# Extension of Horspool Algorithm for Pattern Matching 

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#### Abstract

A new algorithm is proposed that modifies the Horspool algorithm by implementing it in multiple stages. The time complexity required for the search is analyzed. It is shown that when the algorithm is divided into stages it has a better time complexity than when it is executed in one stage. The analysis shows that there exists a threshold value for a reduced sub-sequence length. From the analysis it is found that a sub-sequence of four characters is ideal for execution.


Keywords: Horspool Algorithm; Bioinformatics; Pattern Matching.

## Introduction

Biologists are often interested in performing a simple database search to identify proteins or genes that contain a well-defined sequence pattern [1]. Many databases like BodyMap, UniPROBE [2], Genome Database, TRANSFAC [3] do not provide straightforward or readily available query tools to perform simple searches, such as identifying transcription binding sites, protein motifs, or repetitive DNA sequences. In many cases simple pattern-matching searches can reveal a wealth of information such as gene expressions, pathways. Significant progress has been made in search and homology detection algorithms for DNA and protein sequences. Many of these algorithms are geared toward heuristic searches [4]. Horspool algorithm is one among them that finds substrings in strings. It was published by Nigel Horspool in 1980 [5].

The Horspool algorithm is a simplified version of the Boyer-Moore algorithm [6]. It compares the substring with the string from the last character. If there is a mismatch it shifts the pattern according to a precomputed value. Horspool's efficiency classes are $-\Theta(\mathrm{nm})$ for the worst-case case and $\Theta(\mathrm{n})$ for the average case where n is the length of the input string and $m$ is the length of the search string [7]. The Worst case scenario is when the bad case shift is very small and insignificant. Horspools algorithm's efficiency is better when it makes bigger shifts.

While implementing the Horspool algorithm on bioinformatics data it becomes a very lengthy process [8]. The input is a very long homologous sequence and to directly implement the algorithm is very time consuming. The input can be anywhere from 400 to 1000 characters of ' A ', ' C ', ' T ', ' G '. It has been observed that the time complexity of this algorithm is directly proportional to the input size, this can be very expensive. We propose to implement the Horspool algorithm in multiple stages. In the first stage it initially finds short matches between two sequences. In the later stages the algorithm is again implemented to find the actual matching. This method does not take the entire sub sequence space into account in the later stages for better efficiency in the first stage it initially finds short matches between two sequences. In the later stages the algorithm is again implemented to find the actual mapping. This method does not take the entire sub-sequence space into account in the later stages.

## Procedure of matching

In the first stage an optimal length of the subsequence is searched with the original text. In the later stages the remaining characters of the subsequence are matched with only the sub sequences found in the previous stages. The following paragraphs will illustrate the procedure of selecting sub sequences and related time complexities. The method is applied on a homologous sequence where the subsequence to be found is ATGCAGG.

We implement the Horspool algorithm on the sequence with the substring of word size 4 instead of searching the entire string search for ATGCAGG. Search for the occurrence of ATGC. The word size 4 is found to be optimal in this case study. (Refer Appendix B for Time complexity). Implement the Horspool algorithm again on the sequences found in stage 1 .

ACAAGATGCCATTGTCCCCCGGCCTCCTGCTGCTGCTGCTCTCCGGGGC CACGGCCACCGCTGCCCTGCCCCTGGAGGGTGGCCCCACCGGCCGAGACA GCGAGCATATGCAGGAAGCGGCAGGAATAAGGAAAAGCAGCCTCCTGAC TTTCCTCGCTTGGTGGTTTGAGTGGACCTCCCAGGCCAGTGCCGGGCCCCT CATAGGAGAGGAAGCTCGGGAGGTGGCCAGGCGGCAGGAAGGCGCACCC CCCCAGCAATCCGCGCGCCGGGACAGAATGCCCTGCAGGAACTTCTTCTG GAAGACCTTCTCCTCCTGCAAATAAAACCTCACCCATGAATGCTCACGCA AGTTTAATTACAGACCTGAA

## Sequence 1: Homologous Protein Sequence

We find four occurrences of the sub sequence ATGCAGG in Sequence 1 at positions $6,108,274$ and 336 in the original sequence.

