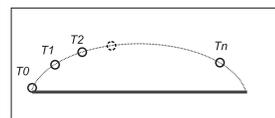


# Lecture 1

source

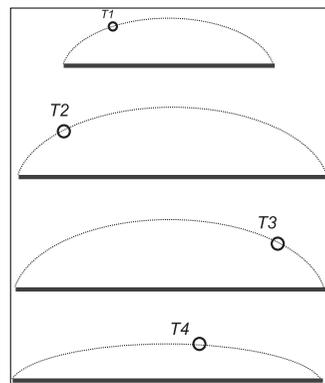
[www.tevza.org/home/course/modelling-II\\_2011](http://www.tevza.org/home/course/modelling-II_2011)

## Why model?



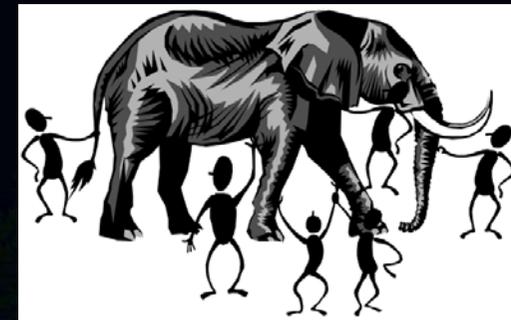
Consequent data

Inconsequent data:



## Modelling Elephant

How good is the model?



# Astrophysical simulations

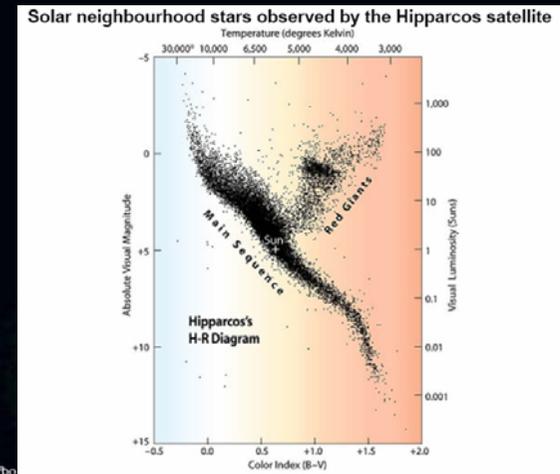
Different physics:

- Different classes
- Different stages of the evolution
- Different scales

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

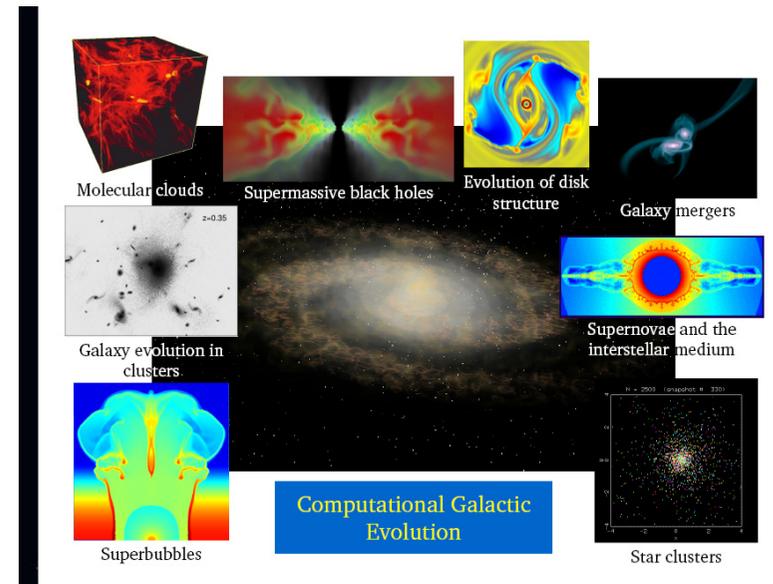
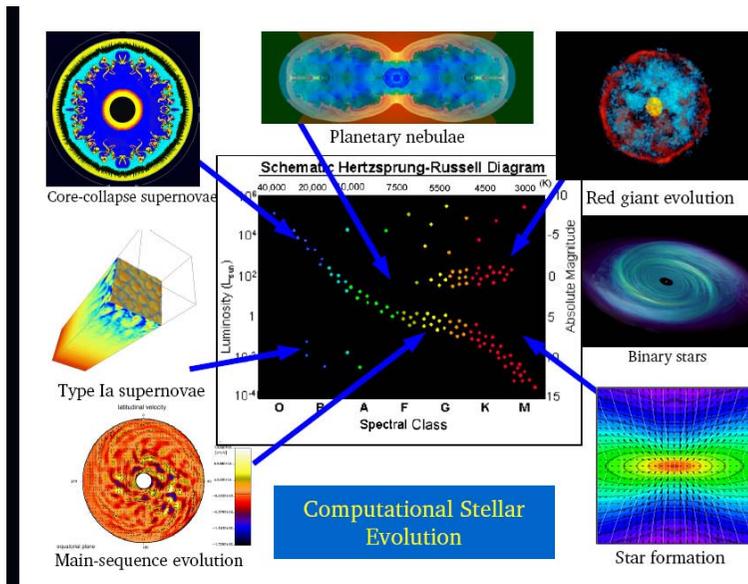
ალ. თევზაძე (2011)

