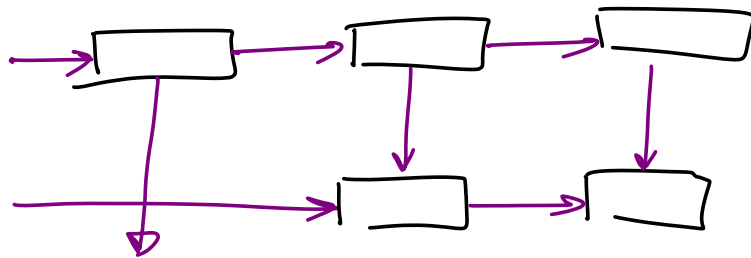


HW # 1 Due today

HW # 2 Assigned and due Wed. Oct 26

- Interfacing to Sparse 1.4
- Solution of linear circuits
- Setup of Newton loop with linear circuit elements.

Sparse Matrix Techniques

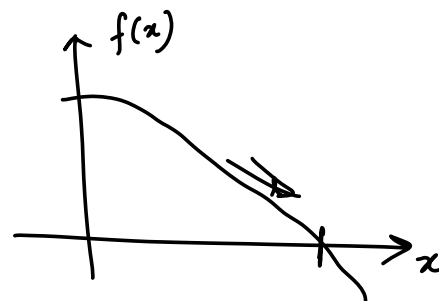
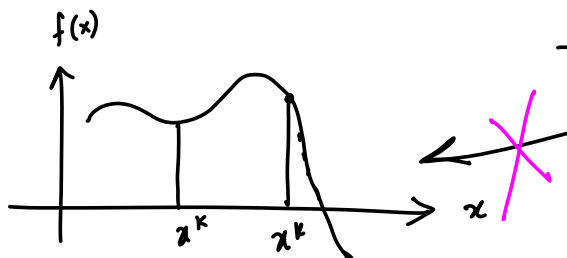


Independent voltage source

sp Get Element (Matrix, A, Ibr)

$$\begin{array}{l} A \\ B \\ \text{BCR} \end{array} \begin{array}{c} V_A \\ V_B \\ I_{br} \end{array} \begin{bmatrix} \\ \\ \boxed{+1} \\ \boxed{-1} \\ \boxed{1} \\ \boxed{-1} \end{bmatrix} \begin{bmatrix} 0 \\ 0 \\ V_s \end{bmatrix}$$

