## Exam questions

## NLA course

## 2023

## List of questions

- 1. Vector norms. Forward and backward stability. Disks in different norms. First norm and compressed sensing.
- 2. Matrix-matrix multiplication. Computer memory hierarchy and blocking. Standard libraries for linear algebra. Strassen algorithm (no need to remember exact formulas) and its complexity (with derivation).
- 3. Matrix norms. Example of a norm that is not a matrix norm (does not satisfy submultiplicative property). Scalar product. Cauchy-Schwarz-Bunyakovsky inequality.
- 4. Unitary matrices and their properties. Examples: Fourier matrix, permutation matrix, Householder reflections, Givens rotations.
- 5. Matrix rank. Skeleton decomposition (with proof). Low-rank matrix storage and matrix-vector product. Instability of matrix rank.
- 6. Singular value decomposition (SVD). Proof of its existence. Null space and image of A and  $A^*$  in terms of singular vectors. Interpretation of SVD as a separation of variables.
- 7. Eckart-Young theorem (proof for the spectral norm). Applications of SVD: latent semantic analysis, collaborative filtering in recommender systems, dense matrix compression.
- 8. LU-decomposition. Criteria of its existence and uniqueness (both with proof). Connection with Gaussian elimination. Complexity of decomposing and solving linear system. The concept of pivoting.
- 9. Cholesky factorization (with proof of its existence).
- 10. Neumann series. Bounds for  $\|(I-A)^{-1}\|$  and  $\frac{\|(A+\Delta A)^{-1}-A^{-1}\|}{\|A^{-1}\|}$  (both with proofs). Estimate of a perturbation of a solution in terms of condition number (with proof). Linear systems with "consistent" and "inconsistent" right-hand sides and behavior of solution error for large condition numbers.
- 11. Least squares (LS) problem for over- and underdetermined linear systems. Methods of solving LS via QR, pseudoinverse, SVD, padding into a bigger system.
- 12. Eigenvalue problem. Eigendecomposition. Criteria of eigendecomposition existence via algebraic and geometric multiplicities (no proof). Example of a nondiagonalizable matrix. Computing eigenvalues using characteristic equation. Is it a good idea? Gershgorin circles theorem (with proof).
- 13. Power method and its convergence (with bound derivation). Application in PageRank.
- 14. Schur decomposition (with proof). Normal matrices and their diagonalizability. Properties of eigenvalues of Hermitian, unitary and skew-Hermitian matrices. Variational concept for eigenvalues: Rayleigh quotient.
- 15. QR decomposition. Proof of its existence. Connection with the Gram-Schmidt algorithm. QR via Cholesky decomposition.
- 16. QR via Householder reflections and Givens rotations (both with derivation). Comparison of these algorithms.
- 17. QR algorithm. Convergence theorem (no proof). Accelerating convergence with shifts. Reducing complexity of QR algorithm from  $\mathcal{O}(n^4)$  down to  $\mathcal{O}(n^3)$ .

- 18. Divide and conquer algorithm for symmetric eigenvalue problems (with derivation).
- 19. Jacobi method for eigenvalue problem. Its convergence (with proof).
- 20. Sparse matrix arithmectics: COO, LIL, CSR, CSC formats. Their comparison. Blocking and cache oblivious algorithms for increasing efficiency of sparse formats.
- 21. Sparse LU decomposition, connection with graphs. Dependence of fill-in on ordering of graph nodes (with example). Nested dissection and spectral bisection algorithms.
- 22. Richardson iteration. Optimal choice of parameter. Convergence estimate.
- 23. Chebyshev iteration. Permutations of roots for computing parameters. Error bounds via Chebyshev polynomials.
- 24. Solving linear system as an optimization problem: minimization of residual and energy functional. Approximation of a solution of a linear system by a subspace, Galerkin projection. Krylov subspace and ill-posedness of natural Krylov basis.
- 25. Ill-posedness of natural Krylov basis. Orthogonal basis in Krylov subspace. Arnoldi relation and its derivation. Lanczos process.
- 26. Direct Lanczos method for solving linear systems. Conjugate gradient method.
- 27. Convergence theory of the conjugate gradient method.
- 28. MINRES method. GMRES method and its connection to Anderson acceleration. Disadvantages of GMRES for nonsymmetric systems. Idea of BiCG and BiCGStab.
- 29. Preconditioning concept. Right and left preconditioners. Jacobi, Gauss-Seidel and SOR preconditioners.
- 30. Incomplete LU for preconditioning. ILUt, ILU(k), second-order ILU (ILU2).