# Hertzsprung-Russell diagram



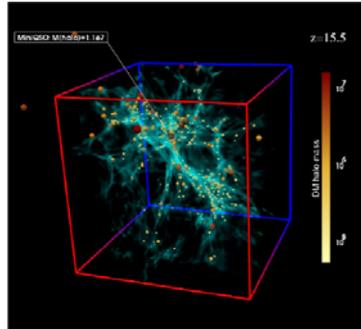
ასტროფიზიკის

ალ. თევზაძე (2011)



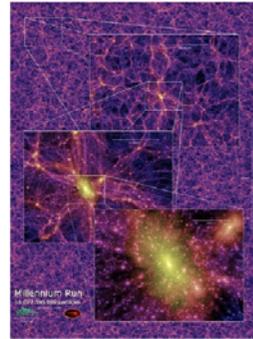
## Computation on the Cosmological Scale...

- On the scale of the Universe, the cosmological scale factor is evolved.
- Self-gravity dominates the evolution



The first mini quasar effects on the surrounding IGM (Kuhlen et al.)

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

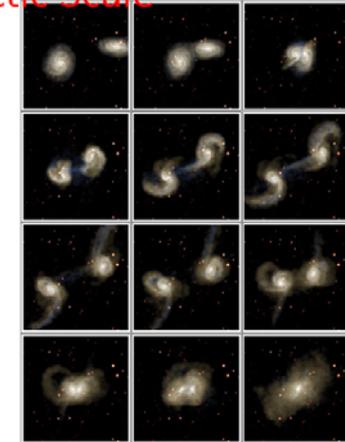


Simulating the growth of structure and the formation of galaxies. (Springel et al. 2005)

ალ. თევზაძე (2011)

## ...the Galactic Scale

We can understand how galaxies interact and merge. It takes 100s of million years to play out in nature—we can see the evolution at a much accelerated pace.



Colliding and merging galaxies  
Springel & White (1999)

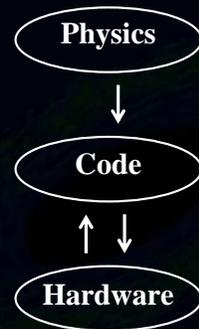
ჩვენს სამყაროში  
მზის სისტემა

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Simulations

Major aspects:



ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Some publicly available simulation codes

Code	Type	Physics	Parallel	Reference
Cactus	Eulerian/Nested	Gas, gravity (GR)	MPI	Allen et al 99
Enzo	AMR/PM	Gas, particles, gravity, cosmology	MPI	Norman & Bryan 98; O'Shea et al 04
FLASH	AMR/PM	Gas, particles, gravity, cosmology, nuclear, MHD	MPI	Fryxell et al 00
GADGET	P3M; TPM (v.2); SPH	Gas, particles, gravity, cosmology	MPI	Springel et al 01
Hydra	AP3M/SPH	Gas, particles, gravity, cosmology	No	Couchman 91
MLAPM	AMR/PM	Particles, gravity	No	Knebe et al 01
PMcode	PM	Particles, gravity	No	Klypin & Holtzmann 97
TITAN	1D AMR	Gas, radiation	No	Gehmeyr & Mihalas
VH-1	Eulerian	Gas	No	Blondin et al 91
Zeus-MP	Eulerian	Gas, gravity, MHD	MPI	Stone & Norman 92

<http://www.cactuscode.org>  
<http://cosmos.ucsd.edu>  
<http://flash.uchicago.edu>  
<http://www.mpa-garching.mpg.de/gadget>  
<http://hydra.mcmaster.ca/hydra>  
<http://www.aip.de/People/AKnebe/MLAPM>  
<http://astro.nmsu.edu/~aklypin/pm.htm>  
<http://wonka.physics.ncsu.edu/pub/VH-1>

