

Setting

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### **Structured Rank Matrices** Lecture 1: What are they?

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Dept. of Computer Science, K.U.Leuven, Belgium Chemnitz, Germany, 26-30 September 2011

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Cooperations and general information

#### Setting

## **Outline**

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Cooperations and general information

2 Structured rank matrices What are structured rank matrices? 

## **Cooperations**

Many of the results described in this lecture series were derived in cooperation with:

- Bernd Beckermann.
- Gianna Del Corso.
- Steven Delvaux.
- Dario Fasino.
- Katrijn Frederix,
- Luca Gemignani,
- Stefan Güttel.
- Nicola Mastronardi.
- Yvette Vanberghen,
- Ellen Van Camp,
- Paul Van Dooren.
- David Watkins.
- o and many others.

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## Extra information,

but not all, since these lectures will contain new developments



 Vandebril R., Van Barel M. and Mastronardi N.,
 Matrix Computations & Semiseparable Matrices I: Linear Systems,

The Johns Hopkins University Press, Baltimore, December 2007 (xviii+575 pp).

Vandebril R., Van Barel M. and Mastronardi N.,
 Matrix Computations & Semiseparable Matrices II:
 Eigenvalue and Singular Value Methods,
 The Johns Hopkins University Press, Baltimore,
 December 2008 (xvi+498 pp).



Structured Rank Matrices Lecture 1: What are they?

Motto

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#### **Quote from Gauss**

Theory attracts practice as the magnet attracts iron.

- Many examples.
- Matlab demos illustrating the theoretical results.
- If something is not clear, please ask!



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Outline

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Lecture series contents

- 1 Introduction: structured rank matrices
- 2 Structure transfer via inversion and factorizations
- 3 The interplay of rotations and the QR-factorization
- Similarity transformation to semiseparable form and convergence theory
- Novel similarity transformations
- The connection with orthogonal rational functions
- Computing eigenvalues of a companion matrix
- Orthogonal functions and matrix computations

## **Outline**



### 2 Structured rank matrices

What are structured rank matrices?

# **Sparse and dense matrices**

#### Wilkinson defined a sparse matrix as

Structured rank matrices

"any matrix with enough zeros that it pays to take advantage of them."



- The other matrices are dense.
- Example of a sparse and dense matrix

12		[163912]
321		42134
523	versus	$63\frac{3}{2}36$
3 8 10		$21\frac{1}{2}810$
9 1		84291

- Sparse matrices are and have been an interesting topic for many years. They are easily representable and they occur frequently in practice. (Discretization of ODE's, PDE's.)
- Structure is readily available.

Structured rank matrices

### Dense does not mean unstructured

#### Almost 'trivial' example

The red block has rank 1.

The underlined block is of rank 1.

1 <u>6 3 9 12</u>	
<u>42134</u>	
$63\frac{3}{2}36$	
$21\frac{1}{2}810$	
84291	

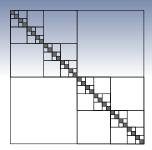
#### Structured rank matrix

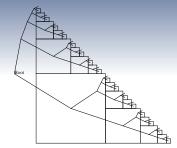
"any matrix with enough 'low' rank blocks that it pays to take advantage of them."

- In a certain sense this is a natural extension of sparse matrices. (A block of zeros has rank 0.)
- Problem: the structure is sort of hidden in the matrix.

Structured rank matrices

## More sophisticated examples





#### What is a hierarchical matrix? (from http://www.hlib.org)

Hierarchical matrices (or short  $\mathcal{H}$ -matrices) are efficient data-sparse representations of certain densely populated matrices. The basic idea is to split a given matrix into a hierarchy of rectangular blocks and approximate each of the blocks by a low-rank matrix.

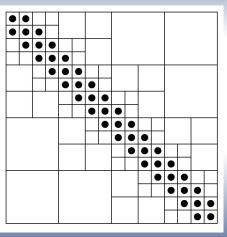
- E.g., discretisation of integral equations.
- W. Hackbusch et al., Max-Planck Institute in Leipzig.

