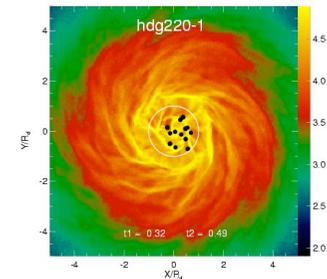
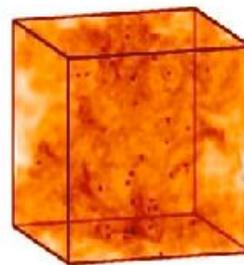
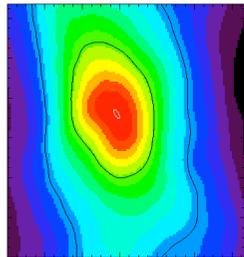
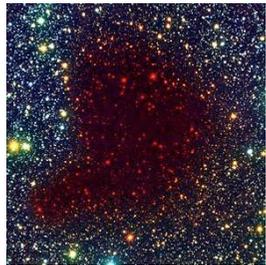


# GRAVOTURBULENT STAR FORMATION with Smoothed Particle Hydrodynamics



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# Collaborators

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# Overview

## 1. Physics of star formation

- a) How do stars form?
- b) Where do stars form?
- c) Theory of *gravoturbulent star formation*

## 2. Numerical approach to star formation

- 1. Large-eddy simulations (*LES*) with smoothed particle hydrodynamics (*SPH*)
- 2. Transition to stellar-dynamics: introducing „*sink particles*“ to represent protostars (i.e. to describe *subgrid-scale physics*)

# STAR FORMATION

# Star formation in "typical" spiral:

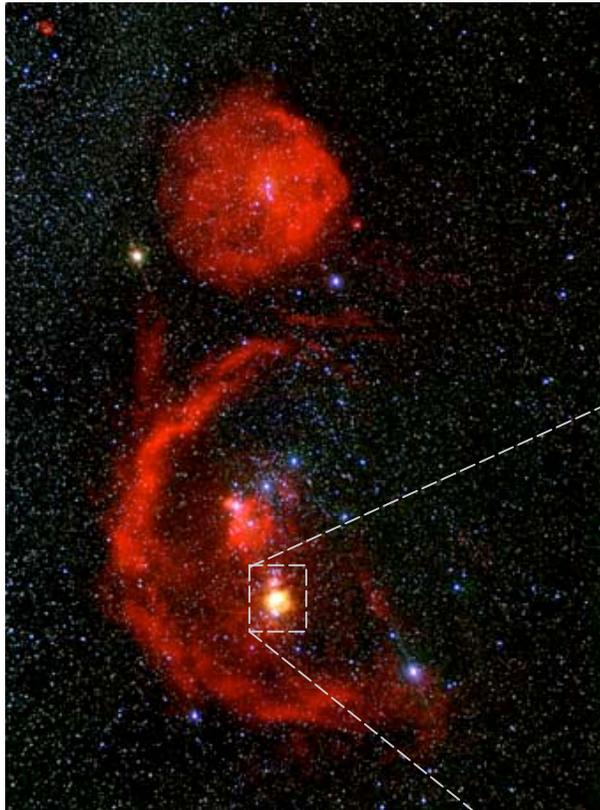


(from the Hubble Heritage Team)

## NGC4622

- Star formation *always* is associated with *clouds of gas and dust*.
- Star formation is essentially a *local phenomenon* (on ~pc scale)
- **HOW** is star formation is *influenced* by *global* properties of the galaxy?

# Local star forming region: The Trapezium Cluster in Orion



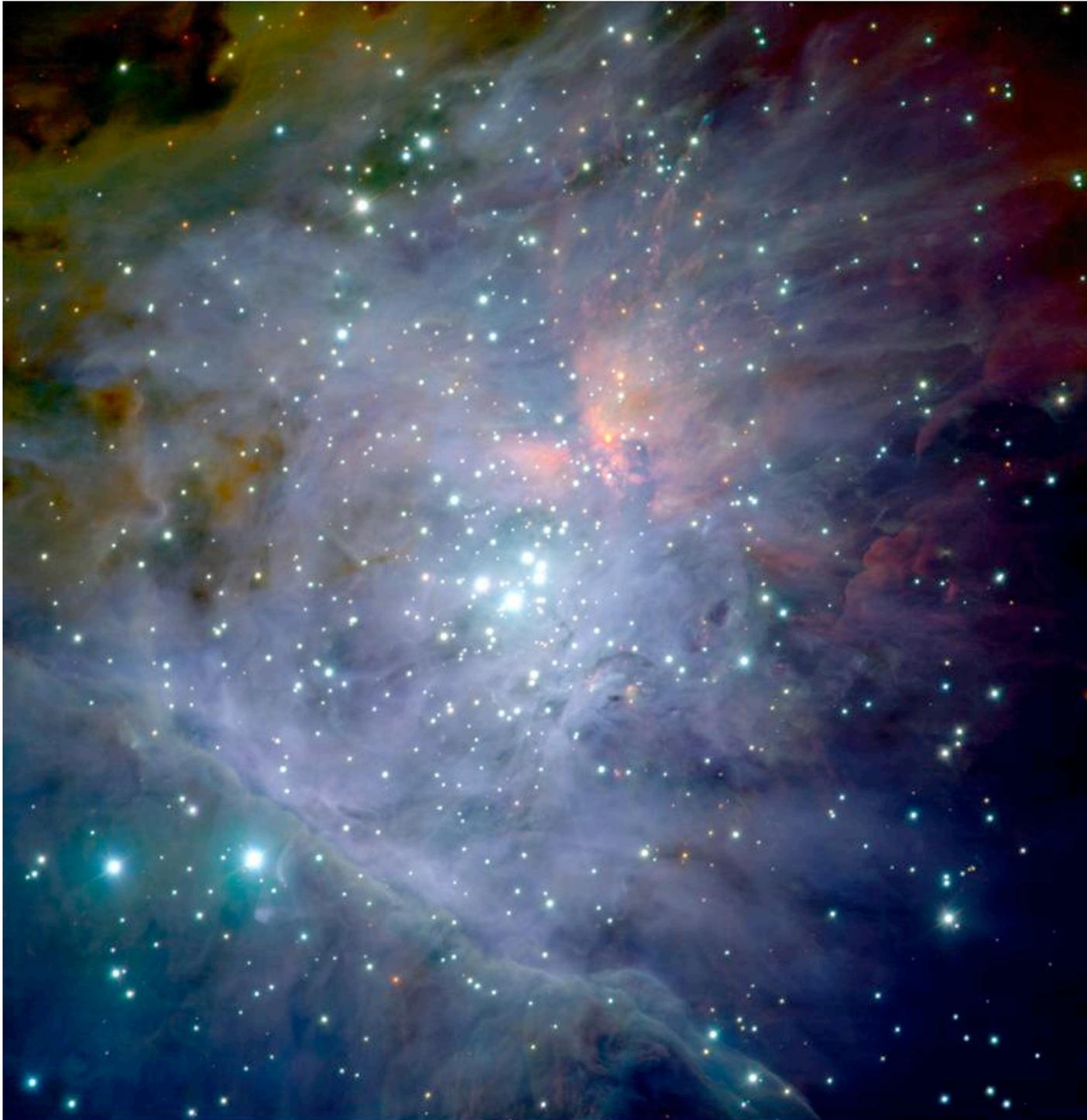
Orion molecular cloud

The Orion molecular cloud is the birth- place of several young embedded star clusters.

The Trapezium cluster is only visible in the IR and contains about 2000 newly born stars.



