## Blocked In-Place Rectangular Transpose

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## Main Idea

- Combine Cache Blocking with Point InPlace Transpose on a very tiny matrix
$\square$ use of RB Format is the key idea
$\square \mathrm{CM}$-> RB -> RB ${ }^{\top}$-> CM
$\square S B$ is special case of RB
- Block In-Place Transpose is Very Fast relative to Point In-Place Transpose
- CM <-> RB uses fast vector In-Place Alg.


## Summary or Overview

- $A$ is $M$ by $N$.
- $\mathrm{M}=\mathrm{m}^{*} \mathrm{MB}$ \& $\mathrm{N}=\mathrm{n}$ *NB
- CM -> RB by vector IP transpose
- RB <-> RB ${ }^{\top}$ by block IP transpose
$\square$ use point IP transpose on m by n A1= SB A
- RB' -> CM by vector IP transpose


# Vector In-Place Xpose or CM<->SB 

- Let A be M by NB with $\mathrm{M}=\mathrm{m}^{*} \mathrm{MB}$
- View A as m by NB A1 with each a1(i,j) being a column vector of size NB
- Apply point IP transpose to A1 to get A2
- A2 is m order NB SB's concatenated
- Apply above subroutine $\mathrm{n}=\mathrm{N} / \mathrm{NB}$ times


## Where does the Speed Come From

- Data moved in blocks and vectors gives a 10 to 100 times performance gain
$\square$ uses stride one processing; every line gets fully used when it enters L1 and streaming by algorithmic / automatic pre-fetching works
- SMP parallelism is easy to implement
$\square$ disjoint cycle structure
$\square$ long cycles can be broken into pieces


## Other Matrix Layouts

- Can block transform (in-place) any permutation that can be described by a compact functional description
$\square$ includes all common matrix data layouts
- standard CM / RM rectangular arrays
- standard CM / RM triangular arrays
- standard packed format


## An Example of CM to RB

- $A$ is $\mathrm{M}=500$ by $\mathrm{NB}=4$
$\square M=m * M B$ with $M B=100$ and $m=5$
- A1 is $m=5$ by NB = 4; each element of A1 is a vector of length $M B=100$
- Both A and A1 are identical in storage and occupy M*NB = 2000 contiguous locations


## Picture of the Previous slide

| 0 | 0 | 50010001500 |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | 0 | 1 | 2 | 3 |
|  | 00 | 01 | 02 | 03 |
| 100 | 10 | 11 | 12 | 13 |
| 200 | 20 | 21 | 22 | 23 |
| 300 | 30 | 31 | 32 | 33 |
| 400 | 40 | 41 | 42 | 43 |


|  | 0 |  | 400 | 800 | 1200 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 0 | 1 | 2 | 3 | 4 |
| 0 | 00 | 10 | 20 | 30 | 40 |
| 100 | 01 | 11 | 21 | 31 | 41 |
| 200 | 02 | 12 | 22 | 32 | 42 |
| 300 | 03 | 13 | 23 | 33 | 43 |

## Previous slide shows CM to RB is vector in place transpose

- The left matrix A1 is a $m=5$ by NB $=4$ matrix whose elements are vectors of length $M B=100$. This matrix is in standard CM format.
- The right matrix is the NB=4 by $m=5$ vector transpose of A1. It is in RB format consisting of $m=5$ RB's of size $M B=100$ by $\mathrm{NB}=4$.


## Details of vector in place transpose

- 0 and $\mathrm{m}^{*} \mathrm{n}-1=10$ are singleton cycles
- 19 is prime and \# d=2;1\&19
- $\mathrm{q}=\mathrm{m}^{*} \mathrm{n}-1=19$ is the mod value
- For problem 19, phi = 18 \& cl = 9; leaders are 1, 2
- For problem 1, phi = $1 \& \mathrm{cl}=1$ at 19
- Further details follow


## More Details continued

- cycle one $=1,4,16,7,9,17,11,6,5,1$
- cycle two $=2,8,13,14,18,15,3,12,10,2$
- cycle three $=19$
- cycle four $=0$
- These four cycles cover all of A1's twenty vectors of length MB = 100
- These four cycles cover all 2000 elements of $A$ and transform A from CM format to RB format


## A1 layout of A; see slide \# 8

|  | $0 \quad 5 \quad 10 \quad 15$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | 0 | 1 | 2 | 3 |
| 0 | 00 | 01 | 02 | 03 |
| 1 | 10 | 11 | 12 | 13 |
| 2 | 20 | 21 | 22 | 23 |
| 3 | 30 | 31 | 32 | 33 |
| 4 | 40 | 41 | 42 | 43 |


|  |  |  |  | $\begin{gathered} 12 \\ 3 \end{gathered}$ | 16 4 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 00 | 10 | 20 | 30 | 40 |
| 1 | 01 | 11 | 21 | 31 | 41 |
| 2 | 02 | 12 | 22 | 32 | 42 |
| 3 | 03 | 13 | 23 | 33 | 43 |

