# Reordering Buffer Management



## Layout

- Problem Definition
- Motivation
- Related Work
- Algorithm:

Almost Tight Bounds for Reordering Buffer Management, Anna Adamaszek and Artur Czumaj, STOC 2011



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- Problem Definition
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#### --Based on Star Metric

#### Input:

A sequence  $\theta$  of n colored items;

Color set C

Buffer size k;

Cost metric  $w_c$  (the cost for switching to a color  $c \in C$  )

#### Output:

A permutation sequence  $\sigma$  of the input sequence  $\theta$ 

#### Objective:

Minimize the total cost switching cost





--Based on Uniform Metric









--Based on Uniform Metric







Cost: 0





--Based on Uniform Metric







Cost: 0





--Based on Uniform Metric



































--Based on Uniform Metric















--Based on Uniform Metric





































Cost: 1





--Based on Uniform Metric



































Cost: 2





--Based on Uniform Metric

































Cost: 2





--Based on Uniform Metric





























Cost: 3





--Based on Uniform Metric





































Cost: 3





--Based on Uniform Metric































Cost: 3





--Based on Uniform Metric





































--Based on Uniform Metric









































--Based on Uniform Metric









Cost: 3





--Based on Uniform Metric







Cost: 4





--Based on Uniform Metric









Cost: 4

 $W_g$   $W_p$   $W_b$   $W_r$ 





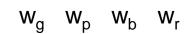
--Based on Uniform Metric















--Based on Uniform Metric

 $\theta$ 







Cost: 4





--Based on Uniform Metric

 $\theta$ 







Cost: 4





--Based on Uniform Metric

















Cost: 4





--Based on Uniform Metric

 $\theta$ 







Cost: 4





--Based on Uniform Metric

 $\theta$ 







Cost: 4





--Based on Uniform Metric

 $\theta$ 







Cost: 4





--Based on Uniform Metric

 $\theta$ 







Cost: 4





--Based on Uniform Metric

 $\theta$ 







Cost: 5

 $W_g \quad W_p \quad W_b \quad W_r$ 





--Based on Uniform Metric

 $\theta$ 







Cost: 5

 $W_g \quad W_p \quad W_b \quad W_r$ 





--Based on Uniform Metric

 $\theta$ 







Cost: 5





--Based on Uniform Metric

 $\theta$ 





Cost: 5





--Based on Uniform Metric

 $\theta$ 





Cost: 6





--Based on Uniform Metric

 $\theta$ 





Cost: 6





--Based on Uniform Metric

 $\theta$ 





Cost: 6





--Based on Uniform Metric

 $\theta$ 





Cost: 7

#### **Problem Definition**





--Based on Uniform Metric

 $\theta$ 





Cost: 8

 $W_g W_p W_b W_r$ 

### Layout

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#### Motivation

- Numerous Application
- Automotive assembly paint shop
- Graphic rendering processors, storage systems network optimization
- Inverted index compression
- Buffers are pervasive in computer and production systems
- Simple, elegant, natural, non-trivial, and appealing model (a sensible generalization of lookahead)

#### A sensible generalization of LOOKAHEAD

- There are different variations on the exact type of information provided to the algorithm under lookahead but arguably the most common one is to assume that, at every point in time, the algorithm has knowledge of the attributes of the next k tasks to arrive. This assumption is justified by the fact that, in practice, tasks may not always strictly arrive one-by-one and therefore, a certain number of tasks are always waiting in a queue to be processed.
- In recent years, so-called reordering buffers have been studied as a sensible generalization of lookahead. The basic idea is that, in problem settings where the order in which the tasks are processed is not important, we can permit a scheduling algorithm to choose to process any task waiting in the queue. This stands in contrast to look-ahead, where the algorithm has knowledge of all the tasks in the queue but still has to process them in the order they arrived.

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#### Related Work

- Mostly in the online setting (competitive analysis)
- $\triangleright$  Upper bounds[RSW'02, EW'05, AR'10, STOC'11]—STOC'11( $\Omega(\log \log k)$ )
- $\triangleright$  Lower bounds[STOC'11]  $\Omega(\sqrt{\log k/\log\log k})$ (det.)  $O(\sqrt{\log k})$  (rand.)
- The algorithms balance between removing large color blocks and removing older color blocks
- E.g. the following algorithm gives  $O(\log k)$
- > While the buffer contains an item of the current color,
- Switch to a color with maximum total penalty and
- Penalize each item the buffer by 1/k.
- The problem is NP-hard[AKM'10]

## lower bound VS upper bound

- Lower bound (all the algorithms)
- ➤ As for online, it aims at the competitive ratio of all the online algorithms (NP-hard problems: offline algorithms should also be bounded)
- Upper bound (all the sequences)
- ➤ As for online, it aims at designing new online algorithms to get smaller competitive ratio
- People attempt to make lower bound and upper bound more and more tight
- We focus on the upper bound of an online algorithm

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- Premise
- Class
- Lower bound of any online algorithms
- Online algorithm (upper bound)
- penalty

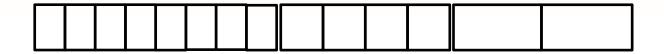


- Premise
- Class
- Lower bound of any online algorithms
- Online algorithm (upper bound)
- > penalty



#### Partition the buffer

• Class – A color is in class i, i=1,2,...,log k at time t if the algorithm stores between  $2^{i-1}$  to  $2^i$  elements of this color at time t.



- Premise
- > partition of the buffer
- Lower bound of any online algorithms
- Online algorithm (upper bound)
- > penalty



## lower bound of any online alg.

- Basic idea:
- For any online algorithms of this problem, we can find a sequence (worst sequence)
- There exists an OPT under this worst sequence consuming smaller cost than any online algorithms
- $\triangleright$  The gap grows to  $\Omega(\sqrt{\log k/\log\log k})$
- The sequence must satisfy some properties:
- $\triangleright$  Define OPT' whose buffer has a size of  $(1+\alpha)k$
- $\triangleright$  OPT' can output a permutation  $\sigma$ , in which the number of color changes equals to that of different colors in

- Premise
- ➤ Class
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### Penalty(from a survey)

- The previous algorithms introduce a penalty counter for each color
- PENALTY:
- Initially set penalty for each color to 0
- Incase you need to do a color-change:
  - Increase the penalty of each color by the number of elements that are in the buffer (uniform metric).
  - Switch to an arbitrary color. Set its counter to 0

### The online algorithm

#### Penalty distribution + Marking:

- Initially set penalty for each color Pc to 0.
- If there is no marked color choose a class and mark all colors in this class
- Switch to an arbitrary marked color. Unmark the color.
  Set its counter Pc to zero
- Increase the penalty Pc of every color by a value proportional to the number of elements n<sub>c</sub> in color c stored in the buffer

#### Algorithm 1 Largest Color Class (LCC) 1: Output: a new output color 2: // let $n_c$ denote the number of elements 3: // with color c in the buffer 4: $\forall \text{ colors } c: t_c \leftarrow \frac{w_c - P_c}{n_c/k}; \quad t \leftarrow \min(\{t_c \mid \text{ color } c\} \cup \{P\});$ 5: $P \leftarrow P - t$ ; $\forall \text{ colors } c : P_c \leftarrow P_c + \frac{n_c}{k} \cdot t$ 6: // the above ensures that t is small enough such that 7: $//P \ge 0$ and $P_c \le w_c$ for all c 8: if P=0 then if no marked color exists then 9: 10: // let $C_{\text{max}}$ denote the class that occupies 11: // the largest space in the buffer 12: mark all colors in $C_{\text{max}}$ 13: end if 14: // let $c_m$ denote an arbitrary marked color 15: $P \leftarrow w_{c_m}$ 16: $P_{c_m} \leftarrow 0$ 17: unmark color $c_m$ return color $c_m$ as the new output color 18: 19: else $c_a \leftarrow \operatorname{arg\,min}_c t_c // \operatorname{pick\,color} c_a \operatorname{such\,that} P_{c_a} = w_{c_a}$ 20: 21: $P_{c_a} \leftarrow 0$ 22: unmark color $c_a$ if it was marked 23: return color $c_a$ as the new output color 24: end if

# Thanks!

Q&A

