



# Numerical Methods in Geophysics: Introduction



## **Why numerical methods?**

simple geometries – analytical solutions  
complex geometries – numerical solutions

## **Applications in geophysics**

seismology  
geodynamics  
electromagnetism  
... in all domains

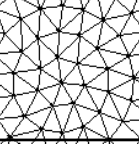
## **History of computers**

serial computers  
vectorization  
parallel computers  
memory requirements



# **Numerical Methods in Geophysics:**

## **Introduction**



### **Macroscopic and microscopic description**

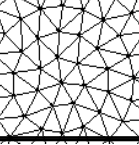
- continuum mechanics
- lattice gases
- fluid mechanics
- nonlinear processes

### **Partial differential equations in geophysics**

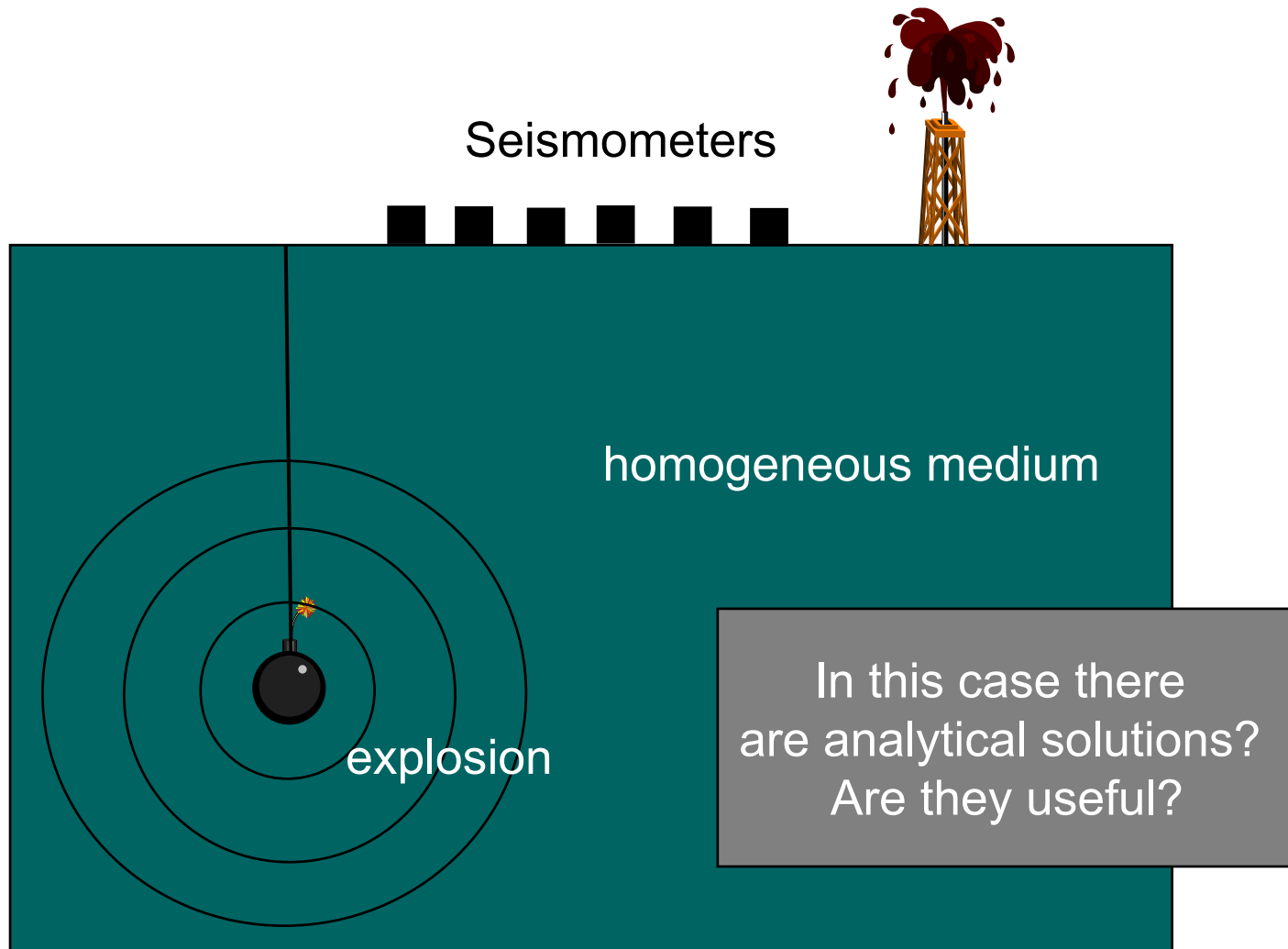
- conservation equations
- constitutive laws
- wave equation
- diffusion equation
- Navier-Stokes equation