Structured rank matrices

## 1D Hierarchical semiseparable

(S. Chandrasekaran, M. Gu et al.)

 $A_{i,j} = \log ||x_i - x_j||, x_i \in \mathbb{R}.$ 



Matrices without • have low rank, the other ones are of full rank.

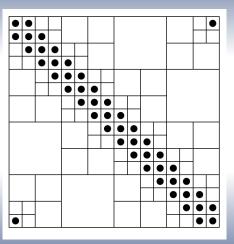
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# 1.5D Hierarchical semiseparable

 $A_{i,j} = \log ||z_i - z_j||, z_i \text{ on a closed curve.}$ 



Matrices without • have low rank, the other ones are of full rank.

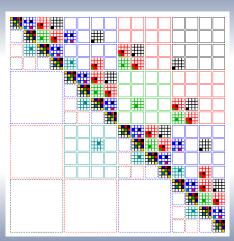
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## 2D Hierarchical semiseparable

$$A_{i,j} = \log ||z_i - z_j||^{\alpha}, z_i \in \mathbb{R}^2.$$



Empty submatrices are of limited rank, the colored ones of full rank.

Structured rank matrices

### Few remarks

What to do with and why use these matrices?

- Solving systems of equations or computing eigenvalues.
- Efficient storage leads to less memory consumption.
- Efficient algorithms lead to faster obtainable results.
- These improvements can lead to more accurate results or to increased problem sizes which one can solve.

How to find the structure?

- Quite often it is readily available, e.g., coming from discretization problems.
- Adaptive skeleton cross-approximation.
   (see, e.g., E. Tyrtyshnikov and co-workers)
   (see also, e.g., M. Bebendorf).



## What are structured rank matrices?

Structured rank matrices are matrices for which a specific part in the

matrix (the so-called structure), satisfies a certain rank condition.

#### **Definition**

Structured rank matrices are matrices for which a specific part in the matrix (the so-called structure), satisfies a certain rank condition.

What are structured rank matrices?

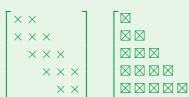
We focus on three important -basic- classes:

- tridiagonal matrices;
- semiseparable matrices;
- quasiseparable matrices.

## **Example**

**Definition** 

Tridiagonal (left) and semiseparable (right) matrices. (Only the lower triangular part is shown.)





Structured rank matrices

## **Outline**

Structured rank matrices

A definition

#### **Definition**

A is an  $m \times n$  matrix, with

$$M = \{1, 2, \dots, m\},$$
  $N = \{1, 2, \dots, n\},$   $\alpha \subset M$  and  $\beta \subset N.$ 

Then,  $A(\alpha; \beta)$  stands for the submatrix of A with row indices in  $\alpha$  and column indices in  $\beta$ .

#### 2 Structured rank matrices

What are structured rank matrices?

#### Definition

## A definition

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#### **Definition**

A structure  $\Sigma$  is a nonempty subset of  $M \times N$ . The structured rank  $r(\Sigma; A)$  is defined as :

$$r(\Sigma; A) = \max\{rank(A(\alpha; \beta)) | \alpha \times \beta \subseteq \Sigma\},\$$

where  $\alpha \times \beta$  denotes the set  $\{(i, j) | i \in \alpha, j \in \beta\}$ .

# Some standard structures

Structured rank matrices

#### **Definition**

The subset.

$$\Sigma_{I} = \{(i,j)|i \geq j, i \in M, j \in N\}$$

is called the lower triangular structure (including the diagonal).

The subset

$$\Sigma_{wl} = \{(i,j)|i>j, i \in M, j \in N\}$$

is the weakly lower triangular structure (excluding the diagonal).

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## Some standard structures

#### **Definition**

The subset

$$\Sigma_{i}^{(p)} = \{(i, j) | i > j - p, i \in M, j \in N\}$$

is the *p*-lower triangular structure and corresponds with all the indices of the matrix, below the pth diagonal.

The pth diagonal refers to the pth superdiagonal (for p > 0); the -pth diagonal refers to the pth subdiagonal (for p > 0).