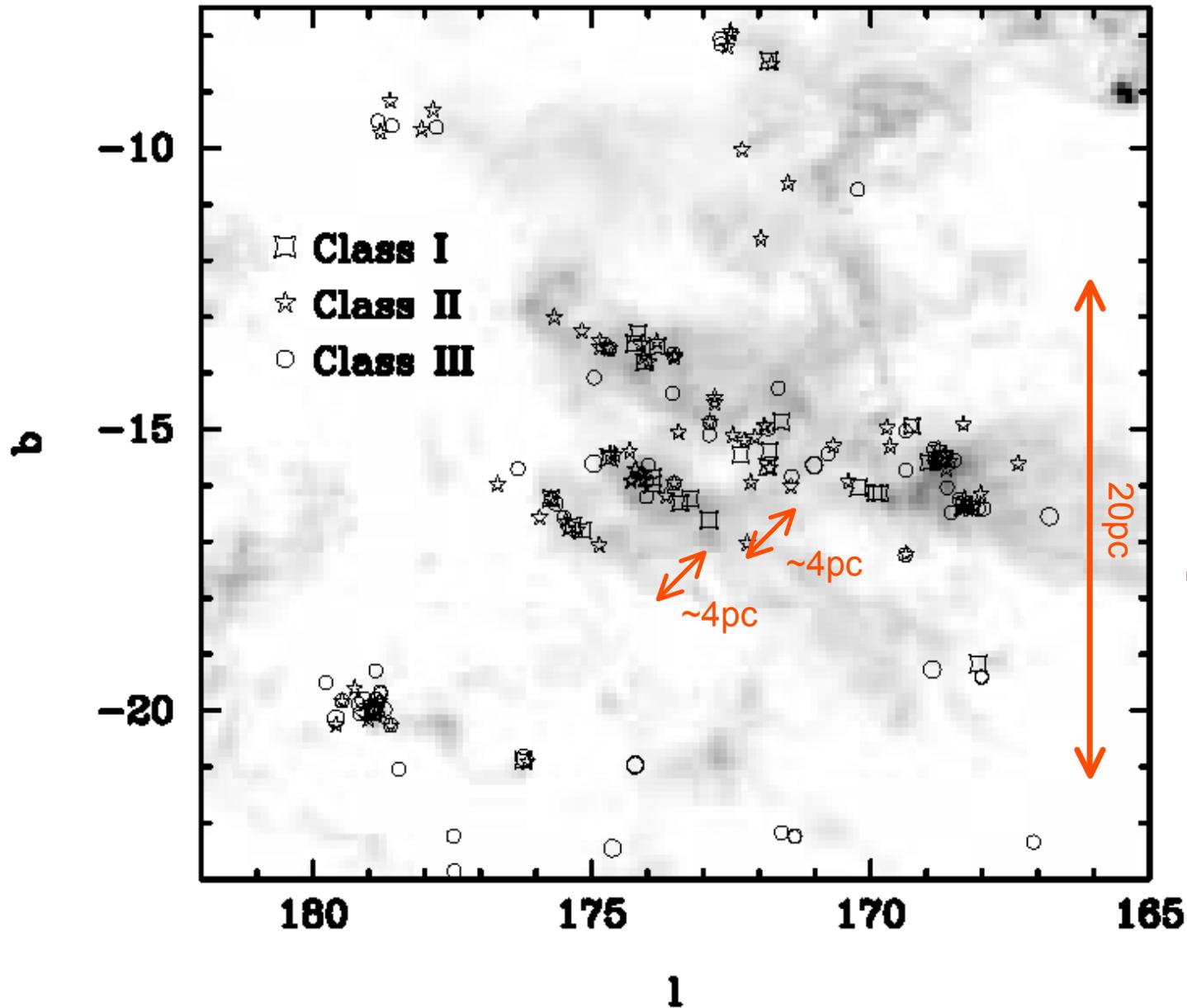
Trapezium cluster



## Trapezium Cluster (detail)

- stars form in **clusters**
- stars form in **molecular clouds**
- (proto)stellar **feedback** is important

(color composite J,H,K  
by M. McCaughrean,  
VLT, Paranal, Chile)



# Taurus molecular cloud

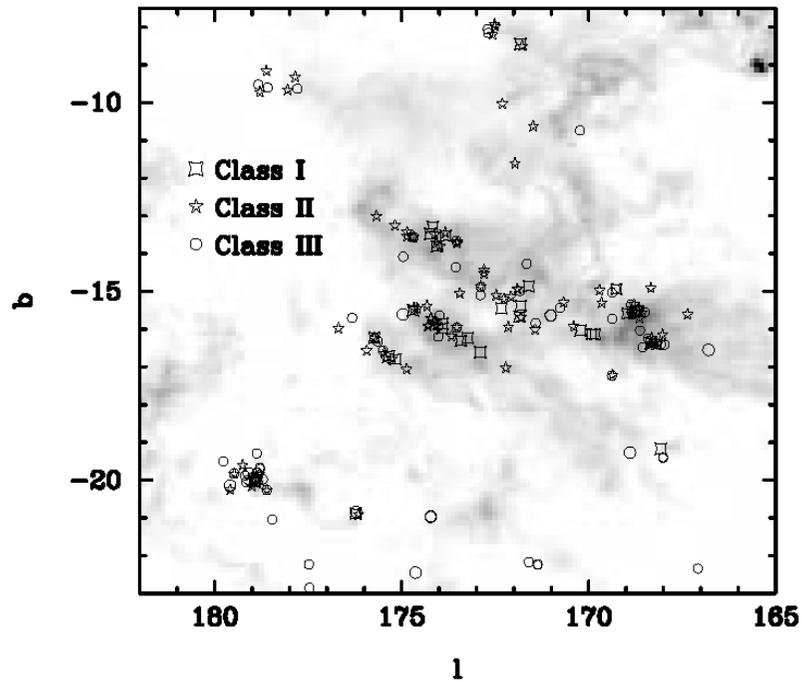
star-forming  
filaments in the  
*Taurus* cloud

- Structure and dynamics of young star clusters is coupled to *structure of mol. cloud*

# Taurus molecular cloud

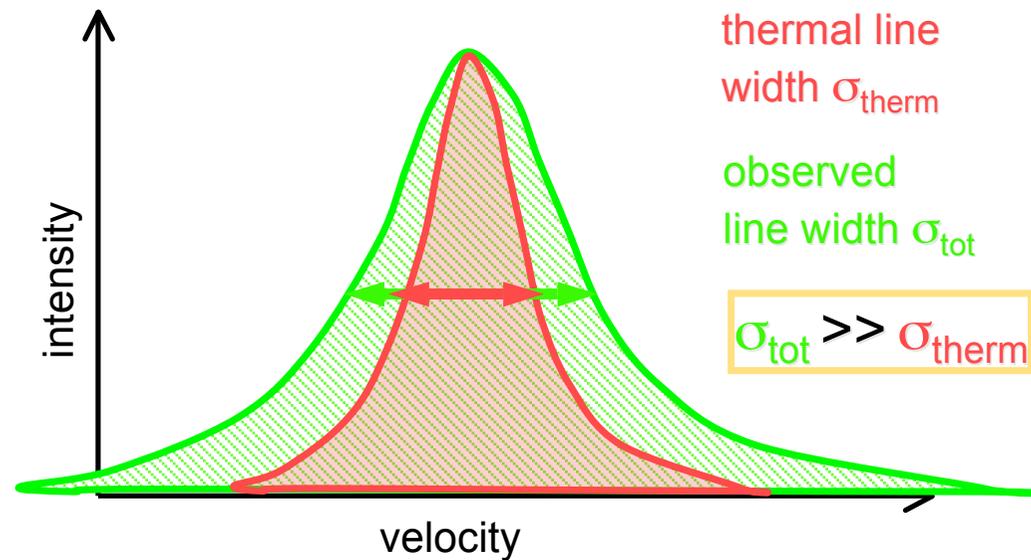
Star-forming filaments in *Taurus* cloud

(from Hartmann 2002)



- Structure and dynamics of young star clusters is coupled to *structure of molecular cloud*

- Structure and dynamics of *molecular cloud* is determined by *supersonic turbulence*



# The star formation process

- *How* do stars form?
  - What determines *when* and *where* stars form?
  - What *regulates* the process and determines its *efficiency*?
  - How do *global* properties of the galaxy influence star formation (a *local* process)?
  - Are there different *modes* of SF?  
(Starburst galaxies vs. *LSBs*, *isolated* SF vs. *clustered* SF)
- *What physical processes initiate and control the formation of stars?*

# Gravoturbulent star formation

- New theory of star formation:

*Star formation is controlled  
by interplay between  
gravity and  
supersonic turbulence!*

