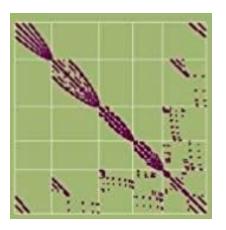


# Iterative Solvers of Ax = b The Jacobi and CG Methods 1

CS 111: Intro to Computational Science
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Carl Gustav Jacob Jacobi (1804 - 1851)

## Administrative

- New homework...!
- Lab tomorrow
- Quiz 2 results will be out on Canvas today
  - Median grade = 8/10 Average = 7.9/10
- Preliminary slides for this lecture available on Canvas

## Ax = b Solvers We've Learned So Far

Solving Ax = b can be easier to do if we first "decompose" A:

• LU Factorization P.A = L.U Useful for most matrices

• Cholesky  $A = R.R^T$  Useful for SPD matrices

• QR Factorization **A** = Q.R Useful for real matrices

#### New iterative methods we'll learn:

- Jacobi Method
- Conjugate Gradient Method

#### An **iterative** algorithm for determining

the solutions of a *diagonally dominant* system of linear equations.

#### Diagonally dominant:

 for every row of the matrix, the absolute value of the diagonal entry in a row is greater than or equal to

the sum of absolute values of all the other (non-diagonal) entries in that row

## Diagonally Dominant Example

#### For example,

$$A = \begin{bmatrix} -4 & 2 & 1 \\ 1 & 6 & -2 \\ -1 & -3 & -5 \end{bmatrix}$$
 is a strictly diagonally dominant matrix

$$|a_{00}| > |a_{01}| + |a_{02}|$$
, that is,  $4 > (2 + 1)$   
 $|a_{11}| > |a_{10}| + |a_{12}|$ , that is,  $6 > (1 + 2)$   
 $|a_{22}| > |a_{20}| + |a_{21}|$ , that is,  $5 > (1 + 3)$ 

- Simple, programmable, efficient
  - Not always the most accurate results (but we can get them fast)
  - Also, not the most efficient iterative algorithm out there
- Given a system: Ax = b, solve for x
- We can start with a guess for x
  - Good starting point is the **zero vector** (i.e. x = [0, 0, 0, ...])
  - We'll call it the **0**<sup>th</sup> **approximation**, or **x**<sup>(0)</sup>
  - We'll *iterate* some process to keep guessing for a better and better solution
  - Our iteration will lead to a **convergence** of  $\mathbf{x}^{(n)}$  to an approximate correct answer
    - But matrix A really needs to be "strictly diagonally dominant"

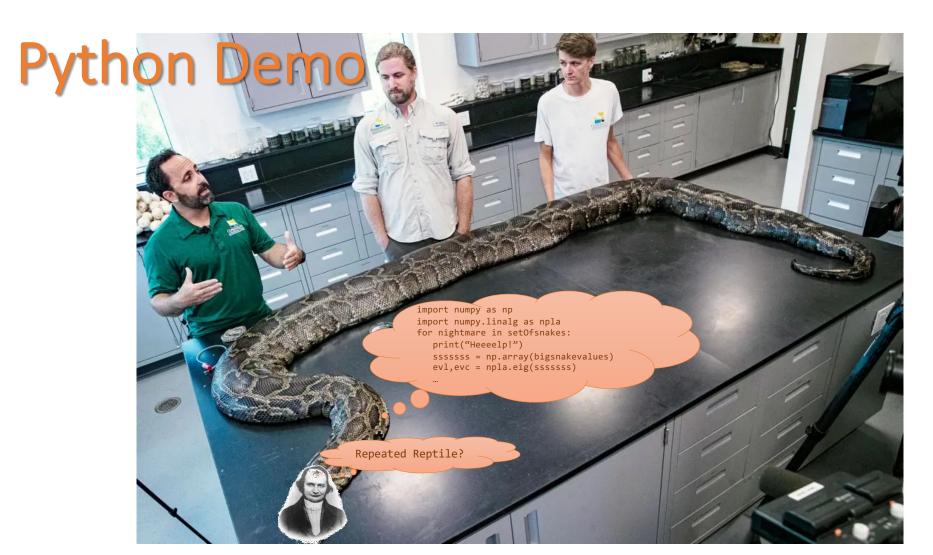
## CALCULATION DEMO Coming up!!!

## Given a current (kth) approximation for **x** as:

$$\mathbf{x}^{(k)} = \begin{bmatrix} \mathbf{x}_1 \\ \mathbf{x}_2 \\ \mathbf{x}_3 \end{bmatrix}$$

- Find the (k+1)<sup>th</sup> solution.
- Keep repeating (iterating) until your "error" is "small enough"
  - Would indicate a *convergence* to the correct value
  - You want to see the error decrease as you keep iterating
  - In a real application, you don't always know if you're close to an answer, but in class, we'll "cheat" and compare with the "ideal" x.
- We'll do an "error analysis" with each iteration
  - o To see the difference of the norms w.r.t. the ideal answer
  - We'll want to define a "threshold" of an acceptable stop-point for convergence

- Strict row diagonal dominance is a sufficient but not necessary condition for Jacobi's Method to converge
  - It <u>sometimes</u> converges even if this condition is not satisfied (though it'll do so much slower)
- The standard convergence condition (for any iterative method) is when the *spectral radius* of the iteration matrix is less than 1
  - Written as:  $\rho$  (**D**<sup>-1</sup>.**C**) < **1**
  - It means that the max. eigenvalue of D<sup>-1</sup>.C should be < 1
- A nice write-up to read (optional) on Wikipedia: <a href="https://en.wikipedia.org/wiki/Jacobi\_method">https://en.wikipedia.org/wiki/Jacobi\_method</a>



## Your TO DOs!

• Work on your homework!

