

**Math 298**  
**Fundamental Concepts in**  
**Computational and Applied**  
**Mathematics**

**Class 2**

# Recap

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- Beware catastrophic cancellation – know limits of precision
- Ask about conditioning of a problem
- Choose stable algorithms so as to not introduce any more loss of precision than is necessary
- **Conditioning** is fundamentally a characteristic of the problem, while **stability** is related to algorithms

# Discussion of Bailey's paper

- Climate modeling
  - *“almost all numerical variation occurred in one inner product loop ... and in a similar operation in a large conjugate gradient calculation”*
- N-Body atomic system simulations
  - *“solve the generalized eigenvalue problem  $(\hat{H} - E\hat{S})C = 0$ , where the matrices  $\hat{H}$  and  $\hat{S}$  are large ... and very nearly degenerate”*
- Computational Geometry and Grid Generation
  - *“small numerical errors in the computation of the point nearest to a given point on a line intersecting two planes can result in the computed point being so far from either plane as to rule out the solution being correct for a reasonable perturbation of the original problem”*

# Dense Linear Algebra

- Basic Linear Algebra
  - dot products, saxpy, matvec
  - Solve  $Ax = b$
  - Solve  $Ax = \lambda x$
- We cannot solve anything except linear systems
- Various standard methods.
  - LU
  - Cholesky
  - QR
  - SVD
- Your choice will depend on the application and time constraints

# Some useful facts

- Define the condition number of a matrix  $A$  by:

- $\kappa(A) = \|A\| \cdot \|A^{-1}\|$

- Best possible error bound for solving a system of linear equations can be given by

- $\frac{\|x - \hat{x}\|_{\infty}}{\|x\|_{\infty}} \leq 4\mu\kappa_{\infty}(A)$

- Problems for which  $\mu\kappa_{\infty}(A) \approx 1$  are considered **ill-conditioned**
- Gaussian elimination always produces solutions with relatively small residuals (minor caveats)

**Stable/Unstable?**

**Well conditioned/ill conditioned?**

$$A = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}$$

# Comparison of algorithms

| Algorithm | Work               | Advantages  | Disadvantages                                    |
|-----------|--------------------|---|--|
| LU        | $\mathcal{O}(n^3)$ | Simple  | Unstable   |
| LU w/PP   | $\mathcal{O}(n^3)$ | (Usually) stable<br>Depends on growth factor $\rho$ | Growth factor;<br>pivoting will change structure |
| LU w/FP   | $\mathcal{O}(n^3)$ | Stable  | More work than PP                                |
| QR        | $\mathcal{O}(n^3)$ | Stable  | Twice the work of LU                             |
| SVD       | $\mathcal{O}(n^3)$ | Stable  | More than twice the work                         |

# LU with partial pivoting

- Can show that LU/PP generates exact solution to a perturbed problem  $(A + E) x = b$ , such that

$$||E||_{\infty} \leq 8n^3 \rho ||A||_{\infty} \mu$$

- The growth factor  $\rho$  can grow exponentially, but in practice is usually or order 10
- Consider the residual,  $b - Ax$ :

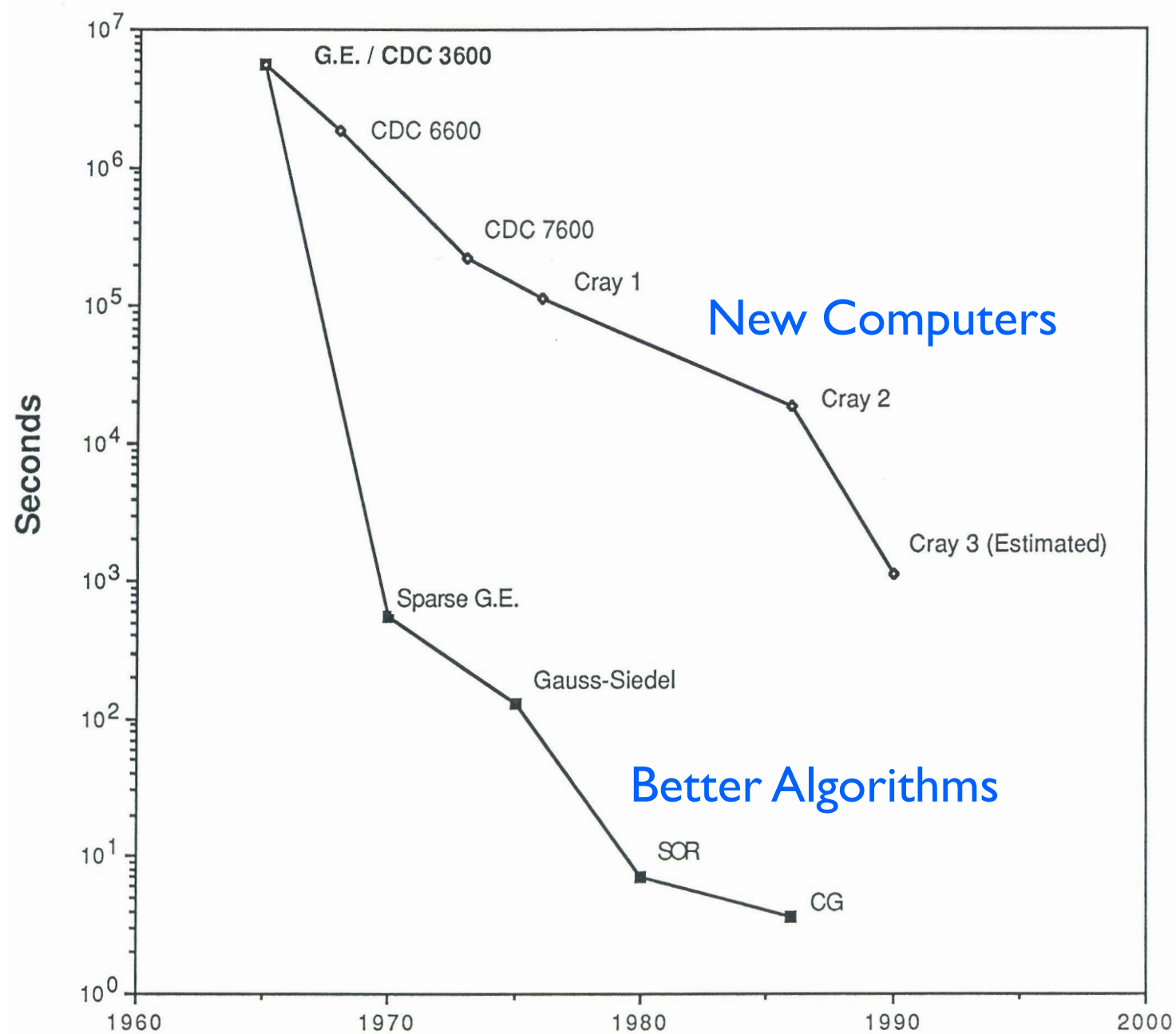
$$\begin{aligned} ||b - Ax||_{\infty} &= ||Ex||_{\infty} \\ &\leq 8n^3 \rho ||A||_{\infty} \mu ||x||_{\infty} \\ &\approx \mu ||A||_{\infty} ||x||_{\infty} \end{aligned}$$



# MODEL PROBLEM

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- **POISSON'S EQUATION**
  - Steady state heat flow
  - Electrostatics
  - Simple diffusion
  - Simple fluid flow
- **3-Dimensional Geometry**
- **30,000 Nodes**



J.C. Meza, Presentation at SNL, 1989