- Dual role of turbulence:
  - *stability on large scales*
  - *initiating collapse on small scales*

# Gravoturbulent star formation

- New theory of star formation:

*Star formation is controlled  
by interplay between  
gravity and  
supersonic turbulence!*

- Validity:

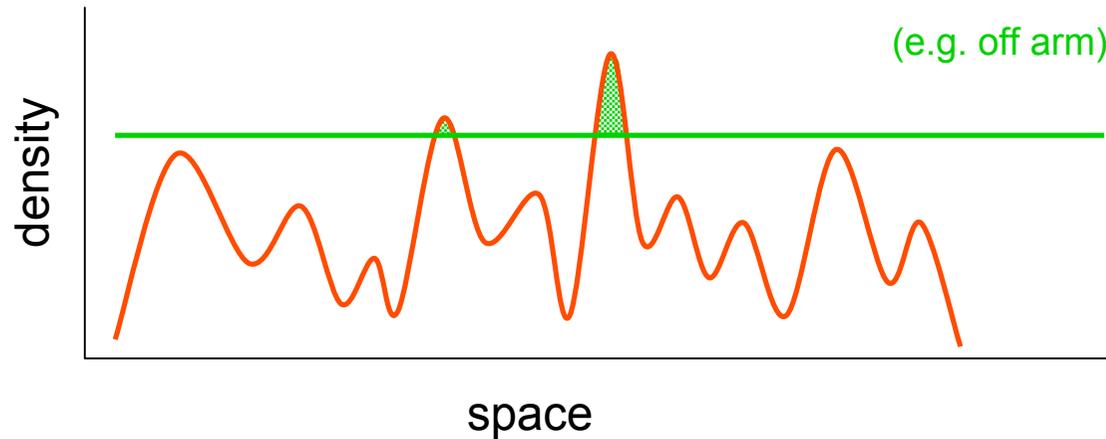
This hold on *all* scales and applies to build-up of stars and star clusters within molecular clouds as well as to the formation of molecular clouds in galactic disk.

# Gravoturbulent Star Formation

- *Supersonic turbulence* in the galactic disk creates strong **density fluctuations** (in shocks:  $\delta\rho/\rho \approx \mathcal{M}^2$ )
  - chemical phase transition: atomic  $\rightarrow$  molecular
  - cooling instability
  - gravitational instability
- Cold *molecular clouds* form at the high-density peaks.
- *Turbulence* creates density structure, *gravity* selects for collapse  
—————→ **GRAVOTUBULENT FRAGMENTATION**

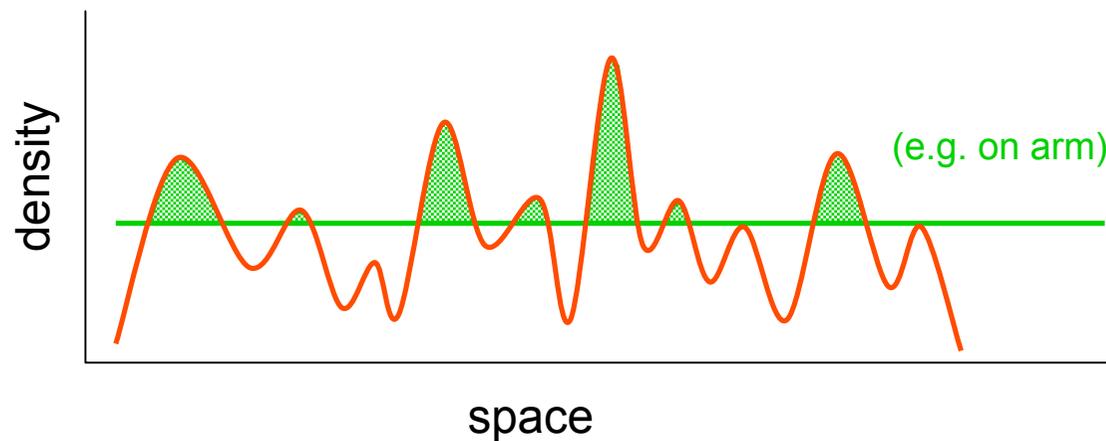
- *Turbulent cascade*: Local compression *within* a cloud provokes collapse  $\rightarrow$  individual *stars* and *star clusters*

# Star formation on *global scales*



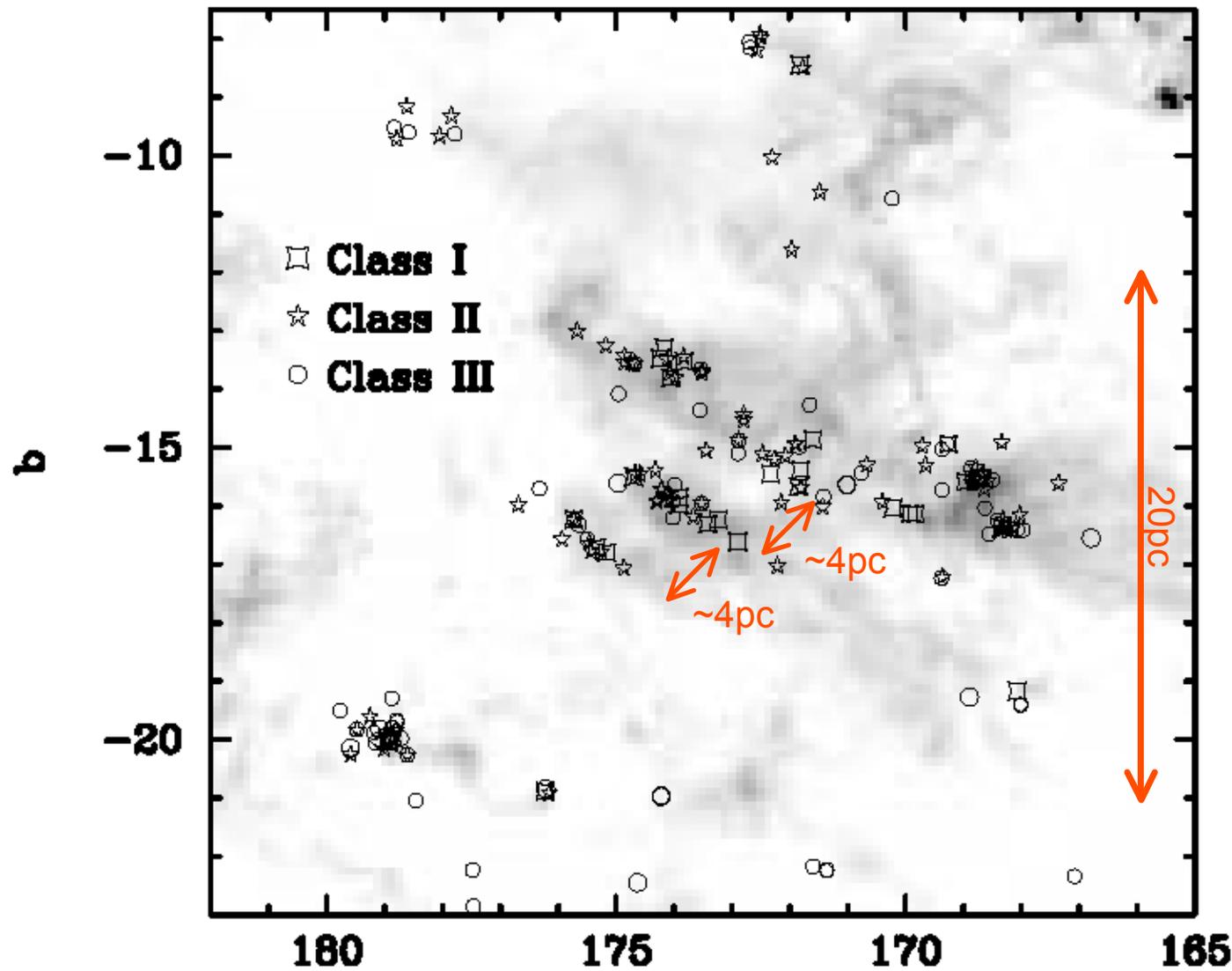
density fluctuations in warm atomic ISM caused by supersonic turbulence

some are dense enough to form H<sub>2</sub> within “reasonable timescale”  
→ molecular clouds