• Similarly: upper triangular structures  $(\Sigma_u)$ .

#### **Resulting equivalences**

- The lower triangular structure:  $\Sigma_l = \Sigma_l^{(1)}$ .
- The weakly lower triangular structure:  $\Sigma_{wl} = \Sigma_{l}^{(0)}$ .
- Similar relations hold for the upper triangular structures.

Structured rank matrices

## A tridiagonal matrix

#### **Example (Tridiagonal matrix)**

• A tridiagonal matrix A is a structured rank matrix with:

$$r(\Sigma_{l}^{(-1)}; A) = 0$$
 and  $r(\Sigma_{u}^{(-1)}; A) = 0$ ,

this means that all the blocks taken out of the matrix below the subdiagonal have rank equal to 0.

• All the red blocks are of rank 0. Consider only the lower triangular part.

$$\begin{bmatrix} \times \times & 0 & 0 & 0 \\ \times \times \times & 0 & 0 \\ 0 & \times \times \times & 0 \\ 0 & 0 & \times \times \times \\ 0 & 0 & 0 & \times \times \\ \end{bmatrix}$$

**Example (Tridiagonal matrix)** 

A tridiagonal matrix

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Structured rank matrices

## A tridiagonal matrix

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Structured rank matrices

## A semiseparable matrix

#### **Example (Semiseparable matrix)**

• A semiseparable matrix is a structured rank matrix A with:

$$r(\Sigma_l; A) \leq 1$$
 and  $r(\Sigma_u; A) \leq 1$ ,

this means that all blocks taken out of the lower triangular part have rank at most 1. (Similar for the upper triangular part.)

• All the red blocks are of rank at most 1.

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### A quasiseparable matrix

### Example (Quasiseparable matrix)

Structured rank matrices

• A quasiseparable matrix is a structured rank matrix A with:

$$r(\Sigma_{wl}; A) \le 1$$
 and  $r(\Sigma_{wu}; A) \le 1$ ,

this means that all blocks taken out of the weakly lower triangular part have rank at most 1. (Similar for the upper triangular part.)

• All the red blocks are of rank at most 1.

$$\begin{bmatrix} \times \times \times \times \times \\ \times \times \times \times \times \\ \times \times \times \times \times \\ \times \times \times \times \times \end{bmatrix}$$

Structured rank matrices

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 Structured rank matrices

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Structured rank matrices

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• All the red blocks are of rank at most 1.

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Structured rank matrices

Relations



Structured rank matrices

## **Outline**

#### Relations

- The quasiseparable class is the most general one.
- Quasiseparables include:
  - semiseparables,
  - tridiagonals.

Structured rank matrices

What are structured rank matrices?

Generalizations

## **Band matrices**

**Definition** ( $\{p, q\}$ -band)

A matrix A is called a  $\{p, q\}$ -band matrix if

$$r\left(\Sigma_{l}^{(-p)};A\right)\leq 0$$
 and  $r\left(\Sigma_{u}^{(-q)};A\right)\leq 0$ .

Structured rank matrices

## **Band matrices**

**Definition** ( $\{p, q\}$ -band)

A matrix A is called a  $\{p, q\}$ -band matrix if

$$r\left(\Sigma_{I}^{(-p)};A\right)\leq 0$$
 and  $r\left(\Sigma_{u}^{(-q)};A\right)\leq 0$ .

### Example (A $\{3,2\}$ -band matrix)

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Structured rank matrices

## Generalized semiseparable matrices

**Definition** (Generalized semiseparable)

A matrix A is called  $\{p, q\}$ -semiseparable if

$$r\left(\Sigma_{l}^{(p)};A\right) \leq p \text{ and } r\left(\Sigma_{u}^{(q)};A\right) \leq q.$$

(Note: the rank blocks cross the diagonal.)

Structured rank matrices

# **Generalized semiseparable matrices Definition** (Generalized semiseparable)

A matrix A is called  $\{p, q\}$ -semiseparable if

$$r\left(\Sigma_{l}^{(p)};A\right) \leq p \text{ and } r\left(\Sigma_{u}^{(q)};A\right) \leq q.$$

(Note: the rank blocks cross the diagonal.)

