

# BASIC CONCEPTS:

①

- \* Inner product, outer product  $x \cdot y = x^* y$
- \* Linear independence, bases, ON bases.
- \* Fundamental subspaces, col/row space, null space.

## \* Rank

\* Norms of vectors, Euclidean,  $l^p$  norms.

\* Norms of matrices.

Some are operator norms  $\|A\| = \sup_{x \neq 0} \frac{\|Ax\|}{\|x\|}$

Not every matrix norm is an operator norm.

\* Unitary matrices, ON matrices,  $\|Ux\| = \|x\|$  if  $U$  is ON

\* For spectral norm of  $C$  matrix:  $\|A\| = \|UAV\|$  if  $U$  &  $V$  are unitary

\* Cauchy Schwarz

# SVD

VERY IMPORTANT!

(2)

- \* Every matrix has an SVD.
- \* Can be used to solve linear systems, least squares problems, low rank approximation, ...
- \* ON-bases for fundamental subspaces.

\* Economy size versus full.

\* Geometry - hyper ellipses

\* EVD vs SVD:  $A = U \Sigma V^*$

$$\begin{aligned} AA^* &= U \Sigma^2 U^* \\ A^*A &= V \Sigma^2 V^* \end{aligned}$$

\* EVD is better for powers of  $A$   
 $A = V \Lambda V^{-1} \Rightarrow \rho(A) = V \rho(\Lambda) V^{-1}$

\* Spectral norm =  $\sigma_1$       Frob norm =  $(\sum_i \sigma_i^2)^{1/2}$

\* Eckart-Young thm.

# PROJECTIONS

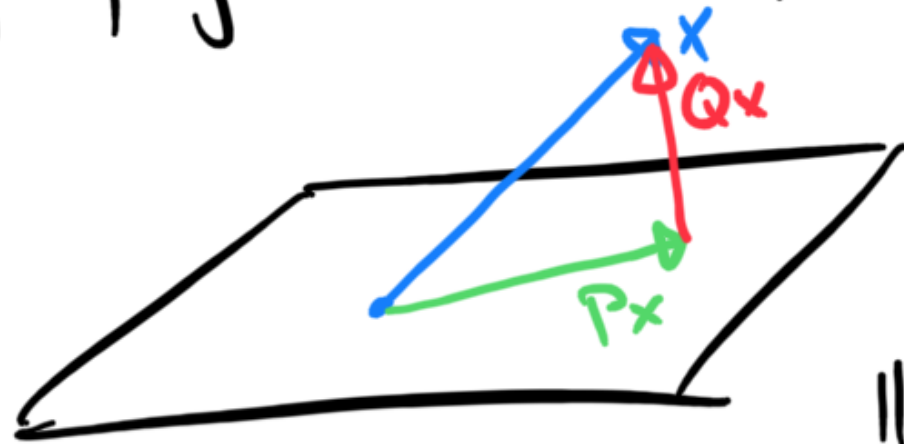
(3)

\*  $P^2 = P$

\*  $M = \text{ran}(P)$      $N = \text{null}(P)$

$$V = M \oplus N.$$

\* Orthog. proj<sup>n</sup>:  $P^k = P$ ,  $\text{ran}(P) = \text{ker}(P)^\perp$ ,  $\|P\| = 1$



$$Qx = (I - P)x$$

$$Px \perp Qx$$

$$\|x\|^2 = \|Px\|^2 + \|Qx\|^2$$

$$\|x - Px\| = \inf_{y \in M} \|x - y\|$$

\* Let  $A$  be a matrix.  $M = \text{col}(A)$ .

$$P = \text{orthog. proj}^n \text{ onto } M = A(A^*A)^{-1}A^* = QQ^* = UU^*$$

from SVD  
↓  
From QR

# QR FACTORIZATION

(4)

$$A = QR$$

- \* Exists for every matrix
- \* Methods for computing:
  - GRAM-SCHMIDT (classical)
  - MODIFIED G-S
  - HOUSEHOLDER
- \* How to use it:
  - Solving linear systems
  - Least square problems.
  - Finding projectors
  - Basis for range.

