## Chapter 2: String comparison

## Basic notions

Let $\Sigma$ be finite ordered alphabet. We suppose $|\Sigma|$ is constant. $\Sigma^{*}$ is the set of all strings over $\Sigma$. We will use symbols $S, S_{1,} S_{2, \ldots}$ for strings. $|S|$ denotes length of string $S$. We also use symbol $n$ to refer to length of string, if not specified otherwise. We write $S[i]$, where $0 \leqslant i<|S|$, to refer to i-th character of $S$. We define $S[-1]=\phi$ and $S[|S|]=\$$, where $\phi, \$ \notin \Sigma$ are special symbols. $S[i . . j]$, where $0 \leqslant i \leqslant j<|S|$ refers to substring of $S$, starting at position $i$ and ending at position $j$.
Each position $0 \leqslant i<|S|$ represents unique suffix $S[i . n-1]$ of $S$. We define left context
$L C_{S}(i)=S[i-1]$ for each suffix $i$. Note that suffix 0 has special left context $\phi$. When it is clear, which string we are refering to, we write just $L C(i)$.

## Matches and repeats

Definition: Let $S$ be string of length $n$. A triple $\left(p_{1,} p_{2} l\right) \in N_{n}{ }^{3}$ is called repeat iff

1. $p_{1}+l-1<n \wedge p_{2}+l-1<n$
2. $S\left[p_{1} . . p_{1}+l-1\right]=S\left[p_{2} . . p_{2}+l-1\right]$

A repeat $\left(p_{1,} p_{2}, l\right)$ is called left maximal if $L C\left(p_{1}\right) \neq L C\left(p_{2}\right) \vee L C\left(p_{1}\right)=\phi$.
A repeat $\left(p_{1,}, p_{2}, l\right)$ is called right maximal if $S\left[p_{1}+l\right] \neq S\left[p_{2}+l\right] \vee S\left[p_{1}+l\right]=\$$.
A repeat is called maximal if it is left and right maximal.
Definition: Let $S_{1,} S_{2}$ be strings, $m=\min \left(\left|S_{1}\right|,\left|S_{2}\right|\right)+1$. A triple $\left(p_{1,} p_{2}, l\right) \in N_{\left|S_{\mid}\right|} \times N_{\left|S_{2}\right|} \times N_{m}$ is called match (of $S_{1}$ and $S_{2}$ ) iff

1. $p_{1}+l-1<\left|S_{1}\right| \wedge p_{2}+l-1<\left|S_{2}\right|$
2. $S_{1}\left[p_{1} . . p_{1}+l-1\right]=S_{2}\left[p_{2} . . p_{2}+l-1\right]$

A match $\left(p_{1,} p_{2}, l\right)$ is called left maximal if $L C_{S_{1}}\left(p_{1}\right) \neq L C_{S_{2}}\left(p_{2}\right) \vee L C_{S_{1}}\left(p_{1}\right)=\phi$.
A match $\left(p_{1,} p_{2}, l\right)$ is called right maximal if $S_{1}\left[p_{1}+l\right] \neq S_{2}\left[p_{2}+l\right] \vee S_{1}\left[p_{1}+l\right]=\$$.
A match is called maximal if it is left and right maximal.

## Chapter 3 : Enhanced suffix array and it's implementation

In Chapter 4, we'll describe algorithms for computing maximal matches and maximal repeats. These algorithms work with rather non-trivial data structure: enhanced suffix array. This data structure was originally introduced in [1]. This chapter contains only brief introduction and also deals with implementation issues.

Enhanced suffix array consists of regular suffix array enhanced with additional information: lcptable. Rows of lcp-table that meet certain conditions can be grouped to intervals called lcp-intervals. These then constitute a virtual data structure lcp-interval tree. This structure is sufficient to replace suffix tree (text indexing data structure used for similar purposes) in almost every application, being more memory efficient, as shown in [2].
[TODO: better introduction, mention suffix tree and reference paper about it]

Definition: Let $S$ be string, $|S|=n$. An array sa of $n$ integers in range 0 to $n-1$ is called a suffix array of string $S$ iff $s a[0], s a[1], \ldots, s a[n-1]$ is sequence of positions of suffixes of $S$ in ascending lexicographic order, i.e $\forall i, j: 0 \leqslant i<j<n \Rightarrow S[s a[i] . . n-1]<_{L} S[s a[j] . . n-1]$, where $<_{L}$ is lexicographic order on $\Sigma^{*}$.

Currently, there are three different ways how to compute suffix array directly (without first computing suffix tree) in linear time. For details see [4], [5] and [6]. In implementation of DiffEngine library, we use algorithm described in [5]. When DiffEngine computes the suffix array over $n$ bytes of data, peak memory usage in our implementation is $9.28 n$ bytes. We suppose ${ }^{1}$ that $n<2^{31}$. Resulting suffix array can be therefore stored in $4 n$ bytes, where most significant bit in each value can be used for special purposes during further computation.