# Why numerical methods?

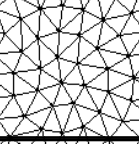


## Example: seismic wave propagation

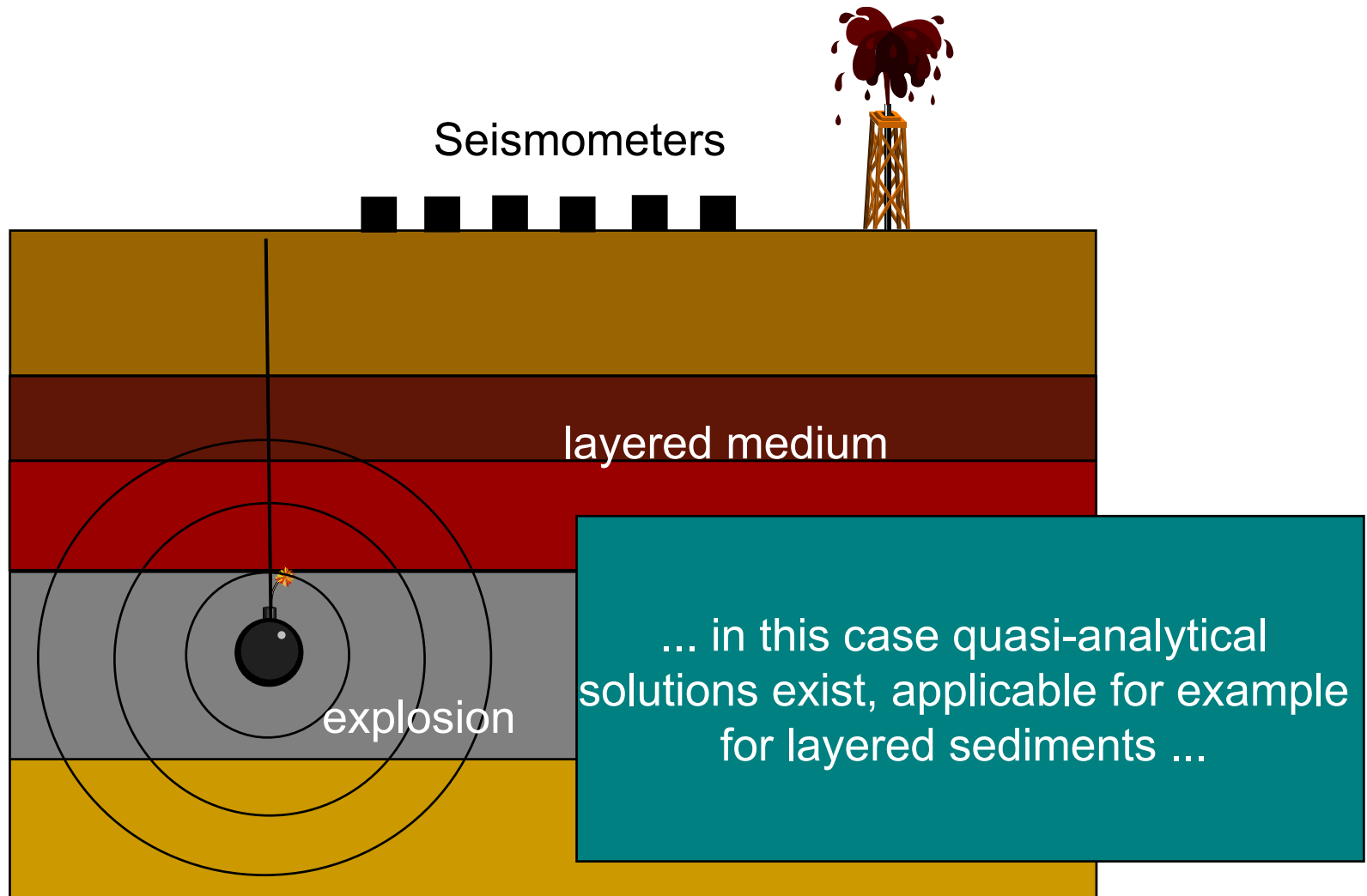




# Why numerical methods?

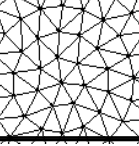


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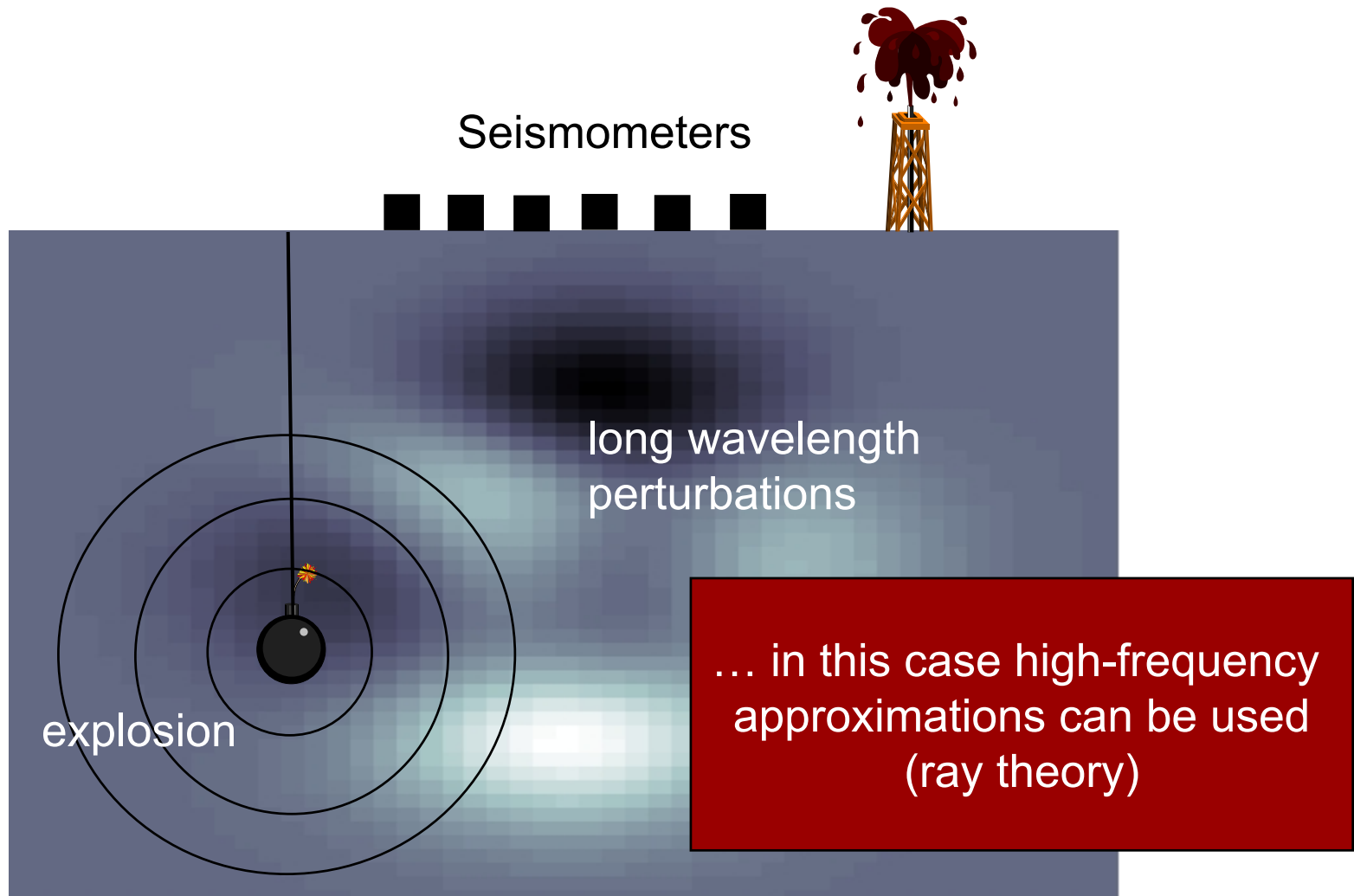




# Why numerical methods?

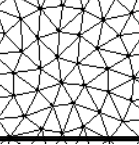


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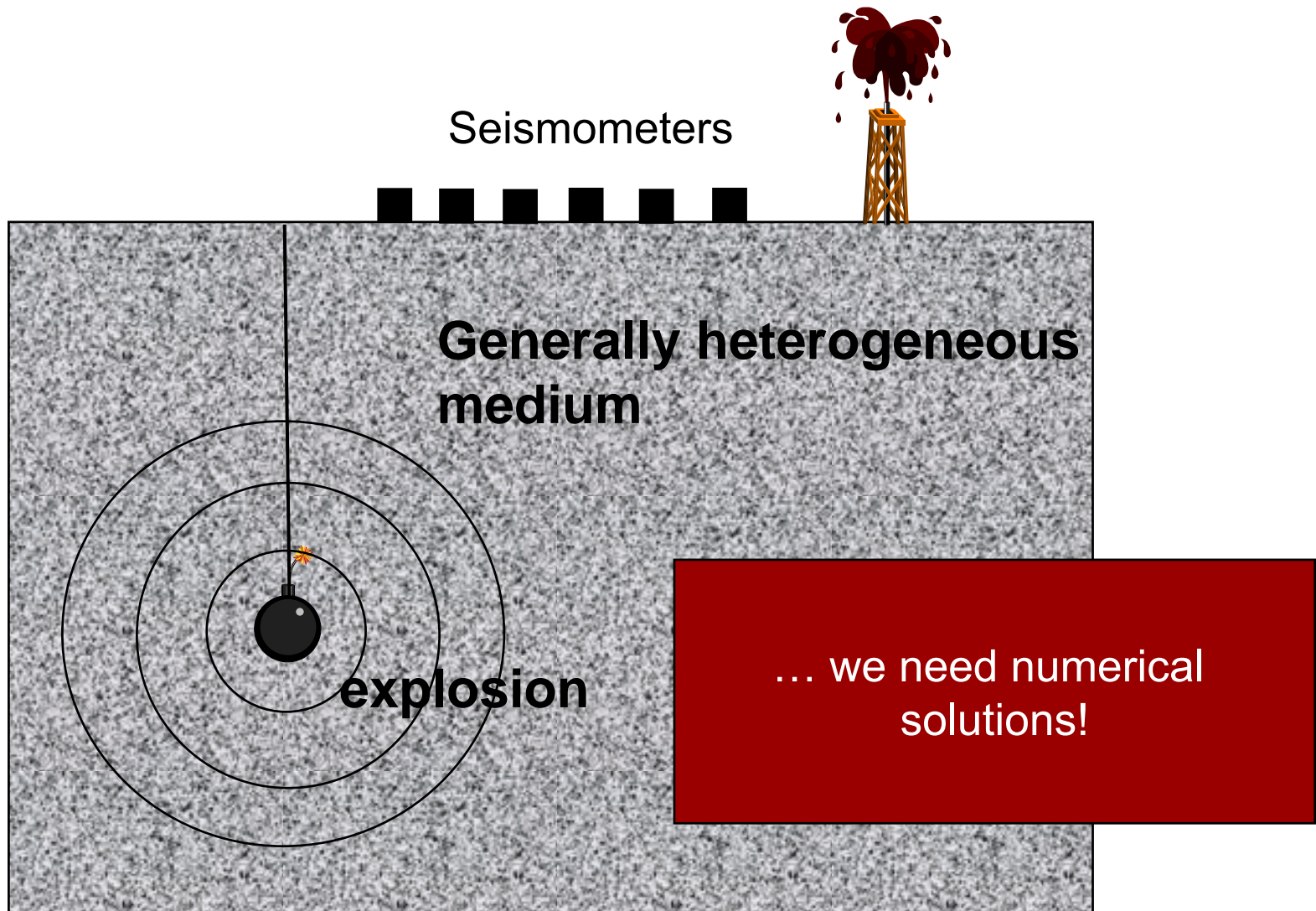


