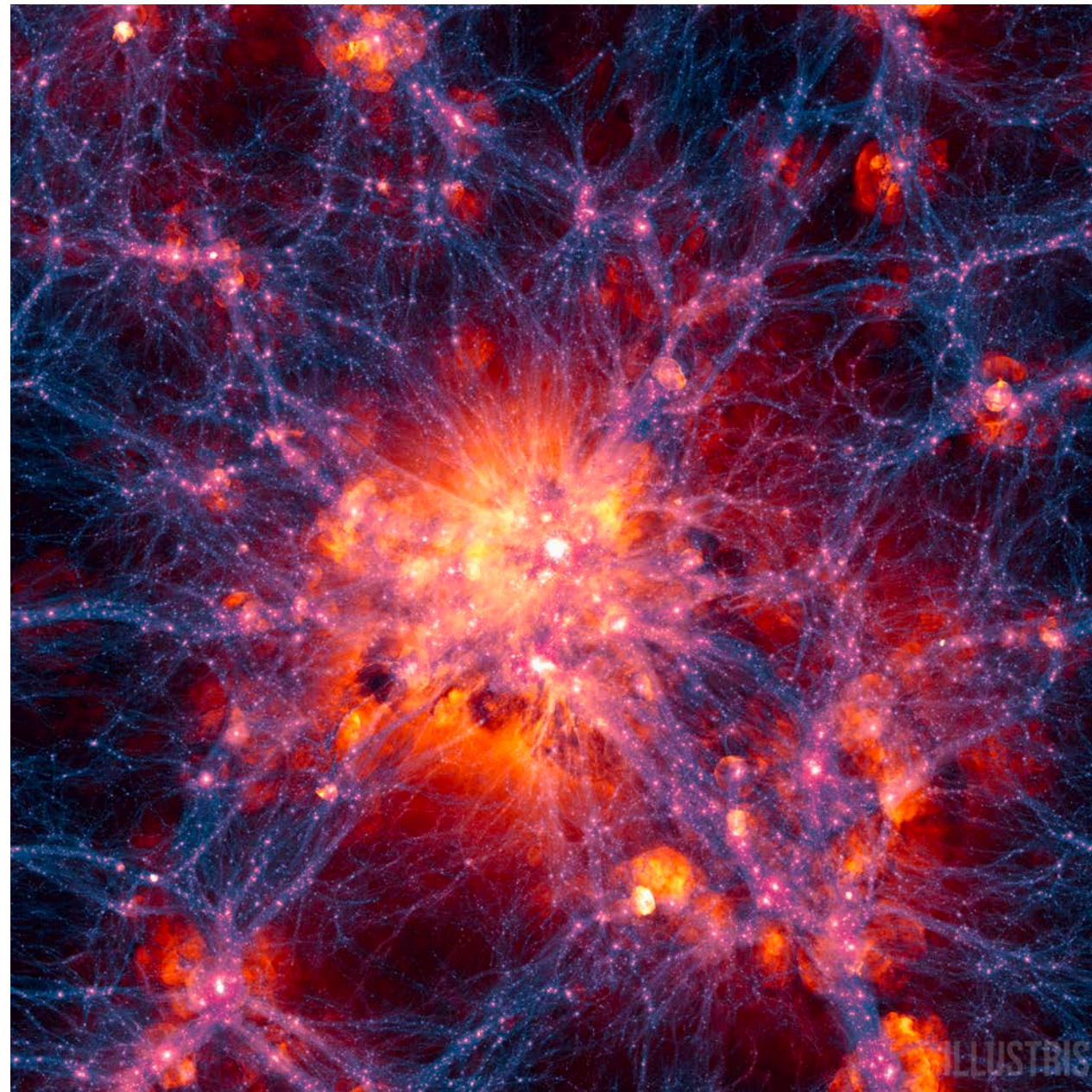


# Large Scale Simulations



# Our Goal In Lecture

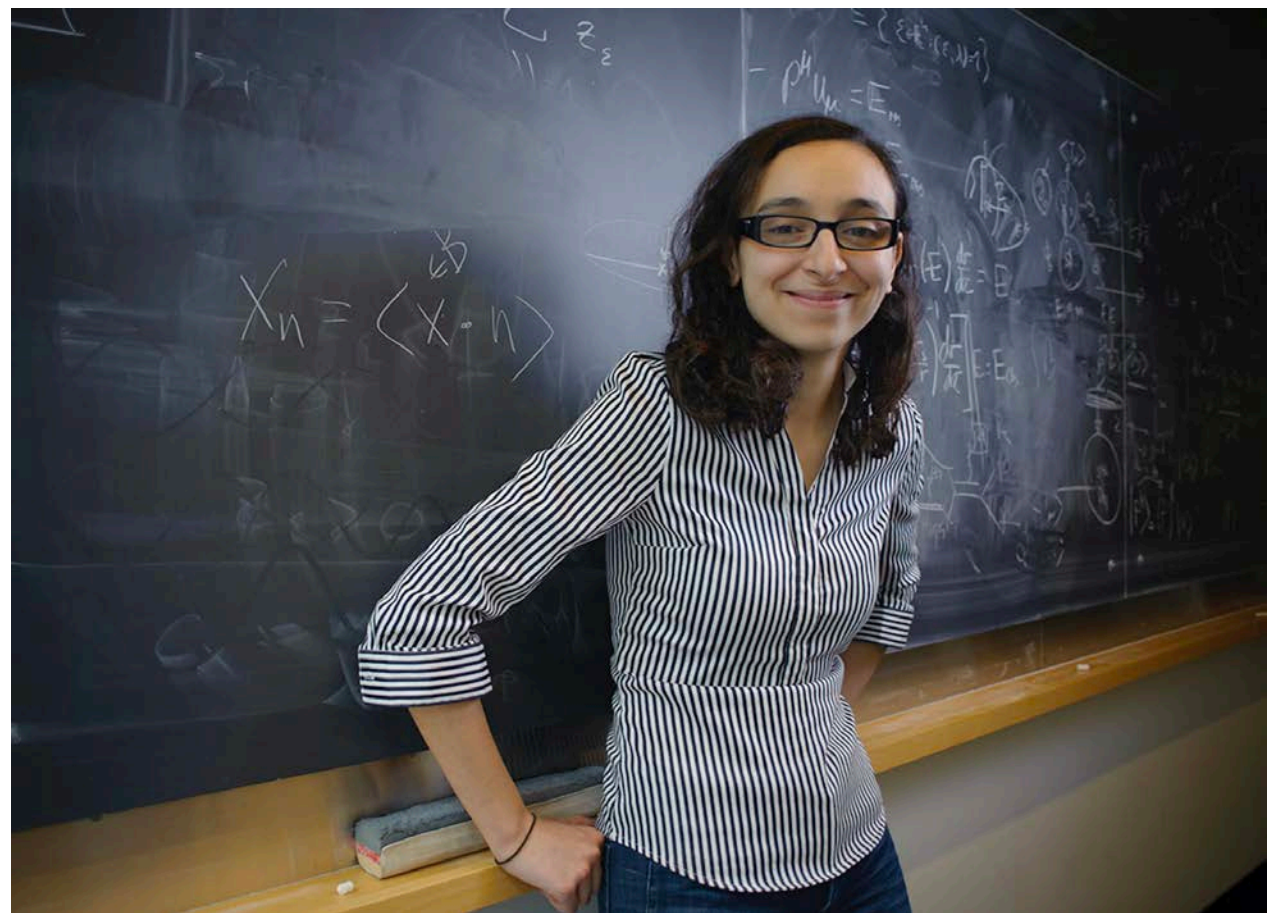
- Going to build up the intuition for large-scale simulation
  - Focus on the simulation of galaxies to the universe
  - This lecture will give the tools to do this
- The devil is in the details
  - Our lecture use the core concepts in large scale sim
  - To get everything to work at scale is much harder
- We will touch on where the field is going



