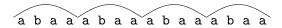
# Efficient Algorithms for Shortest Partial Seeds in Words

### **Tomasz Kociumaka**<sup>1</sup>, Solon P. Pissis<sup>2</sup>, Jakub Radoszewski<sup>1</sup>, Wojciech Rytter<sup>1</sup>, Tomasz Waleń<sup>1</sup>

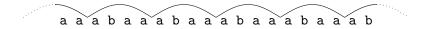
<sup>1</sup>University of Warsaw <sup>2</sup>King's College London

### **CPM 2014** Moscow, June 16, 2014

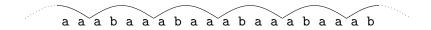
Periodicity: occurrences are aligned



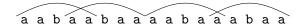
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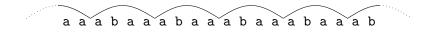
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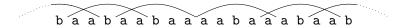
Quasiperiodicity: occurrences may overlap



Periodicity: occurrences are aligned



Quasiperiodicity: occurrences may overlap



### Definition (Apostolico, Farach, Iliopoulos; 1991)

A factor u is a *cover* of w if each position (letter) in w lies within an occurrence of u in w.



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#### Observation

A factor u is a seed of w iff each position (letter) in w lies within a possibly overhanging occurrence of u in w.

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### Definition

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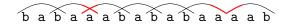
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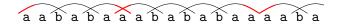
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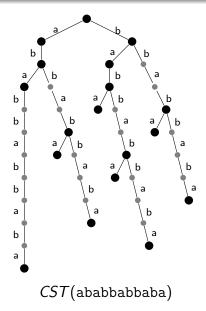


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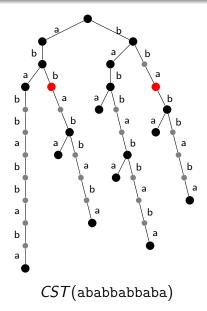
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Main drawback:  $\Omega(n^2)$  algorithms.

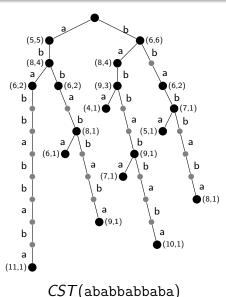


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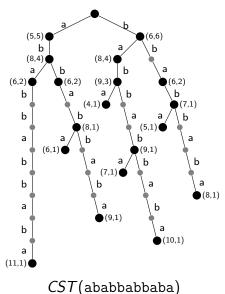
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### Theorem (KPRRW; CPM'13)

The tree CST(w) can be built in  $\mathcal{O}(n \log n)$  time for any word w of length n.

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### Problem (PARTIAL SEEDS)

Given a word w of length n and a positive integer  $\alpha \leq n$  find all shortest factors u of w such that  $S(u) \geq \alpha$ .

### Problem (LIMITED LENGTH PARTIAL SEEDS)

Given a word w of length n and an interval  $[\ell, r]$  find a factor u of w maximizing S(u) among factors for which  $|u| \in [\ell, r]$ .

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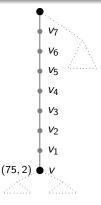
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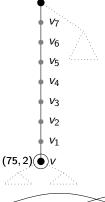
#### Theorem

Given CST(w) both PARTIAL SEEDS and LIMITED LENGTH PARTIAL SEEDS can be solved in linear time.



### Lemma (CPM'13)

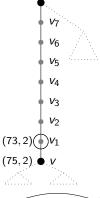
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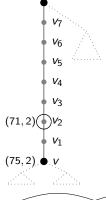




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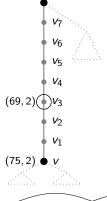




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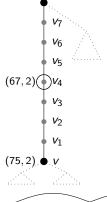




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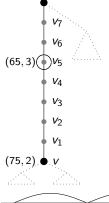




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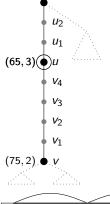




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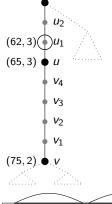


### Lemma (CPM'13)

Let  $v_0, v_1, \ldots, v_k$  be the nodes of an edge of CST(w) with  $v = v_0$  being the lowest (explicit) node. Then

$$\mathcal{C}(v_j) = \mathcal{C}(v) - j\Delta(v).$$



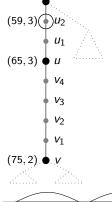


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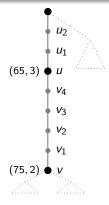


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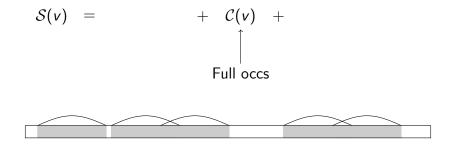
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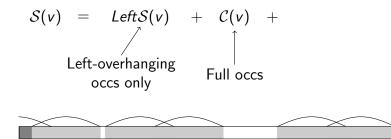
$$C(v_j) = C(v) - j\Delta(v).$$

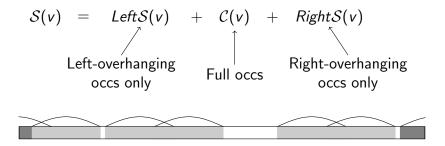
#### Corollary

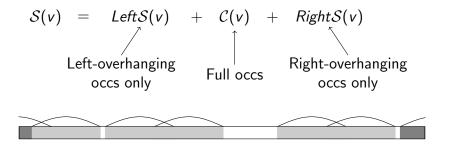
Given a locus of v in CST(w), the cover index C(v) can be computed in O(1) time.