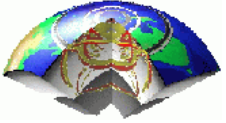


# Why numerical methods



**Example: seismic wave propagation**





# Numerical Methods in Geophysics: Introduction



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complex geometries – numerical solutions



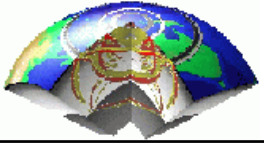
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seismology  
geodynamics  
electromagnetism  
... in all domains ...

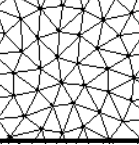
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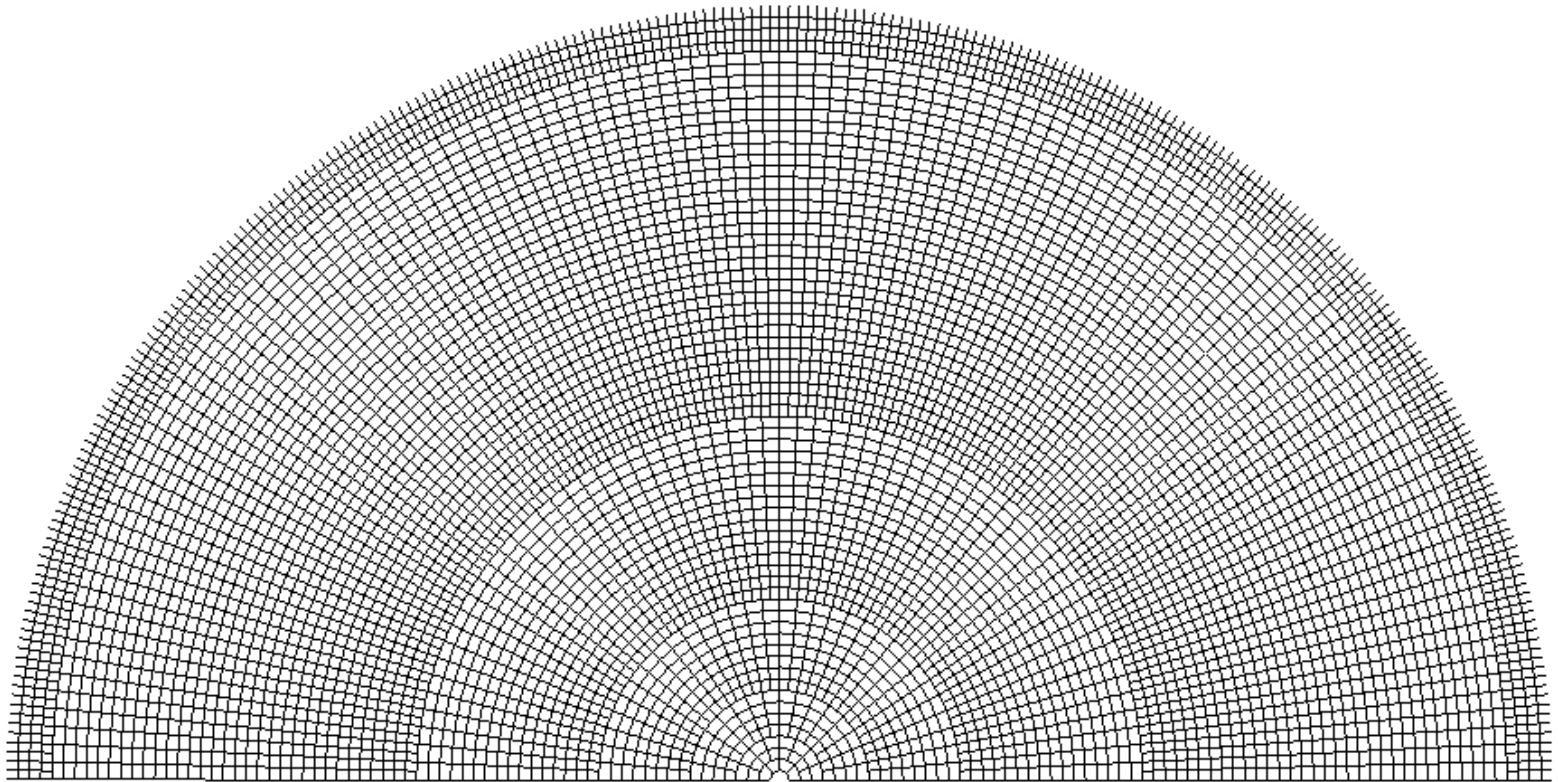




