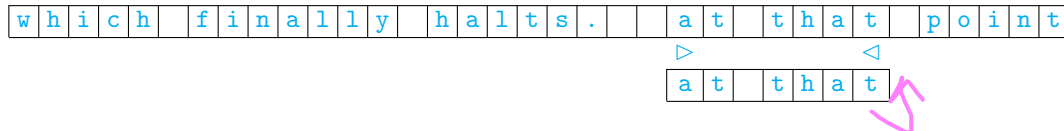


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NOTE: We cannot stop checking from here, as there could be more matches in the text.
NOTE: We shift by one as there can be OVERLAPPING pattern. Example `t = "aaa"` `p = "aa"`

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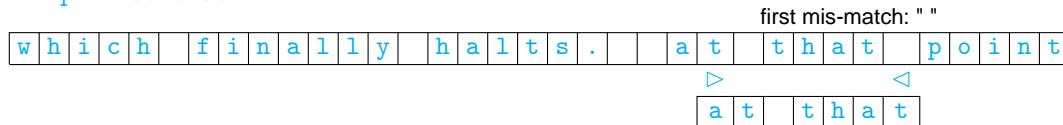
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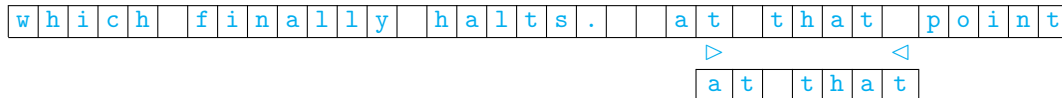
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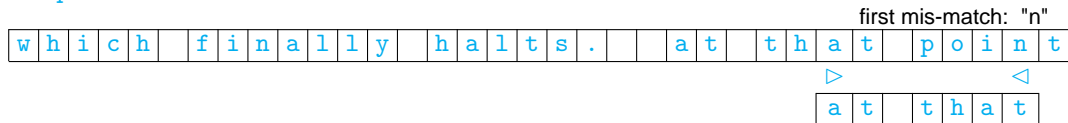
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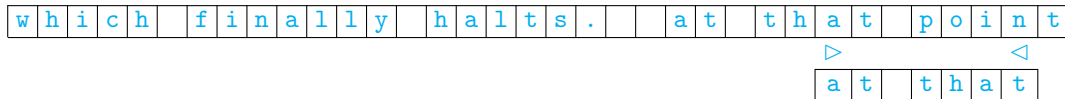
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- `t[27:34] == "at poin"`, "n" not in pattern, shift by 7, index 34, stop

Implementation

- Initialize `last[c]` for each `c` in `p`
 - Single scan, rightmost value is recorded

```
def boyermoore(t,p):  
    last = {}                                # Preprocess  
    for i in range(len(p)):                    
        last[p[i]] = i  
  
    poslist,i = [],0                          # Loop  
    while i <= (len(t)-len(p)):                
        matched,j = True,len(p)-1  
        while j >= 0 and matched:              
            if t[i+j] != p[j]:                 
                matched = False  
            j = j - 1  
        if matched:                            
            poslist.append(i)  
            i = i + 1  
        else:                                  
            j = j + 1  
            if t[i+j] in last.keys():           
                i = i + max(j-last[t[i+j]]),1  
            else:                               
                i = i + j + 1  
    return(poslist)
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 - Single scan, rightmost value is recorded
- Nested loop, compare each segment `t[i:i+len(p)]` with `p`
- If `p` matches, record and shift by 1

As we decremented `j` after mismatch was found. So, we need to restore it, so increment `j` again by 1

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Implementation

$t = \text{__} \underline{a} x a$
 $p = \underline{b} x a$

$\Rightarrow b x a$

moved backward instead of forward

1. The first mis-match occurs at "a", not matching with "b"
2. "a" is there in p but it is in front
3. In this case aligning $p[j]$ and $t[i+j]$ would move p backwards
4. We don't want this because "a" in "bxa" was already aligned in the past

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- We find a mismatch at $t[i+j]$
 - If $j > \text{last}[t[i+j]]$, shift by $j - \text{last}[t[i+j]]$
 - If $\text{last}[t[i+j]] > j$, shift by 1
 - Should not shift p to left!
 - If $t[i+j]$ not in p, shift by $j+1$

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 - $t = \text{aaa...a}$, $p = \text{baaa}$
- Without dictionary, computing `last` is a bottleneck, complexity is $O(|\Sigma|)$
- Boyer-Moore works well, in practice
 - “Sublinear”
 - Experimentally — English text, 5 character pattern, average number of comparisons is 0.24 per character
 - Performance improves as pattern length grows — more characters skipped

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- Boyer-Moore works well, in practice
 - “Sublinear”
 - Experimentally — English text, 5 character pattern, average number of comparisons is 0.24 per character
 - Performance improves as pattern length grows — more characters skipped
- Often used in practice — `grep` in Unix