ILU and IUL factorizations obtained as by-products of FFAPINV and BFAPINV algorithms

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In this paper, we propose an efficient dropping criterion for IUL factorization obtained from Backward Factored APproximate INverse (BFAPINV) and ILU factorization obtained from Forward Factored APproximate INverse (FFAPINV) algorithms.

In this paper, notations $X_{:,j}$ and $X_{j,:}$ are used as the j-th column and j-th row of matrix X, respectively.

Suppose that matrix A is nonsymmetric. Also suppose that L is an unit lower triangular matrix and Uis an upper triangular matrix. Consider D as a diagonal matrix. In [2], an ILU factorization of matrix A, which is obtained as by-product of FFAPINV [3] process, has been presented. Matrices L, U and Asatisfy relation

$$A \approx LU$$
.

We term this ILU factorization, ILUFF (ILU factorization obtained from Forward Factored APproximate INverse). The following algorithm computes the ILUFF preconditioner.

Algorithm 1 (ILUFF factorization)

```
1. w_1 = e_1^T, z_1 = e_1, d_1 = a_{11}..

2. for j = 2 to n do

3. w_j = e_i^T, z_i = e_i.
                        \begin{aligned} \mathbf{r} & j = 2 \text{ to } n \text{ do} \\ & w_j = e_j^T, \quad z_j = e_j. \\ & \text{for } i = 1 \text{ to } j - 1 \text{ do} \\ & L_{ji} = \frac{A_{j,i} z_i}{d_i} \quad U_{ij} = \frac{w_i A_{:,j}}{d_i} \\ & apply \text{ a dropping rule to } L_{ji} \text{ and to } U_{ij} \\ & z_j = z_j - (\frac{w_i A_{:,j}}{d_i}) z_i, \quad w_j = w_j - (\frac{A_{j,i} z_i}{d_i}) w_i \\ & \text{for all } l \leq i \text{ apply a dropping rule to } z_{lj} \text{ and to } w_{jl} \end{aligned}
   7.
   8.
  9.
                           end for
                          \begin{array}{l} d_j = w_j A_{:,j} \{ \text{not positive definite} \} \\ d_j = w_j A w_j^T \{ \text{positive definite} \} \end{array}
10.
11.
12. end for
13. Return L = (L_{ij}) and U = (d_i U_{ij}).
```

Two below dropping strategies can be used to drop entries of z_i and w_i vectors in Algorithm 1.

• First strategy: At each step j of Algorithm 1, entries z_{lj} and w_{jl} for $l \leq i$ are dropped when

$$|z_{lj}| \le \varepsilon_Z, \qquad |w_{il}| \le \varepsilon_W.$$
 (1)

• **Second strategy:** At each step j of Algorithm 1, the whole vectors

$$z_j = e_j - \sum_{i=1}^{j-1} (\frac{w_i A_{:,j}}{d_i}) z_i, \qquad w_j = e_j^T - \sum_{i=1}^{j-1} (\frac{A_{j,:} z_i}{d_i}) w_i,$$

will be computed and then, entries z_{lj} and w_{jl} , for $l \leq j$, that satisfy the former dropping criterion (1) will be dropped.

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The following proposition presents an efficient way of dropping to compute the ILUFF preconditioner [1].

Proposition 1. Let $\varepsilon_{U,Z}$ and $\varepsilon_{L,W}$ be the same drop tolerance parameter for U,Z and L,W matrices, respectively. Suppose that at each step j of Algorithm 1, entries L_{jk} and U_{kj} , for k < j, be dropped when the criterions

$$|L_{jk}| \|W_{k,:}\|_1 \le \varepsilon_{L,W}, \qquad |U_{kj}| \|Z_{:,k}\|_{\infty} \le \varepsilon_{U,Z},$$
 (2)

satisfied. Thus, for $1 \le i \le j \le n$

ullet if the first dropping strategy be applied to drop entries of Z and W matrices, then

$$|(I - ZU)_{ij}| \le 2(j - i)\varepsilon_{U,Z}, \qquad |(I - LW)_{ji}| \le 2(j - i)\varepsilon_{L,W}.$$

• if the second dropping strategy be applied to drop entries of Z and W matrices, then

$$|(I-ZU)_{ij}| \le (j-i+1)\varepsilon_{U,Z}, \qquad |(I-LW)_{ii}| \le (j-i+1)\varepsilon_{L,W}.$$

Suppose that U is an unit upper triangular matrix. Consider L as a lower triangular matrix and D as a diagonal one. The following algorithm computes the incomplete IUL factorization

$$A \approx UL$$
.

which is obtained as by-product of BFAPINV [4] process. We term this IUL factorization as IULBF (IUL factorization obtained from Backward Factored APproximate INverse).

Algorithm 2 (IULBF factorization)

```
1. w_n = e_n^T, z_n = e_n, d_n = a_{nn}.

2. for j = n - 1 to 1 do

3. w_j = e_j^T, z_j = e_j.

4. for i = j + 1 to n do

5. U_{ji} = \frac{A_{j,i}z_i}{d_i} L_{ij} = \frac{w_i A_{:,j}}{d_i}

6. apply \ a \ dropping \ rule \ to \ U_{ji} \ and \ to \ L_{ij}

7. z_j = z_j - (\frac{w_i A_{:,j}}{d_i})z_i, w_j = w_j - (\frac{A_{j,i}z_i}{d_i})w_i

8. for \ all \ l \geq i \ apply \ a \ dropping \ rule \ to \ z_{lj} \ and \ to \ w_{jl}

9. end for

10. d_j = w_j A_{:,j} {not positive definite}

11. d_j = w_j A w_j^T {positive definite}

12. end for

13. Return L = (d_i L_{ij}) and U = (U_{ij}).
```

Two below dropping strategies can be used to drop entries of vectors z_j and w_j in Algorithm 2.

- First strategy: At each step j of Algorithm 2, entries z_{lj} and w_{jl} , for $l \geq i$, are dropped when criterion (1) is satisfied.
- Second strategy: At each step j of Algorithm 2, the whole vectors

$$z_j = e_j - \sum_{i=j+1}^n \left(\frac{w_i A_{:,j}}{d_i}\right) z_i, \qquad w_j = e_j^T - \sum_{i=j+1}^n \left(\frac{A_{j,:} z_i}{d_i}\right) w_i,$$

will be computed and then, entries z_{lj} and w_{jl} , for $l \geq j$, that satisfy the dropping criterion (1) will be dropped.

The following proposition presents an efficient way of dropping to compute the IULBF preconditioner [1].

Proposition 2. Let $\varepsilon_{U,W}$ and $\varepsilon_{L,Z}$ be the same drop tolerance parameter for U,W and L,Z matrices, respectively. Suppose that at each step j of Algorithm 2, entries L_{kj} and U_{jk} , for k > j, are dropped when the criterions

$$|L_{kj}| \|Z_{:,k}\|_{\infty} \le \varepsilon_{L,Z}, \qquad |U_{jk}| \|W_{k,:}\|_{1} \le \varepsilon_{U,W}.$$
 (3)

satisfied. Thus, for $1 \le j \le i \le n$

ullet if the first dropping strategy be applied to drop entries of Z and W matrices, then

$$|(I - UW)_{ji}| \le 2(i - j)\varepsilon_{U,W}, \qquad |(I - ZL)_{ij}| \le 2(i - j)\varepsilon_{L,Z}.$$

• if the second dropping strategy be applied to drop entries of Z and W matrices, then

$$|(I - UW)_{ji}| \le (i - j + 1)\varepsilon_{U,W}, \qquad |(I - ZL)_{ij}| \le (i - j + 1)\varepsilon_{L,Z}.$$

References

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