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1 The binary paint shop problem and its complexity status

2 Greedy heuristic

3 Problems

Definition

Instances of the binary paint shop problem PPW(2,1) are double occurrence words, i.e. words in which every letter occurs exactly twice, and every letter must be colored red once and blue once, so that the number of color changes is minimized.

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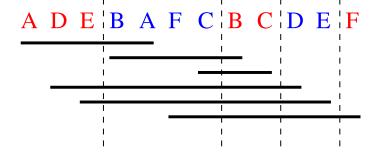
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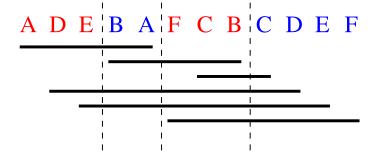
ADEBAFCBCDEF 4 color changes

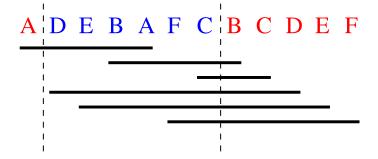
ADEBAFCBCDEF 4 color changes

ADEBAFCBCDEF 2 color changes

A	D	Е	В	A	F	C	В	C	D	E	F
			_				_				







The complexity of the binary paint shop problem

Theorem (Bonsma, Epping, Hochstättler (06); Meunier, Sebő (09)) The binary paint shop problem is \mathcal{APX} -hard.

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Corollary

The binary paint shop decision problem is \mathcal{NP} -complete.

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Corollary

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Problem

Is the binary paint shop problem in APX, i.e. is there a (polynomial) constant factor approximation?

Color the first letter red.

Scan the word from left to right, as long possible use the same color.

ABBCDECFGDFHIJKLHKAJIELG

Color the first letter red.

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AB BCDECFGDFHIJKLHKAJIELG

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ABBCDE CFGDFHIJKLHKAJIELG

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ABBCDECFGD FHIJKLHKAJIELG

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ABBCDECFGDFHIJKL HKAJIELG

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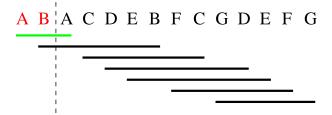
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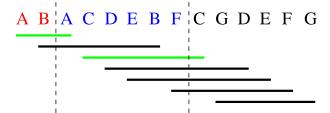
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A I	3	A	C	D	E	В	F	C	G	D	E	F	G
-								_		_			

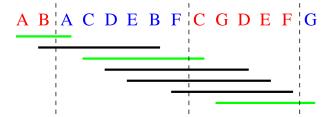
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Optimality and perfectness of the greedy heuristic

Theorem (Amini, Meunier, Michel, Mohajeri (2010))

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The greedy heuristic is optimal on instances that do not contain subwords of the form ABACCB or ABBCAC.

Theorem (Rautenbach, Szigeti (2012))

The greedy heuristic is optimal on every subword of a word w if and only if w does not contain subwords of the form ABACCB or ADDCCAB or ADDCBCAB.

Expected number of color changes for the greedy

Theorem (Amini, Meunier, Michel, Mohajeri (2010))

The expected number of color changes for the greedy heuristic on uniformly distributed double occurrence words of the length 2n with n characters is

$$\mathbb{E}_n(g)\leq \frac{2}{3}n.$$

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The expected number of color changes for the greedy heuristic on uniformly distributed double occurrence words of the length 2n with n characters is

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Conjecture (Amini, Meunier, Michel, Mohajeri (2010))

$$\lim_{n\to\infty}\frac{1}{n}\mathbb{E}_n(g)=\frac{1}{2}.$$

Idea: The greedy heuristic ignors the first occurrence of a letter.

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Only the second occurrence of Z can create an additional color change.

ABCDBE DAEC

On the proof of the conjecture I

Idea: The greedy heuristic ignors the first occurrence of a letter. Consider the last letter Z of a word. If we delete both occurrences of Z, then greedy colors the rest of the word in the same way.

Only the second occurrence of Z can create an additional color change. This happens in about a half of the cases.

ABCDBEZDAECZ

On the proof of the conjecture II

Lemma

The greedy heuristic colors the first occurrence of Z red with probability $\frac{n}{2n-1}$ resp. blue with probability $\frac{n-1}{2n-1}$.

On the proof of the conjecture II

Lemma

The greedy heuristic colors the first occurrence of Z red with probability $\frac{n}{2n-1}$ resp. blue with probability $\frac{n-1}{2n-1}$.

