

Treating breakdowns and near breakdowns in JHESS-algorithm for a reducing a matrix to upper J -Hessenberg form

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- SRDECO algorithm
- Existence of SR decomposition - link with SRDECO
- JHESS algorithm
- Curing breakdowns or treating near-breakdowns in JHESS
- Numerical experiments

Motivation

- The aim of this talk is to treat breakdown and near breakdown in JHESS algorithm.
- JHESS (and recent variants) reduces a matrix to a condensed form : the upper J - Hessenberg form, via elementary symplectic transformations.
- The J -Hessenberg reduction is a key step in the SR -algorithm for computing eigensystems of a class of structured matrices as Hamiltonian, skew Hamiltonian, symplectic matrices.
- The J -Hessenberg form is crucial for structure-preserving model reduction methods for a class of large and sparse structured matrices.

The J -Hessenberg condensed form

- We recall that a matrix $H = \begin{bmatrix} H_{11} & H_{12} \\ H_{21} & H_{22} \end{bmatrix} \in \mathbb{R}^{2n \times 2n}$, is upper J -Hessenberg when H_{11} , H_{21} , H_{22} are upper triangular and H_{12} is upper Hessenberg.
- For example $n = 4$, we have

$$H = \left[\begin{array}{cccc|cccc} x & x & x & x & x & x & x & x \\ 0 & x & x & x & x & x & x & x \\ 0 & 0 & x & x & 0 & x & x & x \\ 0 & 0 & 0 & x & 0 & 0 & x & x \\ \hline x & x & x & x & x & x & x & x \\ 0 & x & x & x & 0 & x & x & x \\ 0 & 0 & x & x & 0 & 0 & x & x \\ 0 & 0 & 0 & x & 0 & 0 & 0 & x \end{array} \right].$$

Van Loan's transformations

Let J_{2n} be $J_{2n} = J = \begin{bmatrix} 0 & I_n \\ -I_n & 0 \end{bmatrix}$. A matrix S is symplectic iff $S^T J S = J$.

Orthogonal and symplectic transformations

- Van Loan's Householder transformation :

$$H(k, w) = \begin{pmatrix} \text{diag}(I_{k-1}, P) & 0 \\ 0 & \text{diag}(I_{k-1}, P) \end{pmatrix}, \text{ where}$$

$$P = I - 2ww^T / w^T w, \quad w \in \mathbb{R}^{n-k+1}.$$

- Van Loan's Givens transformation : $J(k, c, s) = \begin{pmatrix} C & S \\ -S & C \end{pmatrix}$,

where $C = \text{diag}(I_{k-1}, c, I_{n-k})$ and $S = \text{diag}(0_{k-1}, s, 0_{n-k})$,
with $c^2 + s^2 = 1$.

Symplectic Gauss transformations

The *SR* factorization (and reduction to J-Hessenberg) can not be performed for a general matrix by using the sole *H* and *J* transformations. A third type *G*, introduced in Bunse-Gestner 1986, is given by

$$G(k, \nu) = \begin{pmatrix} D & F \\ 0 & D^{-1} \end{pmatrix}, \quad (1)$$

where $k \in \{2, \dots, n\}$, $\nu \in \mathbb{R}$ and D , F are the $n \times n$ matrices

$$D = I_n + \left(\frac{1}{(1 + \nu^2)^{1/4}} - 1 \right) (\mathbf{e}_{k-1} \mathbf{e}_{k-1}^T + \mathbf{e}_k \mathbf{e}_k^T),$$

$$F = \frac{\nu}{(1 + \nu^2)^{1/4}} (\mathbf{e}_{k-1} \mathbf{e}_k^T + \mathbf{e}_k \mathbf{e}_{k-1}^T).$$

The matrix $G(k, \nu)$ is symplectic and non-orthogonal.

SR-decomposition

It is the equivalent of QR decomposition.

- SR decomposition: $A = SR$, with S symplectic and R J -triangular.
- R J -triangular means $R = \begin{bmatrix} R_{11} & R_{12} \\ R_{21} & R_{22} \end{bmatrix}$ with R_{11} , R_{12} , R_{22} are upper triangular and R_{21} is strictly upper triangular.