external perturbations (i.e. potential changes) increase likelihood

Approaching  
the problem

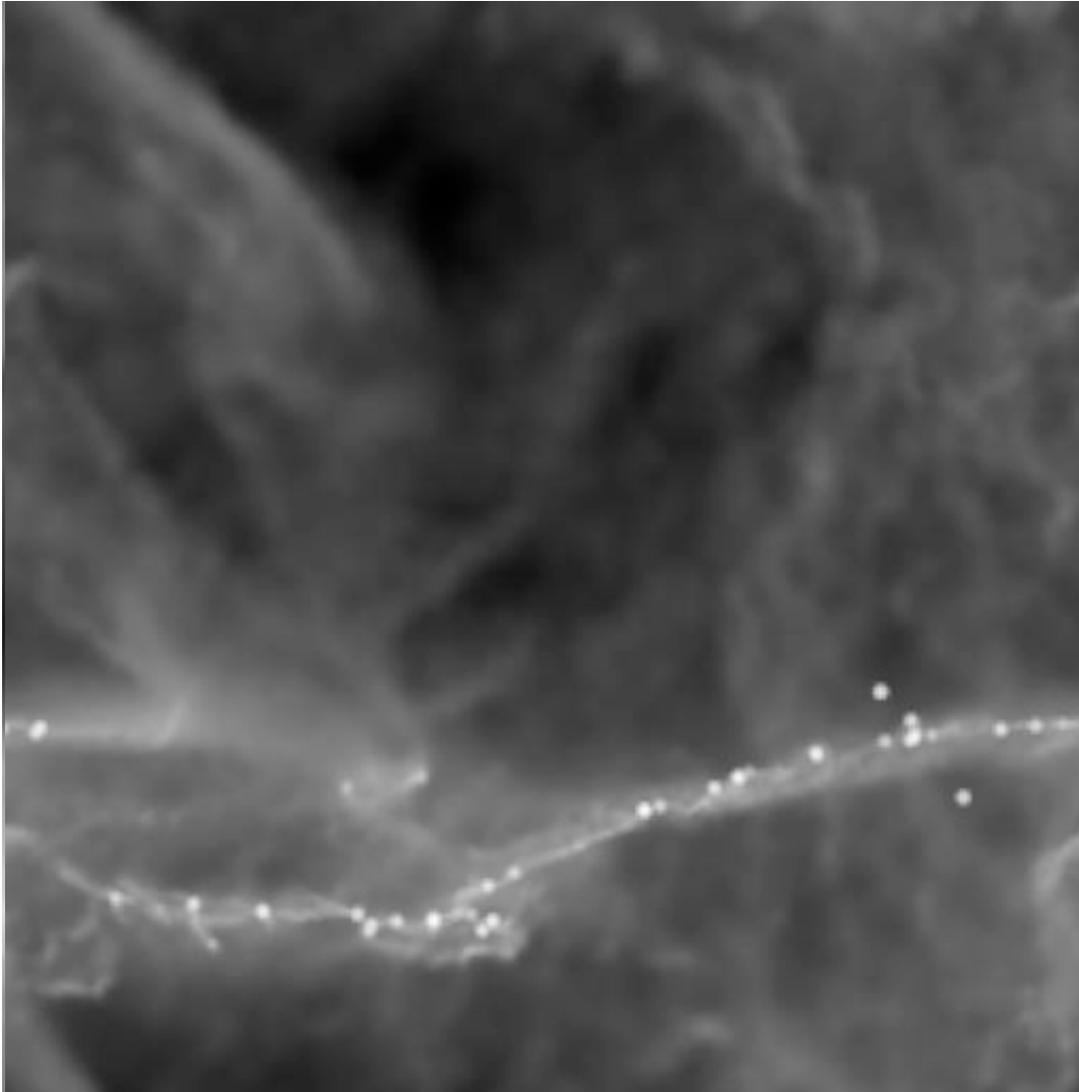


# Taurus SF cloud

Star-  
forming  
filaments in  
the *Taurus*  
molecular  
cloud

(from Hartmann 2002, ApJ)

# Gravoturbulent fragmentation



## Gravoturbulent fragmentation in molecular clouds:

- SPH model with  $1.6 \times 10^6$  particles
- large-scale driven turbulence
- Mach number  $\mathcal{M} = 6$
- periodic boundaries
- physical scaling:

### “Taurus”:

- density  $n(\text{H}_2) \approx 10^2 \text{ cm}^{-3}$ :
- $L = 6 \text{ pc}$ ,  $M = 5000 M_\odot$

# What can we learn from that?

- *global properties* (statistical properties)
  - SF efficiency
  - SF time scale
  - IMF
  - description of self-gravitating turbulent systems (pdf's,  $\Delta$ -var.)
  - **chemical mixing properties**
- *local properties* (properties of individual objects)
  - properties of individual clumps (e.g. shape, radial profile)
  - accretion history of individual protostars ( $dM/dt$  vs.  $t$ ,  $j$  vs.  $t$ )
  - binary (proto)stars (eccentricity, mass ratio, etc.)
  - SED's of individual protostars
  - dynamic PMS tracks:  $T_{\text{bol}}-L_{\text{bol}}$  evolution

# Turbulent diffusion I

- Observations of young star clusters exhibit an enormous degree of chemical homogeneity (e.g. in the Pleiades: Wilden et al. 2002)
- Star-forming gas must be well mixed.
- How does this constrain models of interstellar turbulence?
- → Study mixing in supersonic compressible turbulence.....

# Turbulent diffusion II

- Method:

- second central moment of displacement:

$$\xi_{\vec{r}}^2(t - t') = \left\langle [\vec{r}_i(t) - \vec{r}_i(t')]^2 \right\rangle_i$$

- classical diffusion equation:

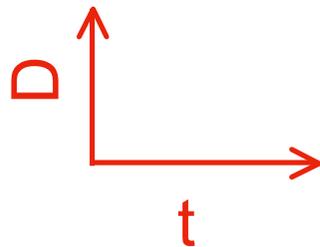
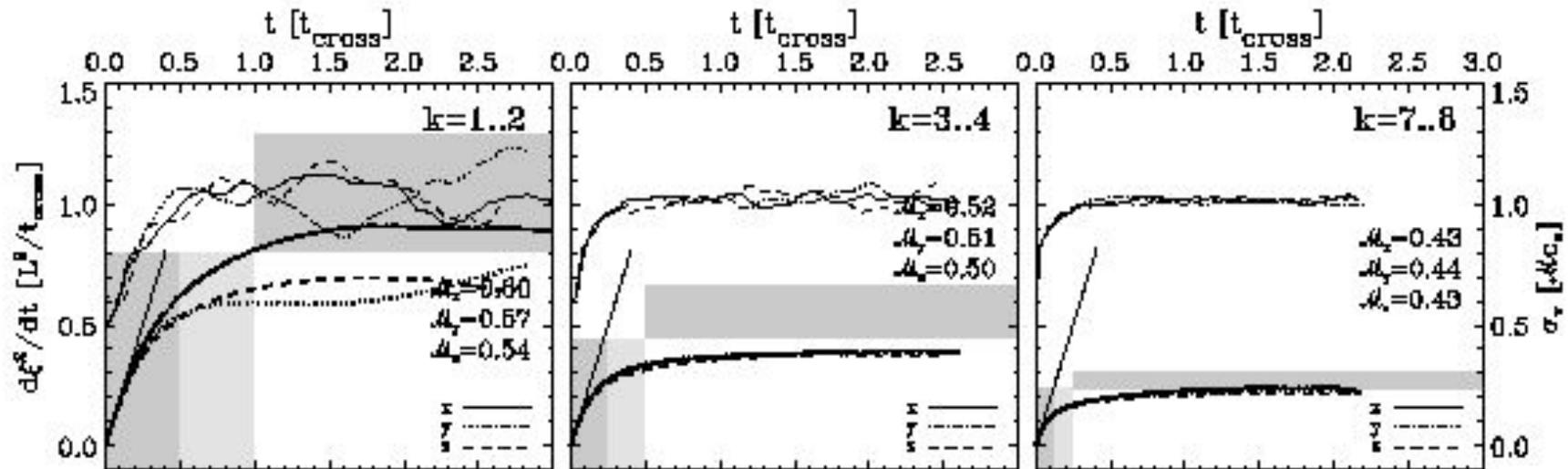
$$\frac{dn}{dt} = D \vec{\nabla}^2 n$$