# Lets Take a look at the<sup>11</sup> Scale of Things

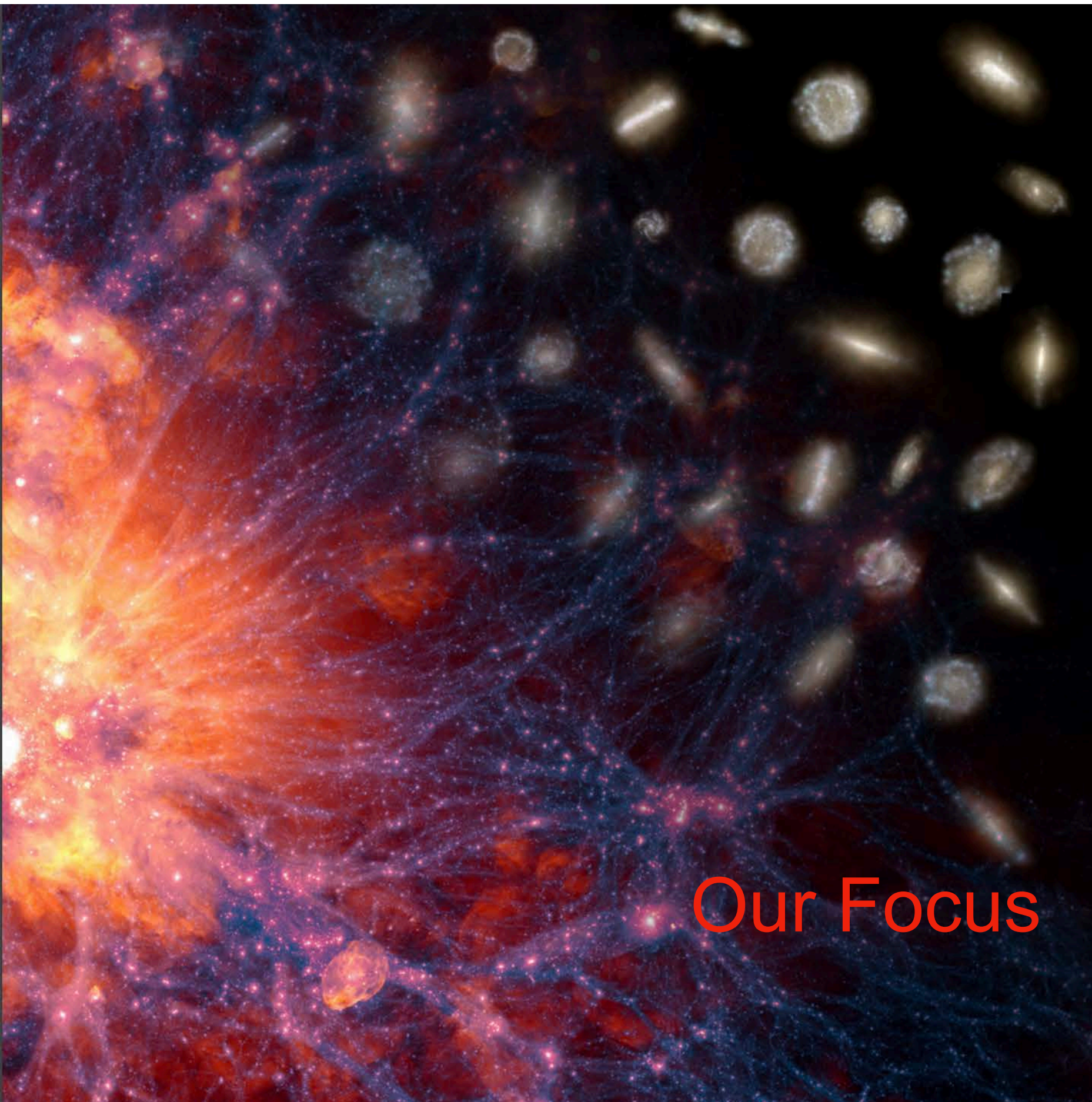
- <https://www.illustris-project.org/media/>

Prof. Mark Vogelsberg  
Main Inspiration for talk



Prof. Lina Necib  
Doing related work on smaller scales





Our Focus

## Illustris/IllustrisTNG Model: - basic ingredients -

- hydrodynamics:  
quasi-Lagrangian moving mesh  
(Arepo, Springel 2010)
- heating / cooling:  
primordial, metal line
- UV background:  
with self-shielding correction
- star formation / ISM:  
effective EOS
- chemical enrichment:  
9 elements by SNIa, SNI, AGB
- supernova feedback:  
kinetic SNI feedback
- supermassive black holes:  
seeding, growth, merging
- AGN feedback:  
quasar, radio mode, radiative



# IllustrisTNG Team:

**Mark Vogelsberger**  
**Shy Genel**  
**Volker Springel**  
**Paul Torrey**  
**Lars Hernquist**  
**Dylan Nelson**  
Rainer Weinberger  
Federico Marinacci  
Ruediger Pakmor  
Annalisa Pillepich  
Jill Naiman

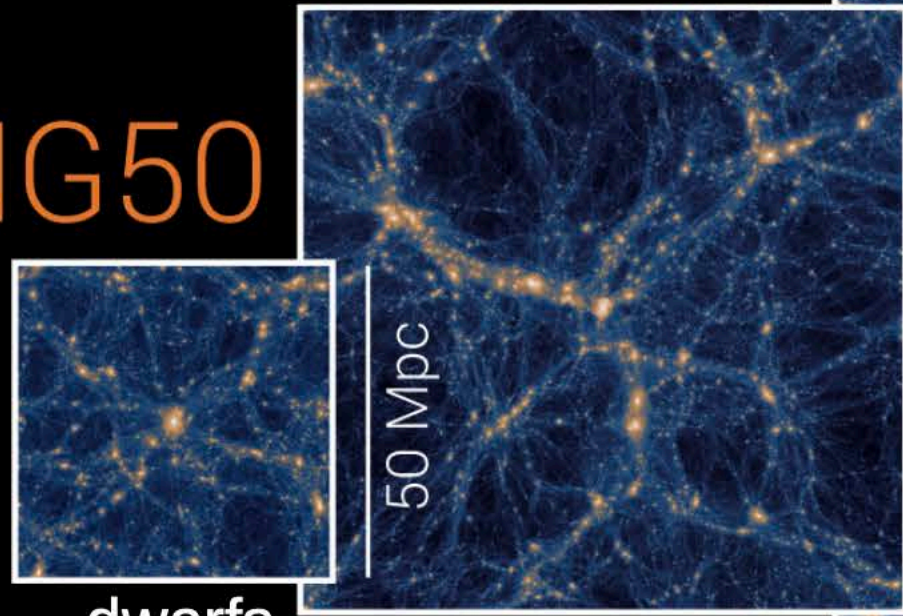
Illustris Team

three boxes with different primary science focus  
(~250 million CPUh)