ACAAGATGCCATTGTCCCCCGGCCTCCTGCTGCTGCTGCTCTCCGGGG CCACGGCCACCGCTGCCCTGCCCCTGGAGGGTGGCCCCACCGGCCGAGAC AGCGAGCATATGCAGGAAGCGGCAGGAATAAG GAAAAGCAGCCTCCTGACTTTCCTCGCTTGGTGGTTTGAGTGGACCTCCCA GGCCAGTGCCGGGCCCCTCATAGGAGAGGAAGCTCGGGAGGTGGCCAGG CGGCAGGAAGGCGCACCCCCCCAGCAATCCGCGCGCCGGGACAGAATGC CCTGCAGGAACTTCTTCTGGAAGACCTTCTCCTCCTGCAAATAAAACCTCA CCCATGAATGCTCACGCAAGTTTAATTACAGACCTGAA

Table 1: Successful matching during first stage.

| First Position | Position | Element |
| :--- | :--- | :--- |
| 6 | 9 | CAT |
| 108 | 111 | AGG |
| 274 | 277 | CCT |
| 336 | 339 | TCA |

The initial stage of execution of the Horspool algorithm gives us four occurrences and a local search alignment must be started from these initial matches. We need to keep track of these four occurrences with their neighbouring characters. The original substring to be matched is of 7 characters in length. The remaining three characters with their positions have to be stored with the position of the first matched character (i.e) A for every occurrence.

With these four characters already matched, implement the algorithm again with the remaining three characters to find the complete occurrence.

Table 2: Successful matching during second stage.

| First Position | Position | Element |
| :--- | :--- | :--- |
| 6 | 9 | CAT |
| 108 | 111 | AGG |
| 274 | 277 | CCT |
| 336 | 339 | TCA |

The string from position 111 matches the substring. We need to get the corresponding first element position (i.e) 108. The matched sub-sequence is highlighted in Table 2.

## Time Complexity

Table 3: Time complexities for different lengths of sub sequences during first and second stage.

| SI. <br> No | Length of <br> subsequence <br> (m) | Number of <br> Subsequence <br> found | Time <br> taken in <br> units <br> during <br> first stage <br> $*$ | Remaining <br> number of <br> letters to be <br> matched | Time <br> taken <br> during <br> second <br> stage | Total <br> time <br> taken |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 1 | 78 | 368 | 6 | 2808 | 3176 |
| 2 | 2 | 12 | 736 | 5 | 300 | 1036 |
| 3 | 3 | 5 | 1104 | 4 | 80 | 1184 |
| 4 | 4 | 4 | 1472 | 3 | 36 | 1508 |
| 5 | 5 | 1 | 1840 | 2 | 4 | 1844 |
| 6 | 6 | 1 | 2208 | 1 | 1 | 2209 |
| 7 | 7 | 1 | 2576 | - | - | 2576 |
| *- explained in Appendix B |  |  |  |  |  |  |

## Analysis

To make an analysis of time versus subsequence length the following graphs are drawn.


Graph 1: Time versus sub sequence length in first stage.

From graph 1 we observe that in case 1 the time taken to search is very less as only one element will be matched. For the remaining cases the time complexity increases as the number of elements to be matched increases. This is due to the fact that the shift table will be referred in these cases since more than one character has to be matched. It has been observed from the graph that the growth in time for the various lengths of sub sequences in the first stage is linear in nature.


Graph 2: Time versus sub sequence length in second stage.

The growth in time for the various lengths of sub sequences in the second stage is non-linear in nature. The growth in time for the various lengths of sub sequences in the second stage is inversely proportional to the lengths. It has been observed from graph 2 that the time taken to search a sub-sequence decreases as the length increases. Here in case 1 the time taken is maximum as it has to check the matching of the remaining six characters. The shift table will be used extensively during this execution. Only for case 7 there is no second execution as all the seven characters have been matched during the first execution.

According to the analysis done that is shown in Appendix B when the length of the subsequence is four we obtain a threshold value. In case 1 the time taken to search during the first stage is the least but is the highest in the second stage. The amount of space required to store the data in the second level also increases. In case 2 and case 3 the time taken to search the sequence is considerably better but the amount of space required to store the data in the second level still remains huge. In case 5 and case 6 the time complexity is closer to the time complexity of case 7. It is found that when the lengths of the sub sequences are five, six and seven the time taken to execute the program in the second stage is nearly the same.

## Implementation

The data structure that can be used to implement this algorithm is a hash table. The keys used here are the starting position of the original subsequence. The mapping is done to the starting position of the remaining sub sequence characters.


Figure 1: Hash Table Implementation.