## Parallel Computers



### Symmetric Multi-Processor (SMP)

- Processors share bus to main memory and I/O
- Processors may share cache memory
- Operating system distributes load
- Example: sipapu (workstation)



### Distributed Shared Memory

- Processors have separate local memories
- Special bus connects memories
- Nonlocal memory appears "local" but is somewhat slower
- Operating system distributes load
- Example: copper (IBM p690)

### Distributed Multi-Processor (Cluster)

- Processors have separate local memories, separate I/O
- Interprocessor communication over proprietary or commodity network (much slower than memory)
- Applications distribute load
- Example: tungsten (Dell Linux cluster)

June 2011 | TOP500 Supercomputing Sites - Windows Internet Explorer

http://top500.org/infocenter/

Rank	Site	Computer
1	RIKEN Advanced Institute for Computational Science (AICS) Japan	K computer, SPARC64 With 2.0GHz, Tofu interconnect Fujitsu
2	National Supercomputing Center in Tianjin China	Tianhe-1A - NUDT TH MPP, X5670 2.93GHz 8C, NVIDIA GPU, FT-1000 8C, NUDT
3	DOE/SC/Or Ridge National Laboratory United States	Jaguar - Cray XTS-HE Opteron 6-core 2.6 GHz Cray Inc.
4	National Supercomputing Centre in Shenzhen (NSCC) China	Nebulae - Dawning TC3000 Blade, Intel X5650, Nvidia Tesla C2050 GPU Dawning
5	GSIC Center, Tokyo Institute of Technology Japan	TSUBAME 2.0 - HP ProLiant SL390s G7 Xeon 8C X5670, Nvidia GPU, Linux/Windows NECMP
6	DOE/NNSA/LANL/SHL United States	Cielo - Cray XE5 8-core 2.4 GHz Cray Inc.
7	NASA/Ames Research Center/AS United States	Pharos - SGI Altix ICE 8200EX/8400EX, Xeon HT OC 3.0/3.0/Xeon 5570/5970 2.93 GHz, Infiniband SGI
8	DOE/SC/ER/LBNL/ERC United States	Hopper - Cray XE6 12-core 2.1 GHz Cray Inc.
9	Commissariat à l'Energie Atomique (CEA) France	Tera-100 - Bull built super-node S610/S6030 Bull SA
10	DOE/NNSA/LANL United States	Roadrunner - BladeCenter G520L521 Cluster, PowerCell 8 2 GHz Opteron DC 1.8 GHz, Voltare Infiniband IBM

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Overview of Simulation in Astrophysics



NASA/Ames Columbia machine—a 10240 processor SGI Altix system.

NASA

The NCCS/ORNL jaguar machine—currently there are 11,000 compute nodes, each with a 2.6 GHz dual-core AMD Opteron processor and 4 GB of memory



NCCS

## Beowulf cluster

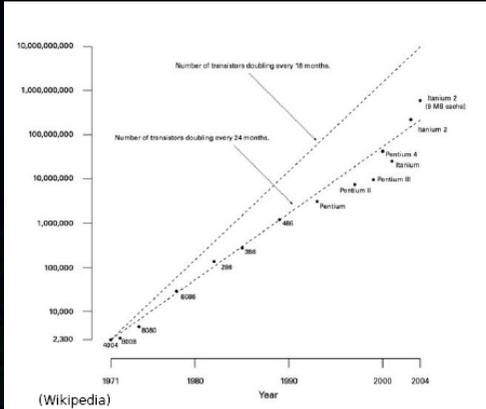


ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

## Perspective

### Moor's law

Doubling of the number of transistors on integrated circuits (1.5-2 years)



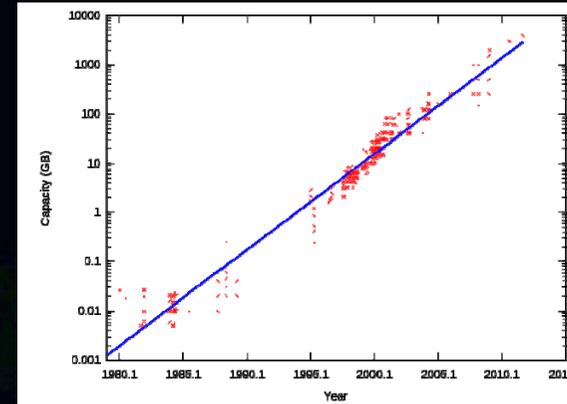
ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Perspective

### Kryder's law

Doubling of the magnetic disk areal storage density (1 year)



ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## BASIC CONCEPTS

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Method

- Continuum -> Discrete
- Physical Model -> Numerical Model

$(V_x, V_y, V_z, \rho, P)$

$(P_x, P_y, P_z, E, M)$

Where to introduce numerical errors:

Discretization, Subgrid, interpolation, etc.