The SRDECO algorithm, as introduced in Bunse -Gestner et al 86 :
Given $A \in \mathbb{R}^{2n \times 2n}$, the algorithm determines an *SR* decomposition of A , using functions

- vlg (symplectic and orthogonal)
- vlh (symplectic and orthogonal)
- gau (symplectic but not orthogonal)

Function vlg

The function `vlg` uses Van Loan's Givens transformation $J(k, c, s)$ as follows : for a given integer $1 \leq k \leq n$ and a vector $a \in \mathbb{R}^{2n}$, it determines coefficients c and s such that the $n + k$ th component of $J(k, c, s)a$ is zero. All components of $J(k, c, s)a$ remain unchanged, except eventually the k th and the $n + k$.

vlg

```
function[c,s]=vlg(k,a)
```

```
1. twon = length(a); n = twon/2;
```

```
2. r = sqrt(a(k)^2 + a(n+k)^2);
```

```
3. if r = 0 then c = 1; s = 0;
```

```
4. else 5. c = a(k)/r; s = a(n+k)/r;
```

```
end
```

Function vlh

The function *vlh* uses Van Loan's Householder transformation $H(k, w)$ as follows : for a given integer $k \leq n$ and a vector $a \in \mathbb{R}^{2n}$, a vector $w = (w_1, \dots, w_{n-k+1})^T$ is determined such that the components $k + 1, \dots, n$ of $H(k, w)a$ are zeros. All components $1, \dots, k - 1$ and $n + 1, \dots, n + k - 1$ remain unchanged.

vlh

```
function[ $\beta$ ,w]=vlh(k,a)
```

```
1.  $twon = \text{length}(a)$ ;  $n = twon/2$ ;
```

```
%  $w = (w_1, \dots, w_{n-k+1})^T$ ;
```

```
2.  $r1 = \sum_{i=2}^{n-k+1} a(i+k-1)^2$ ;
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```
3.  $r = \sqrt{a(k)^2 + r1}$ ;
```

```
4.  $w_1 = a(k) + \text{sign}(a(k))r$ ;
```

```
5.  $w_i = a(i+k-1)$  for  $i = 2, \dots, n-k+1$ ;
```

```
6.  $r = w_1^2 + r1$ ;  $\beta = \frac{2}{r}$ ;
```

```
% $P = I - \beta ww^T$ ;  $(H(k, w)a)_i = 0$  for  $i = k + 1, \dots, n$ .
```

Function gau

The function *gau* uses the transformation $G(k, \nu)$ as follows : for a given integer $k \leq n$ and a vector $a \in \mathbb{R}^{2n}$, satisfying the condition $a_{n+k} = 0$ only if $a_{k+1} = 0$, it determines ν such that the $k + 1$ th component of $G(k, \nu)a$ is zero.

gau

```
function[ $\nu$ ] = gau( $k, a$ )
```

1. $twon = length(a)$; $n = twon/2$;
2. if $a_{k+1} = 0$
3. $\nu = 0$;
4. else
5. $\nu = -\frac{a_{k+1}}{a_{n+k}}$;
6. end
7. end

SRDECO algorithm, Bunse-Gestner et al. 86

The matrix A is overwritten by the J -upper triangular matrix.

SRDECO

function [S,A]=SRDECO(A)

0. $S = I$,
1. For $j = 1, \dots, n$
2. For $k = n, \dots, j$
3. Zero entry $(n + k, j)$ of A : $[c, s] = \text{vlg}(k, A(:, j))$, $J_{k,j} = J(k, c, s)$.
4. Update $A = J_{k,j}A$ and $S = SJ_{k,j}^T$
5. End for.
6. Zero entries $(j + 1, \dots, n)$ of $A(:, j)$: $[\beta, w] = \text{vlh}(j, A(:, j))$,
7. $H_j = H(j, w)$. Update $A = H_jA$ and $S = SH_j^T$.
8. If $j \leq n - 1$
9. For $k = n, \dots, j + 1$
10. Zero the entry $(n + k, n + j)$ of A by running the function $[c, s] = \text{vlg}(k, A(:, n + j))$ and computing $J_{k,n+j} = J(k, c, s)$.

SRDECO algorithm

SRDECO

11. Update $A = J_{k,n+j}A$ and $S = SJ_{k,n+j}^T$.
12. End for.
13. Zero the entries $(j+2, n+j), \dots, (n, n+j)$ of A by running the function $[\beta, w] = vlh(j+1, A(:, j))$ and computing $H_{n+j} = H(j+1, w)$.
14. Update $A = H_{n+j}A$ and $S = SH_{n+j}^T$.
15. If the entry $(j+1, n+j)$ of A is nonzero and the entry $(n+j, n+j)$ is zero then stop the algorithm, %breakdown
16. else
17. Zero the entry $(j+1, n+j)$ of A by running the function $[\nu] = gau(j+1, A(:, n+j))$ and computing $G_{j+1} = G(j+1, \nu)$.
18. Update $A = G_{j+1}A$ and $S = SG_{j+1}^{-1}$. % $G_{j+1}^{-1} = J^T G_{j+1}^T J$.
19. End if
20. End if
21. End for.

Existence of SR decomposition

Elsner L. 79 :

Theorem

Let $A \in \mathbb{R}^{2n \times 2n}$ be nonsingular and P the permutation matrix $P = [e_1, e_{n+1}, e_2, e_{n+2}, \dots, e_n, e_{2n}]$, where e_i denotes the i th canonical vector of \mathbb{R}^{2n} . There exists $S \in \mathbb{R}^{2n \times 2n}$ symplectic and $R \in \mathbb{R}^{2n \times 2n}$ upper J -triangular, such that $A = SR$ if and only if all even leading minors of $P^T A^T J A P$ are nonzero.

Exist. of SR decomp., link with SRDECO

We established

Theorem

*Let $A \in \mathbb{R}^{2n \times 2n}$ be a matrix (not necessarily nonsingular), and let R be the matrix that one obtains at stage $1 \leq j \leq n - 1$ of the algorithm SRDECO, by executing instructions **1.** to **14.** (corresponding to the current updated matrix A in the process, at stage j and until instruction **14.**). Then the leading $2j$ -by- $2j$ minor of $P^T A^T J A P$ satisfies*

$$\det((P^T A^T J A P)_{[2j,2j]}) = [r_{1,1} r_{n+1,n+1} \cdots r_{i,i} r_{n+i,n+i} \cdots r_{j,j} r_{n+j,n+j}]^2. \quad (2)$$

Exist. of SR decomp., link with SRDECO

Corollary

*Let $A \in \mathbb{R}^{2n \times 2n}$ be a nonsingular matrix, and let R be the matrix that one obtains at stage $1 \leq j \leq n - 1$ of the algorithm SRDECO or SRMSH, by executing instructions **1.** to **14.** (corresponding to the current updated matrix A in the process, at stage j and until instruction **14.**). Then A admits an SR decomposition if and only if $r_{n+j, n+j} \neq 0, \forall j \in \{1, \dots, n\}$.*

Theorem

*Let $A \in \mathbb{R}^{2n \times 2n}$ be any matrix, and let R be the matrix that one obtains at stage $1 \leq j \leq n - 1$ of the algorithm SRDECO (or SRMSH), by executing instructions **1.** to **14.** (corresponding to the current updated matrix A in the process, at stage j and until instruction **14.**) Then A admits an SR decomposition if and only if $(r_{n+j, n+j} \neq 0 \text{ or } r_{j+1, n+j} = 0), \forall j \in \{1, \dots, n\}$.*

JHESS algorithm

JHESS (Bunse-Gestner 86) reduces (if possible) $A \in \mathbb{R}^{2n \times 2n}$ to upper J -Hessenberg form $H = \Pi^{-1}A\Pi$, with a symplectic matrix Π whose first column is a multiple of e_1 . A is overwritten by the J -Hessenberg matrix H and S is overwritten by the transforming matrix Π . If this reduction of A does not exist, the algorithm stops”.

JHESS algorithm

JHESS

function [S,A]=JHESS(A)

1. For $j = 1, \dots, n - 1$
2. For $k = n, \dots, j + 1$
3. Zero the entry $(n + k, j)$ of A by running the function $[c, s] = vlg(k, A(:, j))$ and computing $J_{k,j} = J(k, c, s)$.
4. Update $A = J_{k,j}AJ_{k,j}^T$ and $S = SJ_{k,j}^T$.
5. End for.
6. Zero the entries $(j + 2, j), \dots, (n, j)$ of A by running the function $[\beta, w] = vlh(j + 1, A(:, j))$ and computing $H_j = H(j + 1, w)$.
7. Update $A = H_jAH_j^T$ and $S = SH_j^T$.
8. If the entry $(j + 1, j)$ of A is nonzero and the entry $(n + j, j)$ is zero then stop the algorithm % condition of breakdown
9. else
10. Zero the entry $(j + 1, j)$ of A by running the $[\nu] = gau(A(:, j))$

JHESS algorithm

JHESS

11. Compute $G_{j+1} = G(j+1, \nu)$.
12. Update $A = G_{j+1}AG_{j+1}^{-1}$ and $S = SG_{j+1}^{-1}$.
13. End if
14. For $k = n, \dots, j+1$
15. Zero the entry $(n+k, n+j)$ of A by running the function $[c, s] = vlg(k, A(:, n+j))$ and compute $J_{k,n+j} = J(k, c, s)$.
16. Update $A = J_{k,n+j}AJ_{k,n+j}^T$ and $S = SJ_{k,n+j}^T$.
17. End for.
18. If $j \leq n-2$
19. Zero the entries $(j+2, n+j), \dots, (n, n+j)$ of A by running the function $[\beta, w] = vlh(j+1, A(:, n+j))$ and compute $H_{n+j} = H(j+1, w)$.
20. Update $A = H_{n+j}AH_{n+j}^T$ and $S = SH_{n+j}^T$.
21. End if
22. End for.

Example: breakdown in JHESS

Let A_6 be the 6-by-6 matrix

$$A_6 = \begin{pmatrix} 1 & 0 & 0 & 1 & 2 & 0 \\ 2 & 1 & 0 & 2 & 1 & 0 \\ 0 & 2 & 1 & 0 & 2 & 1 \\ 0 & 2 & 0 & 1 & 0 & 0 \\ 0 & 1 & 2 & 3 & 1 & 0 \\ 0 & 0 & 1 & 0 & 3 & 1 \end{pmatrix}. \quad (3)$$

- Breakdown (1^{st} step) : $A_6(2, 1) \neq 0$ & $A_6(4, 1) = 0$.
- The SR-algorithm (QR-like algorithm) breaks also at the first step.

Strategies for curing breakdowns in JHESS/SRMSH

Bunse-Gestner et al. 86

- The j th iteration is stopped if breakdown or $cond(G_{j+1}) \geq \tau$ a certain tolerance.
- A similarity $S_j^{-1}AS_j$ is computed, with $S_j = I - ww^T J$, where w is a random vector with $\|w\|_2 = 1$.
- The algorithm JHESS is then applied to $S_j^{-1}AS_j$.
- If the number of encountered near-breakdowns/breakdowns exceeds a given bound, the whole process is definitively stopped.
- Drawbacks :
 - $cond(S_j^{-1}AS_j)$ will be worse than of $cond(A)$. (S_j simpl., not orth.)
 - The cost of forming the product $S_j^{-1}AS_j$ is $O(n^2)$, $size(A) = 2n$.
 - The product $S_j^{-1}AS_j$ fills-up the matrix and destroys the previous partially created J -Hessenberg form of A . A cost of $O(n^3)$ is needed to restore the J -Hessenberg form.

Strategies for curing breakdowns in JHESS

Salam et al. 2017. Alternative : Compute a similarity transformation $S_j^{-1}AS_j$ for which :

- The proposed matrix S_j is not only symplectic but also orthogonal. Thus, the condition number of $S_j^{-1}AS_j$ is preserved, and the process is numerically as accurate as possible.
- The cost for computing the product $S_j^{-1}AS_j$ is only $O(n)$. Thus, a gain of an order-of- magnitude is guaranteed.
- The product $S_j^{-1}AS_j$ does not fill-up the matrix and preserves all the created zeros in previous steps. Also, to restore the J -Hessenberg form of A , only a cheaper additional cost of $O(n^2)$ is needed.

The idea

Consider the example A_6 . The idea : one seeks for a symplectic and orthogonal transforming matrix S so that the similar matrix SA_6S^{-1} , may be reduced by JHESS. A judicious choice of S consists in taken S equal to Van Loan's Householder matrix

$$S = \begin{pmatrix} H_2 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & H_2 & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}, \quad (4)$$

or Van Loan's Givens matrix

$$S = \begin{pmatrix} G_2 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & G_2 & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}, \quad (5)$$

H_2 (resp. G_2) is a 2x2 Householder (resp. 2x2 Givens) matrix, such that $H_2(1,2)^T = \sqrt{5}(1,0)^T$ (resp. $G_2(1,2)^T = \sqrt{5}(1,0)^T$).

The idea

With choice (5), we obtain

$$SA_6S^{-1} = \begin{pmatrix} 9/5 & -8/5 & 0 & 13/5 & -6/5 & 0 \\ 2/5 & 1/5 & 0 & -6/5 & 3/5 & 0 \\ 4/\sqrt{5} & 2/\sqrt{5} & 1 & 4/\sqrt{5} & 2/\sqrt{5} & 1 \\ 8/5 & 4/5 & 4/\sqrt{5} & 11/5 & 12/5 & 0 \\ -6/5 & -3/5 & 2/\sqrt{5} & 3/5 & -1/5 & 0 \\ 0 & 0 & 1 & 6/\sqrt{5} & 3/\sqrt{5} & 1 \end{pmatrix}. \quad (6)$$

We applied JHESS to the matrix SA_6S^{-1} of (6). The algorithm run well and the reduction to the J -Hessenberg form is obtained.

See Salam et al 2017, general strategy.

Remark: breakdowns/near-breakdowns in JHESS may occur only when the function *gau* is called, and hence it concerns only columns from the first half of the current matrix.

Curing near-breakdowns in JHESS : the idea

- The near-breakdown occurs when the coefficients $A_{n+j,j}$ and $A_{j+1,j}$ are both different from zero but are near to the situation of breakdown : the ratio $\frac{A_{j+1,j}}{A_{n+j,j}}$ is very large.
- In this case, the non-orthogonal and symplectic transformations involved in JHESS become ill-conditioned.
- To remedy: proceed as for a breakdown : the test $A_{n+j,j} = 0$ and $A_{j+1,j} \neq 0$ (corresponding to a breakdown) is replaced by the $\frac{A_{j+1,j}}{A_{n+j,j}} \geq \tau$ (corresponding to a near-breakdown), where τ is a certain tolerance.

Numerical experiments

- To illustrate our purpose, we consider the following numerical example. Let A be the 12-by-12 matrix

$$A = \begin{pmatrix} 1 & 5 & 7 & 9 & 5 & 1 & 1 & 3 & 1 & 3 & 7 & 2 \\ 0 & 1 & 4 & 6 & 1 & 2 & 2 & 1 & 5 & 4 & 3 & 5 \\ 0 & 0 & 1 & 2 & 3 & 2 & 0 & 0 & 1 & 2 & 5 & 3 \\ 0 & 0 & 2 & 1 & 9 & 8 & 0 & 0 & 2 & 1 & 2 & 4 \\ 0 & 0 & 0 & 2 & 1 & 3 & 0 & 0 & 5 & 2 & 1 & 2 \\ 0 & 0 & 0 & 4 & 2 & 1 & 0 & 0 & 4 & 3 & 2 & 1 \\ 1 & 4 & 7 & 2 & 1 & 3 & 1 & 7 & 6 & 1 & 6 & 7 \\ 0 & 1 & 9 & 3 & 5 & 1 & 0 & 1 & 4 & 5 & 8 & 3 \\ 0 & 0 & 0 & 2 & 7 & 9 & 0 & 0 & 1 & 3 & 4 & 5 \\ 0 & 0 & 0 & 1 & 2 & 8 & 0 & 0 & 3 & 1 & 7 & 3 \\ 0 & 0 & 0 & 2 & 1 & 2 & 0 & 0 & 4 & 3 & 1 & 2 \\ 0 & 0 & 0 & 9 & 3 & 1 & 0 & 0 & 1 & 2 & 3 & 1 \end{pmatrix}.$$

Numerical experiments

JHESS (also its variants JHMSH and JHMSH2) breaks down at the step $j = 3$.

Loss of J -Orthogonality $\ I - S^J S\ _2$			
<i>JHESS</i>	<i>MJHESS</i>	<i>JHM²SH</i>	<i>JHM²SH2</i>
fails	$1.8553e - 15$	$5.0842e - 15$	$6.6428e - 15$

- The J -orthogonality is numerically preserved up to the machine precision for MJHESS (respectively JHM²SH and JHM²SH2).

Reduction error $\ A - SHS^{-1}\ _2$			
<i>JHESS</i>	<i>MJHESS</i>	<i>JHM²SH</i>	<i>JHM²SH2</i>
fails	$3.2709e - 14$	$3.8777e - 13$	$2.7653e - 13$

- The error in the reduction to J -Hessenberg form is very satisfactory for MJHESS (respectively JHM²SH and JHM²SH2).

- A. Salam, H. Ben Kahla, An upper J - Hessenberg reduction of a matrix through symplectic Householder transformations, arXiv:1763123 [math.NA], 27 Dec. 2016.
- A. Salam, H. Ben Kahla, A treatment of breakdowns and near breakdowns in a reduction of a matrix to upper J -Hessenberg form and related topics, arXiv:2046100[math.NA], 23 Oct. 2017.

Thank you.