### S(v) = + +



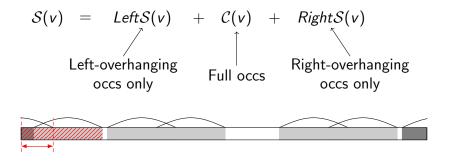






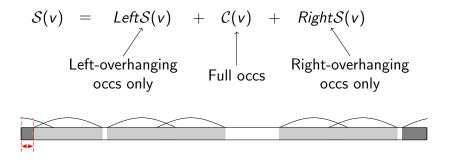
Left S(v) = min(B[first(v) + |v| - 1], first(v) - 1)

first(v) start position of the first occurrence of v, B[i] largest border of w[1..i].



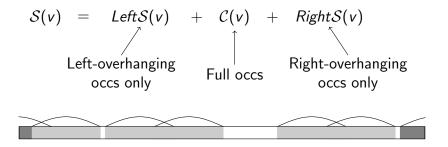
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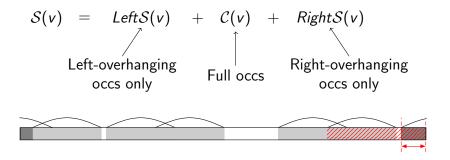
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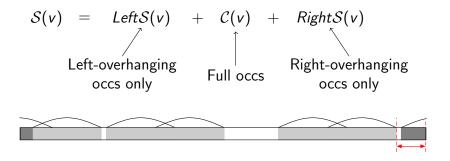
 $Left S(v) = \min(B[first(v) + |v| - 1], first(v) - 1)$ Right S(v) = min(B<sup>R</sup>[last(v)], n - |v| + 1 - last(v))

last(v) start position of the last occurrence of v,  $B^{R}[i]$  largest border of w[i..n].



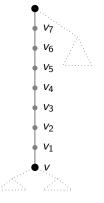
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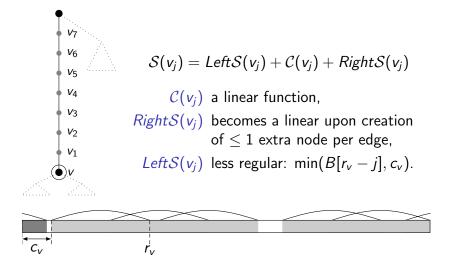
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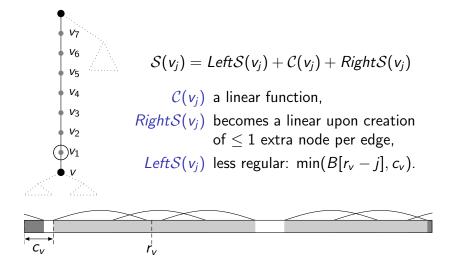
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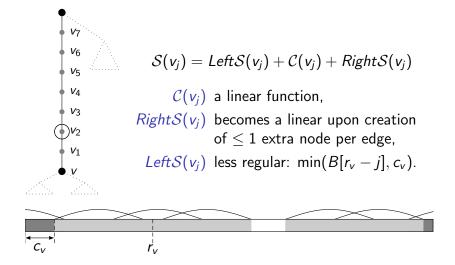


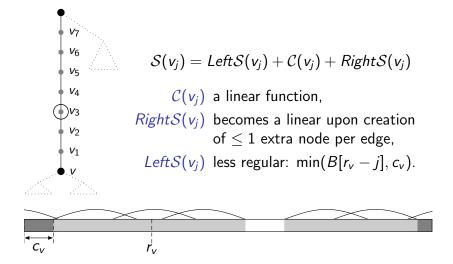
$$\begin{split} \mathcal{S}(v_j) &= Left \mathcal{S}(v_j) + \mathcal{C}(v_j) + Right \mathcal{S}(v_j) \\ \mathcal{C}(v_j) \text{ a linear function,} \\ Right \mathcal{S}(v_j) \text{ becomes a linear upon creation} \\ & \text{of } \leq 1 \text{ extra node per edge,} \end{split}$$

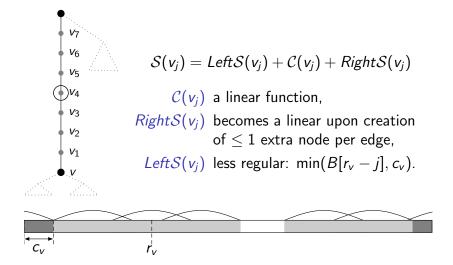
Left  $S(v_j)$  less regular: min $(B[r_v - j], c_v)$ .