The execution of the algorithm can be viewed in a tree structure. The original length of the subsequence is taken as seven in this analysis. The algorithm can be executed in multiple stages with the lengths as one, two, three, four, five, six or seven. If the length is taken as seven then there is only one stage execution of the algorithm which is nothing but a normal Horspool algorithm execution. If the length of the subsequence is taken as one, two, three, four, five or six then the algorithm has to be executed in another stage with the remaining characters of the subsequence of length six, five, four, three, two and one respectively. According to the tree structure the algorithm can be executed in a minimum of one iteration or stage and a maximum of seven iterations or stages. In the figure 2 only the case $4,5,6,7$ are fully depicted. The same can be drawn for all the other cases.


Figure 2: Tree structure implementation of the modified Horspool algorithm.

## Conclusion

The paper proposes a modified algorithm for pattern matching that implement the Horspool algorithm in multiple stages. Pattern matching is a highly used concept in bioinformatics to study genome function, protein analysis, DNA analysis and so on. In the first stage it initially finds short matches between two sequences. In the later stages the algorithm is again implemented to find the actual matching. This method does not take the entire sub sequence space into account in the later stages. After implementing the algorithm it was found that it is efficient to implement the algorithm in multiple stages rather than one stage. The proposed algorithm reduces the need to store the large input during the entire execution of the program. The data needed in the remaining stages is reduced considerably. The time taken to search - $\Theta(\mathrm{nm})$ reduces since the size of the substring has reduced.

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## Appendix A

The Horspool algorithm

1. Precompute shift sizes and store them in a table.
2. For every character c , the shift's value is determined by
a. $t(c)=$ the pattern's length, $m$ if $c$ is not among the first $m-1$ characters of the pattern
b. else $\mathrm{t}(\mathrm{c})=$ the distance from the rightmost c among the first $\mathrm{m}-1$ characters of the pattern to its last character

Given a pattern $p$, the following function horspoolInitocc computes the occurrence function for the shift table.

```
void horspoolInitocc()
{
    int j; char a;
    for (a=0; a<alphabetsize; a++) occ[a]=-1;
    for (j=0; j<m-1; j++)
    { a=p[j]; occ[a]=j; }
}
```

The pattern is compared from right to left with the text. After a complete match or in case of a mismatch, the pattern is shifted according to the precomputed occ.
void horspoolSearch()
\{
int $\mathrm{i}=0, \mathrm{j}$;
while ( $\mathrm{i}<=\mathrm{n}-\mathrm{m}$ )
\{
$\mathrm{j}=\mathrm{m}-1$;
while ( $\mathrm{j}>=0$ \& \& $\mathrm{p}[\mathrm{j}]==\mathrm{t}[\mathrm{i}+\mathrm{j}]$ ) $\mathrm{j}--$;
if ( $\mathrm{j}<0$ ) report( i );
$\mathrm{i}+=\mathrm{m}-1 ; \quad \mathrm{i}-=\mathrm{occ}[\mathrm{t}[\mathrm{i}]] ;$
\}
\}

## Appendix B

Case 1: The size of $m$ is taken as 1 character.

| First <br> position | Remaining <br> characters | First <br> position | Remaining <br> characters | First <br> position | Remaining <br> characters | First <br> position | Remaining <br> characters |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | CAAGAT | 126 | TAAGGA | 220 | GGTGGC | 318 | AATAAA |
| 3 | AGATGC | 128 | AGGAAA | 228 | GGCGGC | 319 | ATAAAA |
| 4 | GATGCC | 129 | GGAAAA | 235 | GGAAGG | 320 | AAAACC |
| 6 | TGCCAT | 132 | AAAGCA | 238 | AGGCGC | 322 | AAACCT |
| 11 | TTGTCC | 133 | AAGCAG | 239 | GGCGCA | 323 | AACCTC |
| 51 | CGGCCA | 134 | AGCAGC | 245 | CCCCCC | 324 | ACCTCA |
| 57 | CCGCTG | 135 | GCAGCC | 253 | GCAATC | 325 | CCCTCA |
| 76 | GGGTGG | 138 | GCCTCC | 256 | ATCCGC | 330 | CCCATG |
| 87 | CCGGCC | 147 | CTTTCC | 257 | TCCGCG | 334 | TGAATG |
| 95 | GACAGC | 169 | GTGGAC | 271 | CAGAAT | 337 | ATGCTC |
| 97 | CAGCGA | 174 | CCTCCC | 273 | GAATGC | 338 | TGCTCA |
| 103 | GCATAT | 181 | GGCCAG | 275 | ATGCCC | 344 | CGCAAG |
| 106 | TATGCA | 186 | GTGCCG | 276 | TGCCCT | 348 | AGTTTA |
| 108 | TGCAGG | 201 | TAGGAG | 285 | GGAACT | 349 | GTTTAA |
| 112 | GGAAGC | 203 | GGAGAG | 288 | ACTTCT | 354 | ATTACA |
| 115 | AGCGGC | 206 | GAGGAA | 289 | CTTCTT | 355 | TTACAG |
| 116 | GCGGCA | 208 | GGAAGC | 300 | AGACCT | 358 | CAGACC |
| 122 | GGAATA | 211 | AGCTCG | 301 | GACCTT | 360 | GACCTG |
| 125 | ATAAGG | 212 | GCTCGG | 303 | CCTTCT | 362 | CCTGAA |
|  |  |  |  |  |  | 367 | A |
|  |  |  |  |  |  |  | 368 |

