



Sebastian Buchwald, Manuel Mohr, Ignaz Rutter

Chair for Programming Paradigms & Chair for Algorithmics, Karlsruhe Institute of Technology (KIT)



KIT – University of the State of Baden-Wuerttemberg and National Research Center of the Helmholtz Association

www.kit.edu



Register Allocation and Shuffle Codea = 10;ab = 20;r1c = 30;r1d = 40; \dots print (a, a, c, b, d);



2 August 5, 2015

Register Allocation and Shuffle Code

```
c = 30;
d = 40;
. . .
```

a = 10;

b = 20;

print(a, a, c, b, d);







Register Allocation and Shuffle Code



r5

r5

d

С

r4

r4

b

b

r3

r3

с

a = 10; b = 20; c = 30; d = 40; ... print(a, a, c, b, d);

Register Transfer Graph (RTG)



а

r1

r1

а

r2

а

Register Allocation and Shuffle Code



a = 10; b = 20; c = 30; d = 40; ... print(a, a, c, b, d);



Register Transfer Graph (RTG)



copy r1, r2 swap r3, r4

c = 30; d = 40; ... print(a, a, c, b, d); r1 r2 r(a) (a) (c)

Register Allocation and Shuffle Code





Register Transfer Graph (RTG)

a = 10; b = 20;

$$\begin{array}{c} & & \\ 1 \rightarrow 2 & 3 \\ \hline & 4 & 5 \end{array}$$

copy r1, r2 swap r3, r4

Shuffle Code Generation Problem

Find a shortest shuffle code that implements a given RTG.



- For large RTGs, implementations can get lengthy
- ⇒ Proposed more powerful permutation instructions [Mohr et al. 2013]



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- Exists as FPGA-based prototype processor with modified compiler [Mohr et al. 2013]
 - Improves performance in practice
 - Uses greedy heuristic





SCGP with permutation instructions

Given RTG, find a shortest shuffle code using permi5, permi23 and copy.



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Naive implementation: copy r1, r2 copy r1, r3 permi5 r4, r5, r6



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Optimal implementation: permi23 r1, r2, r4, r5, r6 copy r2, r3



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Shuffle Code Generation as a Graph Problem



















$$\pi \quad \bullet \quad (V, E) = (V, \{(\pi(u), v) \mid (u, v) \in E\})$$
$$] \bullet \quad 1 \quad 2 \quad 3 = 1 \quad 2 \quad 3$$



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Effect of a copy:



Observations on Shuffle Code







Observations	Karlsruhe Institute of Technology	
rewrite to	Copy $a \rightarrow b$ followed by transposition $\tau = (c$	c d)
	Transposition (<i>c d</i>) followed by copy $\tau(a) \rightarrow$	τ(b)

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 π permutes edge sources in *G*


Can transform shuffle code such that in πG , for every copy $u \rightarrow v$:



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- \Rightarrow All outgoing edges (except one) of *u* in *G* correspond to copies



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- π permutes edge sources in G
- ⇒ All outgoing edges (except one) of u in G correspond to copies → copy set









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(For each vertex, color one outgoing edge red, rest blue.)





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Problem 1: Given copy set *C*, compute optimal shuffle code for G - C. **Problem 2:** Find copy set *C* where G - C requires fewest instructions.



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 - While there is a cycle K of size 4 or more: use permi5 to reduce K's size





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Signature $sig(G) = (X, a_2, a_3)$

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$$X = \sum_{\sigma \in G} \lfloor \operatorname{size}(\sigma)/4 \rfloor$$

• $a_i = |\{\sigma \in G \mid \operatorname{size}(\sigma) = i \mod 4\}|$



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$\begin{aligned} &\textbf{Signature } \operatorname{sig}(G) = (X, a_2, a_3) \\ & \textbf{X} = \sum_{\sigma \in G} \lfloor \operatorname{size}(\sigma) / 4 \rfloor \\ & \textbf{a}_i = |\{\sigma \in G \mid \operatorname{size}(\sigma) = i \mod 4\}| \\ & \textbf{Cost function } \operatorname{GREEDY}(G) = X + \begin{cases} \lceil (a_2 + a_3)/2 \rceil & \text{if } a_2 \geq a_3 \\ \lceil (a_2 + 2a_3)/3 \rceil & \text{if } a_2 < a_3 \end{cases} \end{aligned}$



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Theorem

GREEDY is optimal for PRTGs.