TNG300

TNG100

TNG50

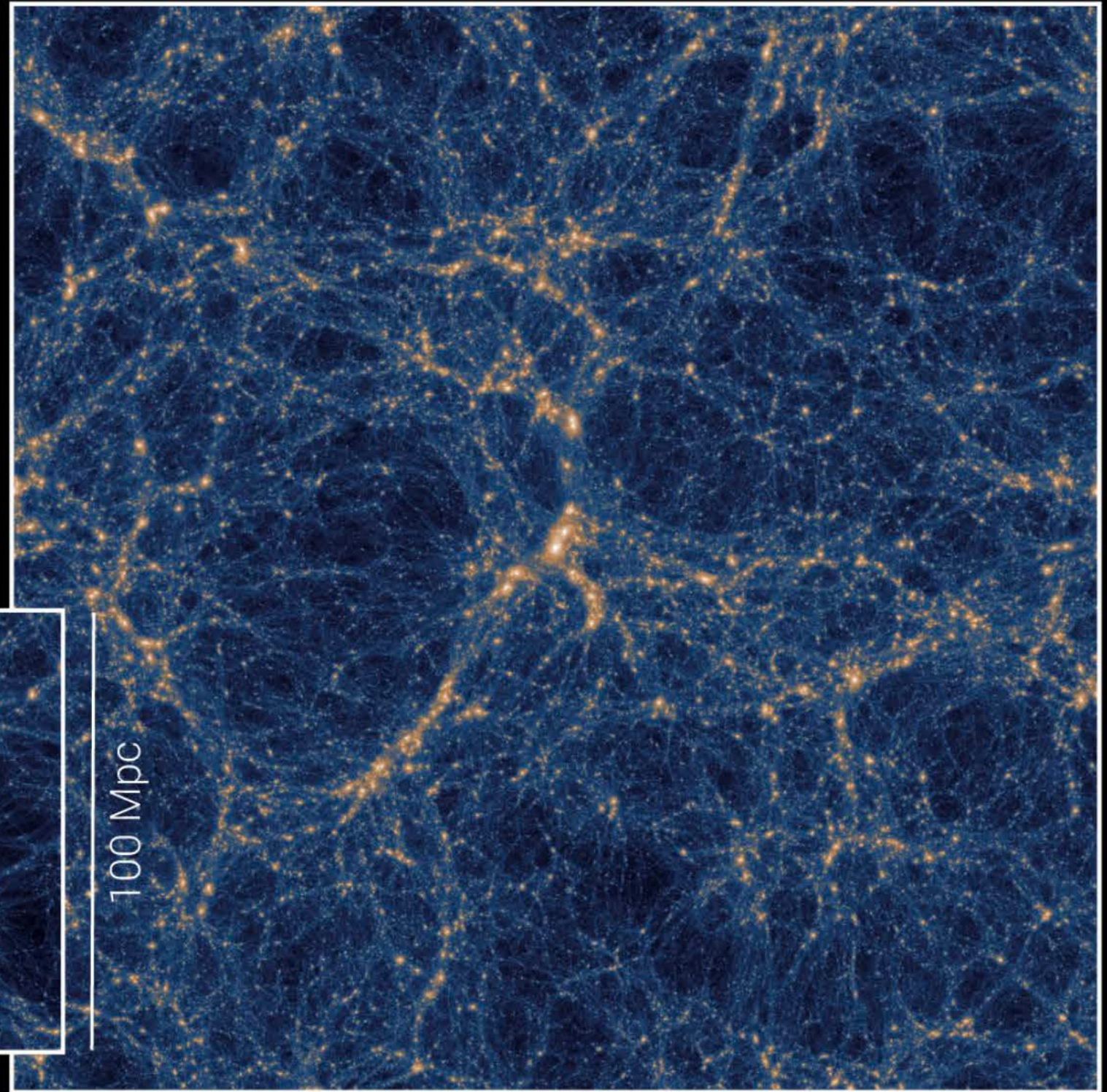


50 Mpc

dwarfs

L\* galaxies

100 Mpc



300 Mpc

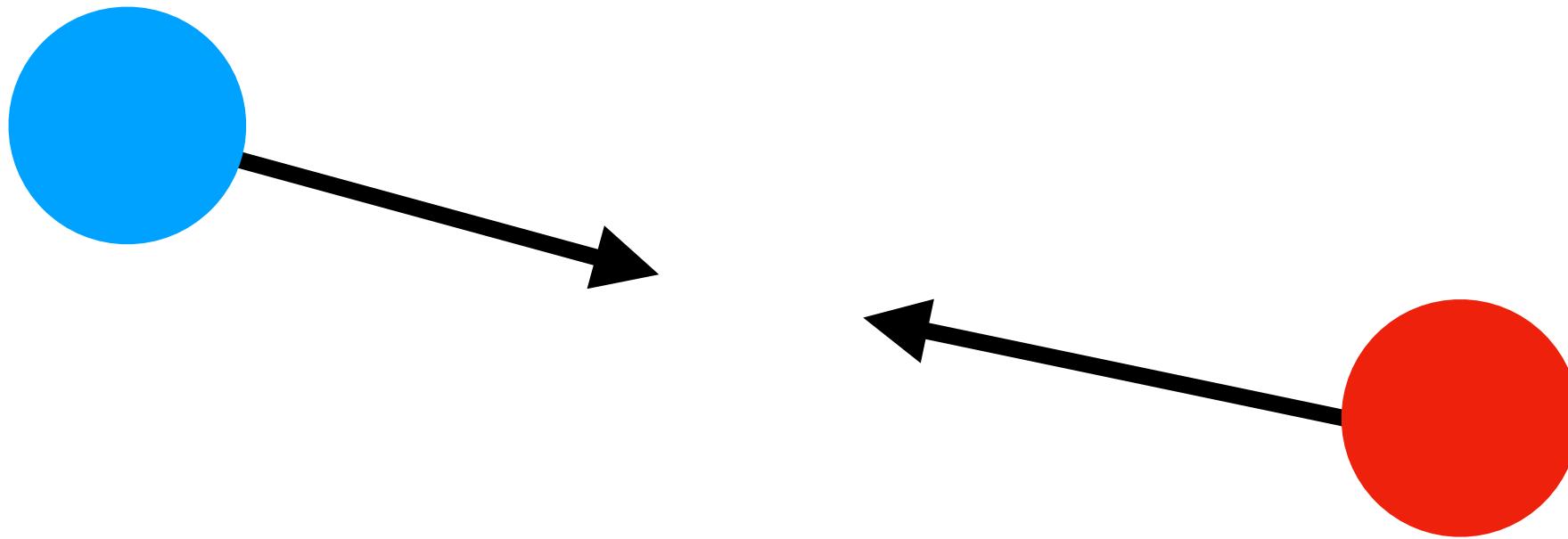
galaxy clusters



# Details

- This lecture is built on the following references:
  - <https://www.youtube.com/watch?v=Fo23ihGLPA0>
  - <https://td.lpi.ru/~eugvas/nbody/lectures.pdf>
  - [https://www.tat.physik.uni-tuebingen.de/~schaefer/teach/f/chaos\\_english.pdf](https://www.tat.physik.uni-tuebingen.de/~schaefer/teach/f/chaos_english.pdf)
  - <https://blbadger.github.io/3-body-problem.html>