## In Place Transpose Mapping

$$
(i, j) \underset{\mathrm{F}^{-1}}{\stackrel{\mathrm{~F}}{\leftrightarrows}} i j \quad \text { (Old) }
$$

M

$$
\begin{aligned}
& F(i, j) \mapsto i+m \cdot j \\
& F^{-1}(i j) \mapsto\left(\bmod (i j, m),\left\lfloor\frac{i j}{m}\right\rfloor\right) \\
& F T(i, j) \mapsto j+n \cdot i \\
& M(i j) \mapsto \bmod (n \cdot i j, q)
\end{aligned}
$$

$$
\mathrm{M}=\mathrm{FT}^{\circ} \circ \mathrm{F}^{-1}
$$

## Mapping $(1,3)$ to $(2,1)$




## Picture of the 4 cycles of slide \# 11

| 0 | 8 | 8 | 5 |
| :--- | :--- | :--- | :--- |
| 0 | 7 | 6 | 2 |
| 0 | 3 | 7 | 5 |
| 6 | 1 | 2 | 4 |
| 1 | 4 | 3 | 0 |

## A is 500 by 700 in CM order

- CM A has LDA = 500
- A has 7 column swaths: 500 by 100 each
- A1 is 5 by 100 matrix of vectors
- In-place transpose with q = 499
- repeat above 6 more times
- A is now in SB format of size 5 by 7


## Details of CM to SB Vector

- 0 and $\mathrm{m}^{*} \mathrm{n}-1=499$ are singleton cycles
- 499 is prime and \# d=2;1\&499
- $q=m * n-1$ is the mod value
- for problem 499, phi = $498 \& \mathrm{cl}=249$; leaders are 1, 2
- for problem 1, phi = $1 \& \mathrm{cl}=1$ at 499


## Details of SB to $\mathrm{SB}^{\top}$

- $q=5^{*} 7-1=34=2 * 17$
- q = sum over divisors of phi
$\square \# d=4 ; 34,17,2,1$; phi's $=16,16,1,1$
- \#d problems gives cycles of length 16, 16, 1,1 starting at $1,2,17,34$


## Cycles for SB to SB ${ }^{\top}$

- $\operatorname{Map}(\mathrm{ij})=\bmod \left(\mathrm{ij}{ }^{*} \mathrm{n}, \mathrm{q}\right) ; \mathrm{m}=5, \mathrm{n}=7$, $q=m * n-1=34$
- cycle one: $1,7,15,3,21,11,9,29,33$, 27, 19, 31, 13, 23, 25, 5, 1
- cycle two : $2,14,30,6,8,22,18,24,32$, $20,4,28,26,12,16,10,2$
- cycles at 17,34 , and 0 are singletons


## Picture of Map on slide \# 19

| 0 | 15 | 15 | 2 | 9 | 14 | 2 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 3 | 5 | 14 | 4 | 12 | 11 |
| 0 | 1 | 13 | 0 | 5 | 9 | 8 |
| 3 | 4 | 12 | 6 | 13 | 11 | 8 |
| 10 | 6 | 1 | 10 | 7 | 7 | 0 |

## Details of $\mathrm{SB}^{\top}$ to CM

- m = 100, $\mathrm{n}=7, \mathrm{q}=699=3^{*} 233$

■ \# d = 4; 699, 233, 3, 1; phi's 464, 232, 2, 1

- cl's are 166, 166, 1, 1
- leaders are 1, 2, 5, 10; 3, 9; 233, 466; 699


## The 500 by 700 A as a point matrix

- $\mathrm{q}=\mathrm{m} * \mathrm{n}-1=349,999=13^{* *} \mathbf{2}^{*} 19^{*} 109$
- \# d's = 3*2*2 = 12:
- sum of phi(d) = q

■ twelve phi's are 303264, 23328, 16848, 2808, 1944, 1296, 216, 156, 108, 18, 12, 1

- twelve cl's are $468,36,156,468,18,12,36$, 156, 6, 9, 12, 1
■ ratio's give \# of leaders: 648, 648, 108, 6,108, 108, 6, 1, 18, 2, 1, 1: sum = 1655


## 500 by 700 A as point matrix

- hand-out has cycle of length 12 at $\mathrm{ij}=247$
$\square \mathrm{ij}$ is $(247,0)$ element of A; next element in cycle is $\bmod \left(247^{*} 700\right.$, q); 247 | q so we get cycle is $\mathrm{i}<-\bmod \left(700^{*} \mathrm{i}, 1417\right)$ :
$\square 247^{*}(1,700,1135,980,172,1372,1091$, $1354,1244,762,608,500,1) \bmod (q)$

