

Class 14: Newton for Systems (II) / Quasi Newton

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Recall: Last time, we wrapped up our discussion on the Fixed Point Iteration for systems of non-linear equations and the corresponding rootfinding problems. We then generalized the ideas behind the Newton method to show how linear approximation of $F(x)$ at $x = x_k$ can be used to generate a formula for the Newton step. This gives us the equation:

$$J_F(x_k) (x_{k+1} - x_k) = -F(x_k)$$

We then compute $p_k = \text{np.linalg.solve}(J_F(x_k), -F(x_k))$, and compute $x_{k+1} = x_k + p_k$.

$$\boxed{\vec{x}_{k+1} = \vec{x}_k - J_F^{-1}(\vec{x}_k) F(\vec{x}_k).}$$

Q Do not compute $J_F^{-1}(x_k)$!

MORE EXPENSIVE AND LESS STABLE.

- $\vec{p}_k = \text{np.linalg.solve}(J_F(x_k), -F(x_k))$
- $\vec{x}_{k+1} = \vec{x}_k + \vec{p}_k$.

Why do we like Newton

↳ Quadratic convergence.

↳ Solution in few # of iter.

(How fast do I get my answer?)

$$\text{COST} = (\# \text{ Iters}) (\text{Cost per Iter})$$

NEWTON LOW GROWING $O(n^3)$

OTHER HIGH CHEAP!

- EVALUATE $J_F(x_k)$. \rightarrow EXPENSIVE
- SOLVE $J_F(x_k) P_k = -F(x_k)$ \rightarrow EXPENSIVE

LIMITATIONS OF NEWTON (COST PER ITER)

OTHER SOURCE:

OUTSIDE OF BASIN OF QUAD CONVERGENCE
 \hookrightarrow No guarantees.

ADD SOMETHING TO ENSURE CONV.
 (GLOBALLY CONV.).

- o Hybrid method
- o Line-search methods.

QUASI-NEWTON:

WANT:

Preserve — for $\|x_0 - r\| < \delta$, I
 have that $x_k \rightarrow r$ quadratically.
(superlinear)

AVOID:

- o Computing $J_F(x_k)$.
- o Make the linear solve cheaper.



"Lazy Newton" (Chord Iteration)

$$x_{k+1} = x_k - J_F(x_0)^{-1} F(x_k) \quad (P_k = \text{np.linalg.solve}(J_F(x_0), -F(x_k)))$$

✓ Chord does avoid computing J_F except once.

✓ Solving a lot of Linear Systems for the same matrix.

$$J_F(x_0) = L \cdot U \rightarrow \text{SOLVE } \underline{\underline{O(n^2)}}$$

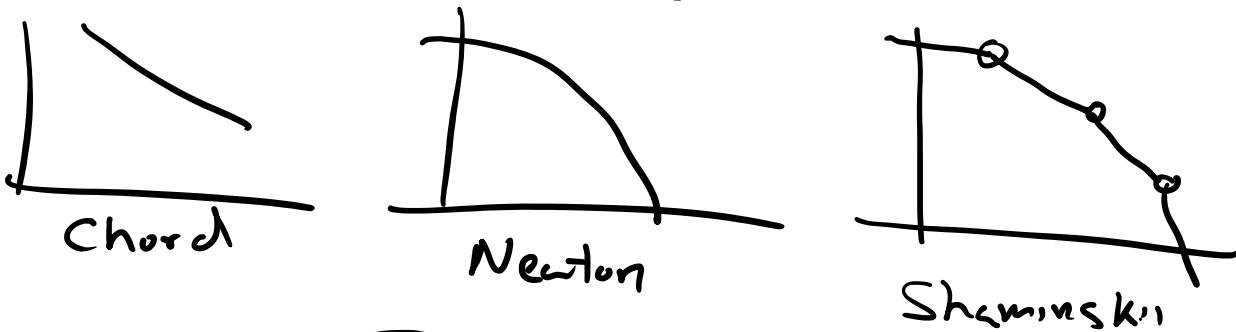
LOWER TRIANG. UPPER TRIANG.

✗ If it converges, it does so linearly.

Between chord & Newton.

↳ Shamin'skii method.

Update J_F every m steps.



• Inexact Newton.

- ① Inexact Newton.
- ② "Secant" method (?)
 \hookrightarrow Quasi-Newton \rightarrow Broyden
 (Other methods — for optimization)

$$\underbrace{L_F(\vec{x}) = F(\vec{x}_0) + \overline{J_F}(\vec{x}_0)(\vec{x} - \vec{x}_0)}$$

$$L_S(\vec{x}) = \overline{F(x_0)} + \underbrace{\overline{B_0}(\vec{x} - \vec{x}_0)}_{\text{inversible}}.$$