The number of matches found in first stage is 78 . When the analysis is done it is found that

1. A number of matches are repetitive in nature.
2. Some of the sequences have just one position difference.

Time complexity is calculated as $n * m-368 * 1=368$ units of time.
For the second stage the algorithm is implemented on these 78 substrings again to find the match. Time taken in the second stage is $(78 * 6) * 6=2808$ units of time.

Case 2: The size of $m$ is taken as 2 characters.

| First <br> position | Remaining <br> characters | First <br> position | Remaining <br> characters | First <br> position | Remaining <br> characters | First <br> position | Remaining <br> characters |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 6 | GCCA | 108 | GCAG | 257 | CCGC | 334 | GAAT |
| 11 | TGTC | 126 | AAGG | 276 | GCCC | 338 | GCTC |
| 106 | ATGC | 201 | AGGA | 320 | AAAA | 355 | TACA |

The number of matches found is 12 . The analysis shows that

1. The number of matches has reduced from 78 in case 1 to just 12 .
2. The time complexity is 1191 units theoretically.

Time complexity is calculated as $n * m-368 * 2=736$ units of time.
For the second stage the algorithm is implemented on these 12 substrings again to find the match. Time taken in the second stage is $(12 * 5) * 5=300$ units of time.

Case 3: The size of $m$ is taken as 3 characters.

| First position | Remaining characters | First position | Remaining characters |
| :--- | :--- | :--- | :--- |
| 6 | CCAT | 334 | AATG |
| 108 | CAGG | 338 | CTCA |
| 276 | CCCT |  |  |

The number of matches found is 5 . The analysis shows that

1. The number of matches has reduced from 12 in case 2 to just 5.
2. The time complexity is 1438 units theoretically.

Time complexity is calculated as $n * m-368 * 3=1104$ units of time.
For the second stage the algorithm is implemented on these 5 substrings again to find the match. Time taken in the second stage is $(5 * 4) * 4=80$ units of time.

Case 4: The size of $m$ is taken as 4 characters.

| First position | Remaining characters | First position | Remaining characters |
| :--- | :--- | :--- | :--- |
| 6 | CAT | 338 | TCA |
| 108 | AGG |  |  |
| 276 | CCC |  |  |

The number of matches found is 4 . The analysis shows that

1. The number of matches has reduced from 5 in case 3 to 4 .
2. The time complexity is 1868 units theoretically.

Time complexity is calculated as $n * m-368 * 4=1472$ units of time.
For the second stage the algorithm is implemented on these 4 substrings again to find the match. Time taken in the second stage is $(4 * 3) * 3=36$ units of time.

Case 5: The size of $m$ is taken as 5 characters.

| First position | Remaining characters |
| :--- | :--- |
| 108 | G |

The number of matches found is 1 . The analysis shows that

1. The number of matches has reduced from 4 in case 4 to 1 .
2. The time complexity is 2292 units theoretically.

Time complexity is calculated as $n * m-368 * 5=1840$ units of time.
For the second stage the algorithm is implemented on this 1 substring again to find the match. Time taken in the second stage is $(1 * 2) * 2=4$ units of time.

Case 6: The size of $m$ is taken as 6 characters.

| First position | Remaining characters |
| :--- | :--- |
| 108 | G |

The number of matches found is 1 . The analysis shows that

1. The number of matches has remained the same.
2. The time complexity is 2749 units theoretically.

Time complexity is calculated as $n * m-368 * 6=2208$ units of time.

For the second stage the algorithm is implemented on these 1substrings again to find the match. Time taken in the second stage is $(1 * 1) * 1=1$ units of time.

Case 7: The size of $m$ is taken as 7 characters.

| First position | Remaining characters |
| :--- | :--- |
| 108 | - |

The number of matches found is 1 . The analysis shows that 1. The number of matches has remained the same.
2. The time complexity is 3206 units theoretically.

Time complexity is calculated as $n * m-368 * 7=2576$ units of time.