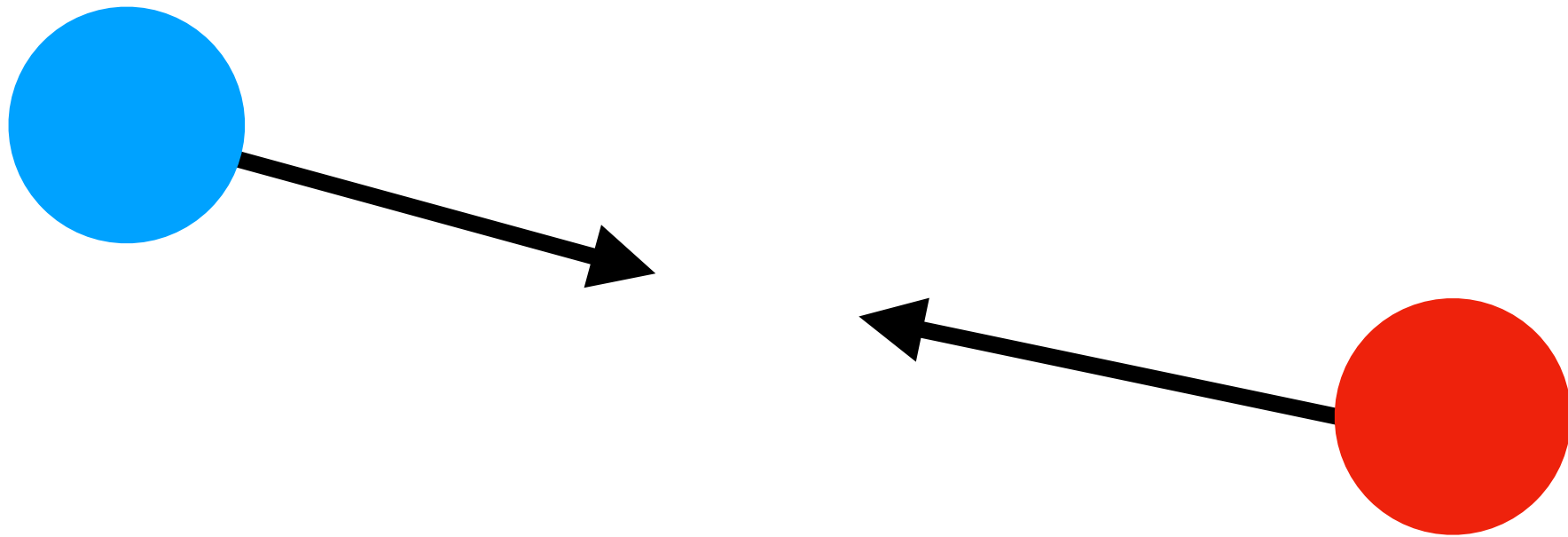
# What do we need for<sup>15</sup> Simulation?



$$\vec{F} = \frac{Gm_1m_2}{|\vec{r}_1 - \vec{r}_2|^3} (\vec{r}_1 - \vec{r}_2)$$

- All Physics we need has been developed 100s of years ago
- The two body problem has been solved since the 18th century

# What do we need for Simulation?<sup>16</sup>



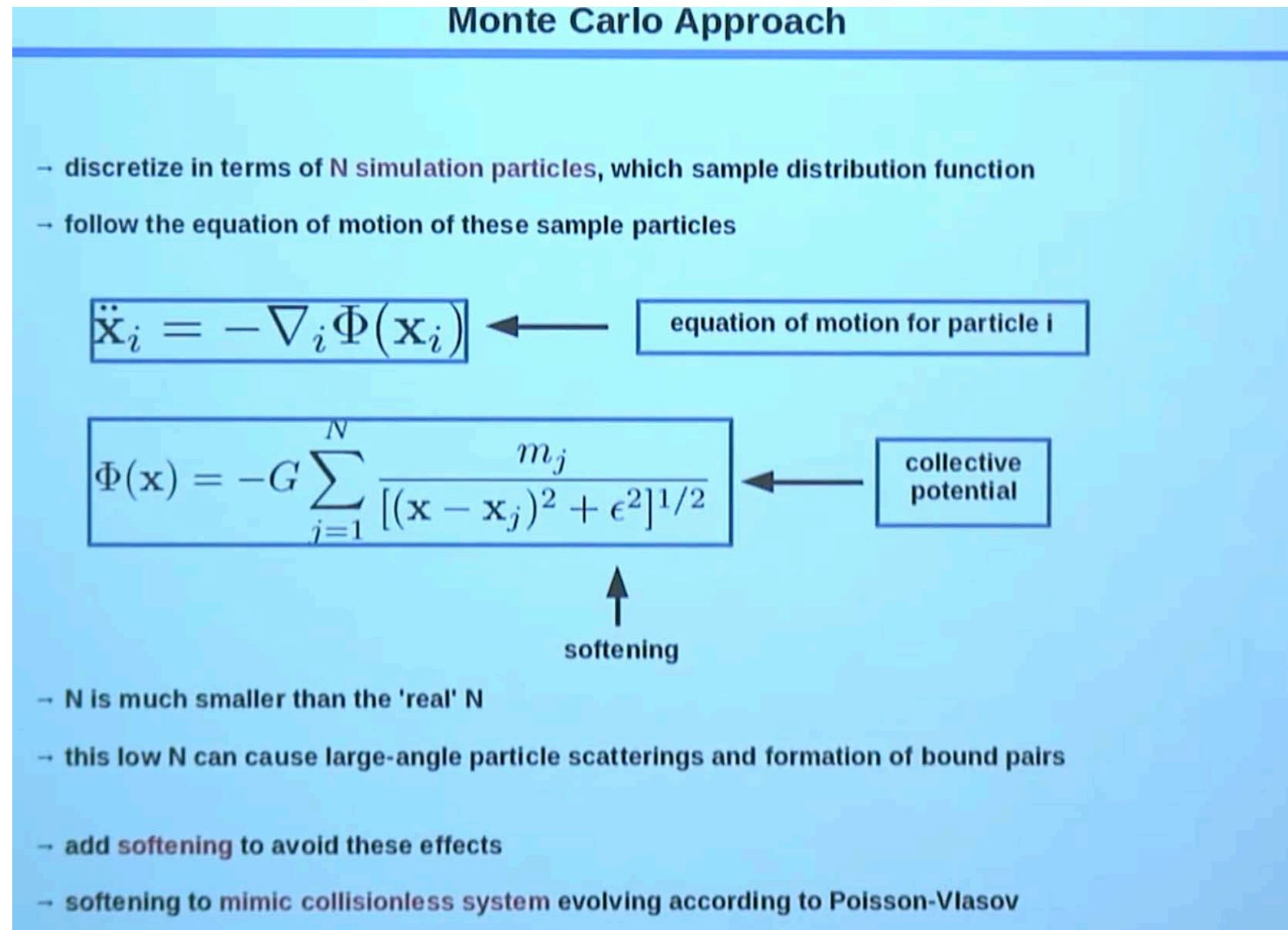
$$F = \frac{Gm_1m_2}{|\vec{r}_1 - \vec{r}_2 + \epsilon|^3} (\vec{r}_1 - \vec{r}_2)$$

- To simulate this on a computer we will add a “softening” term



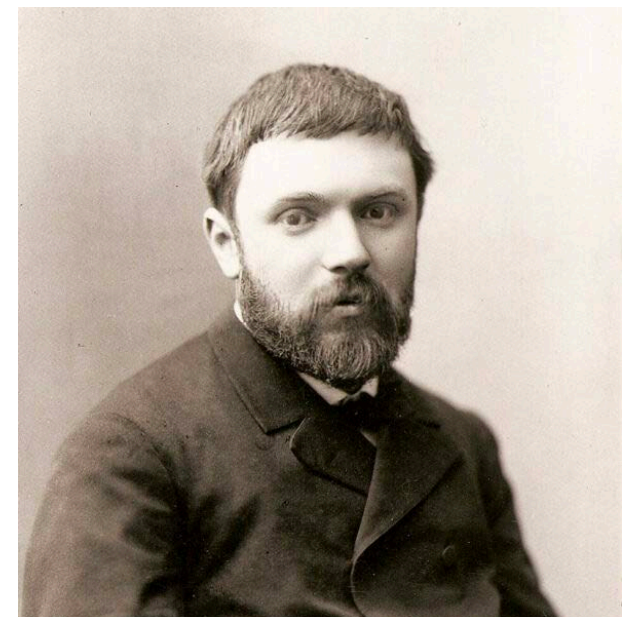
# This is how DM/galaxies<sup>17</sup> are modeled

- Instead of treating matter as a fluid
- Discretize matter into chunks and solve n-body problem



# 3 body Problem: History

- The original two body problem was solved in 18th century
  - Work done by Newton, Bernoulli Bros, Euler, Laplace,...
  - All started on the 3 body problem and built on the two body
- King Oscar II decided to make a competition:
  - For his 60th birthday he bestowed a prize on who could solve the n-body problem