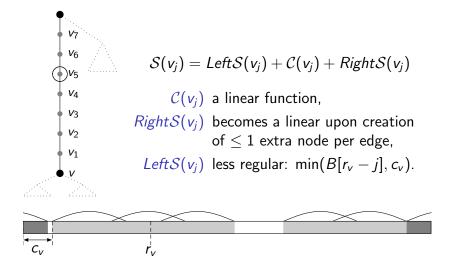


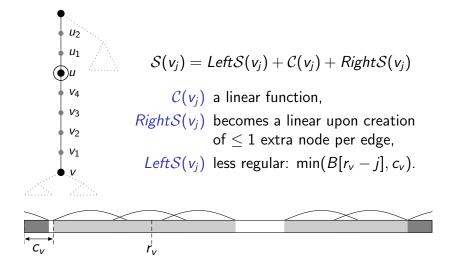


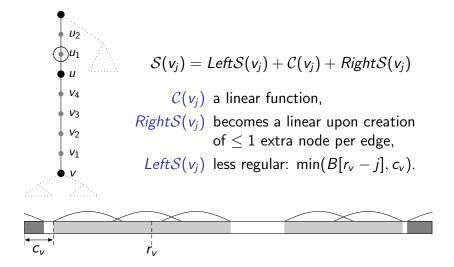


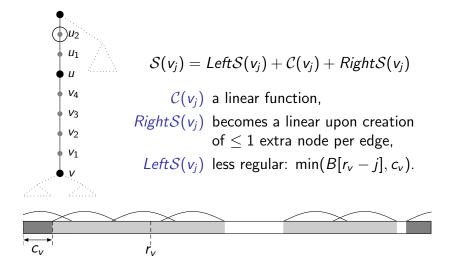












# Seed Suffix Tree

CST(w) can be further augmented in  $\mathcal{O}(n)$  time to SST(w)(Seed Suffix Tree) such that

• for each node v there exists a function

$$\phi_{v}(x) = a_{v}x + b_{v} + \min(c_{v}, B[x])$$

and a range  $R_v = (\ell_v, r_v]$  such that  $S(v_j) = \phi_v(r_v - j)$  for any  $v_j$  on the edge immediately above v,

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#### Observation

Given a locus of v in SST(w) and the border table B, the seed index S(v) can be computed in O(1) time.

#### Problem

**Input**: pairs  $(\phi_i, R_i)$ , where  $\phi_i(x) = a_i x + b_i + \min(c_i, B[x])$  is a function and  $R_i = (\ell_i, r_i] \subseteq [1, n]$  is a non-empty range **Output**:

(a) 
$$\operatorname{argmax}\{\phi_i(x) : x \in R_i\}$$
 for each pair,

(b) min
$$\{x \in R_i : \phi_i(x) \ge \alpha\}$$
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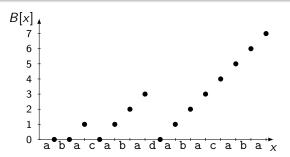
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Workaround for  $\sum a_i = O(n)$ :

• use (a) queries to restrict the set of edges queried for (b).

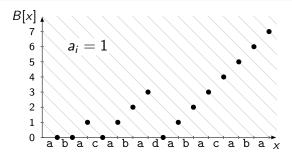
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For the border array B to answer (off-line) the following queries: given a non-negative coefficient  $a_i$  and a range  $R_i = (\ell_i, r_i]$  compute  $x_i = \operatorname{argmax}\{a_i x + B[x] : x \in R_i\}$ .



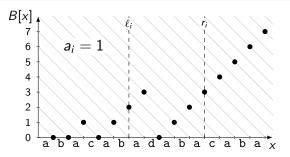
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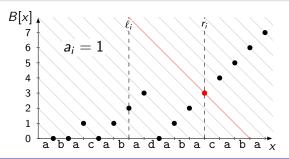


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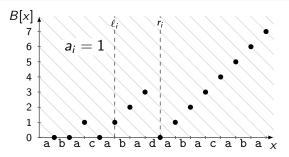


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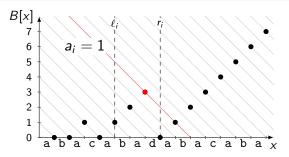
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T. Kociumaka, S. Pissis, J. Radoszewski, W. Rytter, T. Waleń Efficient Algorithms for Shortest Partial Seeds in Words 13/16

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- So For each query check the possibility of  $x_i = r_i$ .

### Conclusions and open problems

Two problems regarding partial seeds can be solved in O(n) time provided that CST(w) is already computed:

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- for each length find the factor u maximizing  $\mathcal{S}(u)$ 
  - for partial covers  $\mathcal{O}(n \log n)$  time.

# Thank you for your attention!