Numerical Comparison of Accelerating Polynomials in Product-type Iterative Methods

# Outline

- Product-type methods
- Accelerating polynomials
- Picking up Bi-CG part
- Reconstructing from a common Bi-CG
- Conclusion

(about accelerating polynomials and Quadruple arithmetic)

#### Iterative methods for Nonsymmetric Matrix

- Product-type methods
  - Bi-CG (1976)
  - CGS (1984, Sonneveld)
  - Bi-CGSTAB (1989, van der Vorst)
  - GPBi-CG(1992, Zhang)
  - Bi-CGSTAB(*l*) (1993)
- Others
  - GCR (1982)
  - GMRES (1983)

## Structure of Product-type methods

• Series of residual vectors in Bi-CG method

 $r_0, r_1, r_2, \ldots, r_k, \ldots$ 

- Series of residual vectors in Product-type method H<sub>0</sub>(A)r<sub>0</sub>, H<sub>1</sub>(A)r<sub>1</sub>, ..., H<sub>k</sub>(A)r<sub>k</sub>, ...
   accelerated and stabilized by k-th polynomial H<sub>k</sub>(A)
- Bi-CG part in these methods must be same in Mathematics!

### **Residual Vectors**

• CGS:  $r_k CGS = R_k(A)r_k$  $R_{k}(A)$  is Residual polynomial of Bi-CG method • Bi-CGSTAB:  $r_k^{STA} = Q_k(A) r_k$  $Q_0() = 1; Q_{k+1}() = (1 - k) Q_k()$ k minimizes  $r_{k+1}$  STA =  $t_k - k$ • GPBi-CG :  $r_k^{GP} = H_k(A) r_k$  $H_0() = 1; H_1() = 1 - 0;$  $H_{k+1}() = (1 + k - k) H_k() - k H_{k-1}()$ k and k minimize  $r_{k+1}^{GP} = t_k - k y_k - k A t_k$ 

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## Test problem

Toeplitz Matrix, N = 200, 
$$\gamma = 1.7$$
  
 $A := \begin{bmatrix} 2 & 1 & & \\ 0 & 2 & 1 & & \\ \gamma & 0 & 2 & 1 & \\ & \gamma & 0 & 2 & \ddots & \\ & & \ddots & \ddots & \ddots & \ddots \end{bmatrix}$ 

Right-hand side 
$$b = (1, 1, \dots, 1)^T$$

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## Convergence history



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# Why?

- We wish that Product-type methods show good convergence history, but some of them could not.
- We try to compare accelerating polynomials  $R_k(A)$ ,  $Q_k(A)$ , and  $H_k(A)$ .
  - Reconstructing Bi-CG from EACH methods
  - Reconstructing EACH methods from one Bi-CG(Bi-CG part in each methods should be same in Mathematics)
- We compute them in Quadruple-arithmetic.

# Picking up Bi-CG part

- All methods have Bi-CG part in their process
- We reconstruct Bi-CG process by using alpha and beta of the CGS, Bi-CGSTAB, and GPBi-CG:

CGS: 
$$r_k^{CGS} = R_k(A)\underline{r}_k$$
  
Bi-CGSTAB:  $r_k^{STA} = Q_k(A) \underline{r}_k$   
GPBi-CG:  $r_k^{GP} = H_k(A) \underline{r}_k$ 

• Bi-CG part must be same in Mathematics, effect of some errors will be shown.

#### Convergence history of Bi-CG part (reconstruct Bi-CG using alpha and beta in each methods)



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#### Convergence of Bi-CG part: Quadruple (reconstruct Bi-CG using alpha and beta in each methods)



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## How Bi-CG part works?

- Bi-CGSTAB converges by an effect of MR part (Bi-CG part is still unstable)
- GPBi-CG makes Bi-CG part stable
- CGS did not converge in Quadruple arithmetic
- In Quadruple arithmetic, simple Bi-CG is the best (Bi-CG is much affected by Rounding errors)
- In Quadruple arithmetic, Bi-CG part in Bi-CGSTAB is bad convergence even if Bi-CG converges.

### Reconstructing from one Bi-CG part

- Bi-CG part must be same in Mathematics, so we force being same Numerically.
- We reconstruct each methods based on the same alpha and beta of the original Bi-CG:

CGS:  $\underline{\mathbf{r}}_{\underline{k}} \stackrel{\text{CGS}}{=} \mathbf{R}_{k}(\mathbf{A})\mathbf{r}_{k}$ Bi-CGSTAB:  $\underline{\mathbf{r}}_{\underline{k}} \stackrel{\text{STA}}{=} \mathbf{Q}_{k}(\mathbf{A}) \mathbf{r}_{k}$ GPBi-CG:  $\underline{\mathbf{r}}_{\underline{k}} \stackrel{\text{GP}}{=} \mathbf{H}_{k}(\mathbf{A}) \mathbf{r}_{k}$ 

• The effect of accelerating polynomials will be shown.

# Convergence history based on one Bi-CG (alpha and beta in Bi-CG are used in all methods)



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# Convergence history based on one Bi-CG (Quadruple arithmetic is used for Bi-CG)



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# Convergence history based on one Bi-CG (Quadruple arithmetic is used for ALL)



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### How accelerating polynomial works

- Qudaruple arithmetic works very well.
- If enough accuracy was provided, Bi-CG was the best.
- Bi-CGSTAB and GPBi-CG work well.
- In Quadruple arithmetic, sometimes it works as braking not as accelerating.
- GPBi-CG is robust in both two conditions.
- CGS does not work in both conditions because of "squared".

## Conclusion

- 1. Quadruple arithmetic is very powerful tool for accelerating and stabilizing, also easy and simple.
- Effects of accelerating polynomials are not same. It depends on Computing Accuracy.
- 3. GPBi-CG converges well, and is robust.
- 4. Bi-CGSTAB converges well, but is not robust.
- 5. Bi-CG is the best in more accurate environment.
- 6. CGS should be out of consideration.

# Appendix

- We believe that high performance should be used not only for "Speeding" but also the "Quality of Computation".
- Effectiveness of Iterative algorithms strongly depends on the Computing Accuracy.
- Quadruple arithmetic operation is not expensive in HighPerformance Computers and classic machines.