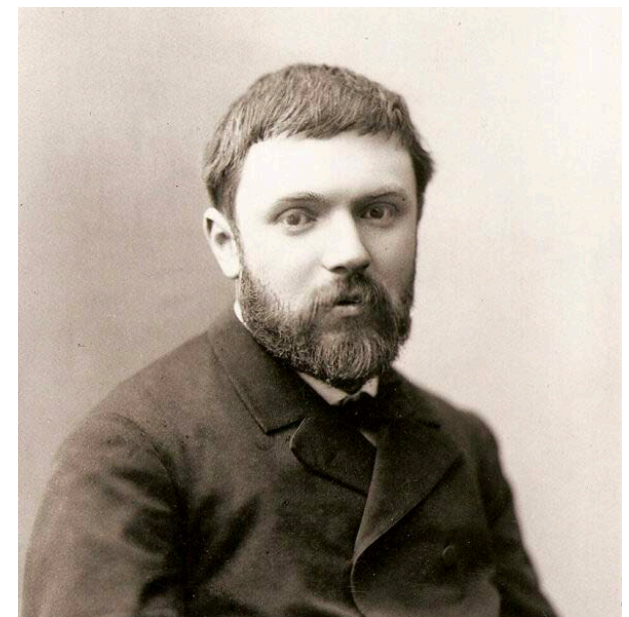


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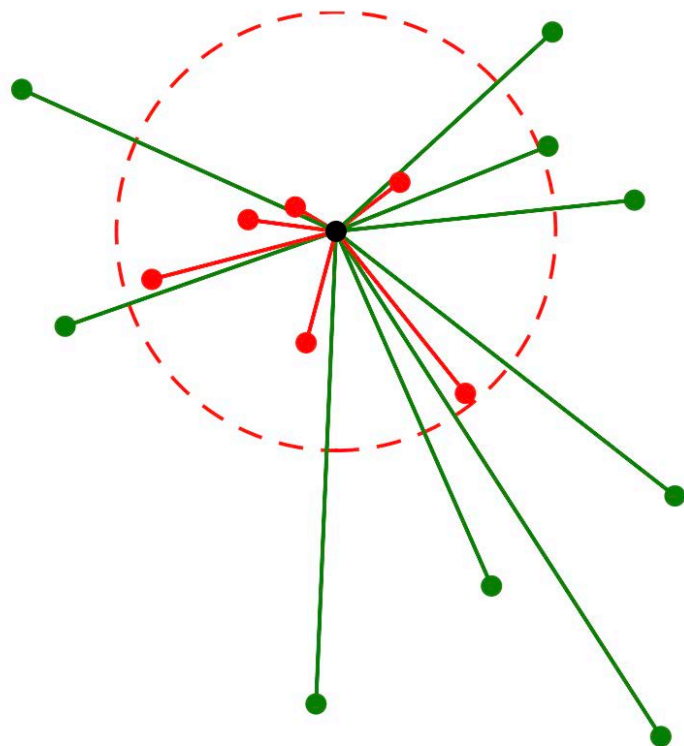
Henri Poincare →

He proved no solution existed!



# Going to N-body

- The challenge of solving this numerically for n-body
  - This scales with the number of bodies  $N^2$
  - Requires the computations of all pairwise distances

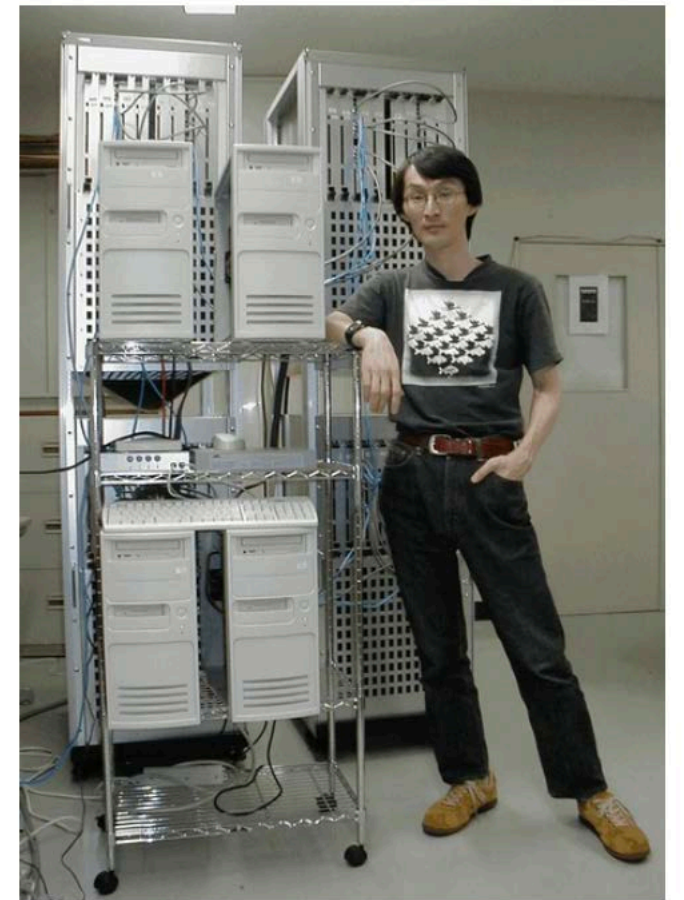
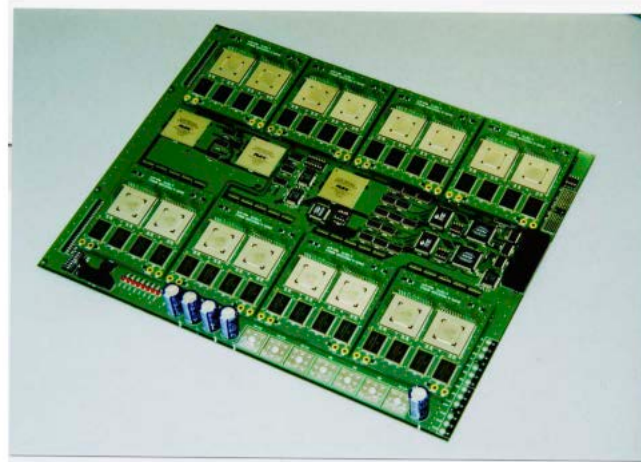


- For  $N=1000$  (1 Million/step computations)
- For  $N=10^6$  Something ridiculous