Damped Newton Method



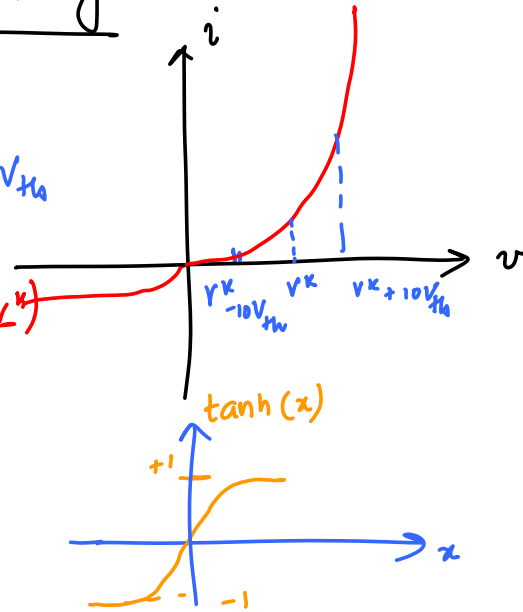
J_F^{-1} is bounded

Diode (pn junction) Limiting

Ensure that

$$V_{-10V_{th}}^k \leq V_{lim}^{k+1} \leq V_{+10V_{th}}^k$$

$$V^{k+1} = V^k + 10V_{th} \tanh\left(\frac{V^{k+1} - V^k}{10V_{th}}\right)$$

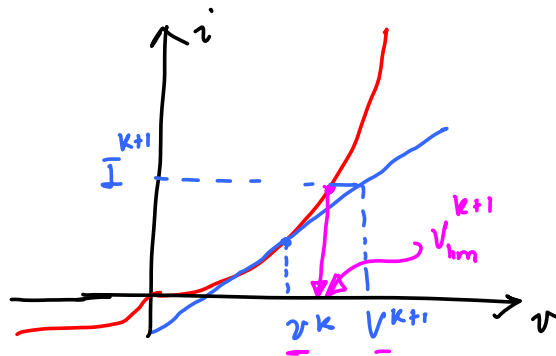


SPICE PN Junction
limiting (PNJLIM)

For the diode:

$$i = I_s (e^{v/V_{th}} - 1)$$

$$\frac{\partial i}{\partial v} = \frac{I_s}{V_{th}} e^{v/V_{th}}$$



Linearization at iteration $k+1$

$$\hat{I} = I^{k+1} = I_s (e^{v^k/V_{th}} - 1) + \frac{I_s}{V_{th}} e^{v^k/V_{th}} (v^{k+1} - v^k)$$

$$\hat{I} = I_s (e^{v_{lim}^{k+1}/V_{th}} - 1)$$

$$v_{lim}^{k+1} = V_{th} \ln \left(\frac{\hat{I}}{I_s} + 1 \right)$$

$$= V_{th} \ln \left[e^{v^k/V_{th}} + \frac{e^{v^k/V_{th}}}{V_{th}} (v^{k+1} - v^k) \right]$$

$$V_{th} \ln \left[e^{v^k/V_{th}} \left(1 + \frac{v^{k+1} - v^k}{V_{th}} \right) \right]$$

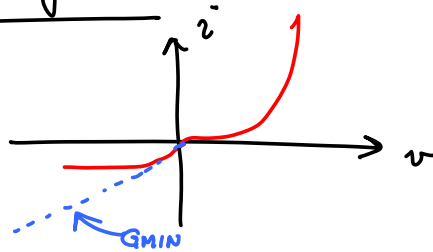
$$v_{lim}^{k+1} = v^k + V_{th} \ln \left[\frac{v^{k+1} - v^k}{V_{th}} + 1 \right]$$

This limiting formula is applied only when $v^{k+1} > v_{crit}$, and $v^{k+1} > v^k$

$$V_{th} \ln \left(\frac{V_{th}}{\sqrt{2} I_s} \right) \leftarrow \text{maximum curvature}$$

What happens if v^k are negative?

$$\frac{di}{dv} = \frac{I_s}{V_{th}} e^{v/V_{th}} \approx 0$$



$$i = I_s (e^{v/V_{th}} - 1) + G_{min} v \quad G_{min} = 10^{-12}$$

$$\frac{\partial i}{\partial v} = \frac{I_s}{V_{th}} e^{v/V_{th}} + G_{min}$$

In SPICE2 $v < -5 * V_{th}$ $i = -I_s + G_{min} v$
 \downarrow
 $\frac{di}{dv} = G_{min}$

Other limiting schemes in SPICE

FET LIM (limits V_{gs})

LIM VDS (limits V_{ds})

} MOSFETS

Usage for Sparse 1.4:
on unix

/sparse mat0
mat1
- - mat4

Nonlinear equation Solution

- 1) Newton's method
- 2) Optimization methods
- 3) Continuation methods

Optimization - based methods

Solve $f(x) = 0$ by solving $\min \|f(x)\|_2^2$

If $f(x)$ has a zero (x^*) then $\min \|f(x)\|_2^2 = 0$
 $\Rightarrow f(x) = 0$

Steepest descent method

$$x^{k+1} = x^k + \alpha (-J^T f)$$

Newton's method $x^{k+1} = x^k + \lambda (-J^{-1} f)$

Continuation methods

1) Source stepping

When sources are at zero: $x = 0$

ramp up source voltage by a small amount (say δ_i) then $x(\delta_i)$ is close to $x(0)$