Definition: Let $S$ be string, $|S|=n$, sa is suffix array of $S$. The lcp-table Icptab of string $S$ is an array of integers in range 0 to $\mathrm{n}-1$. We define $l c p t a b[0]=0$ and $l c p t a b[i]$ is length of longest common prefix of suffixes $S[s a[i-1] . . n-1]$ and $S[s a[i] . . n-1]$ for $0<i<n$.

Lcp-table can be computed in linear time when suffix array is available (see [7]), or can be computed as by-product of linear time suffix array construction as shown in [4]. In DiffEngine library, we compute lcp-table separately from suffix array, using space saving implementation trick described in [3]. That way, we can compute it, with $4 n$ peak extra memory usage (apart from memory used to store text ( $n$ ) and suffix array (4n)). Amount of memory for storage varies and depends on input data. DiffEngine library uses variable coding scheme ranging from $n$ to $4 n$. This will be described in section XXX.

Table 1 shows example of enhanced suffix array. Note that we also added a row with left context of each suffix.

| $i$ | suftab | lcptab | LC | S[suftab[i]..n-1] |
| :--- | :--- | :--- | :--- | :--- |
| 0 | 2 | 0 | c | aaacatat |
| 1 | 3 | 2 | a | aacatat |
| 2 | 0 | 1 | ¢ | acaaacatat |
| 3 | 4 | 3 | a | acatat |
| 4 | 6 | 1 | c | atat |
| 5 | 8 | 2 | t | at |
| 6 | 1 | 0 | a | caaacatat |
| 7 | 5 | 2 | a | catat |
| 8 | 7 | 0 | a | tat |
| 9 | 9 | 1 | a | t |

Table 1: Enhanced suffix array of the string $S=$ acaaacatat

[^0]Definition: A triple $(l, i, j) \in N_{n}{ }^{3}$ is an lcp-interval iff

1. $i<j$
2. lcptab $[i]<l$
3. $\forall k, i+1 \leqslant k \leqslant j: \operatorname{lcptab}[k] \geqslant l$
4. $\exists k, i+1 \leqslant k \leqslant j: \operatorname{lcptab}[k]=l$
5. lcptab $[j+1]<l$


Illustration 1: Lcp-interval tree for suffix array in Table 1

Definition: A lcp-interval $(p, q, r)$ is said to be embedded in lcp-interval $(l, i, j)$ if $i \leqslant q<r \leqslant j \wedge p>l$. Lcp-interval $(l, i, j)$ is then called the interval enclosing $(p, q, r)$. If $(l, i, j)$ encloses $(p, q, r)$ and there is no interval embedded in $(l, i, j)$ that also encloses $(p, q, r)$, then is $(p, q, r)$ called a child interval of $(l, i, j)$.

This parent-child relationship constitutes a conceptual (or virtual) tree which we call lcp-interval tree. Root of this tree is interval ( $0,0, n-1$ ). See Illustration 1.

This tree is never really constructed i.e. no parent-child pointers are stored in memory. All lcpintervals and their relationships can be computed during one sequential scan of lcp-table which would simulate bottom-up traversal of the tree.
lcp-interval $(l, i, j)$ also defines an interval of suffix array sa. We say that a position $p$ belongs to (or is from) interval $(l, i, j)$ if $p=s a[k]$ where $i \leqslant k \leqslant j$.

Lcp-intervals represent very useful information from repeat point of view.
Consider following three facts about lcp-intervals:
Let $p_{1,} p_{2}$ be the positions from a lcp-interval $(l, i, j), p_{1}=s a\left[k_{1}\right], p_{2}=s a\left[k_{2}\right], k_{1}<k_{2}$
Fact 1: $\quad\left(l, p_{1,} p_{2}\right)$ is repeat.
Proof: $\quad$ From property 3 of lcp-interval it follows that $\forall k, k_{1}<k \leqslant k_{2}: l \operatorname{cptab}[k] \geqslant l$, i.e. $\forall k, k_{1}<k \leqslant k_{2}: S[s a[k-1] . . s a[k-1]+l-1]=S[s a[k] . . s a[k]+l-1]$ $\Rightarrow S\left[s a\left[k_{1}\right] . . s a\left[k_{1}\right]+l-1\right]=S\left[s a\left[k_{2}\right] . . s a\left[k_{2}\right]+l-1\right]$

Fact 2: $\quad\left(l, p_{1,} p_{2}\right)$ is left maximal iff $L C\left(p_{1}\right) \neq L C\left(p_{2}\right) \vee L C\left(p_{1}\right)=\phi$
Fact 3: $\quad\left(l, p_{1}, p_{2}\right)$ is right maximal iff there is no other lcp-interval $(p, q, r)$ embedded in $(l, i, j)$ so that $p_{1,} p_{2}$ both belong to $(p, q, r)$.