Error propagation science

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Workflow

### Configuration

- Initial conditions
- Boundary conditions

### Calculus

- Compilation
- Run

### Data analysis

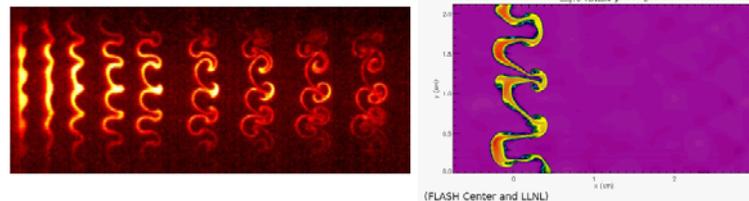
- Post processing
- Visualization

## Are my results correct?

### Indicators:

- Exact Analytic Solutions
- Different Numerical Methods
- Code Validation

## Code Validation



(FLASH Center and LLNL)

## Catastrophic cancellation

Calculate the equation with  $a=77617$  and  $b=33096$

$$y = 333.75b^6 + a^2(11a^2b^2 - b^6 - 121b^4 - 2) + 5.5b^8 + \frac{a}{2b}$$

answer depends of the compiler  
(C, Fortran, Matlab) processor type!

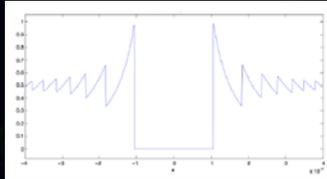
$$\begin{aligned} & \stackrel{?}{=} 5.76461 \dots \times 10^{17} \\ & \stackrel{?}{=} 6.33825 \dots \times 10^{29} \\ & \stackrel{?}{=} 1.1726 \dots \\ & \stackrel{?}{=} -0.827396 \dots \end{aligned}$$

## Catastrophic cancellation

Plot function:

$$f(x) = \frac{1 - \cos x}{x^2}$$

$$-4 \cdot 10^{-8} \leq x \leq 4 \cdot 10^{-8}$$



`cos(x) = 0.999999999999999988897769753748434595763683319091796875.`

**Catastrophic cancellation.** Devastating loss of precision when small numbers are computed from large numbers, which themselves are subject to roundoff error.

## Numerical catastrophes

### Ariane 5 rocket. [June 4, 1996]

10 year, \$7 billion ESA project exploded after launch.  
64-bit float converted to 16 bit signed int.  
Unanticipated overflow.



### Vancouver stock exchange. [November, 1983]

Index undervalued by 44%.  
Recalculated index after each trade by adding change in price.  
22 months of accumulated truncation error.



### Patriot missile accident. [February 25, 1991]

Failed to track scud; hit Army barracks, killed 28.  
Inaccuracy in measuring time in 1/20 of a second since using 24 bit binary floating point.

## Courant-Friedrichs-Lewy condition

CFL number: numerical stability

$$CFL = \frac{u\Delta t}{\Delta x}$$

$$CFL < 1$$

2D:

$$\frac{u_x \Delta t}{\Delta x} + \frac{u_y \Delta t}{\Delta y} = C[2D]$$

$$\Delta t = \text{Min}[CFL * u_{ij} \Delta x_{ij}]$$

## Properties of Numerical Models

**A robust simulation has the following properties:**

(J.H. Ferziger and M. Peric, Computational Methods for Fluid Dynamics, Springer, 1999)

- Consistency (regular, statistical)
- Stability
- Convergence (analytic solution, ?)
- Conservation
- Boundedness
- Realizability
- Accuracy

## Stability Theory

- Lyapunov stability
- Asymptotic stability
- Exponential stability

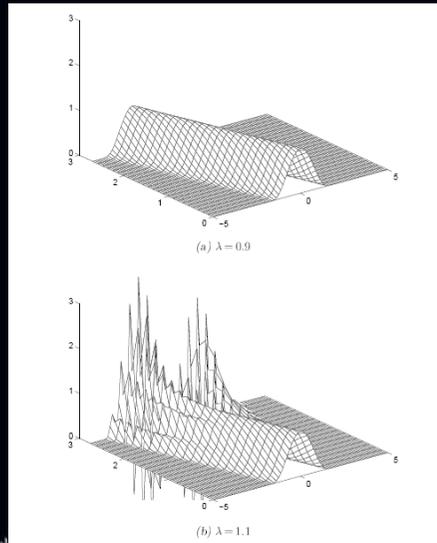
1. The origin of the above system is said to be **Lyapunov stable**, if, for every  $\epsilon > 0$ , there exists a  $\delta = \delta(\epsilon) > 0$  such that, if  $\|x(0)\| < \delta$ , then  $\|x(t)\| < \epsilon$ , for every  $t \geq 0$ .
2. The origin of the above system is said to be **asymptotically stable** if it is Lyapunov stable and if there exists  $\delta > 0$  such that if  $\|x(0)\| < \delta$ , then  $\lim_{t \rightarrow \infty} x(t) = 0$ .
3. The origin of the above system is said to be **exponentially stable** if it is asymptotically stable and if there exist  $\alpha, \beta, \delta > 0$  such that if  $\|x(0)\| < \delta$ , then  $\|x(t)\| \leq \alpha \|x(0)\| e^{-\beta t}$ , for  $t \geq 0$ .

## Numerical Stability

An algorithm is stable if the numerical solution at a fixed time remains bounded as the step size goes to zero

- Numerical diffusion
- CFL number (0.4 .. 0.6)

## Numerical Instability



## Numerical Methodology

- DNS (Finite difference, finite volume, split, unsplit, etc.)
- Spectral Methods (Fourier, Chebishev)
- Pseudo-Spectral
- N-body

## Mesh

### Static grids

- Uniform grid
- Linearly nonuniform grid
- Complex nonuniformity (Chebishev, etc)
- Non-Cartesian grids

### Dynamical grids

- Adaptive Mesh Refinement (AMR)

## Algorithms

Spatial Integration:

Temporal Integration:

Time step determination: CFL condition

## Parallelization

Hardware

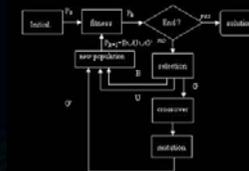
PC, Beowulf, HPC,

Software

- MPI
- PVM
- OpenMP

## Pseudocode

Algorithm development



Pseudocode:

Code intended for human reading rather than the machine reading

- *no variable definitions;*
- *no memory management;*
- *no subroutines;*
- *no system-specific code;*

**Pseudocode language choice: Matlab**

- Avoid Matlab specific functions and simulink

## Pseudocode

Pseudocode is intended to be rewritten in low level programming language later

### Pseudocode

```
{
//IF robot has no obstacle in
front THEN
// Call Move robot
// Add the move command to
the command history
// RETURN true
//ELSE
// RETURN false without
moving the robot
//END IF
}
```

### Java implementation

```
{
if (aRobot.isFrontClear())
{
aRobot.move();
cmdHistory.add(RobotAction.MOVE);
return true;
}
else
{
return false;
}
}
```

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## PDE classification

Linear second order Partial Differential Equation

$$a \frac{\partial^2}{\partial x^2} \Psi + b \frac{\partial^2}{\partial x \partial y} \Psi + c \frac{\partial^2}{\partial y^2} \Psi + d \frac{\partial}{\partial x} \Psi + e \frac{\partial}{\partial y} \Psi + f \Psi = g$$

Elliptic:  $b^2 - 4ac < 0$

Parabolic:  $b^2 - 4ac = 0$

Hyperbolic:  $b^2 - 4ac > 0$

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## PDE classification

Elliptic equation: *Poisson equation*

Parabolic equation: *Diffusion equation*

Hyperbolic equation: *Wave equation*

### EXAMPLES

*Numerical methods: individual treatment*

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Conservation laws

Modelling conservation laws:

Method - rewrite set of equations in the form of the general set of conservation laws (analytically)

Conserved quantities: **volume integrals**

Differential form of continuity eq.:  $\frac{\partial \rho}{\partial t} + \nabla \cdot (\rho V) = 0$

Mass conservation in total volume:  $M = \int_V \rho dV = const.$

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

## Conservation laws

Generalized form of conservation laws:

$$\frac{\partial \Phi}{\partial t} + \nabla(J) = 0$$

$\Phi$  – numerical variable

$J$  – numerical flux of the variable  $\Phi$

$\rho, P, V$  (physical variables): **primitive variables**

Task: *reducing existing system of hyperbolic PDE to the conserving form*

### EXAMPLES

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

ალ. თევზაძე (2011)

end

ასტროფიზიკის და პლანეტის ფიზიკის ამოცანების მოდელირება

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