Recall "close enough"

\Rightarrow expect Newton's method to converge

Procedure:

Source vector S

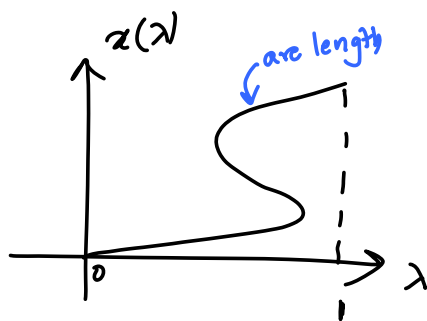
Define a parameter $\lambda: 0 \leq \lambda \leq 1$

Define $S(\lambda) = \lambda S$

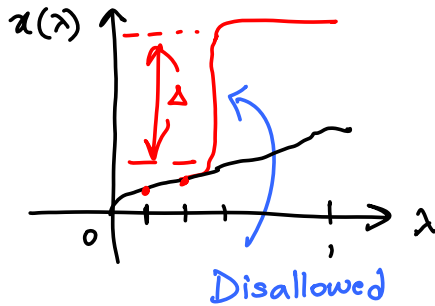
Vary λ from 0 to 1 and solve circuit for each λ

$\lambda = 1$ is the solution for the original problem

$x(\lambda)$ i.e. the solution for source λS should be sufficiently smooth



General Case



$f(x) = 0$ original problem

Solve $\tilde{f}(x(\lambda), \lambda) = 0$

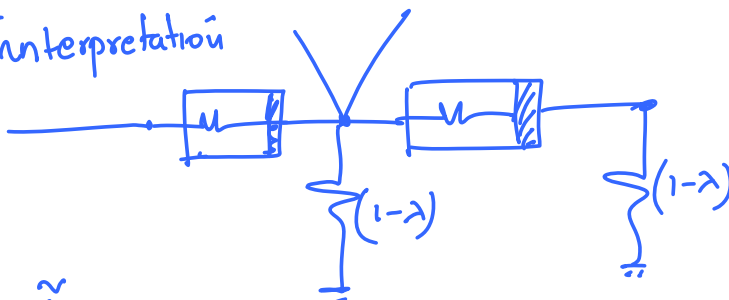
- Where:
- 1) $\tilde{f}(x(1), 1) = f(x)$
 - 2) $\tilde{f}(x(0), 0) = 0$ is easy to solve
 - 3) $x(\lambda)$ is sufficiently smooth

Simple scheme:
 Embedding function $\tilde{f}(x(\lambda), \lambda) = \lambda f(x(\lambda)) + (1-\lambda)x(\lambda)$
 For $\lambda=0$: $\tilde{f}(x(0), 0) = x(0) = 0$
 $\lambda=1$: $\tilde{f}(x(1), 1) = f(x(1)) = 0$

Application of Newton's method

$$\frac{\partial \tilde{f}}{\partial x} = \lambda \frac{\partial f}{\partial x} + (1-\lambda) I$$

Circuit interpretation



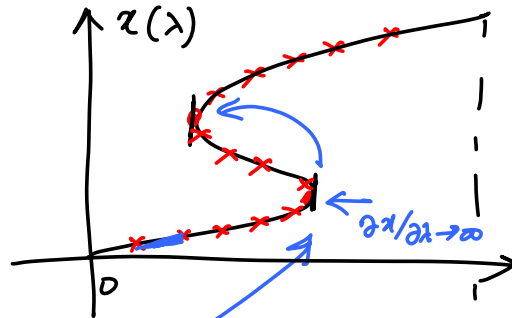
$$\frac{\partial \tilde{f}}{\partial \lambda} = f(x(\lambda)) - x(\lambda)$$

$$\tilde{f}(x(\lambda), \lambda) = 0$$

$$\frac{\partial \tilde{f}}{\partial x} \frac{\partial x}{\partial \lambda} + \frac{\partial \tilde{f}}{\partial \lambda} = 0$$

$$\frac{\partial x}{\partial \lambda} = \left[\frac{\partial \tilde{f}}{\partial x} \right]^{-1} \left(-\frac{\partial \tilde{f}}{\partial \lambda} \right)$$