Proof: $\quad \Rightarrow$ :
Let $\left(l, p_{1}, p_{2}\right)$ be right maximal and let $p_{1,} p_{2}$ belong to $(p, q, r)$ embedded in $(l, i, j)$. From fact $1,\left(p, p_{1}, p_{2}\right)$ is also repeat, with $p>l$, which contradicts right maximality of $\left(l, p_{1,}, p_{2}\right)$
$\Leftarrow:$
Let $\left(l, p_{1} p_{2}\right)$ be not right maximal, i.e. $S\left[p_{1}+l\right]=S\left[p_{2}+l\right] \wedge S\left[p_{1}+l\right] \neq \$$
$\Rightarrow S\left[s a\left[k_{1}\right] . . s a\left[k_{1}\right]+l\right]=S\left[s a\left[k_{2}\right] . . s a\left[k_{2}\right]+l\right]$. We see that suffixes at $p_{1,} p_{2}$ have common prefix of length at least $1+1$. Since sa is sorted lexicographically, also suffixes at $s a[k]$ for $\forall k, k_{1}<k<k_{2}$, have the same prefix and therefore
$\forall k, k_{1}<k \leqslant k_{2}: l \operatorname{cptab}[k] \geqslant l+1$. Let $p=\min \left\{l \operatorname{cptab}[k] \mid k_{1}<k \leqslant k_{2}\right\}$ From property 2 of lcp-interval: $\exists q, i \leqslant q \leqslant k_{1}: l \operatorname{cptab}[q]<p$ and from property 5
$\exists r, k_{2} \leqslant r \leqslant j: \operatorname{lcptab}[r]<p$. If we take maximal such $q$ and minimal such $r$, we have an lcp-interval $(p, q, r)$ embedded in $(l, i, j)$.

## Implementation issues

In worst case lcp-table takes $4 n$ bytes. In most cases lcp values rarely exceed $2^{8}$ or $2^{16}$ and therefore can be represented by 1 - or 2 - byte integer (char or short). When most of the values of LCP table are small, we can save space by using more economical coding and register exceptions for greater values.

Let $m$ be minimal match/repeat length. Since we process only items i from $S A$ and $L C P$ tables where $L C P[i] \geqslant m$, we don't need to represent values smaller than $m$. Furthermore, we need one value to indicate end of root interval and one to indicate exception (value greater than $\mathrm{m}+254$ ). LCP

| 0 | End of interval |
| :--- | :--- |
| 1 | m |
| 2 | $\mathrm{~m}+1$ |
| $\ldots$ |  |
| 254 | $\mathrm{~m}+253$ |
| 255 | Exception |

Table 2: 1-byte LCP code values will be coded to 1-byte representation according to Table 1. The 2byte representation is coded similarly.

To determine which representation of LCP table to use, we determine following numbers:
$k_{1}$ - number of values greater than or equal $\mathrm{m}+254$
$k_{2}$ - number of values greater than or equal $\mathrm{m}+65634$
$k^{\prime}{ }_{1}$ - number of values greater than $\mathrm{m}+254$
$k^{\prime}{ }_{2}$ - number of values greater than $\mathrm{m}+65634$
Then, we use rules in Table 2 to decide coding. We start from line 1 . If condition in line i holds we use given coding, else we assume conditions 1..i are false and move to line $\mathrm{i}+1$.

| $\boldsymbol{i}$ | condition | ccp value <br> coding | exception <br> coding | table <br> size |
| :--- | :--- | :--- | :--- | :--- |
| 1 | $k_{1}^{\prime}=0$ | 1-byte | - | $n$ |
| 2 | $k_{2}^{\prime}=0 \wedge n+2 \mathrm{k}_{1}<2 \mathrm{n}$ | 1 -byte | 2-byte | $n+2 \mathrm{k}_{1}$ |
| 3 | $k_{2}^{\prime}=0$ | 2 -byte | - | 2 n |
| 4 | $n+4 \mathrm{k}_{1}<2 \mathrm{n}+4 \mathrm{k}_{2}$ | 1 -byte | 4 -byte | $n+4 \mathrm{k}_{1}$ |
| 5 | $2 \mathrm{n}+4 \mathrm{k}_{2}<4 \mathrm{n}$ | 2-byte | 4 -byte | $2 \mathrm{n}+4 \mathrm{k}_{2}$ |
| 6 | true | 4-byte | - | 4 n |

Table 3: coding of lcp value

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[^0]:    1 This limit is practically much lower. Current version of DiffEngine works only on 32bit systems with 4GB RAM limit. Therefore with peak memory usage $9.28 n$, internal memory algorithm can compute suffix array on cca 440 MB of data. The number is even little lower as the factor doesn't consider a few megabytes of data structures whose size don't depend on $n$.