- relation between  $D$  and  $\xi$ :

$$D(t - t') = \frac{d\xi_{\vec{r}}^2(t - t')}{dt} = 2 \left\langle \vec{v}_i(t - t') \cdot \vec{r}_i(t - t') \right\rangle_i$$

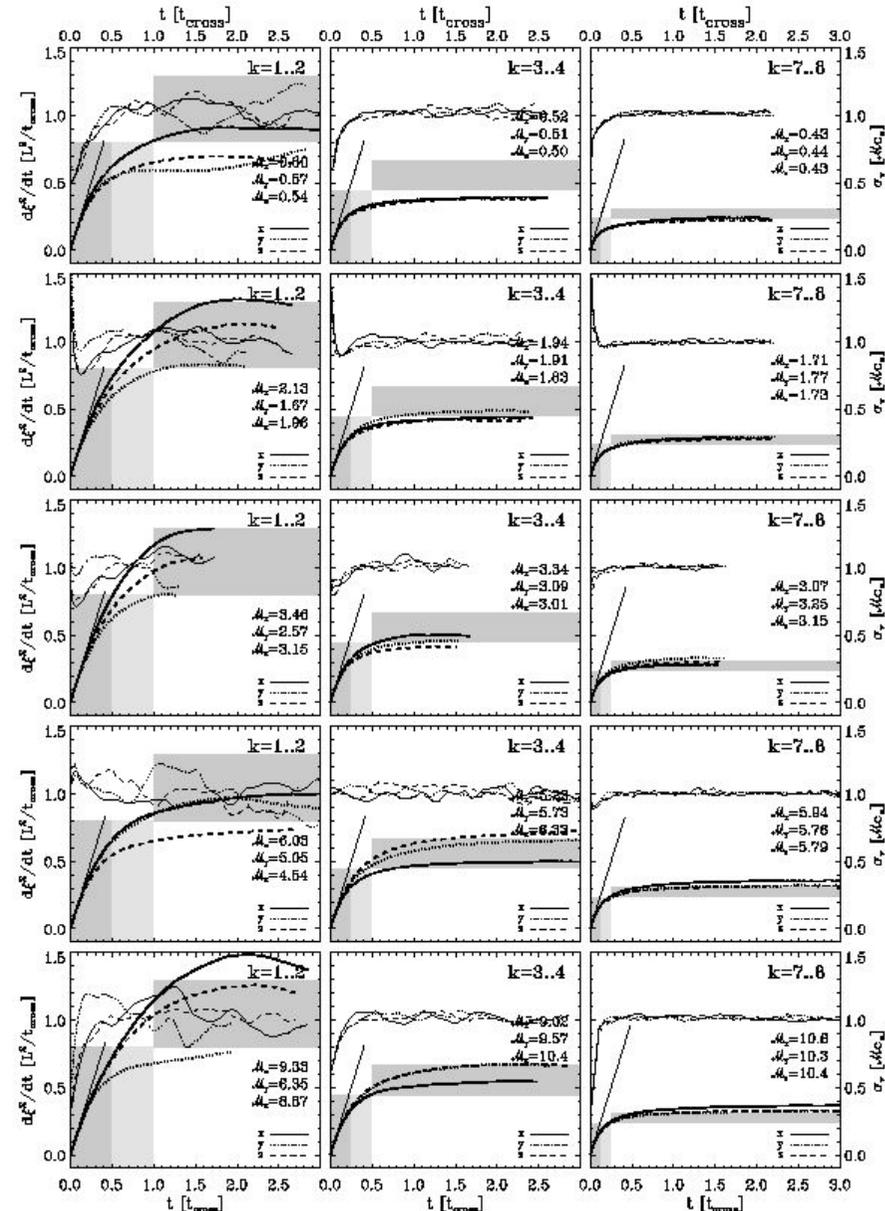
# Turbulent diffusion III

- Time evolution of diffusion coefficient  
(mean motion corrected).



# Turbulent diffusion IV

- Mean-motion corrected diffusion
- Simple mixing-length approach works!
  - $D(t) \approx v_{\text{rms}}^2 t \quad t < \tau$
  - $D(t) \approx v_{\text{rms}}^2 \tau = v_{\text{rms}} \ell \quad t > \tau$
- With  $v_{\text{rms}}$  = rms velocity and  $\ell = L/k =$  shock sep.

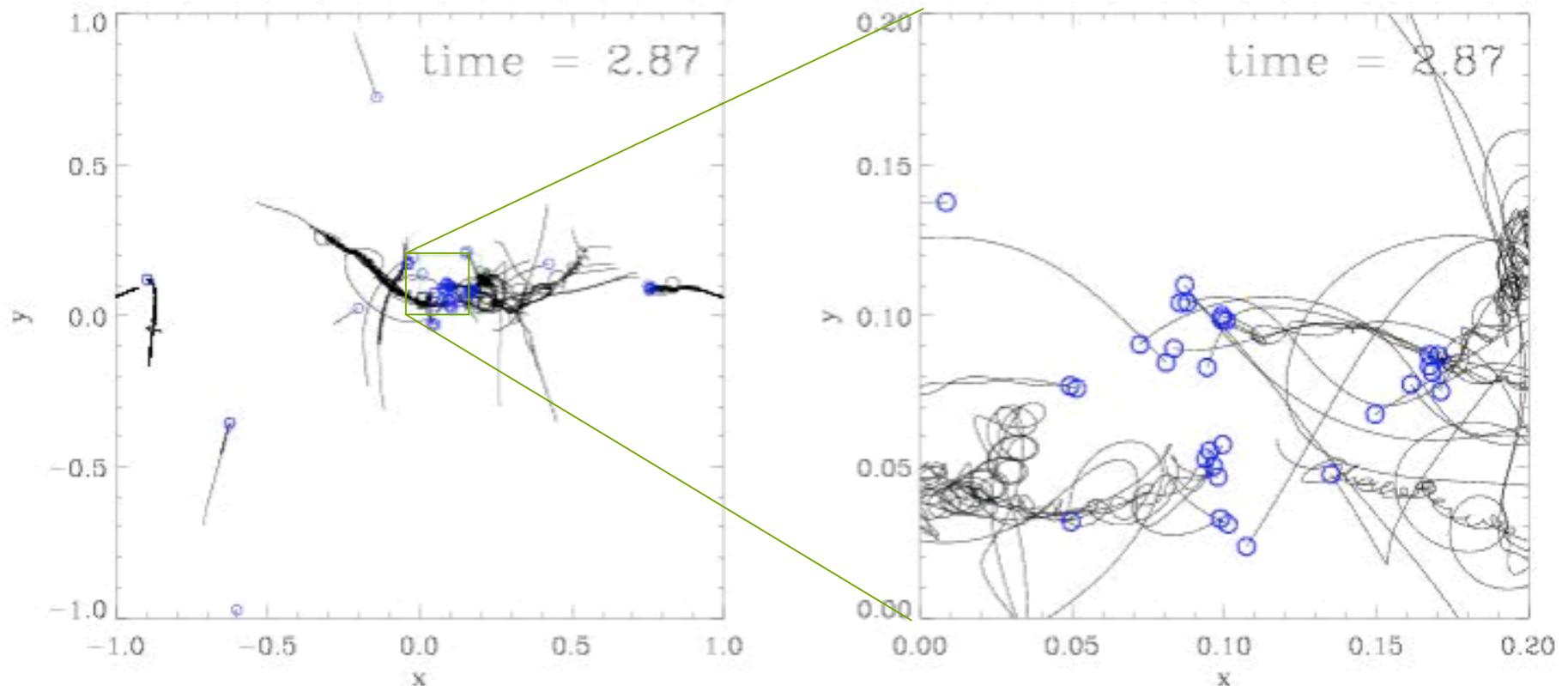


# What can we learn from that?

- *global properties* (statistical properties)
  - SF efficiency and timescale
  - stellar mass function -- IMF
  - dynamics of young star clusters
  - description of self-gravitating turbulent systems (pdf's,  $\Delta$ -var.)
  - chemical mixing properties
- *local properties* (properties of individual objects)
  - properties of individual clumps (e.g. shape, radial profile)
  - accretion history of individual protostars ( $dM/dt$  vs.  $t$ ,  $j$  vs.  $t$ )
  - binary (proto)stars (eccentricity, mass ratio, etc.)
  - SED's of individual protostars
  - dynamic PMS tracks:  $T_{\text{bol}}-L_{\text{bol}}$  evolution