# Historical Solutions

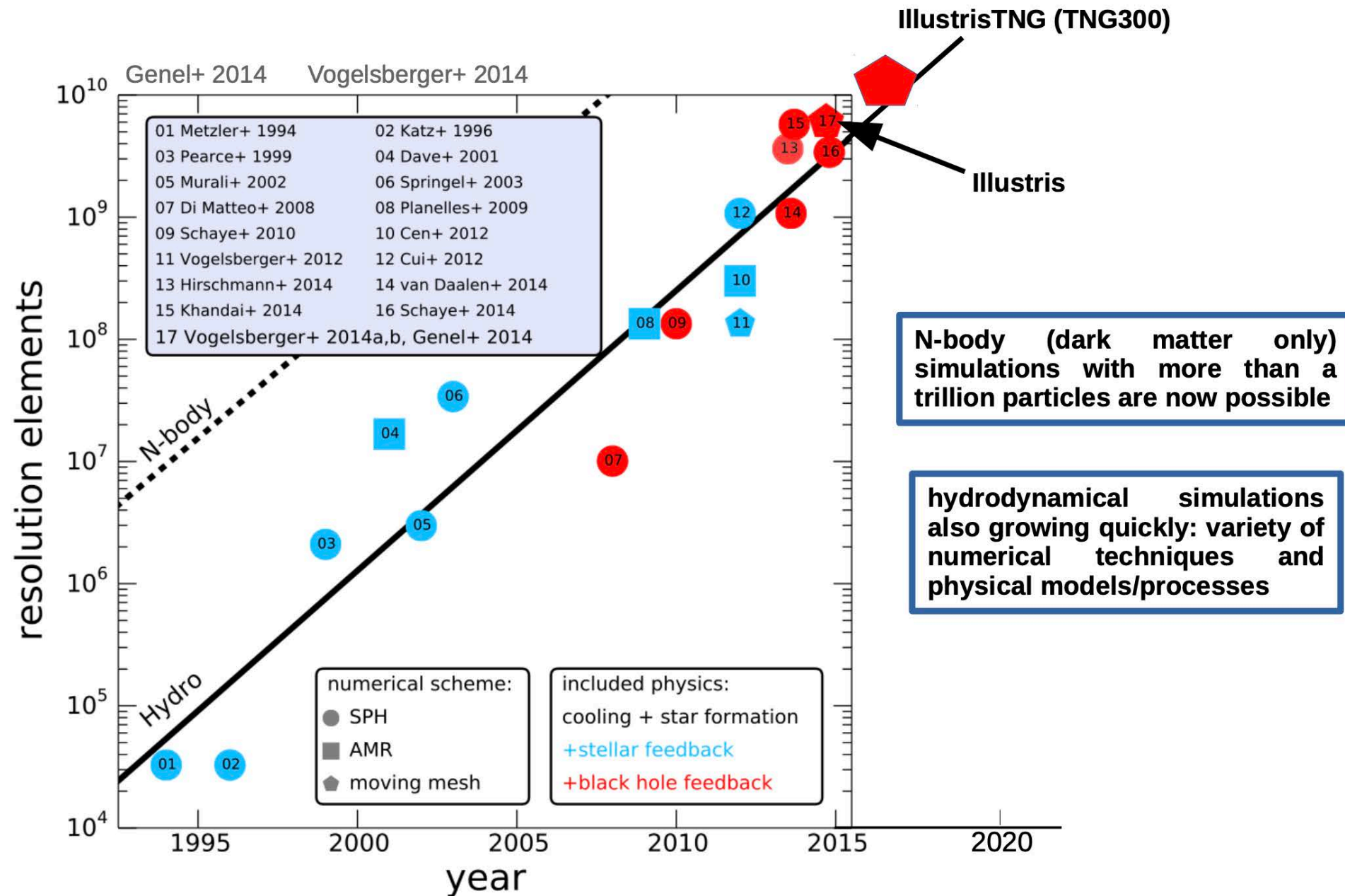
- One approach has been to build dedicated computing hardware
  - Dedicated hardware that can do large-scale parallel computation
  - Focused specifically on n-body simulation
  - GRAPE boards (GRAvity PipelinE)
- Now done with GPUs



Jun Makino with GRAPE-6

# Scaling of n-body

## The Evolution of Large-Scale Simulations

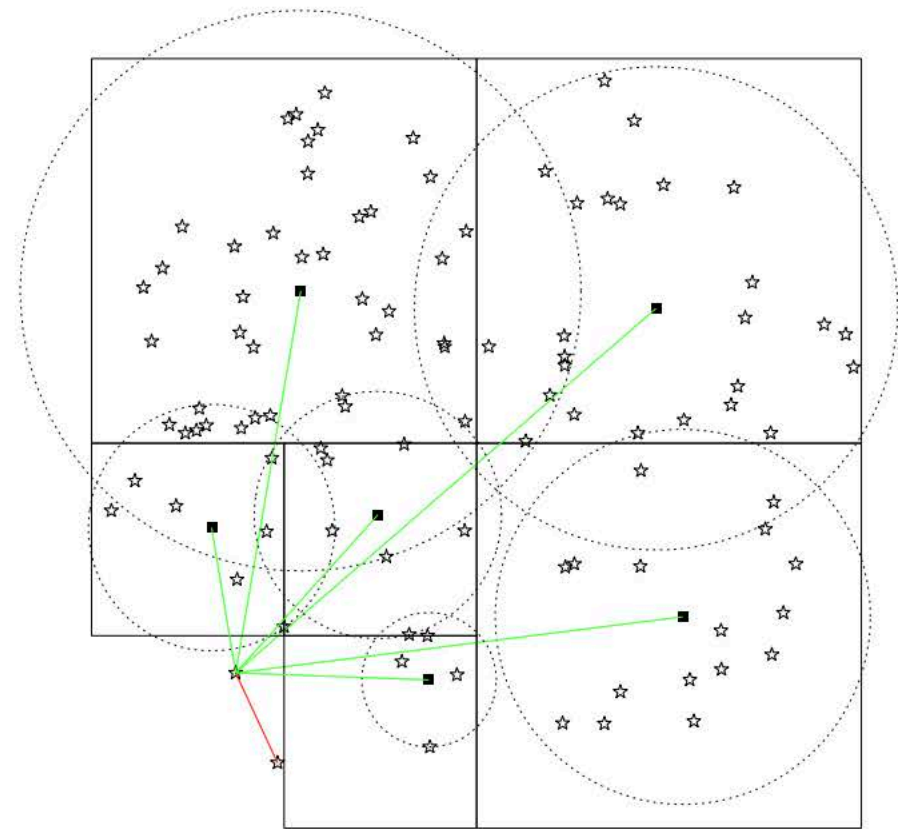
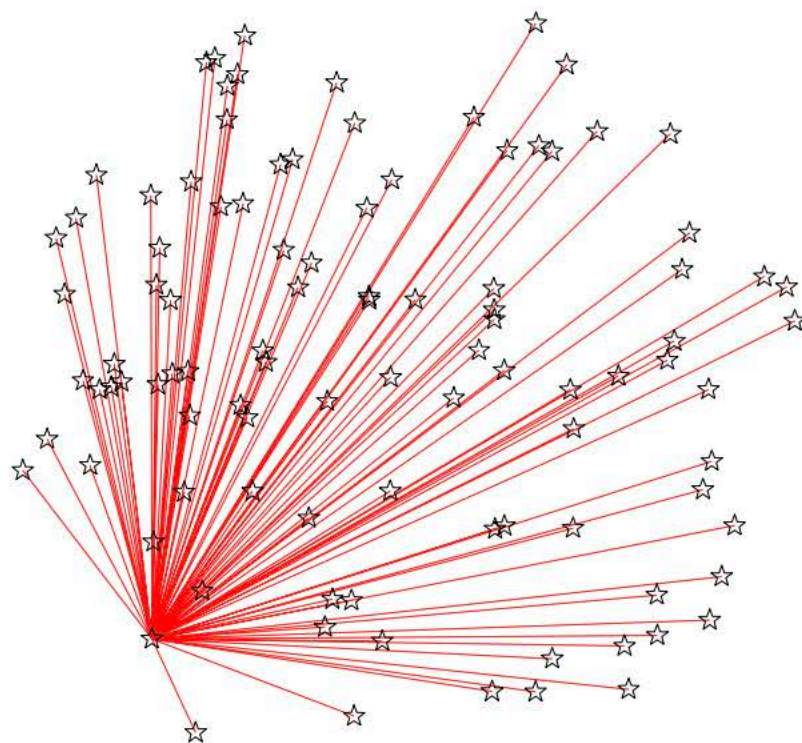


- M. Vogelsberger([https://indico.cern.ch/event/736594/contributions/3184103/attachments/1738225/2812076/talk\\_vogelsberger.pdf](https://indico.cern.ch/event/736594/contributions/3184103/attachments/1738225/2812076/talk_vogelsberger.pdf))