# LEAST SQUARES PROBLEMS

(5)

\* Definition of sol<sup>n</sup> to  $Ax=b$

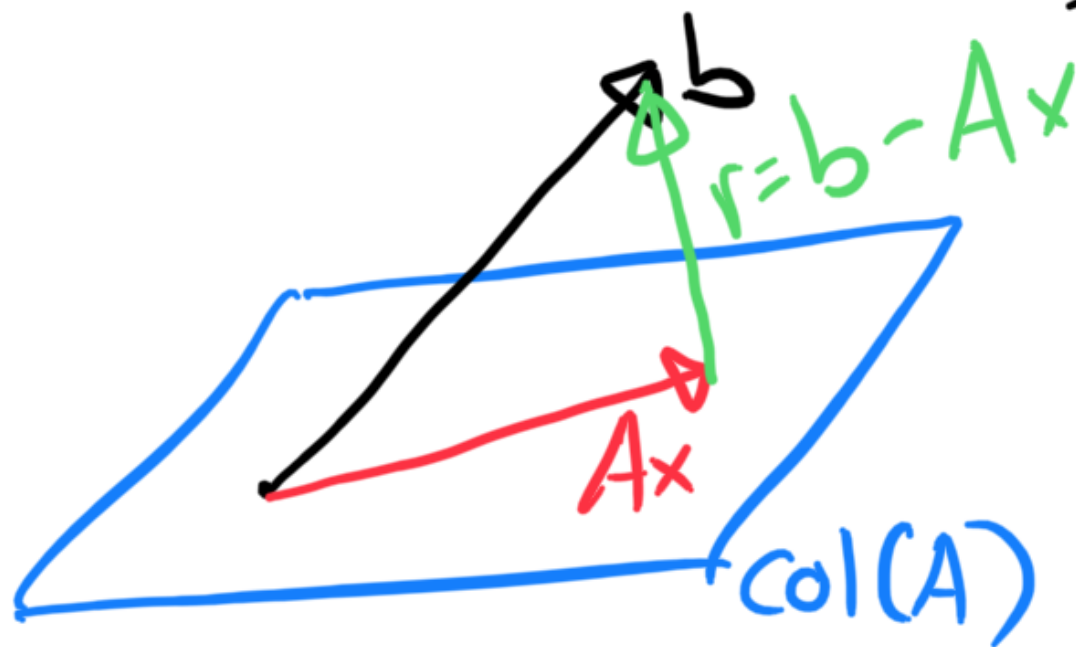
\* Geometry

\* How to compute sol<sup>n</sup>

- SVD

- QR

- Normal eq<sup>ns</sup> ← ill-cond!



# STABILITY & CONDITIONING

⑥

- \* Floating point arithmetic
- \* Round off errors. Def<sup>n</sup> of  $\epsilon_{mach}$
- \* Condition number
- \* Forwards & Backwards stability
- \* Concept of "significant digits"
- \* Summation: Order by magnitude.
- \* Conditioning of least squares problems

# LU FACTORIZATION & GAUSSIAN ELIM (7)

- \* Connection between G.E. and LU factorization.
- \* LU is cheaper than QR/SVD for solving linear systems.
- \* Pivoting.
- \* Stability of LU.
- \* (Better for sparse matrices)
- \* CHOLESKY  
 $A = R^*R$  FOR SPD matrices only!

# EIGENVALUE PROBLEMS

(8)

- \* Square matrices only.
- \*  $Av = \lambda v$  for  $v \neq 0$
- \*  $p(x) = \det(xI - A)$
- \* Geometric multiplicity  
vs. Algebraic
- \* Defective matrices.
- \*  $A = V\Lambda V^{-1}$  ← Does not always exist!  
↑ diagonal
- \* If  $A = A^*$  (or  $AA^* = A^*A$  more generally)  
then  $A = U\Lambda U^*$  with  $U$  unitary
- \* Schur decomposition  
 $A = U T U^*$  Always exists!  
↑ triangular
- \*  $A^k = V\Lambda^k V^{-1}$  ↑ triangular  
 $\exp(A) = V \exp(\Lambda) V^{-1}$
- \* Similarity transform:  $B = X A X^{-1}$



# ALGORITHMS FOR EVALS AND EVECS

9


- \* Must be iterative if  $m \geq 5$
- \* Power iteration. Shifted inverse iteration.  
→ Speed of convergence
- \* Rayleigh quotient → Cubic convergence  
when  $A = A^*$ !
- \* Block power iteration.
- \* Tridiagonal form (when  $A = A^*$ )  
Hessenberg form
- \* QR algorithm

# KRYLOV METHODS

(10)

\* Def<sup>n</sup> of Krylov space

$$K_n = \text{span}(b, Ab, A^2b, \dots, A^{n-1}b)$$

\* Uses only matrix-vector multiply   
Good for large sparse matrices

\* Arnoldi: Build  $A = QHQ^*$   
 $Ax = \lambda x$  one column at a time  
 $AQ_n = Q_{n+1} \tilde{H}_n$

\* GMRES  $Ax = b$

\* Lanczos  $Ax = \lambda x$  symmetric matrices  
3-term recurrence

\* Conjugate gradients - for SPD matrices  
 $Ax = b$

## Final exam:

- Saturday Dec 14, 19:00 - 22:00. Room: BUR 136.
- Cumulative exam. All material covered in the class is included.
- Material covered after the midterm will be emphasized *slightly* heavier.
- The first question will involve several short questions based on the homeworks.  
Use your time wisely.