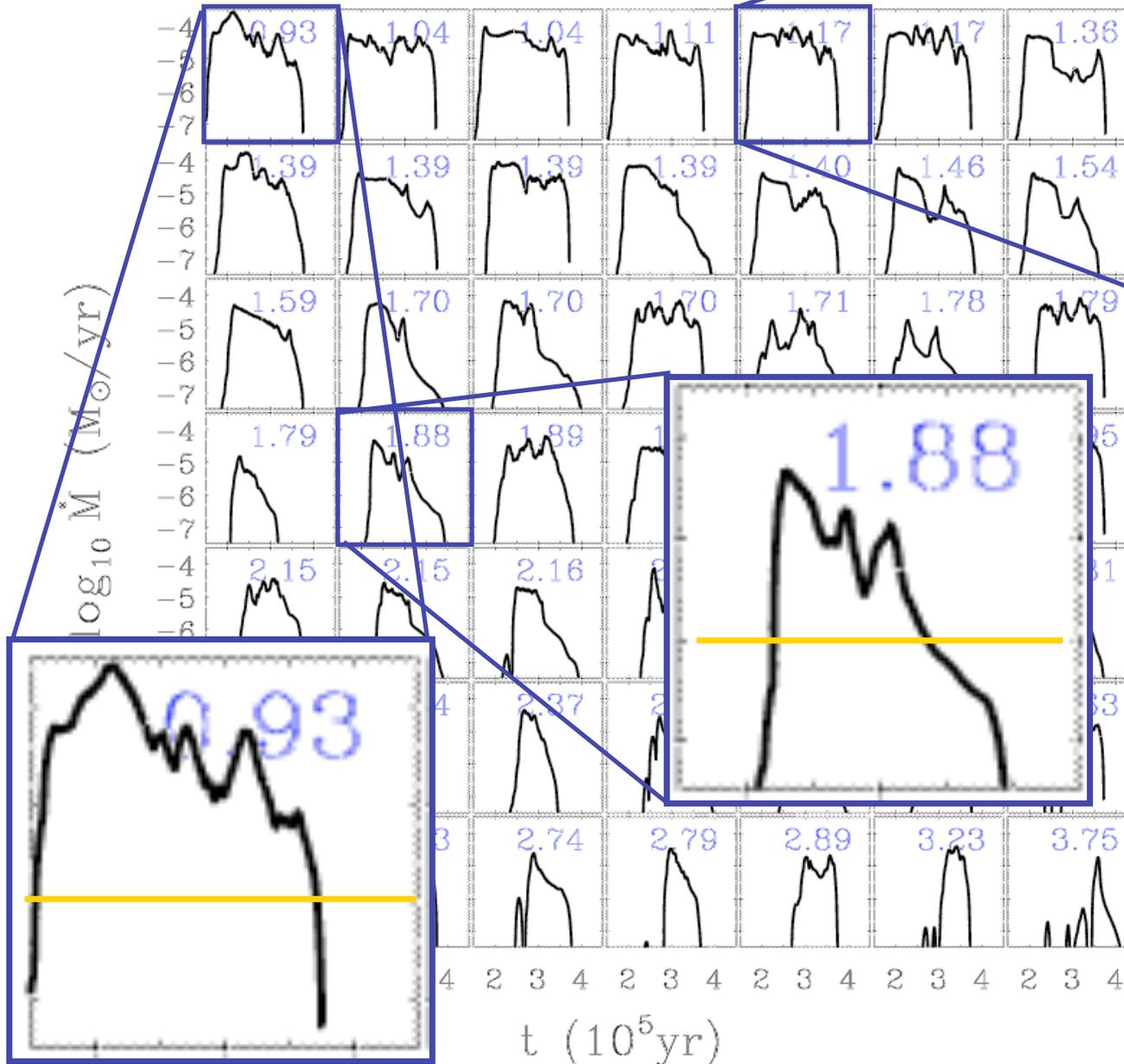
# Star cluster formation

Most stars form in clusters → *star formation = cluster formation*



Trajectories of protostars in a nascent dense cluster created by gravoturbulent fragmentation  
(from Klessen & Burkert 2000, ApJS, 128, 287)

# Accretion rates in clu

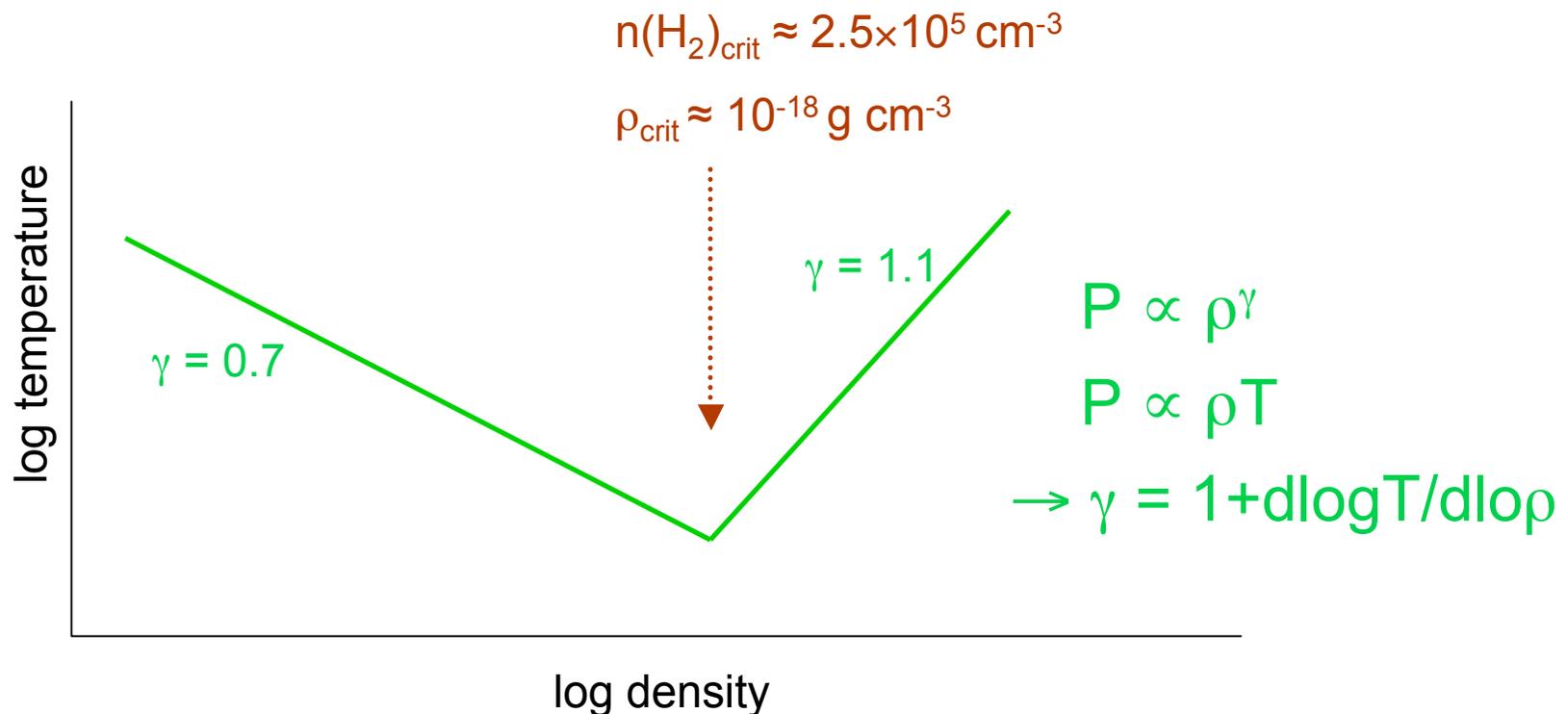


Mass accretion rates *vary with time* and are strongly *influenced* by the *cluster environment*.

(Klessen 2001, ApJ, 550, L77;  
also Schmeja & Klessen,  
2004, A&A, 419, 405)

# Influence of EOS

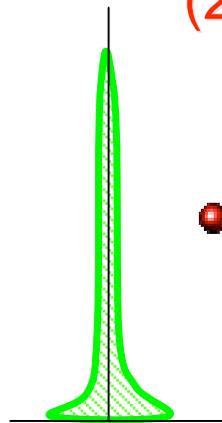
- But EOS depends on *chemical state*, on *balance* between *heating* and *cooling*



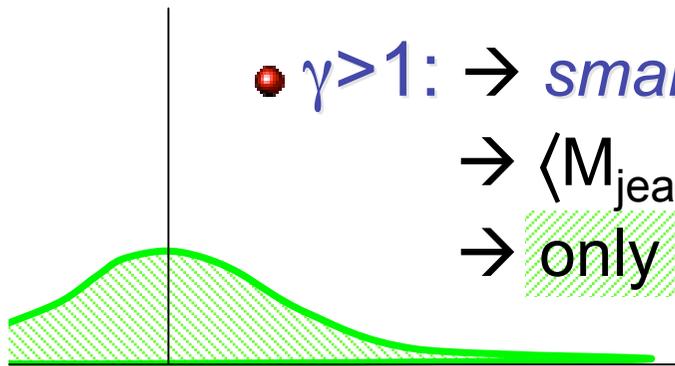
# Influence of EOS

$$(1) \quad p \propto \rho^\gamma \quad \rightarrow \quad \rho \propto p^{1/\gamma}$$

$$(2) \quad M_{\text{jeans}} \propto \gamma^{3/2} \rho^{(3\gamma-4)/2}$$



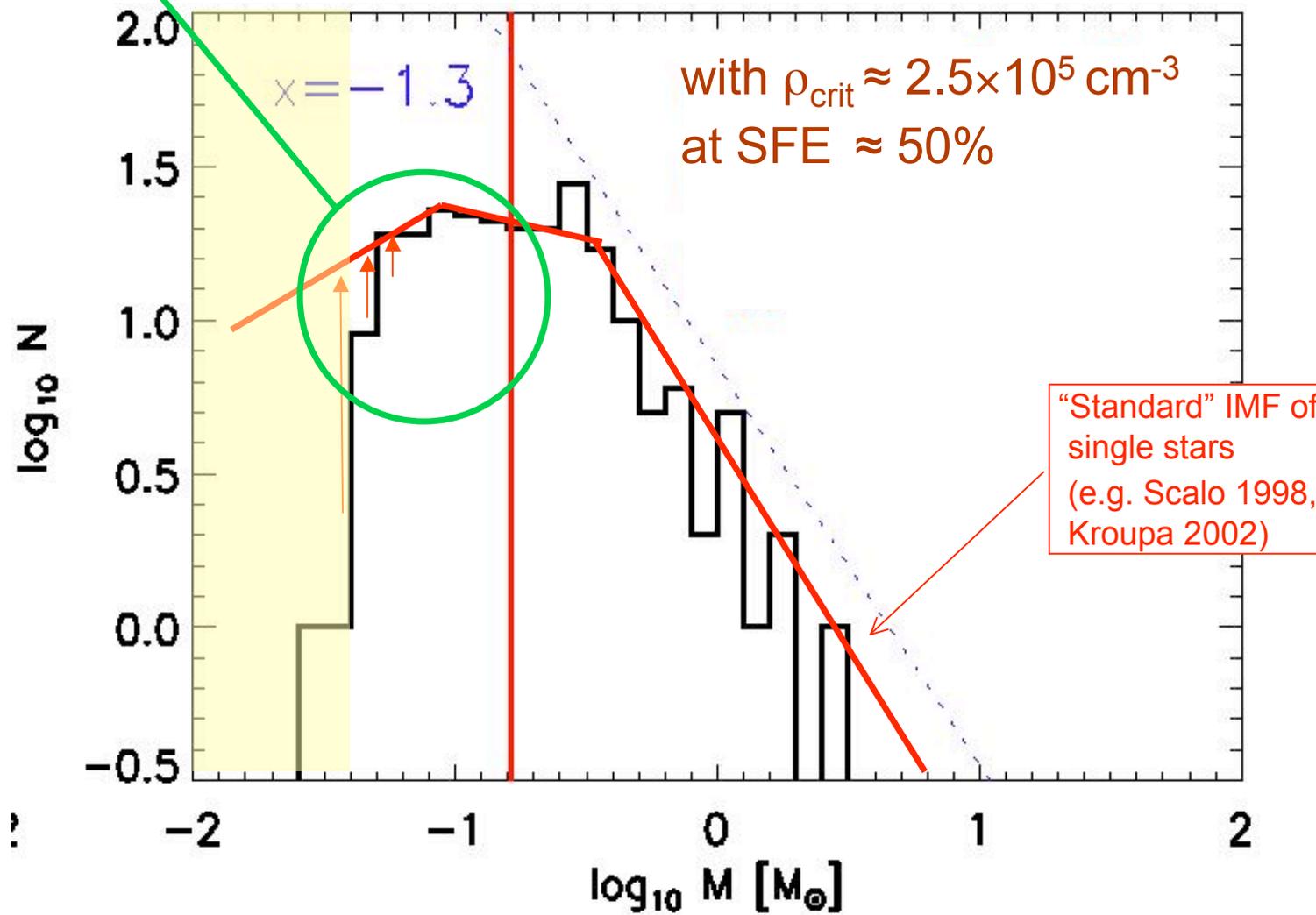
- $\gamma < 1$ :  $\rightarrow$  *large* density excursion for given pressure  
 $\rightarrow$   $\langle M_{\text{jeans}} \rangle$  becomes small  
 $\rightarrow$  number of fluctuations with  $M > M_{\text{jeans}}$  is large



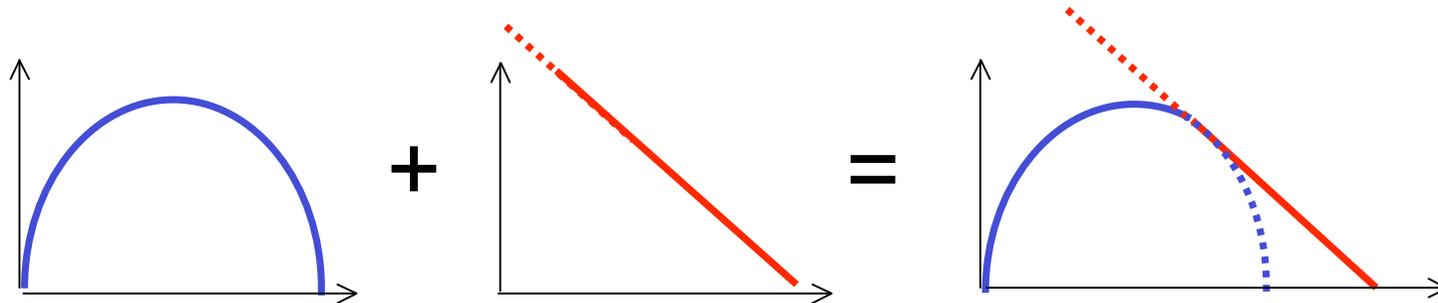
- $\gamma > 1$ :  $\rightarrow$  *small* density excursion for given pressure  
 $\rightarrow$   $\langle M_{\text{jeans}} \rangle$  is large  
 $\rightarrow$  only few and massive clumps exceed  $M_{\text{jeans}}$

# Mass spectrum

sufficient # of brown dwarfs



# Plausibility argument for shape



- Supersonic turbulence is scale free process

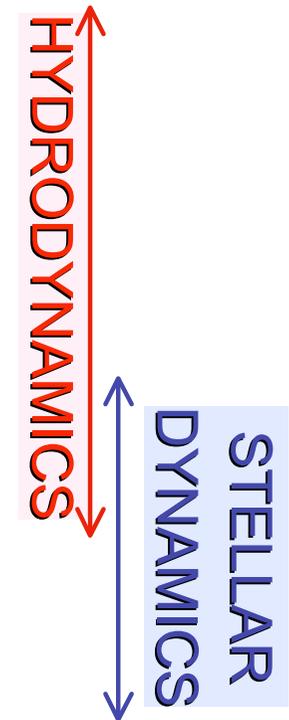
→ *POWER LAW BEHAVIOR*

- *But also:* turbulence and fragmentation are highly stochastic processes → central limit theorem

→ *GAUSSIAN DISTRIBUTION*

# IMF: Summary

- To get the stellar mass function (IMF) we need to:
  - describe **supersonic turbulence** (LES)
  - include **self-gravity**
  - model **thermodynamic balance** of the gas (heating, cooling, time-dependent chemistry, EOS)
  - follow formation of **compact collapsed cores** (transition from hydro to stellar dynamics)
  - treat **stellar dynamical processes** (protostellar collisions, ejection by close encounters)



# NUMERICS

# Goal

- We want to understand the formation of star clusters in turbulent interstellar gas clouds.