G









• Take arbitrary permutation instruction π





- Take arbitrary permutation instruction π
- Show that always $GREEDY(G) \le GREEDY(\pi G) + 1$ $\Leftrightarrow GREEDY(G) - GREEDY(\pi G) \le 1$







































- Look at all possible signature changes $(\Delta_X, \Delta_2, \Delta_3)$
- Cost change only depends on signature change





- Look at all possible signature changes (Δ_X, Δ₂, Δ₃)
- Cost change only depends on signature change

	0	1	2	3		0	1	2	3	
0	0	0	0	0	0	0	0	0	0	
1		1/2	0	1⁄2	1		1⁄3	1⁄3	1⁄3	
2			0	0	2			1⁄3	0	
3				1/2	3				0	
$a_2 \geq a_3$						$a_2 < a_3$				
Merges





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0	0	0	0	0	0	0	0	0	0	
1		1/2	0	1/2	1		1⁄3	1⁄3	1⁄3	
2			0	0	2			1⁄3	0	
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1		1/2	0	1/2	1		1⁄3	1⁄3	1⁄3	
2			0	0	2			1⁄3	0	
3				1/2	3				0	
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⇒ Merges are never worthwhile!













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GREEDY is optimal for PRTGs

GREEDY computes an optimal shuffle code for PRTGs in linear time.



Given G, have to find copy set C, s.t. GREEDY(G - C) is minimal



Given *G*, have to find copy set *C*, s.t. GREEDY(G - C) is minimal Equivalent to minimizing

$$\mathsf{GREEDY}'(\mathbf{G} - \mathbf{C}) = \begin{cases} X + \frac{a_2}{2} + \frac{a_3}{2} \\ X + \frac{a_2}{3} + \frac{2a_3}{3} \end{cases}$$

if $a_2 \ge a_3$ if $a_2 < a_3$

• Distinguish cases with diff $(G - C) = a_2 - a_3$



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$$\mathsf{GREEDY}'(G-C) = \begin{cases} X + \frac{a_2}{2} + \frac{a_3}{2} =: cost^1(G-C) & \text{if } a_2 \ge a_3 \\ X + \frac{a_2}{3} + \frac{2a_3}{3} =: cost^2(G-C) & \text{if } a_2 < a_3 \end{cases}$$

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Dynamic program with tables $T^1[\cdot]$, $T^2[\cdot]$ $T^i[d] = \min\{ \cot^i(G - C) \mid C \text{ copyset with } \operatorname{diff}(G - C) = d \}$



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Computing Tables for Different RTG Shapes







Disconnected RTGs $O(n^2)$

Computing Tables for Different RTG Shapes







Disconnected RTGs Tree RTGs



Computing Tables for Different RTG Shapes





Disconnected RTGs $O(n^2)$ Tree RTGs $O(n^3)$ Connected RTGs containing cycle $O(n^4)$

Conclusion



Problem 1: Given copy set C, compute optimal shuffle code for G - C.

- Shown that GREEDY is optimal for PRTGs, runs in O(n) time
- Equivalent to factoring permutation into shortest product of permutations of maximum size 5

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Future work:

- Works for k = 3, 4, 5, 6, what about larger sizes?
- Problem NP-complete if permutation size is part of input
- \Rightarrow FPT-algorithm?



Backup Slides

Speedup Measurements























• $C := C_1 \cup C_2$ • $\cot(G - C) = \cot(H_1 - C_1) + \cot(H_2 - C_2)$ • $\operatorname{diff}(G - C) = \operatorname{diff}(H_1 - C_1) + \operatorname{diff}(H_2 - C_2)$







• $C := C_1 \cup C_2$

- $\operatorname{cost}(G C) = \operatorname{cost}(H_1 C_1) + \operatorname{cost}(H_2 C_2)$
- diff(G C) = diff $(H_1 C_1)$ + diff $(H_2 C_2)$
- \Rightarrow Can find optimal copy set C by trying all pairs C_1 , C_2
- \Rightarrow Can be computed in $O(n^2)$ time































- Process tree RTGs in bottom-up fashion
- Extend table to track length of path

starting at root







- Process tree RTGs in bottom-up fashion
- Extend table to track length of path (modulo 4) starting at root

Tree RTGs





- Process tree RTGs in bottom-up fashion
- Extend table to track length of path (modulo 4) starting at root
- \Rightarrow Can find optimal copy set C by trying all outgoing edges of root
- \Rightarrow Can be computed in time $O(n^3)$









Either keep cycle K and put edges leaving K into copy set





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Either keep cycle K and put edges leaving K into copy set
Or cut K, G - C is a tree
Connected RTGs





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Connected RTGs





- Either keep cycle K and put edges leaving K into copy set
- Or cut K, G C is a tree
- \Rightarrow Can find optimal copy set C by trying all of K's edges (or keeping K)
- \Rightarrow Can be computed in time $O(n^4)$