

# Lecture 09 – HW2 and Intro to Krylov Methods (CG)

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NERS/ENGR 570 - Methods and Practice of Scientific Computing (F22)



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# Outline

- 10,000 ft view

- Krylov Methods Alphabet Soup

- Conjugate Gradient

- HW2

# Learning Objectives: By the end of Today's Lecture you should be able to

- ★ • (Skill) Decide what Krylov method to use for a particular problem
- (Knowledge) explain what defines a Krylov method
- (Knowledge) implement the CG algorithm
- (Knowledge) have an intuition about CG converges
- ✓ • (Skill) Complete HW 2



# The 10,000' View

# Overview of Solution Methods

$$Ax = b$$



Direct  $O(n^3)$   
 Iterative  $O(n^2) \times m$   
 $\downarrow$  iterations  
 SPMV  
 $O(n)$  - Fast

L7

Direct

LU (Gaussian Elimination)

QR

Cholesky

Singular Value Decomposition

Eigendecomposition

Iterative

L8

L9

non-Stationary

Stationary

- Conjugate Gradient
- Lanczos
- Arnoldi

Krylov  
1950's 1970's 1990's

Jacobi  
Gauss-Seidel } ~1800's  
SOR/SSOR 1950's  
Multigrid



# Alphabet Soup

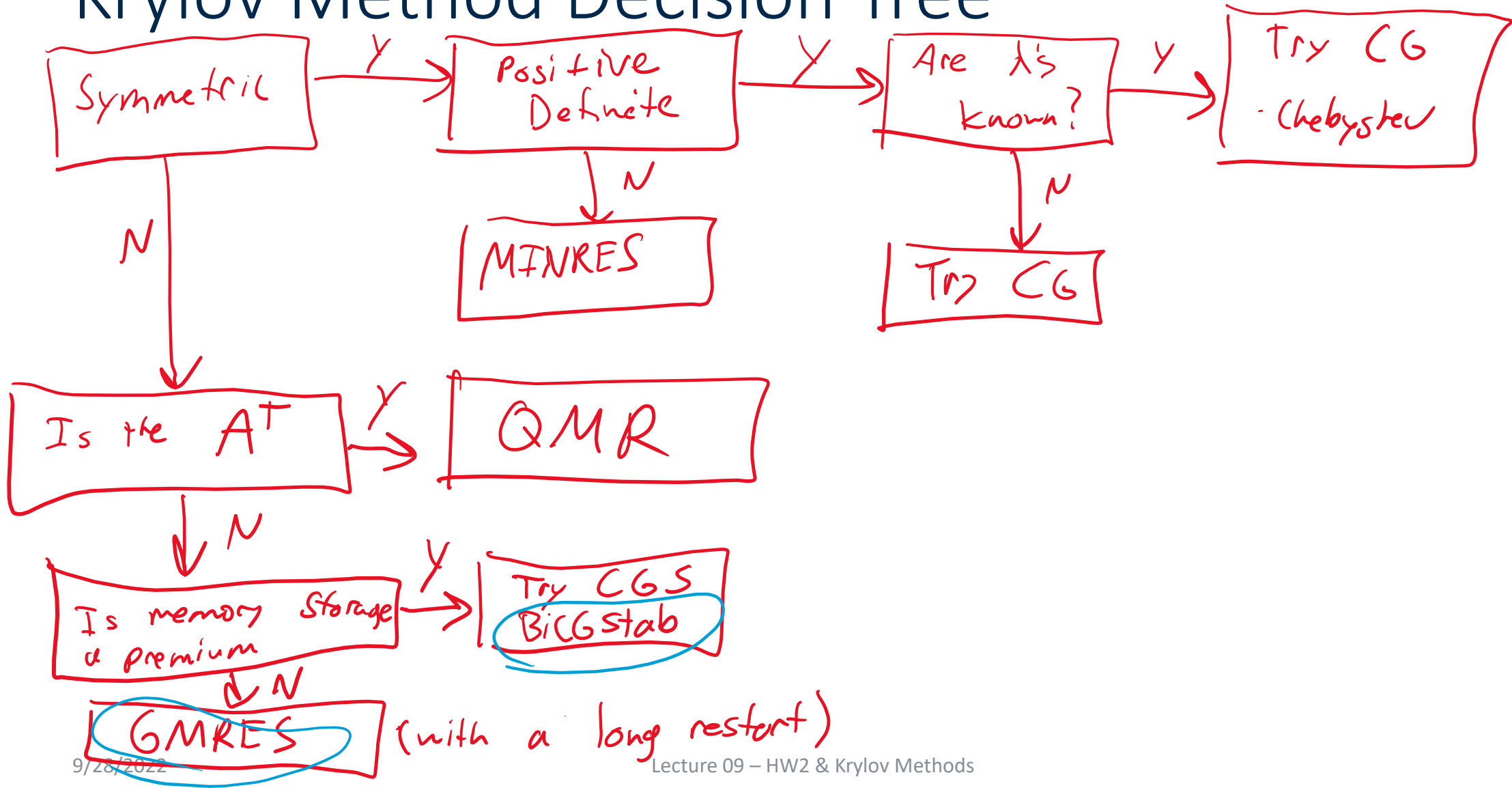
CG, SYMMLQ, MINRES, GMRES, BICGTSAB, QMR, ...



# Krylov Method Categorization

	$Ax = b$	$Av = \lambda v$
$A = A^T$	Conjugate Gradient (CG) - $A$ is s.p.d. MINRES (Minimized Resis.) SYMMLQ	Lanczos * implicitly restarted * Jacobi-Davidson
$A \neq A^T$	CGN/LSQR $\Rightarrow A^T A x = A^T b$ GMRES (Generalized Minimum Residual) QMR, Bi-Conjugate Grad (BiCG) CGS, Bi-Conjugate Gradient-Stable BiCGstab $\rightarrow$ 1992	Arnoldi * implicitly restarted * Jacobi-Davidson (JD)

# Krylov Method Decision Tree







# The Method of Conjugate Gradients



# History of CG



# Krylov (subspace) Methods



# What CG does



# How does CG work?



# The actual procedure



# The polynomial aspect



# Convergence of CG