# Applications in Geophysics

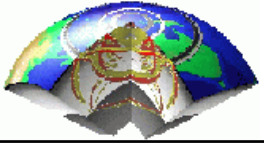


global seismology – spherical coordinates - axisymmetry

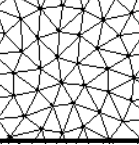


finite differences – multidomain method

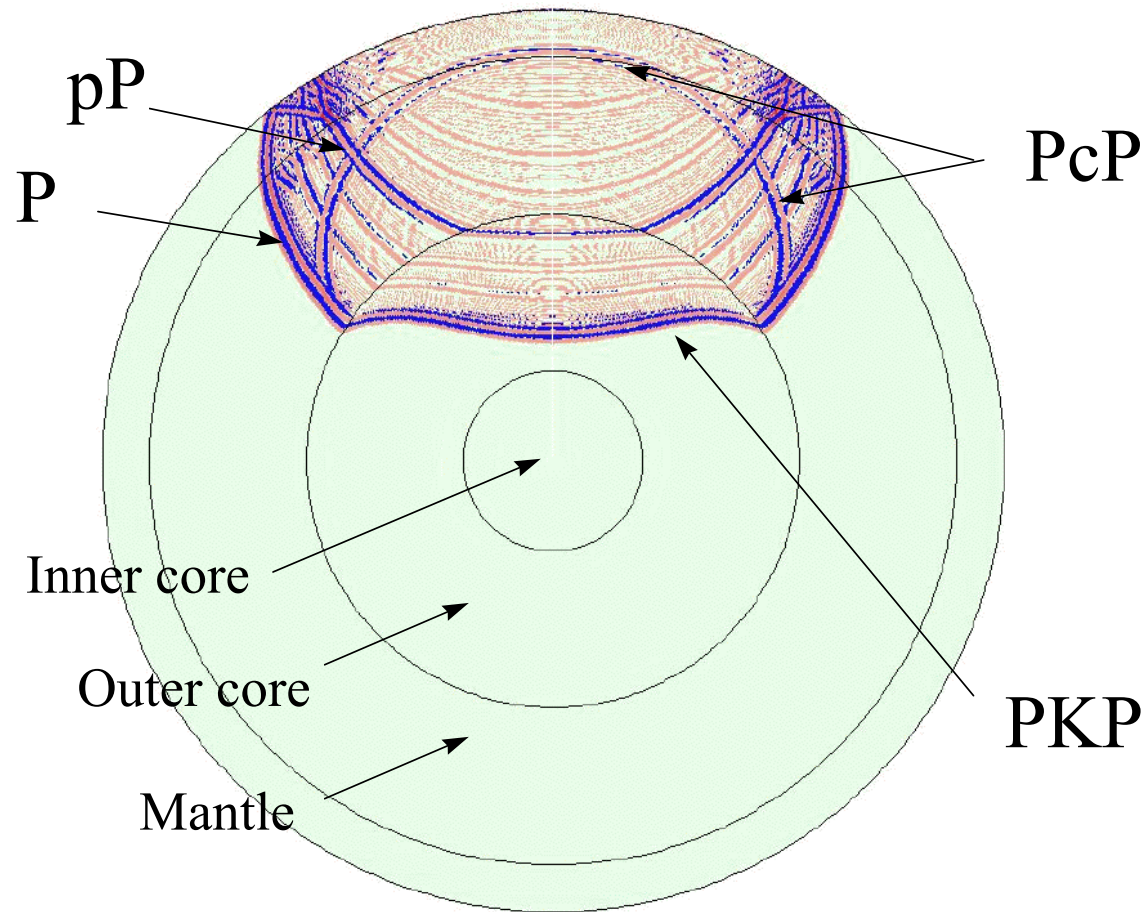




# Applications in Geophysics



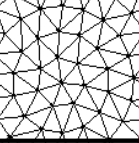
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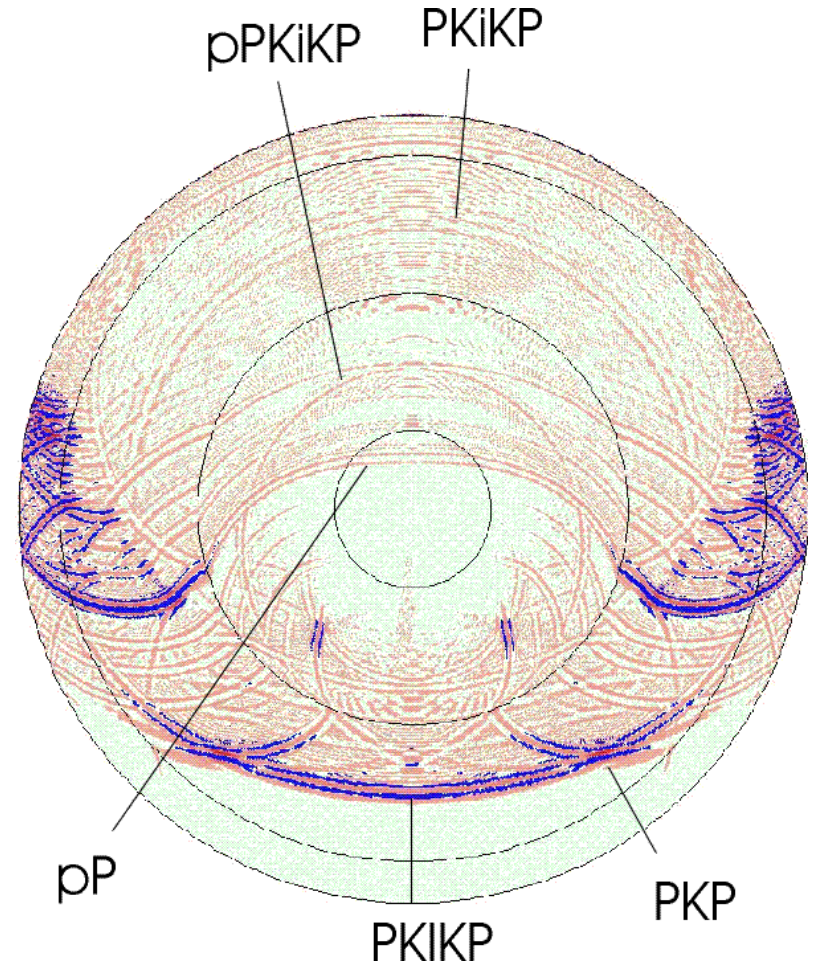
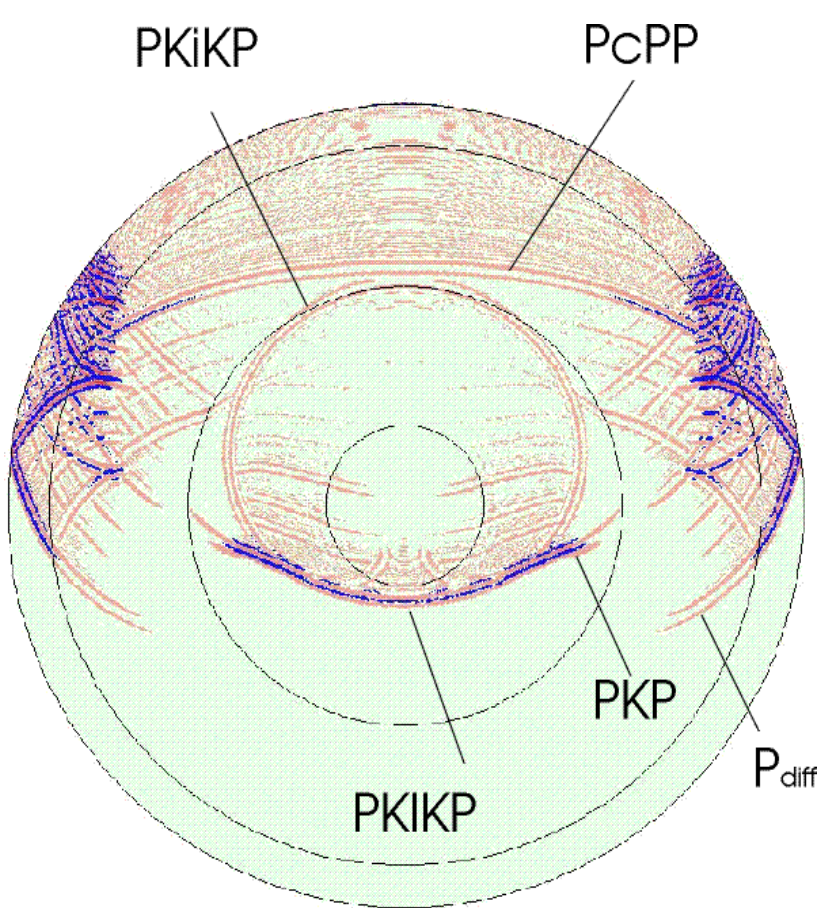
finite differences – multidomain method



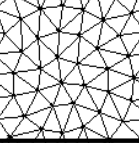
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global seismology – spherical coordinates - axisymmetry



finite differences – multidomain method



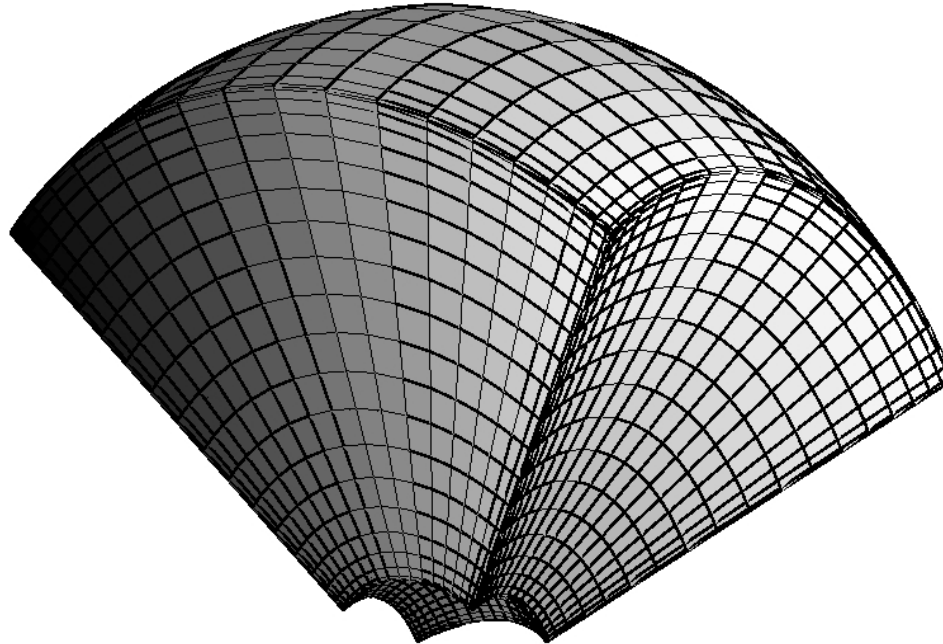
P-waves in the Earth: the movie



finite differences – multidomain method

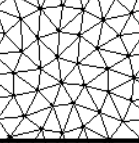


global seismology

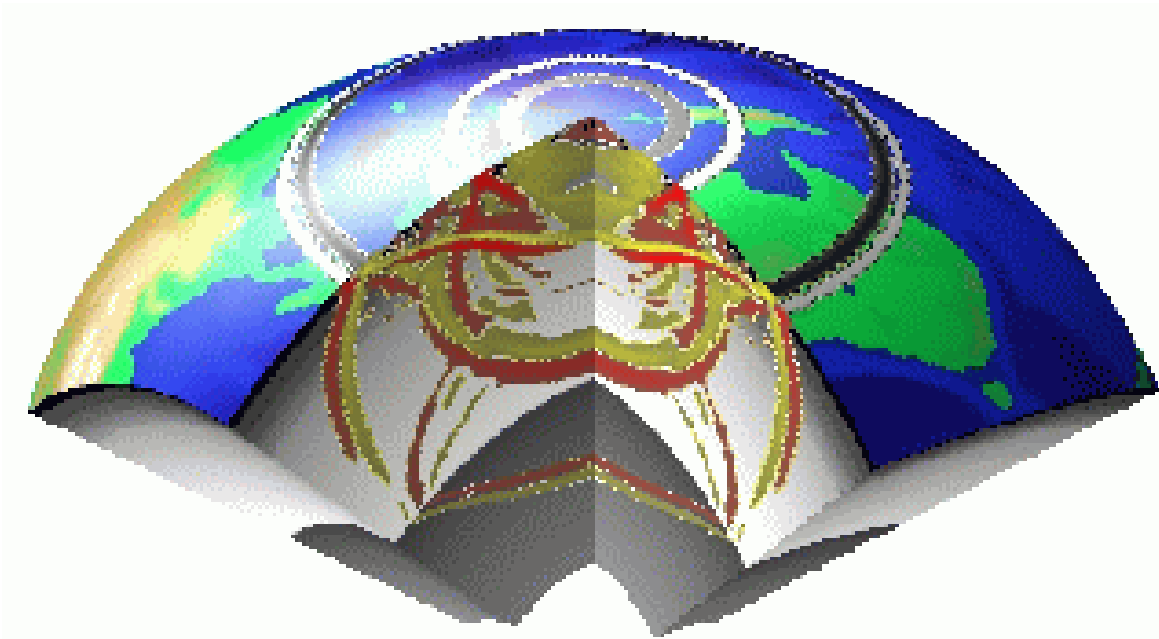


3-D grid for space-dependent parameters  
Chebyshev collocation points denser near the boundaries  
Better implementation of boundary conditions.

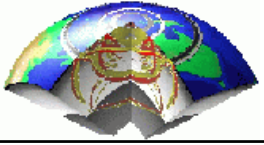




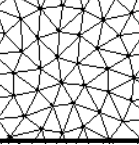
global seismology



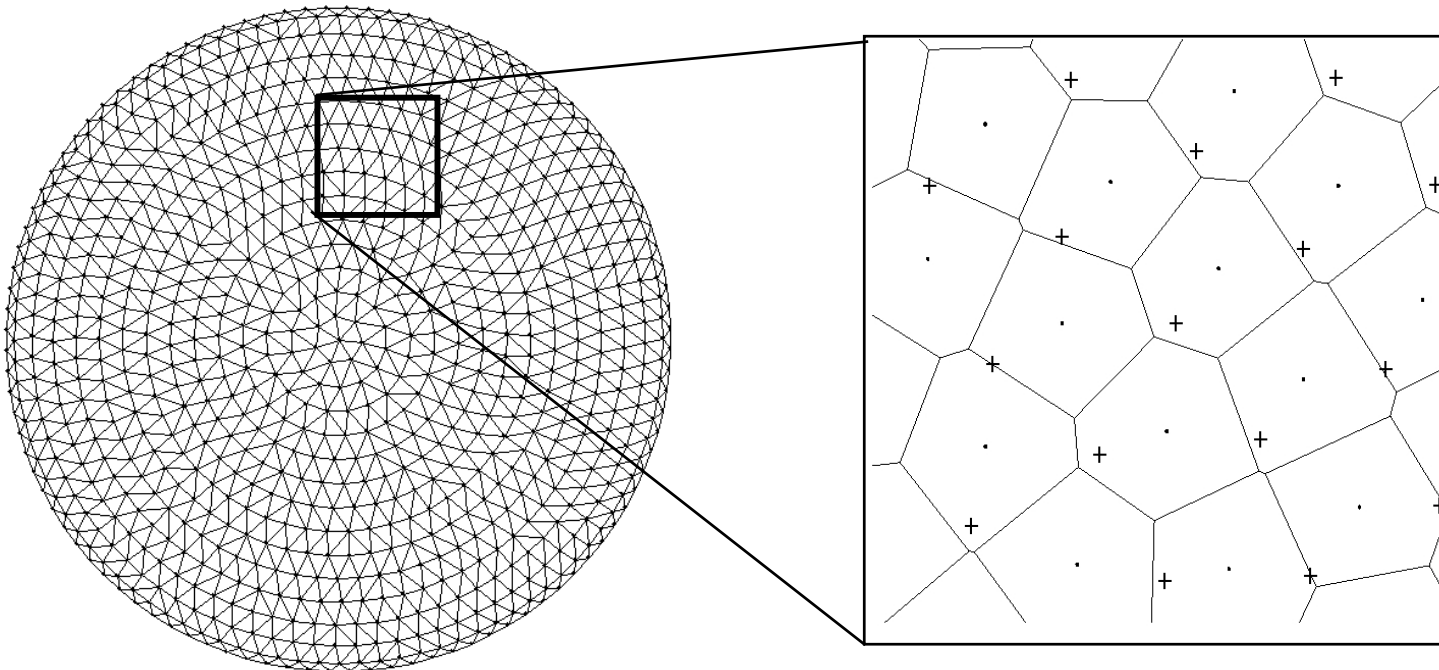
Wave propagation in spherical sections.  
Investigation of 3-D effects of subduction zones.  
Grid size 200x200x200.  
Grid distance 50km  
Finite differences and pseudospectral methods



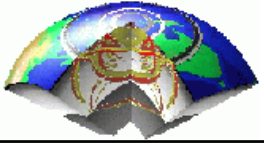
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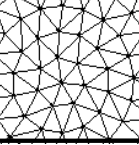
global seismology – spherical geometry – cartesian equations



Delauney triangulation – Voronoi cells  
3-D – irregular grids – natural differences

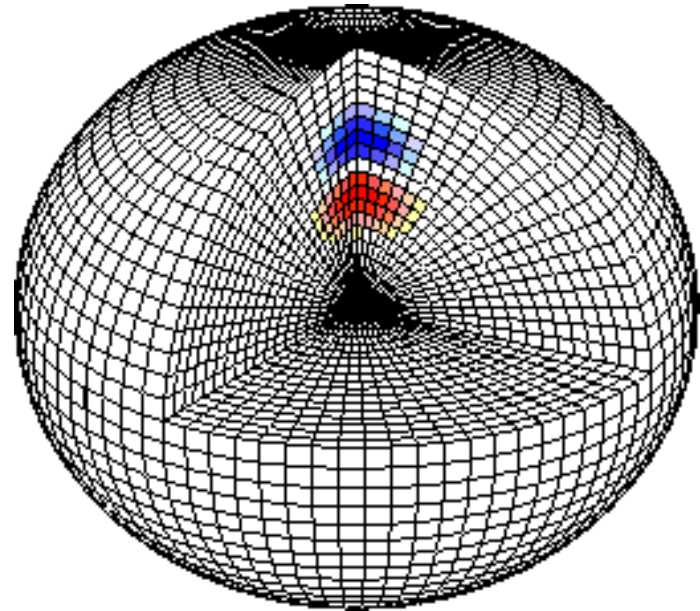


# Applications in Geophysics

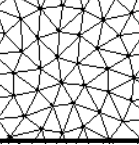
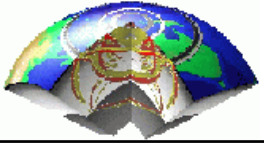


global seismology – spherical geometry – cartesian equations

3-D – irregular grid  
natural differences  
20000 grid points  
test case

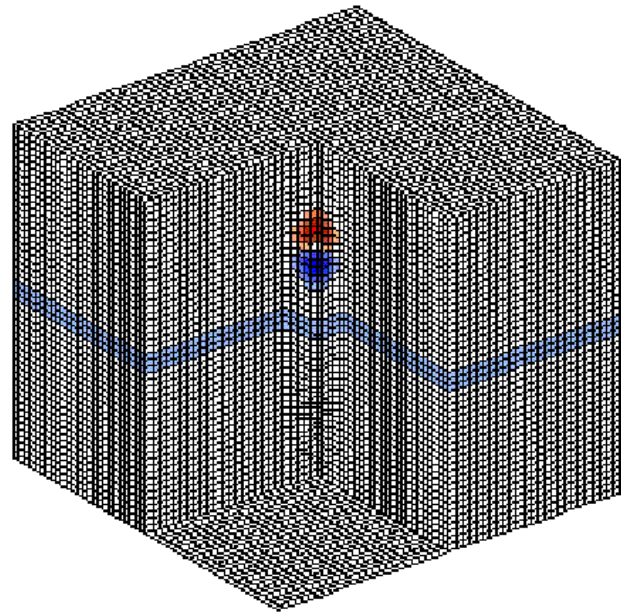


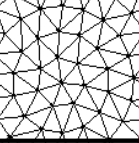




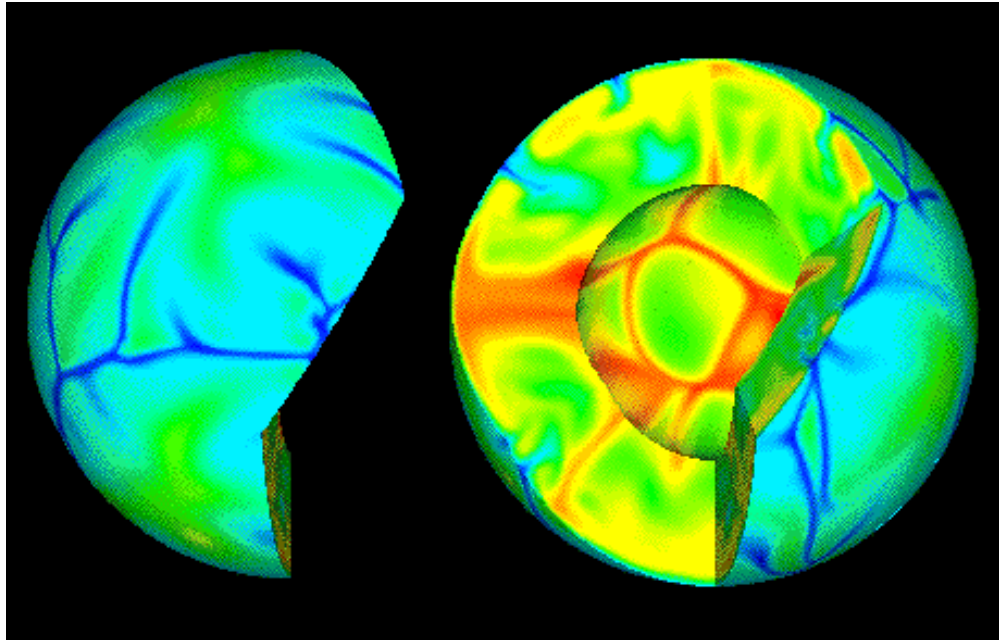
## Exploration seismology

- wave propagation in media with thin curved layers
- finite difference method
- grid size  $200 \times 200 \times 200$
- orthogonal grid is stretched by analytical functions

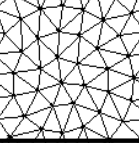




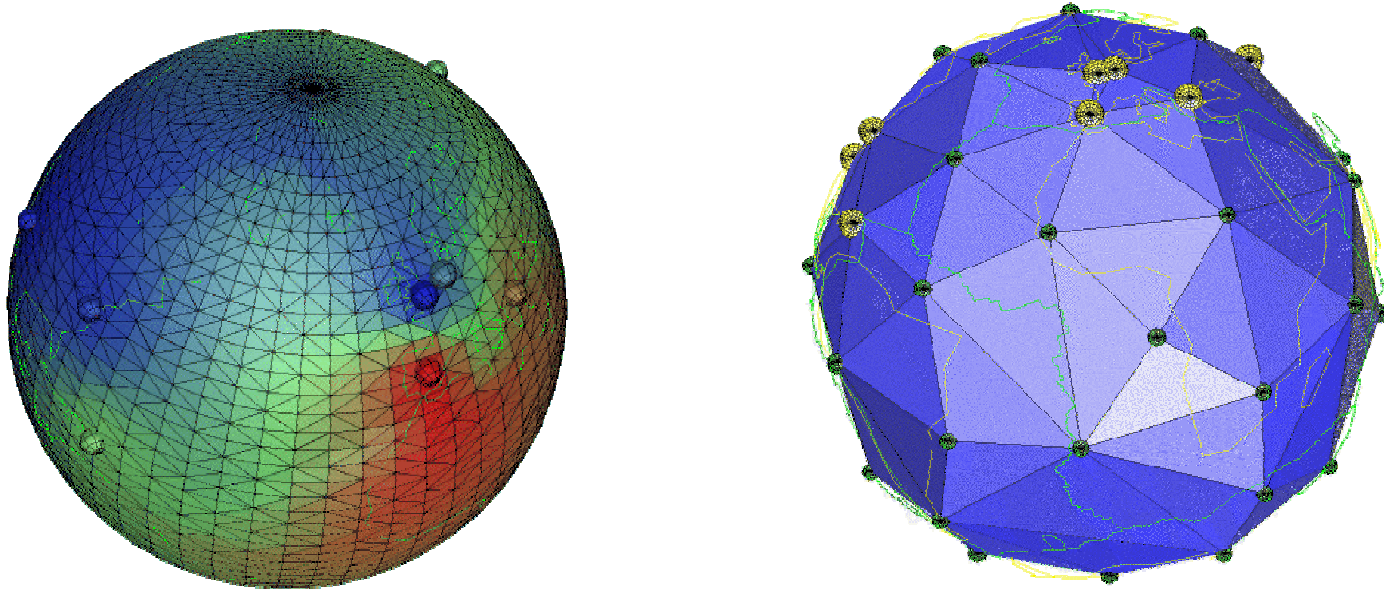
geodynamics – mantle convection



3-D finite-element modelling of mantle convection  
in spherical geometry. 10 Million grid points.  
Implementation on parallel hardware (P. Bunge, Munich).



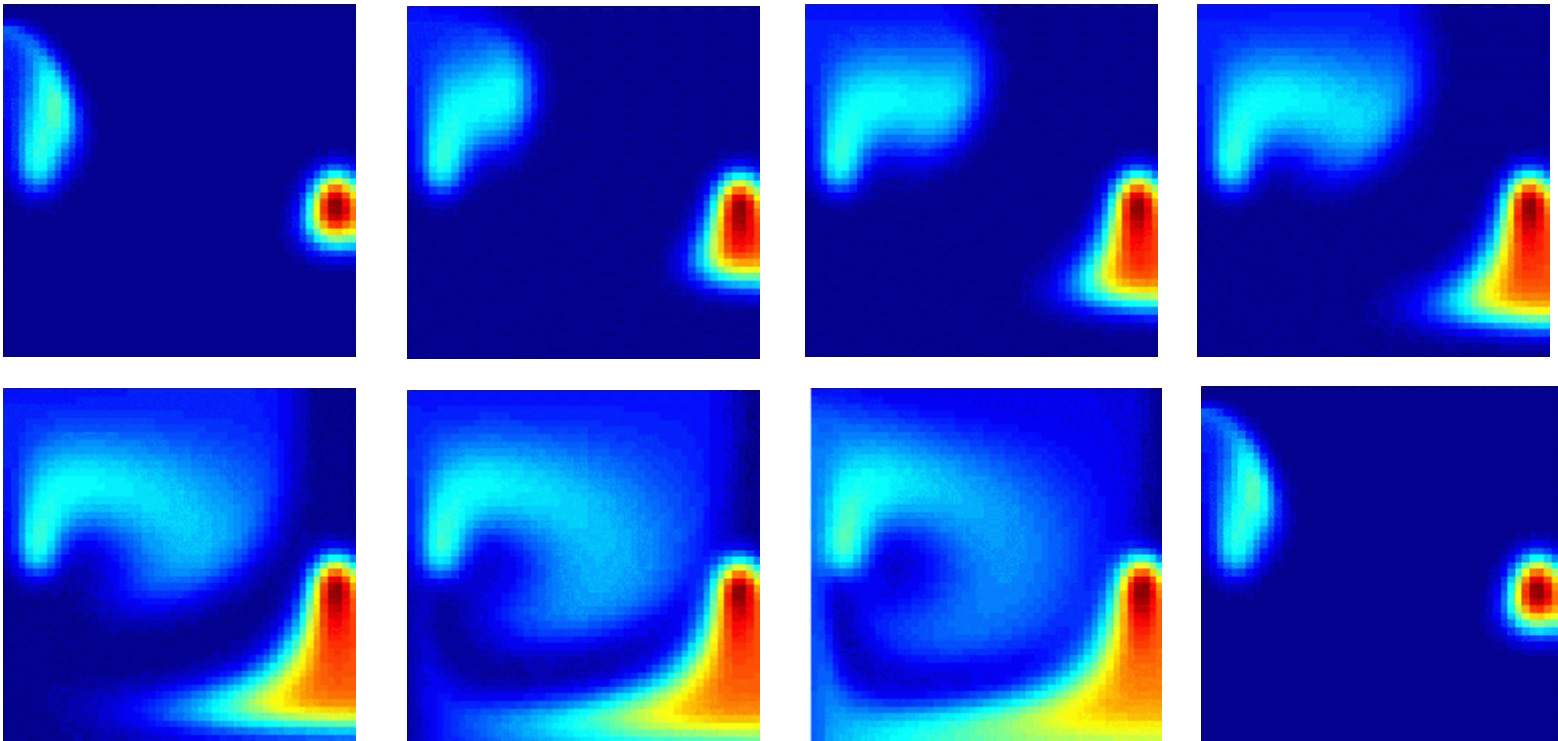
global electromagnetism – conductivity of the Earth's mantle



3-D finite-element modelling  
(Schultz, Cambridge)



isotope mixing in the oceans  
Stommel-gyre  
input of isotopes near the boundaries (e.g. rivers)



diffusion – reaction – advection equation



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# Memory Requirements



Example: seismic wave propagation, 2-D case

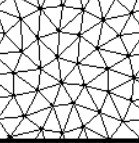
grid size:	1000x1000
number of grid points:	$10^6$
parameters/grid point:	elastic parameters (3), displacement (2), stress (3) at 2 different times -> 16
Bytes/number:	8
required memory:	$16 \times 8 \times 10^6 \times 1.3 \times 10^8$

You can do this on a standard  
PC!

130 Mbyte memory (RAM)



# Memory Requirements



Example: seismic wave propagation, 3-D case

grid size:	1000x1000x1000
number of grid points:	$10^9$
parameters/grid point:	elastic parameters (3), displacement (3), stress (6) at 2 different times -> 24
Bytes/number:	8

This is a  
**GRAND CHALLENGE PROJECT**  
for supercomputers

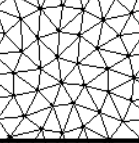
required memory:  $24 \times 8 \times 10^9 \times 1.9 \times 10^{11}$

190 Gbyte memory (RAM)





# Memory requirements



**... this would mean**

...we could discretize our planet with volumes of the size

$$\frac{4}{3} \pi (6371 \text{ km})^3 / 10^9 \times 1000 \text{ km}^3$$

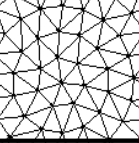
with an representative cube side length of 10km.

Assuming that we can sample a wave with 20 points per wavelength we could achieve a dominant period T of

$$T = \lambda / c = 20 \text{ s}$$

for global wave propagation!





## History

1960: 1 MFlops

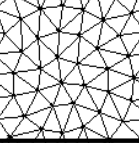
1970: 10MFlops

1980: 100MFlops

1990: 1 GFlops

1998: 1 TFlops

2010: ?



What are parallel computations

Example: Hooke's Law  
stress-strain relation

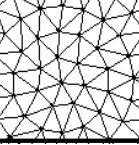
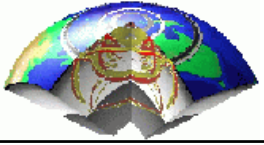
$$\sigma_{xx} = \lambda (\varepsilon_{xx} + \varepsilon_{yy} + \varepsilon_{zz}) + 2\mu \varepsilon_{xx}$$

$$\sigma_{ij}, \varepsilon_{ij} \Rightarrow f(x, y, z, t)$$

$$\lambda, \mu \Rightarrow f(x, y, z)$$

These equations hold at each point in time at all points in space

-> Parallelism

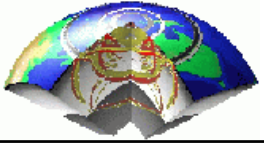


... in serial Fortran (F77) ...

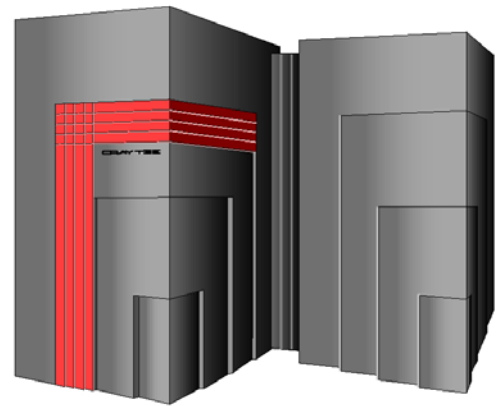
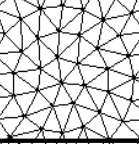
at some time  $t$

```
for i=1,nx
  for j=1,nz
    sxx(i,j)=lam(i,j)*(exx(i,j)+eeyy(i,j)+eizz(i,j))+2*mu(i,j)*exx(i,j)
  enddo
enddo
```

add-multiplies are carried out sequentially



# Parallelism



... in parallel Fortran (F90/95) ...  
*array syntax*

$$sxx = lam*(exx+eyy+ezz) + 2*mu*exx$$

On parallel hardware each matrix is distributed on  $n$  processors. In our example no communication between processors is necessary. We expect, that the computation time reduces by a factor  $1/n$ .



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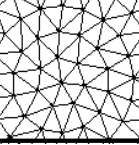


## **Macroscopic and microscopic description**

- continuum mechanics
- lattice gases
- fluid mechanics
- nonlinear processes

## **Partial differential equations in geophysics**

- conservation equations
- constitutive laws
- wave equation
- diffusion equation
- Navier-Stokes equation



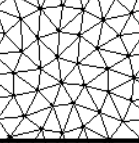
## ***Macroscopic*** description:

The universe is considered a continuum. Physical processes are described using partial differential equations. The described quantities (e.g. density, pressure, temperature) are really averaged over a certain volume.

## ***Microscopic*** description:

If we decrease the scale length or we deal with strong discontinuous phenomena we arrive at the discrete world (molecules, minerals, atoms, gas particles). If we are interested in phenomena at this scale we have to take into account the details of the interaction between particles.





## ***Macroscopic***

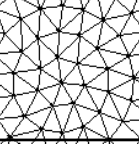
- elastic wave equation
- Maxwell equations
- convection
- flow processes

## ***Microscopic***

- ruptures (e.g. earthquakes)
- waves in complex media
- tectonic processes
- gases
- flow in porous media



# Numerical Methods in Geophysics: Introduction



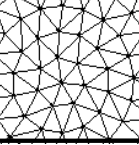
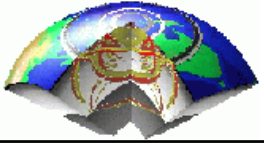
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conservation equations

$$\partial_t \rho + \partial_j (v_j \rho) = 0$$

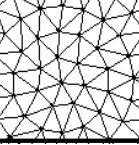
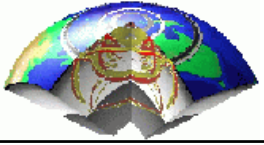
mass

$$\partial_t (v_j \rho) + \partial_j (\rho v_i v_j - \sigma_{ij}) = f_i$$

momentum

$$f_i = s_i + g_i$$

gravitation (g)  
und sources (s)



gravitation

$$\mathbf{g}_i = -\partial_i \Phi$$

gravitational field

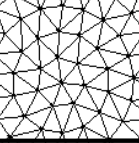
$$\Delta \Phi = -\rho \, 4\pi \, G$$

$$\Delta = (\partial_x^2 + \partial_y^2 + \partial_z^2)$$

gravitational potential  
Poisson equation

still missing: forces in the medium

->stress-strain relation



stress and strain

$$\sigma_{ij} = \theta_{ij} + c_{ijkl} \partial_l u_k$$

prestress and  
incremental stress

$$\varepsilon_{ij} = \frac{1}{2} (\partial_j u_i + \partial_i u_j + \partial_i u_m \partial_j u_m)$$

nonlinear stress-strain  
relation

$$\varepsilon_{ij} = \frac{1}{2} (\partial_j u_i + \partial_i u_j)$$

... linearized ...

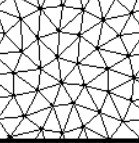


general viscoelastic solid

$$\sigma_{ij}(x, t) = \theta_{ij} + \int_0^{\infty} d\tau \Psi_{ijkl}(x, \tau) \partial_l u_k(x, t - \tau)$$

$$\Psi_{ijkl}(x, t) = c_{ijkl} \delta(t) + \nu_{ijkl} \delta_t(t)$$

relaxation functions



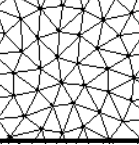
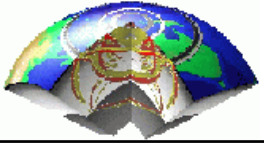
special case:  $v \Rightarrow 0$   
small velocities

$$\partial_t(\rho v_j) + \partial_j(\rho v_i v_j - \sigma_{ij}) = f_i$$

$$v_i \rightarrow 0 \Rightarrow \rho v_i v_j \approx 0$$

We will only consider problems in the low-velocity regime.



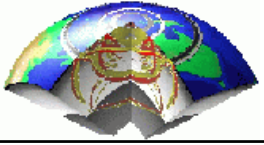


special case: static density

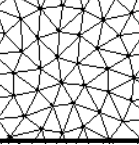
$$\rho(x, t) = \rho_0(x) + \delta\rho(x, t) \approx \rho_0(x)$$

incompressible flow, wave phenomena

We will only consider problems with static density.



## Special PDEs



**hyperbolic** differential equations  
e.g. the acoustic wave equation

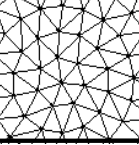
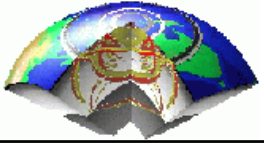
$$\frac{1}{K} \partial_t^2 p - \partial_{x_i} \frac{1}{\rho} \partial_{x_i} p = -s$$

K compression  
s source term

**parabolic** differential equations  
e.g. diffusion equation

$$\partial_t T = D \partial_i^2 T$$

T temperature  
D thermal diffusivity



elliptical differential equations  
z.B. static elasticity

$$\partial_{x_i}^2 U(x) = F(x)$$

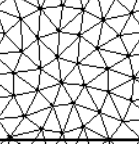
$$U = \partial_m u_m$$

$$F = \partial_m f_m / K$$

u displacement  
f sources



# Numerical Methods in Geophysics: Introduction



## ***Summary:***

Numerical methods play an increasingly important role in all domains of geophysics.

The development of hardware architecture allows an efficient calculation of large scale problems through parallelisation.

Most of the dynamic processes in geophysics can be described with time-dependent partial differential equations.

The main problem will be to find ways to determine how best to solve these equations with numerical methods.