Proof. First occurrence of Z

- at the beginning: Z red 1 case
- after red letter: $Z \operatorname{red} n 1 \operatorname{cases}$
- after blue letter: Z blue n-1 cases



$$\frac{n-1}{2n-1}$$

$$\mathbb{E}_n(g) = \sum_{k=0}^{n-1} \frac{2k^2 - 1}{4k^2 - 1}.$$



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$$\stackrel{\text{i.h.}}{=} \sum_{k=0}^{n-2} \frac{2k^{2}-1}{4k^{2}-1} + \frac{n^{2}-2n}{4n^{2}-8n+3} + \frac{n^{2}-2n+1}{4n^{2}-8n+3}$$



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$$= \sum_{k=0}^{n-2} \frac{2k^{2}-1}{4k^{2}-1} + \frac{2(n-1)^{2}-1}{4(n-1)^{2}-1} = \sum_{k=0}^{n-1} \frac{2k^{2}-1}{4k^{2}-1}.$$

$$A_1 \dots A_k A_k A_{k+1} \dots A_{2k} A_{2k} A_1 A_{k+1} A_2 A_{k+2} \dots A_{k-1} A_{2k-1}$$

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Greedy: n color changes; Optimal: 3 color changes

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Greedy: n color changes; Optimal: 3 color changes

⇒ Greedy is not a constant factor approximation

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on the worst-case instance of greedy red-first colors optimally!

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red-first needs n+1 color changes; greedy/optimal coloring needs 2

---- Red-first is neither a constant factor approximation

Result for the red-first heuristic

Theorem (A, Hochstättler (2011))

The expected number of color changes for the red-first heuristic on an instance of length 2n is

$$\mathbb{E}_n(rf)=\frac{2n+1}{3}.$$

AZABBZ

AZ ABBZ

AZAB BZ

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Recursive greedy heuristic:

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 \rightarrow delete both occurrences of the last letter Z

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- \longrightarrow delete both occurrences of the last letter Z
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Recursive greedy heuristic:

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Result for the recursive greedy heuristic

Theorem (A, Hochstättler (2011))

For all $n \ge 1$, the expected number $\mathbb{E}_n(rg)$ of color changes for the recursive greedy heuristic is bounded by

$$\frac{2}{5}n + \frac{8}{15} \leq \mathbb{E}_n(rg) \leq \frac{2}{5}n + \frac{7}{10}.$$

red-first heuristic
$$\lim_{n\to\infty}\frac{1}{n}\mathbb{E}_n(rf) = \frac{2}{3}$$
 greedy heuristic
$$\lim_{n\to\infty}\frac{1}{n}\mathbb{E}_n(g) = \frac{1}{2}$$
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Problem

Find better heuristics (with expected number of color changes $\leq 2n/5$).

red-first heuristic
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Problem

Find better heuristics (with expected number of color changes < 2n/5).

Problem

Characterize the instances where the recursive greedy is optimal.

Optimal coloring

Problem

Determine the expected number of color changes for optimal coloring.

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Determine the expected number of color changes for optimal coloring.

n	1	2	3	4	5	6	7
$\mathbb{E}(\mathit{opt})$	1	<u>4</u> 3	<u>26</u> 15	223 105	<u>2355</u> 945	29541 10395	429677 135135
$\frac{\mathbb{E}(opt)}{n}$	1	0.6667	0.5778	0.5310	0.4984	0.4736	0.4542

Optimal coloring

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Determine the expected number of color changes for optimal coloring.

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$\frac{\mathbb{E}(opt)}{n}$	1	0.6667	0.5778	0.5310	0.4984	0.4736	0.4542

Conjecture (Meunier, Neveu (2012))

This number is sublinear in n.

Optimal coloring and heuristics

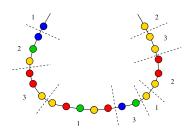
Remark

In case

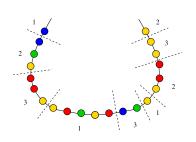
- there is a constant factor approximation and
- the expected number of color changes for optimal coloring is sublinear

every constant factor approximation for the binary paint shop problem is (in expectation) a better heuristic than the recursive greedy.

Given: open necklace of length n with t types of beads, every type i occurs qa_i times, q thieves want to cut the necklace in a fair way, so that everyone receives exactly a_i beads of every type i.

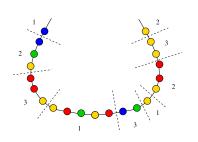


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(binary paint shop:
$$t = \frac{n}{2}$$
, $q = 2$, $a_i = 1$.)

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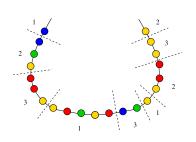


(binary paint shop: $t = \frac{n}{2}$, q = 2, $a_i = 1$.)

Theorem (Alon (1987))

There is a solution with at most (q-1)t cuts.

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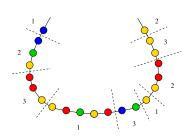
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This is best possible.

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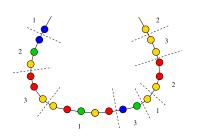
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Problem

Is there a polynomial algorithm to determine these cuts?

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Problem (Meunier, Neveu (2012))

Is the necklace splitting problem PPAD-complete for q = 2?

(binary paint shop: $t = \frac{n}{2}$, q = 2, $a_i = 1$.)

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Thank you!