

# DN1240 ht 12 för I

Numeriska metoder

# F1

- Översikt 12 F, 6 Ö, X Lab. - följer
- Lärare
  - Davoud Saffar Shamshigar
  - Ludwig Af Klinteberg
  - Jesper Ooppelstrup
- Examination
  - 2 Matlab-lab, muntlig redovisning, 1 projekt, skriftlig
  - Tenta – som alla Numme GK (DN1212,1214,...)
    - 1 kryssfrågedel för betyg E
    - 1 med räkneuppgifter

## A(n in)convenient truth

It is hard to understand an ocean because it is too big.

It is hard to understand a molecule because it is too small.

It is hard to understand nuclear physics because it is too fast.

It is hard to understand the greenhouse effect because it is too slow.

[Super]Computers break these barriers to understanding. They, in effect, shrink oceans, zoom in on molecules, slow down physics, and fast-forward climates. Clearly a scientist who can see natural phenomena at the right size and the right speed learns more than one who is faced with a blur.

Al Gore, 1990, “Scientific Computing”

# Scientific Computing

Wikipedia:

Scientific computing (or computational science) *is...* concerned with constructing mathematical models and numerical solution techniques and [...] using computers to analyze and solve scientific, social scientific, and engineering problems.

“Numerical analysis is the study of algorithms for the problems of continuous mathematics [...] to compute quantities that are typically uncomputable, [...] with lightning speed”  
(L.N.Trefethen 1992)

“The purpose of computing is insight, not numbers.”

(R.W.Hamming)

*"The Unreasonable Effectiveness of Mathematics"* (1980)

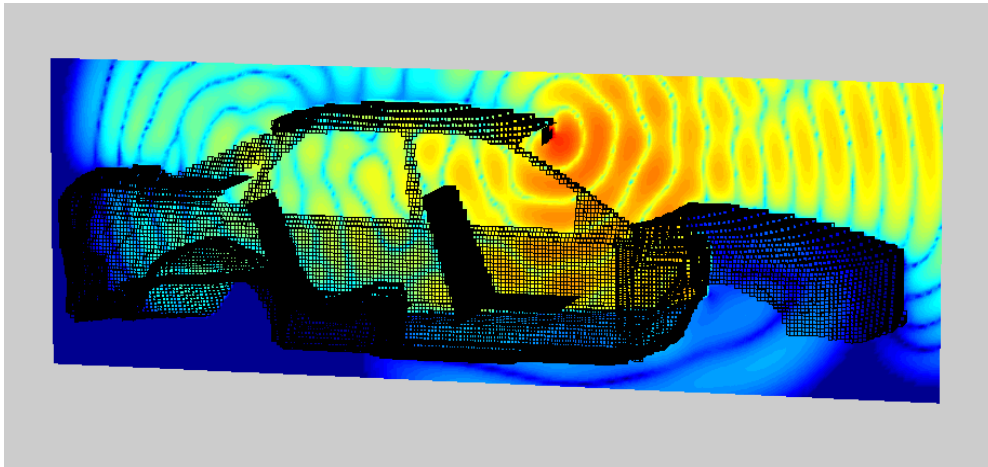


# Computer simulation is ... the third paradigm of science

“Simulation has become recognized as the third paradigm of science, the first two being experimentation and theory.”

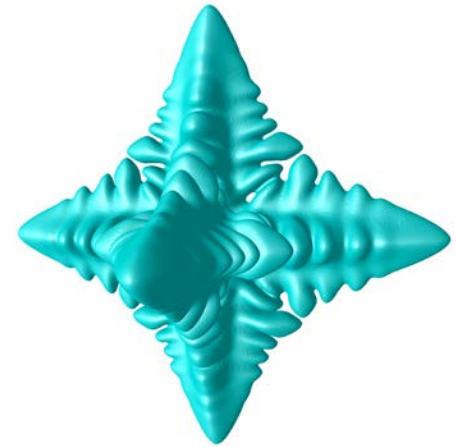
*High Performance Computing and Communications:  
Foundation for America's Information Future*  
(Supplement to the President's FY 1996 Budget)

Antenna in rear-view mirror: Directivity, EMC, ...



Maxwell simulator  
(T.Rylander & al, CTU)

Dendritic solidification

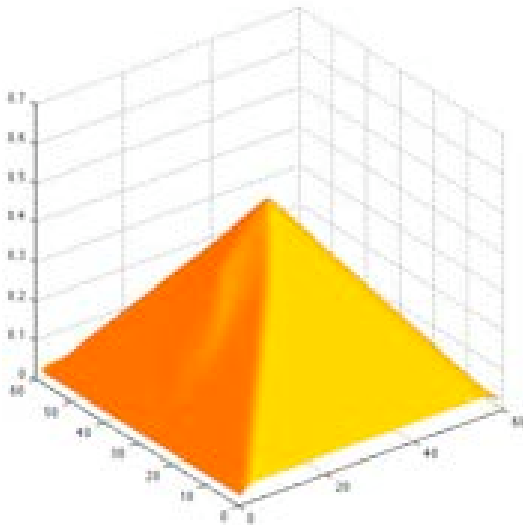


Phase-field simulator  
(G.Amberg & al, KTH)

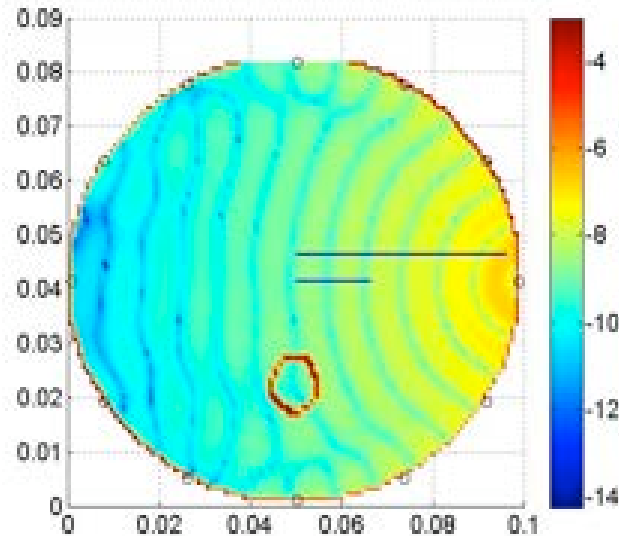
“There are three kinds of lies:  
Lies, damn’ lies, and colorful computer  
pictures” (P.Colella)

# Differential Equation Models

Shortest path



Micro-wave tomography



Tsunami



$$|\nabla T(x,y)| = 1/c(x,y) \text{ in } \Omega, \quad T = 0 \text{ on } \partial\Omega, \quad \Delta\phi + k^2(a(x,y) + ib(x,y))\phi = 0 \quad \begin{cases} h_t + hu_x + h_xu = 0 \\ u_t + uu_x + g(h_x + H_x) = 0 \end{cases}$$

Eikonal

Helmholtz

Shallow Water

# Computational Materials Science

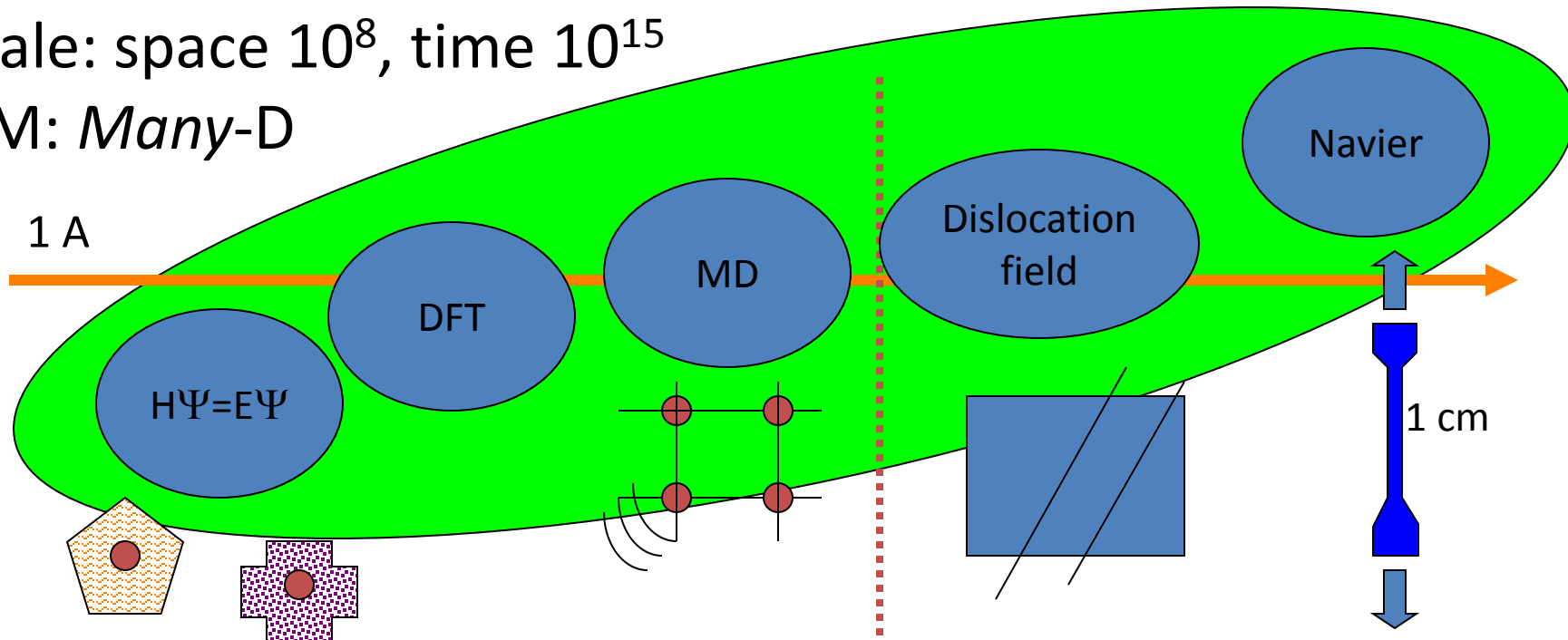
From quantum mechanics to structures:

Goals:

- Predict macroscopic properties from first principles
- Design new materials (ex. nano-technology)

Scale: space  $10^8$ , time  $10^{15}$

QM: *Many-D*



$$\sigma_{,j}^{ij} = F_i$$

$$\sigma^{ij} = \mu(u_{,j}^i + u_{,i}^j) - \lambda u_{,k}^k \delta^{ij}$$



## Success Story I: MATLAB

Major tool for engineering computing,  
Numerical analysis, visualization ...

1974 “Matrix Laboratory” C.Moler

Now: MathWorks > 1000 pers.

20th anniversary 2005:



## Success Story II: comsol

Multiphysics FE software

S.Littmarck

1995: MATLAB PDEToolBox

Now: Comsol > 150 pers.



- “Numerical Methods 101” 2012
  1. Why numerical methods? What can be computed?
  2. Approximation, iteration, linearization, algorithm
  3. Ordinary differential equations:
    - simulation, examples
  1. Partial differential equations:
    - simulation, exempel

***Most solutions are approximations!***

$$x^2 = 2$$

$$x = \pm\sqrt{2} \approx \pm 1.414$$

Compute ... but how?

1. Calculator ... but how does it do it?
2. Mathematics:

$$(1+x)^{1/2} = \sum_{k=0}^{\infty} \binom{1/2}{k} x^k = 1 + \frac{1}{2}x - \frac{1}{8}x^2 + \frac{1}{16}x^3 - \frac{5}{128}x^4 + \dots$$

$$(2)^{1/2} = \left(\frac{25}{16} + \frac{7}{16}\right)^{1/2} = \frac{5}{4} \left(1 + \frac{7}{25}\right)^{1/2} =$$

$$= \frac{5}{4} \left( 1 + \frac{1}{2} \frac{7}{25} - \frac{1}{8} \left(\frac{7}{25}\right)^2 + \frac{1}{16} \left(\frac{7}{25}\right)^3 - \frac{5}{128} \left(\frac{7}{25}\right)^3 + \dots \right)$$

$$= 1.25 \times (1 + 0.1400 - 0.0098 + 0.0014 - \dots) = 1.4145$$

*(Puh... despite the convergence acceleration)*

# ***Linearisation*** and ***iteration***: Newton's method

$$f(x) = 0 : x_{n+1} = x_n - \frac{f(x_n)}{f'(x_n)}, x_0 = \dots$$

$$f(x) = x^2 - 2 : x_{n+1} = \frac{1}{2} \left( x_n + \frac{2}{x_n} \right)$$

1    1.5    1.417    1.414216    1.4142136

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Mmm!

## Linjära ekvationssystem

Finn  $\mathbf{x} = (x_1, x_2, \dots, x_n)$  så  
att  $\mathbf{Ax} = \mathbf{b}$ ,  $\mathbf{A} = (a_{ij})$

NAM: 1.4, 1.5, 1.6 (inte  
1.6.2), 1.7, 1.8

eller

minstakvadrat-lösning

$\min \|\mathbf{Ax} - \mathbf{b}\|^2$

NAM 2

## Olinjär ekvation

Finn  $x$  så att  $f(x) = 0$

NAM 6

## Olinjära ekvationssystem

Finn  $\mathbf{x}$  så att  $\mathbf{f}(\mathbf{x}) = 0$

NAM 6.8, 6.9

eller

minstakvadrat-lösning

$\min \|\mathbf{f}(\mathbf{x})\|^2$

NAM 6.10

Initialvärdesproblem för  
ordinära differential-  
ekvationer

Finn  $\mathbf{y}(t)$  för  $t > 0$

då  $d\mathbf{y}/dt = \mathbf{f}(t, \mathbf{y})$ ,  $\mathbf{y}(0) = \mathbf{c}$

NAM 8.1-8.6

plus extra

Randvärdesproblem för  
ordinära differential-  
ekvationer

Finn  $\mathbf{y}(x)$  för  $a < x < b$

då  $dy/dx = \mathbf{f}(x, \mathbf{y})$ ,

$\mathbf{G}(\mathbf{y}(a), \mathbf{y}(b)) = \mathbf{0}$

NAM 8.7

plus extra

Partiella differentialekvationer

Initial/randvärdesproblem:

Finn  $T(x, t)$  för  $0 < x < L$ ,  $t > 0$  då

$$\rho C \frac{\partial T}{\partial t} = k \frac{\partial^2 T}{\partial x^2}; \quad 0 < x < L; t > 0$$

$$T(0, t) = T_0, \quad T(L, t) = T_L$$

$$T(x, 0) = f(x)$$

Kvadratur

Beräkna 
$$I = \int_a^b f(x) dx$$

$$I = \int_D f(x, y) dx dy$$

NAM 5 Inte 5.2.4,5.2.5;

Optimering

Finn max. för  $f(x)$  i

$$a < x < b$$

NAM 7 (inte 7.1.2)

plus extra

Beräkna  $f(x)$  då

$$f(x_i) = y_i, i = 1, 2, \dots, m$$

Interpolation / Approximation

- Tabeller
- Polynom  $P_k(x)$
- Spline-funktioner
- Bézier-kurvor



# Linjära ekvationssystem

Finn  $\mathbf{x} = (x_1, x_2, \dots, x_n)$  så  
att  $\mathbf{Ax} = \mathbf{b}$ ,  $\mathbf{A} = (a_{ij})$

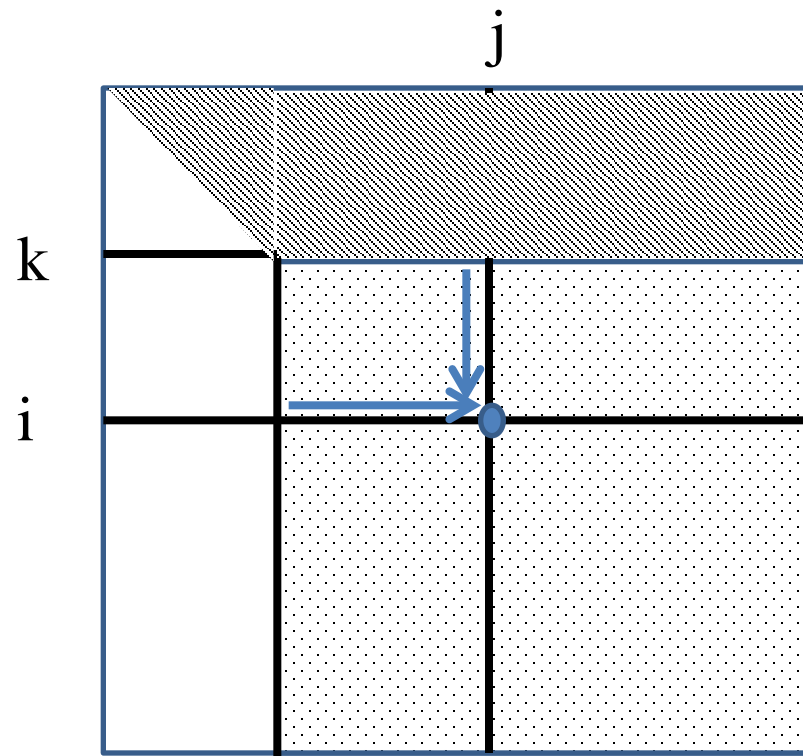
NAM: 1.4, 1.5, 1.6 (inte  
1.6.2), 1.7, 1.8

Formulering

*Gauss-elimination*

Pivotering

Arbetsvolym



Pivot - rad  $k$  : för  $i = k + 1, k + 2, \dots, n$

$$a_{ij} \leftarrow a_{ij} - m_{ik} a_{kj}, j = k + 1, \dots, n \quad m_{ik} = \frac{a_{ik}}{a_{kk}},$$

Antal mult. & add :  $\sum_{k=1}^{n-1} (n-k)^2 = \frac{n^3}{3} + O(n^2)$

## Exempel:

Approximation, iteration, linjarisering, algoritm:

*Newton-Raphsons* metod för lösning av  $f(x) = 0$

**1. Approximation med linjarisering:**

av  $y = f(x)$  med tangenten i  $(x_0, f(x_0))$ ,  
som har nollställe i

$$x_1 = x_0 - f(x_0) / f'(x_0)$$

**2. Iteration:** Upprepa!

(\*):  $x_n = x_{n-1} - f(x_{n-1}) / f'(x_{n-1}), n = 1, 2, \dots$

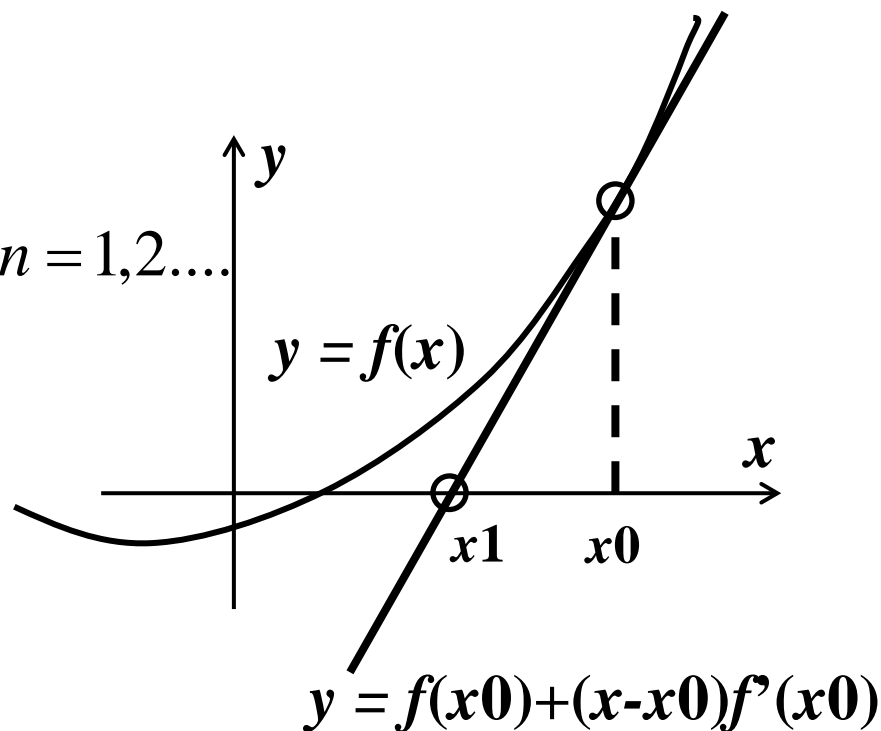
**3. Algoritm:**

a) välj  $x_0$  och tolerans  $\varepsilon$

b) Iterera med (\*) tills

$$|x_n - x_{n-1}| \leq \varepsilon$$

c)  $x_n$  är närmevärde till nollstället



# Exempel

## 1. Kvadratrotten (Herons metod)

$$f(x) = x^2 - 2, \quad f'(x) = 2x:$$

$$x_n = x_{n-1} - \frac{x_{n-1}^2 - 2}{2x_{n-1}} = \dots = \frac{1}{2} \left( x_{n-1} + \frac{2}{x_{n-1}} \right)$$

## 2. Division utan divisions-instruktion

$$f(x) = \frac{1}{x} - a \quad f'(x) = -\frac{1}{x^2}:$$

Cray – 1, 1976  
160 Mflops

$$x_n = x_{n-1} - \left( \frac{1}{x_{n-1}} - a \right) / \left( -\frac{1}{x_{n-1}^2} \right) = x_{n-1} (2 - ax_{n-1})$$

## Division utan division – analys.

$$f(x) = 1/x - a; f' = -1/x^2$$

$$x_{n+1} = 2x_n - ax_n^2$$

Vi vill se hur  $x_n$  konvergerar mot  $1/a$  och betraktar felet

$$E_n = 1/a - x_n : \dots$$

$$1/a - x_{n+1} = 1/a - 2x_n + ax_n^2 = a(1/a - x_n)^2 :$$

$$E_{n+1} = aE_n^2$$

med  $l_n = \ln E_n$  får vi

$$l_{n+1} = 2l_n + \ln a$$

För tillämpningen på division av binära flyttal är bara  $1/2 < a < 1$  intressant, så vi tar  $a = 1$  och  $l_0 = -1$ ;

$$l_n = -2^n : \quad E_n = e^{-2^n}$$