# do you deal with N-body?

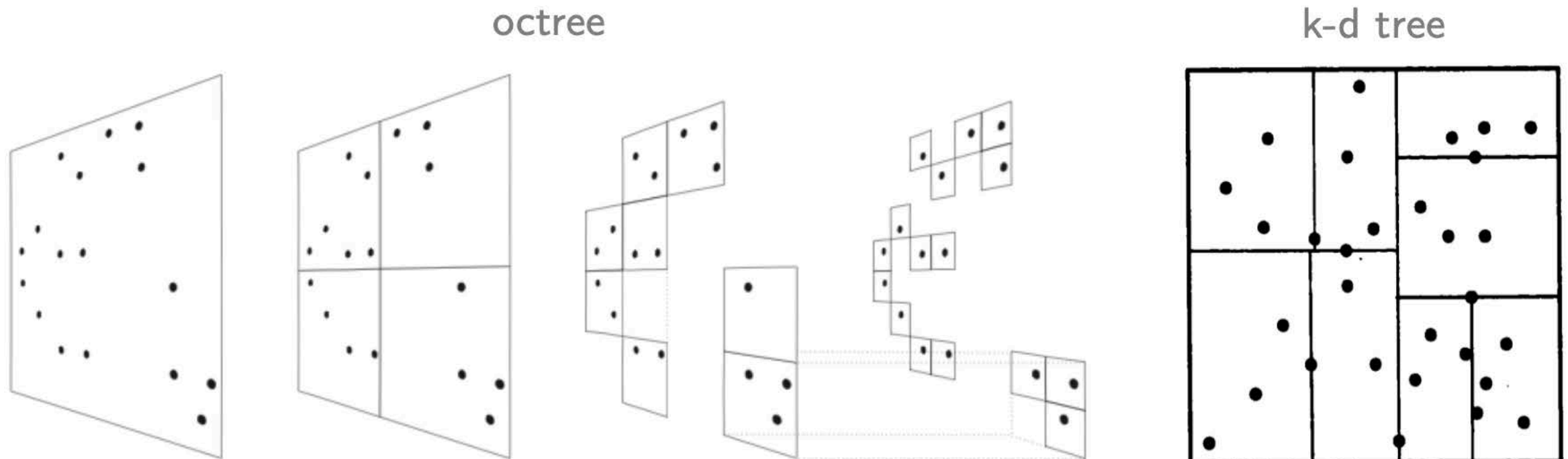
- Barnes's-Hut Algorithm re-rank stars into a tree structure
- Structure is a grid over the whole space



[from Dehnen & Read 2011]

# Tree Construction

- QuadTree/OctTree
  - Split each square(cube) into 4(8) sub regions
- KD Tree
  - Use the data to draw equal numbered regions in space

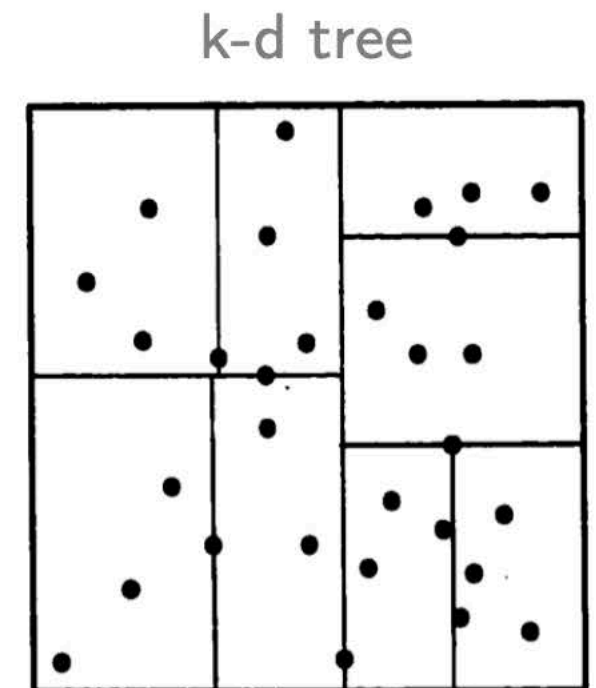
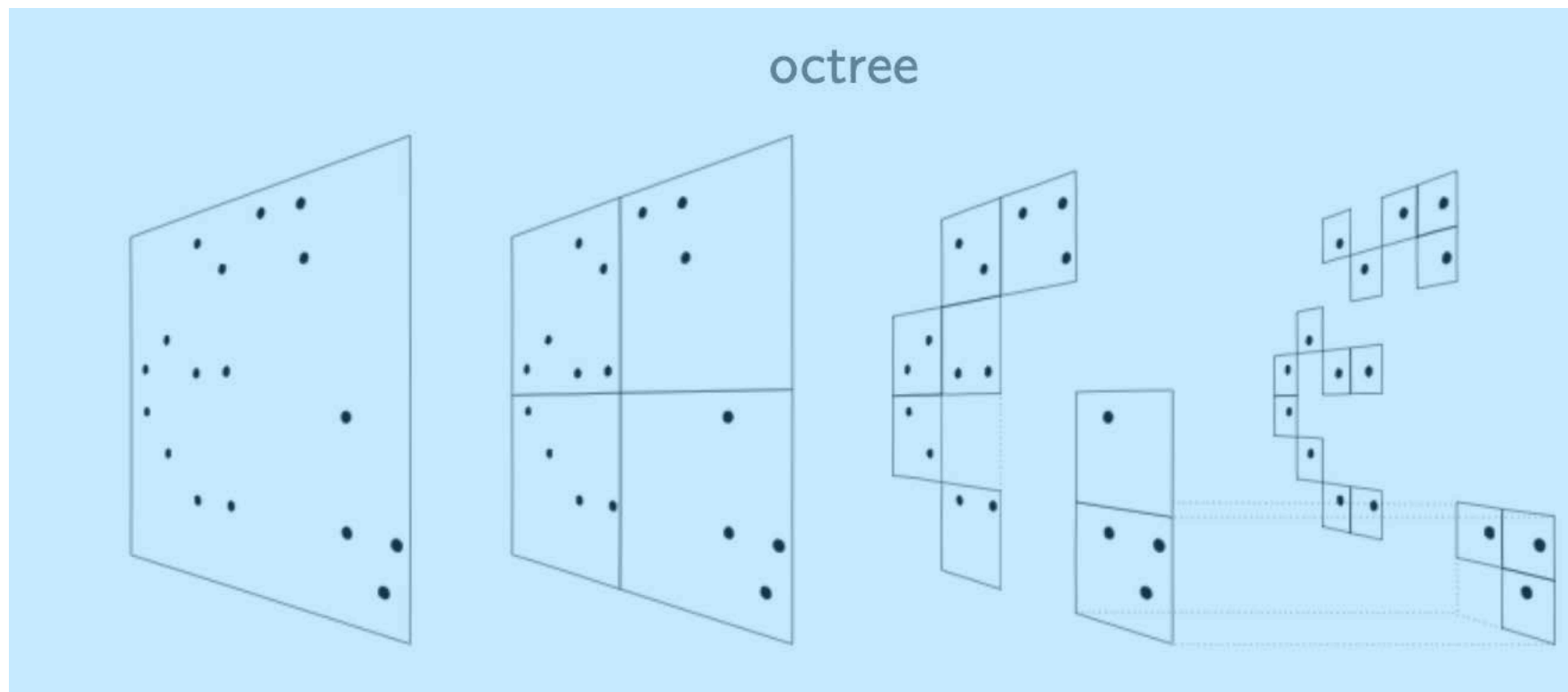