↑ singular $\frac{\partial \tilde{f}}{\partial x}$



$$\delta \sigma = \sqrt{(\delta x)^2 + (\delta \lambda)^2}$$

Parameterize x & λ in terms of the arc length

$$\begin{matrix} x(\sigma) \\ \lambda(\sigma) \end{matrix} \quad 0 \leq \sigma \leq \sigma_L$$

$$\tilde{f}(x(\sigma), \lambda(\sigma)) = 0$$

$$\|\delta x\|^2 + |\delta \lambda|^2 = \delta \sigma^2$$

$$\begin{bmatrix} \frac{\partial \tilde{f}}{\partial x} & \frac{\partial \tilde{f}}{\partial \lambda} \\ 2(x - x_{\text{prev}})^T & 2(\lambda - \lambda_{\text{prev}}) \end{bmatrix} \begin{bmatrix} x^{k+1} - x^k \\ \lambda^{k+1} - \lambda^k \end{bmatrix} = \begin{bmatrix} -\tilde{f}(x^k, \lambda^k) \\ \dots \end{bmatrix}$$

Exact arc length : $\|\dot{x}(s)\|^2 + |\dot{\lambda}(s)|^2 = 1$

↑ exact arc length

HOMPACK homotopy method

Calling Sparse 1.4

```
/*Declaration of cktMatrix */
char * cktMatrix;

/* setup circuit matrix */
cktMatrix = spCreate( NumEqns, 0, &error );
if( error IS spNO_MEMORY ) {
    printf( "\n: --- NO MEMORY ---" );
    exit( -1 );
}
/* compute DC solution */
/* first Factor the matrix and then Forward/Back solve */
error = spFactor( cktMatrix ); /* LU factorization; Pivoting */
if( foundError( error ) ) {
    exit( -1 );
}

spSolve( cktMatrix, Rhs, Sol ); /* Forward/Back Solve */
```

Res.h

```
typedef struct resistor{
    char *name; /* pointer to character string naming this instance */
    int pNode; /* number of positive node of resistor */
    int nNode; /* number of negative node of resistor */

    double value; /* resistance */
    double conduct; /* conductance */
    double *pn1n1; /*pointer to sparse-matrix location (pNode, pNode)*/
    double *pn1n2; /*pointer to sparse-matrix location (pNode, nNode)*/
    double *pn2n2; /*pointer to sparse-matrix location (nNode, nNode)*/
    double *pn2n1; /*pointer to sparse-matrix location (nNode, pNode)*/
} resistor ;
```

Setup

```
void setupRes(Matrix, Res, numRes)
char *Matrix;
resistor *Res[];
int numRes;
{
    int i, n1, n2;
    resistor *inst;
    for(i = 1; i <= numRes; i++) {
        inst = Res[i];
        inst->conduct = 1.0/inst->value;
        n1 = inst->pNode;
        n2 = inst->nNode;
        /* setup matrix and pointers */
        inst->pn1n1 = spGetElement(Matrix, n1, n1);
        inst->pn1n2 = spGetElement(Matrix, n1, n2);
        inst->pn2n2 = spGetElement(Matrix, n2, n2);
        inst->pn2n1 = spGetElement(Matrix, n2, n1);
    }
}
```

Load

```
void loadRes(Matrix, Rhs, Res, numRes)
char *Matrix;
double *Rhs;
resistor *Res[];
int numRes;
{
    int i;
    resistor *inst;
    double conduct;
    for(i = 1; i <= numRes; i++) {
        inst = Res[i];
        conduct = inst->conduct;
        /* load matrix */
        *(inst->pn1n1) += conduct;
        *(inst->pn1n2) -= conduct;
        *(inst->pn2n2) += conduct;
        *(inst->pn2n1) -= conduct;
    }
}
```

Multidimensional Newton Method Algorithm

Newton Algorithm for Solving $F(x) = 0$

$x^0 =$ Initial Guess, $k = 0$

Repeat {

 Compute $F(x^k), J_F(x^k)$

 Solve $J_F(x^k)(x^{k+1} - x^k) = -F(x^k)$ for x^{k+1}

$k = k + 1$

} Until $\|x^{k+1} - x^k\|, \|f(x^{k+1})\|$ small enough

From: A. Nardi

Multidimensional Newton Method Convergence

Local Convergence Theorem

If

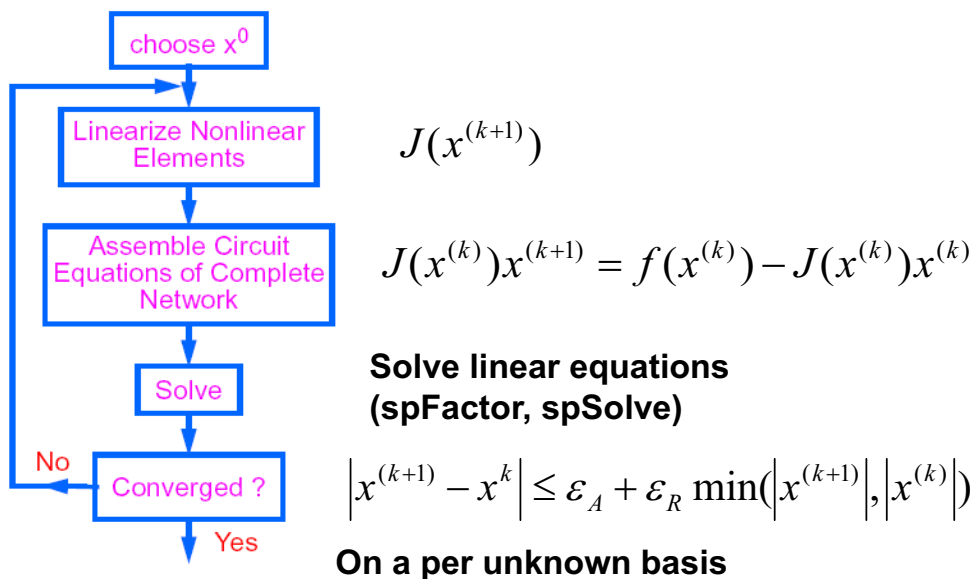
a) $\|J_F^{-1}(x^k)\| \leq \beta$ (Inverse is bounded)

b) $\|J_F(x) - J_F(y)\| \leq \ell \|x - y\|$ (Derivative is Lipschitz Cont)

Then Newton's method converges given a sufficiently close initial guess (and convergence is quadratic)

From: A. Nardi

The Newton Loop in DC Analysis

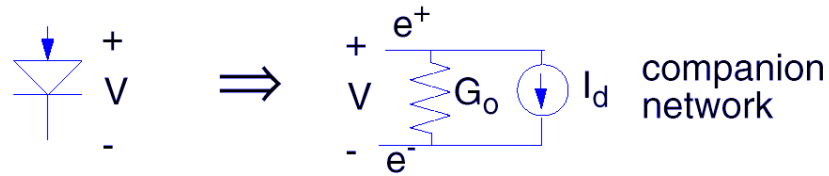


Practical Considerations

- **Device model equations must be continuous with continuous derivatives**
 - Not all models have this property
 - **Recent shift to C_∞ models – correct by construction**
 - Be cautious of designer/user-supplied models
- **Check for floating nodes**
 - If a node is disconnected, then $J(x)$ is singular
- **Provide a good initial guess for $x^{(0)}$**
 - This is easy for digital circuits but difficult for analog circuits

Application of NR to Circuit Equations

Companion Network – MNA Stamp



	e ⁺	e ⁻	RHS
+	G ₀	-G ₀	-I _d
-	-G ₀	G ₀	+I _d

G_0 and I_d depend on the iteration number k
 $\Rightarrow G_0 = G_0(k)$ and $I_d = I_d(k)$

From: A. Nardi

MOS Level 1 MOSFET Equations

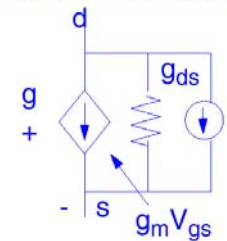
Body Effect Ignored

Choose source as reference node

$$\frac{\partial I_{ds}}{\partial V_{gs}} \equiv g_m$$

$$\frac{\partial I_{ds}}{\partial V_{ds}} \equiv g_{ds}$$

Linearized Model (Companion Model)



$$I = I_{ds}^k - g_m V_{gs}^k - V_{ds}^k g_{ds}$$

	e _d	e _s	e _g	RHS
d	g _{ds}	-g _{ds} -g _m	g _m	-I
s	-g _{ds}	g _{ds} +g _m	-g _m	I
g				

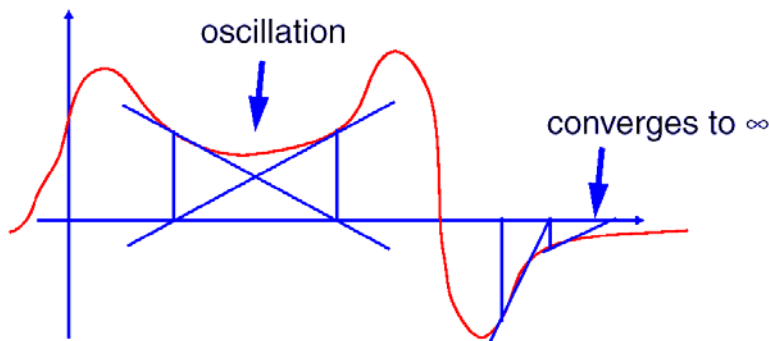
From: A. Nardi

Problems with Newton Method

Non Convergence

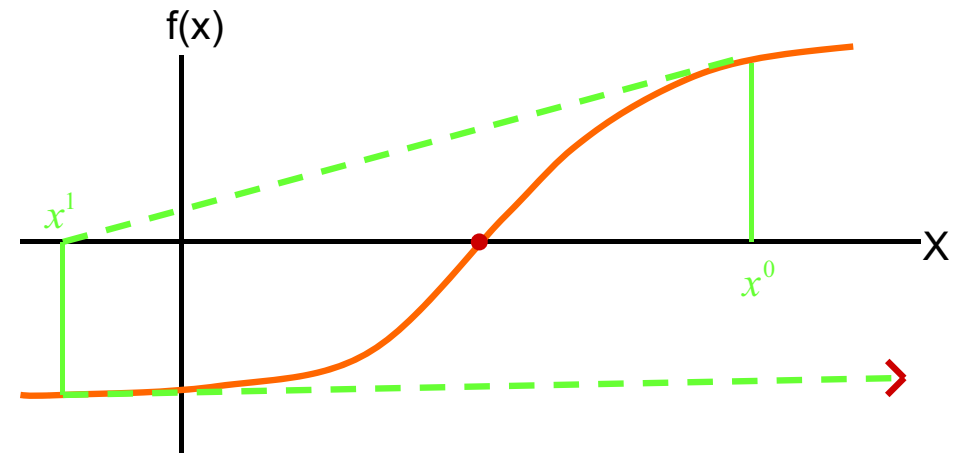
Convergence Depends on a Good Initial Guess

Example:



From: A. Nardi

Convergence Problems With Newton Method

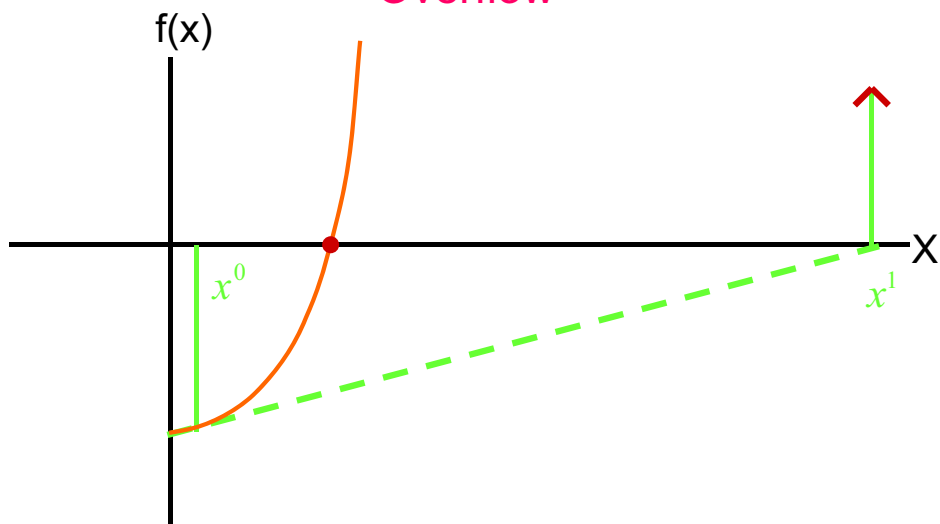


Must limit the changes in X

From: A. Nardi

Convergence Problems

Overflow



Must limit the changes in X

From: A. Nardi

Newton Method with Limiting

Newton Algorithm for Solving $F(x) = 0$

$x^0 =$ Initial Guess, $k = 0$

Repeat {

Compute $F(x^k), J_F(x^k)$

Solve $J_F(x^k)\Delta x^{k+1} = -F(x^k)$ for Δx^{k+1}

$x^{k+1} = x^k + \text{limited}(\Delta x^{k+1})$

$k = k + 1$

} Until $\|\Delta x^{k+1}\|, \|F(x^{k+1})\|$ small enough

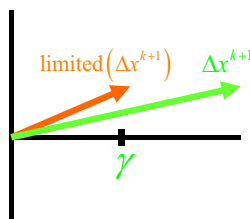
From: A. Nardi

Newton Method with Limiting

Limiting Schemes

- Direction Corrupting

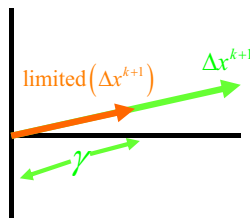
$$\text{limited}(\Delta x^{k+1})_i = \begin{cases} \Delta x_i^{k+1} & \text{if } |\Delta x_i^{k+1}| < \gamma \\ \gamma \text{ sign}(\Delta x_i^{k+1}) & \text{otherwise} \end{cases}$$



- Non Direction Corrupting

$$\text{limited}(\Delta x^{k+1}) = \alpha \Delta x^{k+1}$$

$$\alpha = \min \left\{ 1, \frac{\gamma}{\|\Delta x^{k+1}\|} \right\}$$



Heuristics, No Guarantee of Convergence

From: A. Nardi

Newton Method with Limiting

Damped Newton Scheme

General Damping Scheme

Solve $J_F(x^k)\Delta x^{k+1} = -F(x^k)$ for Δx^{k+1}

$x^{k+1} = x^k + \alpha^k \Delta x^{k+1}$

Key Idea: Line Search

Pick α^k to minimize $\|F(x^k + \alpha^k \Delta x^{k+1})\|_2^2$

Perform a one-dimensional search in Newton Direction

From: A. Nardi