#### Example (A $\{3,1\}$ -semiseparable matrix)

All blocks taken out of the red part of rank at most 3

$$\begin{bmatrix} \times \times \times \times \times \\ \end{bmatrix}$$



Structured rank matrices

## Generalized semiseparable matrices

#### **Definition** (Generalized semiseparable)

A matrix A is called  $\{p, q\}$ -semiseparable if

$$r\left(\Sigma_{l}^{(p)};A\right) \leq p \text{ and } r\left(\Sigma_{u}^{(q)};A\right) \leq q.$$

(Note: the rank blocks cross the diagonal.)

#### Example (A $\{3,1\}$ -semiseparable matrix)

All blocks taken out of the red part of rank at most 1

Structured Rank Matrices Lecture 1: What are they?

# Generalized quasiseparable matrices

### **Definition** (Generalized quasiseparable)

Structured rank matrices

A matrix A is called  $\{p, q\}$ -quasiseparable if

$$r(\Sigma_{wl}; A) \leq p$$
 and  $r(\Sigma_{wu}; A) \leq q$ .

(Note: the rank blocks do not cross the diagonal.)

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## Generalized quasiseparable matrices

#### **Definition** (Generalized quasiseparable)

A matrix A is called  $\{p, q\}$ -quasiseparable if

$$r(\Sigma_{wl}; A) \leq p$$
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(Note: the rank blocks do not cross the diagonal.)

#### Example (A $\{3,1\}$ -quasiseparable matrix)

All blocks taken out of the red part of rank at most 3

$$\begin{bmatrix} \times \times \times \times \times \\ \times \times \times \times \times \\ \times \times \times \times \times \\ \times \times \times \times \times \end{bmatrix}$$

Structured rank matrices

## Generalized quasiseparable matrices

#### **Definition** (Generalized quasiseparable)

A matrix A is called  $\{p, q\}$ -quasiseparable if

$$r(\Sigma_{wl}; A) \leq p$$
 and  $r(\Sigma_{wu}; A) \leq q$ .

(Note: the rank blocks do not cross the diagonal.)

#### Example (A $\{3,1\}$ -quasiseparable matrix)

All blocks taken out of the red part of rank at most 1

$$\begin{bmatrix} \times \times \times \times \times \\ \times \times \times \times \times \\ \times \times \times \times \times \\ \times \times \times \times \times \end{bmatrix}$$

Relations

## Summary

•  $\{p, q\}$ -semiseparable (cross the diagonal).

$$r\left(\Sigma_{l}^{(p)};A\right)\leq p$$
 and  $r\left(\Sigma_{u}^{(q)};A\right)\leq q$ .

•  $\{p, q\}$ -band (zero outside the band).

$$r\left(\Sigma_{l}^{(-p)};A\right)\leq 0$$
 and  $r\left(\Sigma_{u}^{(-q)};A\right)\leq 0$ .

•  $\{p, q\}$ -quasiseparable (do not cross the diagonal).

$$r(\Sigma_{wl}; A) \leq p$$
 and  $r(\Sigma_{wu}; A) \leq q$ .

• Very special structures entail summations of the above.

#### Relations

- The  $\{p, q\}$ -quasiseparable class is the most general one.
- $\{p, q\}$ -quasiseparables include:
  - {p, q}-semiseparables,
  - {p, q}-band matrices.

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# References to structured rank matrices

All the material presented in this first part can be contributed to Fiedler.

- M. Fiedler, Structure ranks of matrices, Linear Algebra and Its Applications 179 (1993), 119-127.
- M. Fiedler and T. L. Markham. Completing a matrix when certain entries of its inverse are specified, Linear Algebra and Its Applications 74 (1986), 225-237.
- M. Fiedler and Z. Vavřín, Generalized Hessenberg matrices, Linear Algebra and Its Applications 380 (2004), 95-105.
- M. Fiedler Basic matrices, Linear Algebra and Its Applications 373 (2003), 143-151.





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