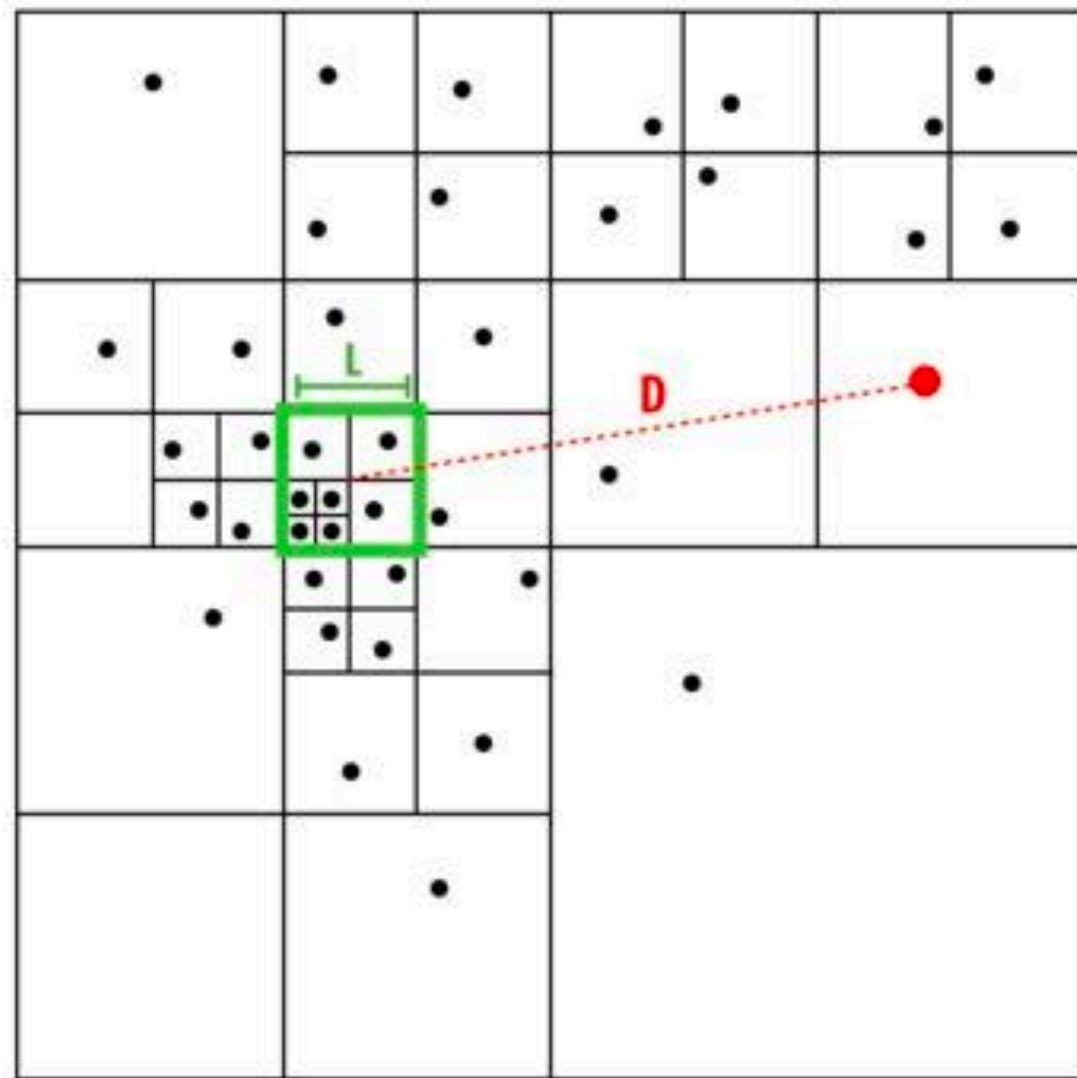
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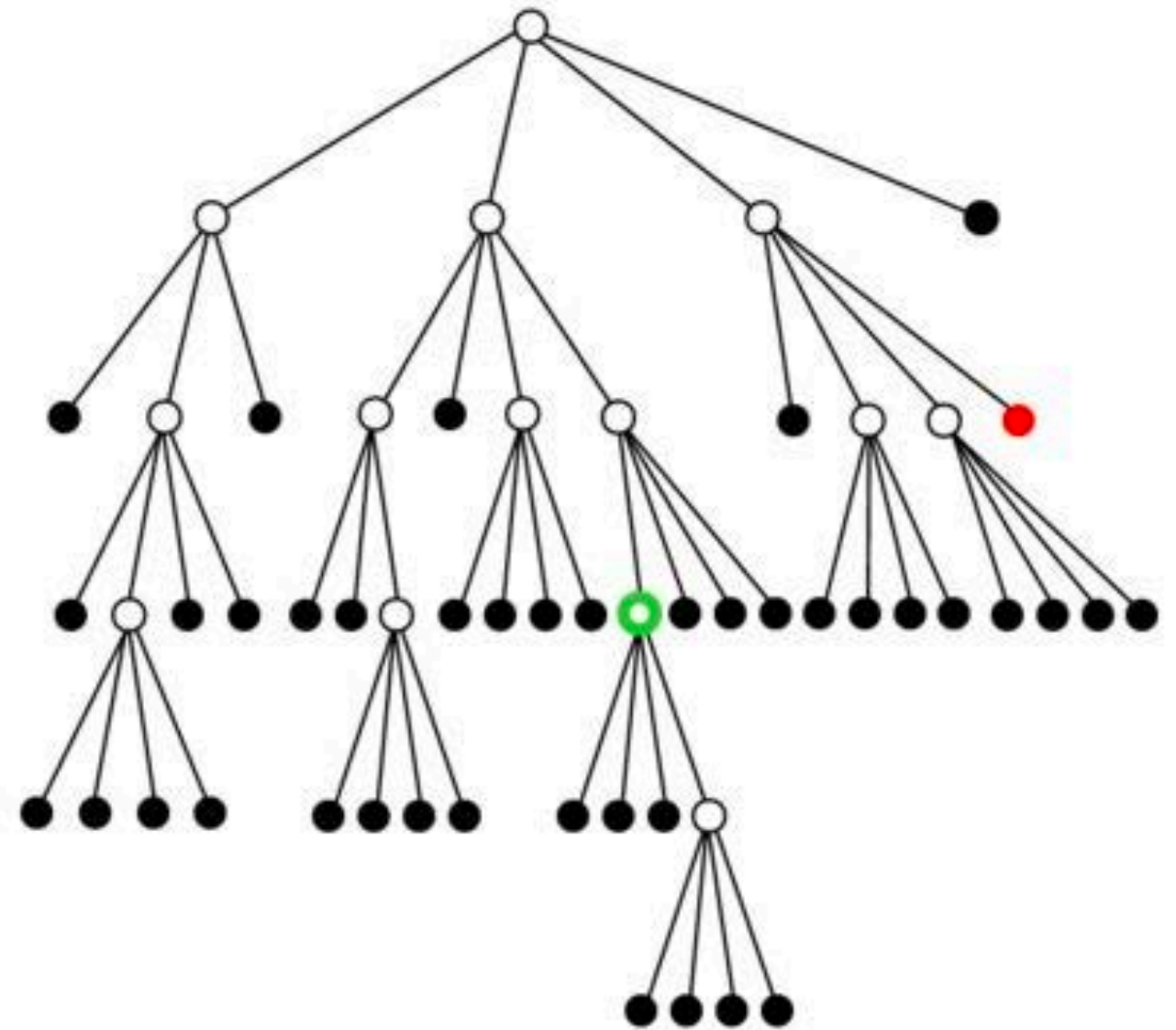
**Just requires that we know the bounds of the space**



# Visualizing Tree



Spatial Domain



Quad-Tree Representation

Note that for the big grids, this equates to Gauss' law style an approach  
Treat each square as a star w/total mass at mass weighted center



# Barnes-Hut Algorithm

- We can follow a step by step construction of this :
  - 1. Construct tree structure with bounds
  - 2. Loop over stars and fill tree structure
  - 3. Loop over stars and compute distance
    - Full n-body computation for nearby trees only
  - 4. Step forward everything
- The above process is  $N \log(N)$  in computational time

# Image Sources

**image**

link:

attribution: