

Structures preserved by the QR -algorithm

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- 1 Introduction
 - The shifted QR -algorithm
- 2 Polynomial structures
 - Definition
 - Examples
- 3 Rank structures
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 - Nonsingular case
- 4 Singular case
 - Singular case
 - Effectively eliminating QR -decompositions
 - Sparse Givens patterns

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The shifted QR-algorithm

- Given a matrix $A \in \mathbb{C}^{n \times n}$.

We want to compute the eigenvalues, eigenvectors of A .

- Initialization of the shifted QR-algorithm: $A^{(0)} = A$.

QR-step: given $A^{(\nu)}$, we compute

$$A^{(\nu)} - \lambda I = QR \quad (1)$$

$$A^{(\nu+1)} = RQ + \lambda I, \quad (2)$$

with $\lambda \in \mathbb{C}$ the *shift*, Q unitary and R upper triangular.

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- (1) and (2) imply the similarity relations

$$A^{(\nu+1)} = Q^H A^{(\nu)} Q$$

$$A^{(\nu+1)} = RA^{(\nu)}R^{-1}.$$

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- Preservation of structure under the shifted QR -algorithm:
 - (3) \Rightarrow polynomial structures
 - (4) \Rightarrow rank structures.

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Definition

- A polynomial structure on $\mathbb{C}^{n \times n}$ is defined as a collection $\mathcal{P} = \{p_k\}_k$, where each p_k is a polynomial in 7 variables.
- A matrix A is said to satisfy the structure $\mathcal{P} = \{p_k\}_k$ if for every k ,

$$p_k(A, A^H, A^{-1}, A^{-H}, \text{Herm}_k, \text{Uni}_k, (\text{Rk } r)_k) = 0,$$

for certain

- Herm_k Hermitian,
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Theorem

Polynomial structure is strictly preserved by the shifted QR-algorithm, i.e. $A^{(\nu)} \in \mathcal{M} \Leftrightarrow A^{(\nu+1)} \in \mathcal{M}$.

PROOF.

- Any unitary matrix Q can be 'pulled through'.
- \Rightarrow Polynomial structures satisfied by A , must carry over to $A_0 = Q^H A Q$. And conversely, by applying the same argument to $Q A_0 Q^H = Q(Q^H A Q)Q^H = A$.
- In particular, the Q -factor of the shifted QR-factorization of $A^{(\nu)}$ is the Q -factor of the shifted QR-factorization of $A^{(\nu+1)}$.

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$$\begin{aligned} Q^H p(A, A^H, A^{-1}, A^{-H}, \text{Herm}, \text{Uni}, \text{Rk } r) Q \\ = p(A_Q, A_Q^H, A_Q^{-1}, A_Q^{-H}, \text{Herm}_Q, \text{Uni}_Q, (\text{Rk } r)_Q), \end{aligned}$$

where

$$\begin{aligned} A_Q &:= Q^H A Q, & \text{Herm}_Q &:= Q^H (\text{Herm}) Q, & \text{Uni}_Q &:= Q^H (\text{Uni}) Q, \\ & & (\text{Rk } r)_Q &:= Q^H (\text{Rk } r) Q. \end{aligned}$$

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Examples of polynomial structures

- Hermitian matrices: $A - A^H = 0$, or $A - \text{Herm} = 0$,
- unitary matrices: $A^H - A^{-1} = 0$, or $A - \text{Uni} = 0$,
- normal matrices: $AA^H - A^HA = 0$,
- unitary plus rank r correction: $A - \text{Uni} - \text{Rk } r = 0$,
- [Bini, Gemignani, Pan]: $A - \text{Herm} - \text{Rk } 1 = 0$,
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Definition

- We define a rank structure on $\mathbb{C}^{n \times n}$ as a collection $\mathcal{R} = \{\mathcal{B}_k\}_k$ where each \mathcal{B}_k is a 'structure block'.

$$\mathcal{B}_k = (i_k, j_k, r_k, \lambda_k) :$$

- i_k : row index,
- j_k : column index,
- r_k : rank upper bound,
- $\lambda_k \in \mathbb{C}$: shift element.
- A matrix $A \in \mathbb{C}^{n \times n}$ satisfies the structure \mathcal{R} if for every k ,

$$\text{Rank } A_k(i_k : n, 1 : j_k) \leq r_k, \quad \text{where } A_k := A - \lambda_k I.$$

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Definition

(Continuation)

- As a special case, \mathcal{R} is called a *pure rank structure* if all structure blocks \mathcal{B}_k have shift element $\lambda_k = 0$.
- \mathcal{M} : set of matrices which satisfy \mathcal{R} .
 $\mathcal{R}_{\text{pure}}$: pure rank structure.
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Definition

(Continuation)

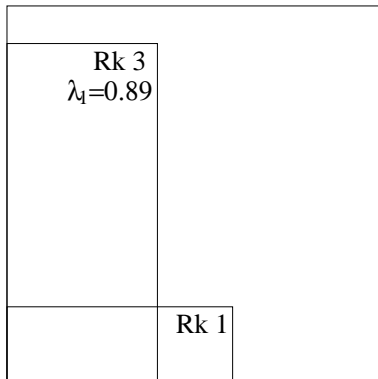
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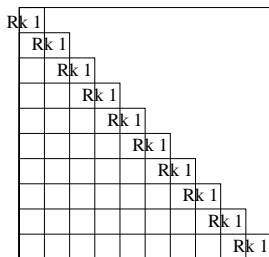
Example

Here is an example of a rank structure $\mathcal{R} = \{\mathcal{B}_1, \mathcal{B}_2\}$. The structure block \mathcal{B}_1 intersects the diagonal and has shift $\lambda_1 = 0.89$, while the structure block \mathcal{B}_2 is pure:



Example

Here is an example of a rank structure $\mathcal{R}_{\text{pure}} = \{\mathcal{B}_k\}_{k=1}^n$, yielding the class of lower semiseparable matrices:

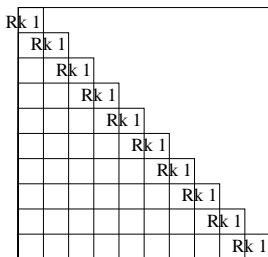


Allowing shift elements λ_k , we get the class $\mathcal{R} = \{\mathcal{B}_k\}_{k=1}^n$ of lower semiseparable *plus diagonal* matrices.

The diagonal $\Lambda = \text{diag}(\lambda_k)_{k=1}^n$ is part of the structure.

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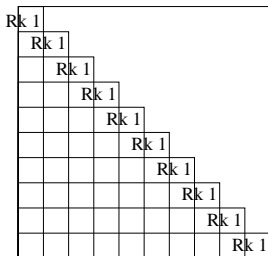


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Examples of rank structures

- Hessenberg matrices (+symmetry: tridiagonal)
- lower-semiseparable matrices (+symmetry: semiseparable)
- [Fasino] lower-semiseparable **plus diagonal** (+symmetry: semiseparable plus diagonal)
- Higher semiseparability ranks
- Also 'poorly ordered' structures are possible

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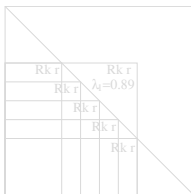
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Theorem

(The nonsingular case:) For $A \in \mathcal{M}$ nonsingular we have

- ① rank structure is strictly preserved by applying a QR-step without shift on A ;
- ② factorizing $A = QR$, then Q satisfies the pure structure induced by \mathcal{R} .

- ① Proof: use $A^{(\nu+1)} = RA^{(\nu)}R^{-1}$.
- ② Example of induced pure structure:

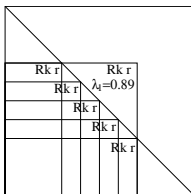


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Singular case

- We proved preservation of structure if A is nonsingular.
 What happens in the singular case?

Theorem

Let A satisfy a structure block \mathcal{B}_k .

By applying a QR-step without shift on A , the rank upper bound r_k of \mathcal{B}_k can increase by at most $\#(\mathcal{I}_{\text{dep},A} \cap \mathcal{I}_{\text{left},k})$.

Example of $\mathcal{I}_{\text{left},k}$:



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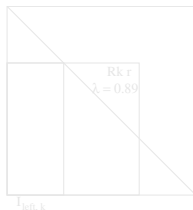
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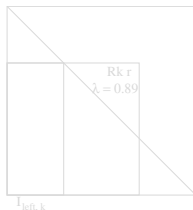
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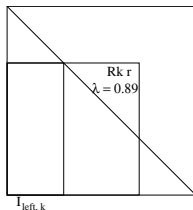
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Solution: apply a QR-step with 'suitable' choice of the QR-decomposition $A = QR$.

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The rank upper bound r_k of \mathcal{B}_k can increase by at most $\#(\mathcal{I}_{\text{dep},A} \cap \mathcal{I}_{\text{left},k})$.

Problem: we want \mathcal{B}_k to be **exactly** preserved.

Solution: apply a QR-step with 'suitable' choice of the QR-decomposition $A = QR$.

\Rightarrow $\left\{ \begin{array}{l} \text{Effectively eliminating QR-decompositions} \\ \text{Sparse Givens patterns} \end{array} \right.$

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 - The shifted QR -algorithm
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Givens transformations

- Given a matrix A , we can search a QR-decomposition by solving

$$\begin{cases} Q^H A = R \\ Q^H = (G_{n-1,n}^{(n-1)}) \cdots (G_{2,3}^{(2)} \cdots G_{n-1,n}^{(2)}) (G_{1,2}^{(1)} \cdots G_{n-1,n}^{(1)}) \end{cases}$$

$G_{i-1,i}^{(j)}$: Givens transformation acting on rows $i-1$ and i .

- For $n=3$ this specializes to $(G_{2,3}^{(2)})(G_{1,2}^{(1)} G_{2,3}^{(1)})A = R$:

$$\begin{bmatrix} x & x & x \\ x & x & x \\ x & x & x \end{bmatrix} \rightarrow \begin{bmatrix} x & x & x \\ x & x & x \\ 0 & x & x \end{bmatrix} \rightarrow \begin{bmatrix} x & x & x \\ 0 & x & x \\ 0 & x & x \end{bmatrix} \rightarrow \begin{bmatrix} x & x & x \\ 0 & x & x \\ 0 & 0 & x \end{bmatrix}$$

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A QR-decomposition $A = QR$ is called *effectively eliminating* if each non-trivial $G_{i-1,i}^{(j)}$ realizes a transition

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where $b \neq 0$ lies in the strictly lower triangular part of A .

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Theorem

The effectively eliminating QR-decomposition of A is essentially unique, i.e. given $A = Q_1 R_1$ and $A = Q_2 R_2$ both effectively eliminating, we have that $Q_1 = Q_2 D$ for a certain unitary diagonal matrix D .

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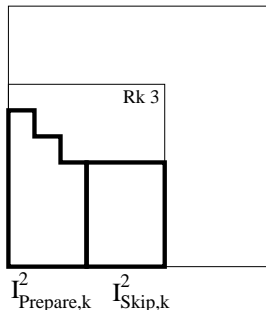
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Sparse Givens patterns

Definition

Given a pure structure block $\mathcal{B}_k = (i_k, j_k, r_k)$.

We define the staircase shaped set $\mathcal{I}_{\text{Prepare},k}^2$ and the rectangular shaped set $\mathcal{I}_{\text{Skip},k}^2$ as illustrated.



Sparse Givens patterns

Reason for introducing $\mathcal{I}_{\text{Prepare},k}^2$, $\mathcal{I}_{\text{Skip},k}^2$:

Definition

Let $\mathcal{R}_{\text{pure}} = \{\mathcal{B}_k\}_k$ be such that $r_k =: r$ for all k .

A QR-decomposition $A = QR$ is said to satisfy the sparse Givens pattern induced by $\mathcal{R}_{\text{pure}}$ if $G_{i-1,i}^{(j)} = I_2$ for all $(i,j) \in \bigcup_k \mathcal{I}_{\text{Skip},k}^2$.

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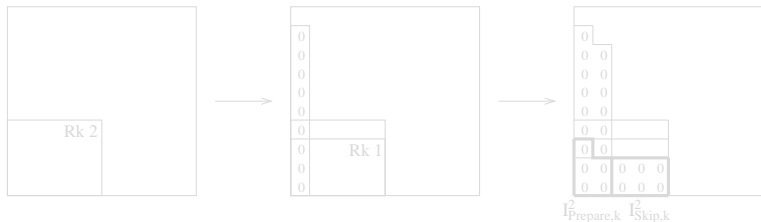
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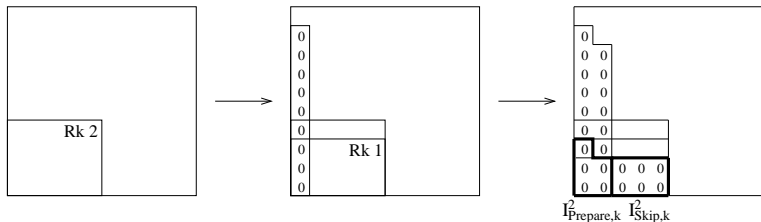
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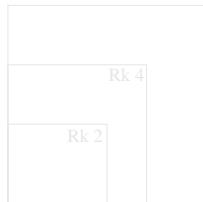
Relative position:



Type a



Type b



Type c

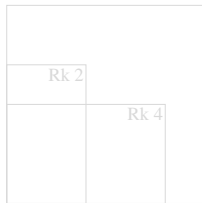
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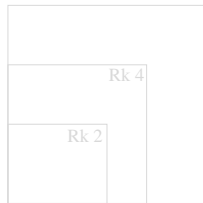
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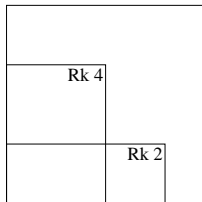
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Types a, b: good behaviour (definition can be easily adapted).
 Type c: bad behaviour (complicated).

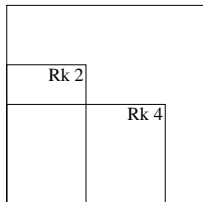
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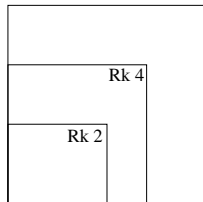
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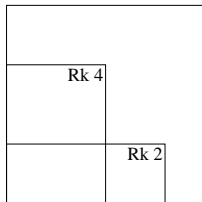
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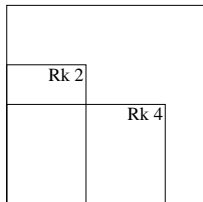
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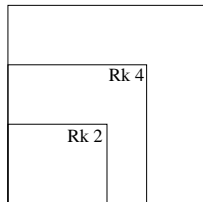
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Some properties

We introduced now sparse Givens pattern induced by any pure structure $\mathcal{R}_{\text{pure}}$.

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Theorem

- 1 *for $A \in \mathcal{M}_{\text{pure}}$, we have the implication effectively eliminating \Rightarrow sparse Givens pattern induced by $\mathcal{R}_{\text{pure}}$;*
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Preservation of structure

Preservation of structure by a QR-step:

Theorem

Given a structure \mathcal{R} and its induced pure structure $\mathcal{R}_{\text{pure}}$.

Let $A \in \mathcal{M}$ be arbitrary, possibly singular.

When applying a QR-step without shift on A , we have the implications

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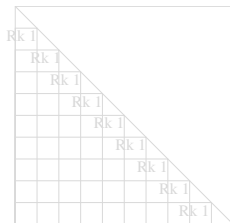
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Example: lower semiseparable plus diagonal matrices

Example: let \mathcal{R} be a lower ss+d structure, for some $\Lambda = \text{diag}(\lambda_k)$.

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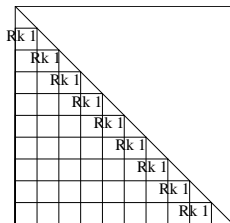
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Doing this in an effectively eliminating way: \mathcal{R} is preserved.

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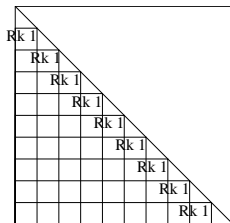
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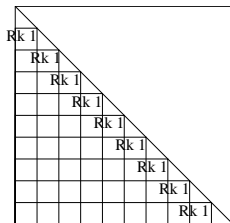
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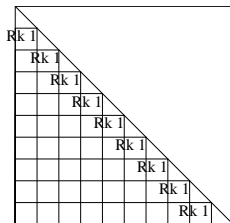
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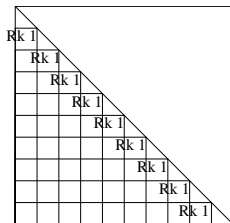
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