--> We want to describe the transition from a hydrodynamic system (the self-gravitating gas cloud) to one that is dominated by (collisional) stellar dynamics (the final star cluster).

- How can we do that?

# Numerical approach I

- Problem of star formation is very complex. It involves many scales ( $10^7$  in length, and  $10^{20}$  in density) and many physical processes → NO analytic solution  
→ NUMERICAL APPROACH
- BUT, we need to...
  - solve the MHD equations in 3 dimensions
  - solve Poisson's equation (self-gravity)
  - follow the full turbulent cascade (in the ISM + in stellar interior)
  - include heating and cooling processes (EOS)
  - treat radiation transfer
  - describe energy production by nuclear burning processes

# Numerical approach II

- Simplify!  
Divide problem into little bits and pieces.....
- **GRAVOTURBULENT CLOUD FRAGMENTATION**
- We try to...
  - solve the HD equations in 3 dimensions
  - solve Poisson's equation (self-gravity)
  - include a (humble) approach to supersonic turbulence
  - describe perfect gas (with polytropic EOS)
  - follow collapse: include "sink particles"  
(this will "handle" our subgrid-scale physics)

# Intermezzo: HD & SPH

- derivation of equations of hydrodynamics
  - Boltzmann equation for 1D distribution function:

$$\frac{df}{dt} \equiv \frac{\partial f}{\partial t} + \dot{\vec{q}} \cdot \vec{\nabla}_{\vec{q}} f_{\vec{p}} + \dot{\vec{p}} \cdot \vec{\nabla}_{\vec{p}} f$$

- moments of distribution function:  
density  $\rho$ , momentum  $\vec{p}$ , energy  $\varepsilon$
- SPH: smoothed particle hydrodynamics
  - particle-based scheme to solve eqn.'s of hydrodynamics
  - thermodynamic behavior --> equation of state (EOS)

# Hydrodynamics

- gases and fluids are *large* ensembles of interacting particles
- $\longrightarrow$  state of system is described by location in  $6N$  dimensional phase space  $f^{(N)}(\vec{q}_1 \dots \vec{q}_N, \vec{p}_1 \dots \vec{p}_N) d\vec{q}_1 \dots d\vec{q}_N d\vec{p}_1 \dots d\vec{p}_N$
- time evolution governed by 'equation of motion' for  $6N$ -dim probability distribution function  $f^{(N)}$
- $f^{(N)} \rightarrow f^{(n)}$  by integrating over all but  $n$  coordinates  $\longrightarrow$  BBGKY hierarchy of equations of motion (after Born, Bogoliubov, Green, Kirkwood and Yvon)
- physical observables are typically associated with 1- or 2-body probability density  $f^{(1)}$  or  $f^{(2)}$
- at lowest level of hierarchy: 1-body distribution function describes the probability of finding a particle at time  $t$  in the volume element  $d\vec{q}$  at  $\vec{q}$  with momenta in the range  $d\vec{p}$  at  $\vec{p}$ .
- **Boltzmann equation** – equation of motion for  $f^{(1)}$

$$\begin{aligned} \frac{df}{dt} &\equiv \frac{\partial f}{\partial t} + \dot{\vec{q}} \cdot \vec{\nabla}_{\vec{q}} f + \dot{\vec{p}} \cdot \vec{\nabla}_{\vec{p}} f \\ &= \frac{\partial f}{\partial t} + \vec{v} \cdot \vec{\nabla}_{\vec{q}} f + \vec{F} \cdot \vec{\nabla}_{\vec{p}} f = f_c \end{aligned}$$

- Boltzmann equation

$$\begin{aligned}\frac{df}{dt} &\equiv \frac{\partial f}{\partial t} + \dot{\vec{q}} \cdot \vec{\nabla}_{\vec{q}} f + \dot{\vec{p}} \cdot \vec{\nabla}_{\vec{p}} f \\ &= \frac{\partial f}{\partial t} + \vec{v} \cdot \vec{\nabla}_{\vec{q}} f + \vec{F} \cdot \vec{\nabla}_{\vec{p}} f = f_c\end{aligned}$$

→ first line: transformation from comoving to spatially fixed coordinate system.

→ second line: velocity  $\vec{v} = \dot{\vec{q}}$  and force  $\vec{F} = \dot{\vec{p}}$

→ all higher order terms are 'hidden' in the collision term  $f_c$

- observable quantities are typically (velocity) moments of the Boltzmann equation, e.g.

→ density:

$$\rho = \int m f(\vec{q}, \vec{p}, t) d\vec{p}$$

→ momentum:

$$\rho \vec{v} = \int m \vec{v} f(\vec{q}, \vec{p}, t) d\vec{p}$$

→ kinetic energy density:

$$\rho \vec{v}^2 = \int m \vec{v}^2 f(\vec{q}, \vec{p}, t) d\vec{p}$$

- in general: the  $i$ -th velocity moment  $\langle \xi_i \rangle$  (of  $\xi_i = m\vec{v}^i$ ) is

$$\langle \xi_i \rangle = \frac{1}{n} \int \xi_i f(\vec{q}, \vec{p}, t) d\vec{p}$$

with the mean particle number density  $n$  defined as

$$n = \int f(\vec{q}, \vec{p}, t) d\vec{p}$$

- the equation of motion for  $\langle \xi_i \rangle$  is

$$\int \xi_i \left\{ \frac{\partial f}{\partial t} + \vec{v} \cdot \vec{\nabla}_q f + \vec{F} \cdot \vec{\nabla}_p f \right\} d\vec{p} = \int \xi_i \{f_c\} d\vec{p},$$

which after some complicated rearrangement becomes

$$\frac{\partial}{\partial t} n \langle \xi_i \rangle + \vec{\nabla}_q (n \langle \xi_i \vec{v} \rangle) + n \vec{F} \langle \vec{\nabla}_p \xi_i \rangle = \int \xi_i f_c d\vec{p}$$

(Maxwell-Boltzmann transport equation for  $\langle \xi_i \rangle$ )

- if the RHS is zero, then  $\xi_i$  is a conserved quantity. This is only the case for first three moments, **mass**  $\xi_0 = m$ , **momentum**  $\vec{\xi}_1 = m\vec{v}$ , and **kinetic energy**  $\xi_2 = m\vec{v}^2/2$ .
- MB equations build a hierarically nested set of equations, as  $\langle \xi_i \rangle$  depends on  $\langle \xi_{i+1} \rangle$  via  $\vec{\nabla}_q (n \langle \xi_i \vec{v} \rangle)$  and because the collision term cannot be reduced to depend on  $\xi_i$  only.
  - need for a closure equation
  - in hydrodynamics this is typically the equation of state.

# assumptions

- **continuum limit:**

- distribution function  $f$  must be a 'smoothly' varying function on the scales of interest → local average possible
- stated differently: the averaging scale (i.e. scale of interest) must be larger than the mean free path of individual particles
- stated differently: microscopic behavior of particles can be neglected
- concept of fluid element must be meaningful

- **only 'short range forces':**

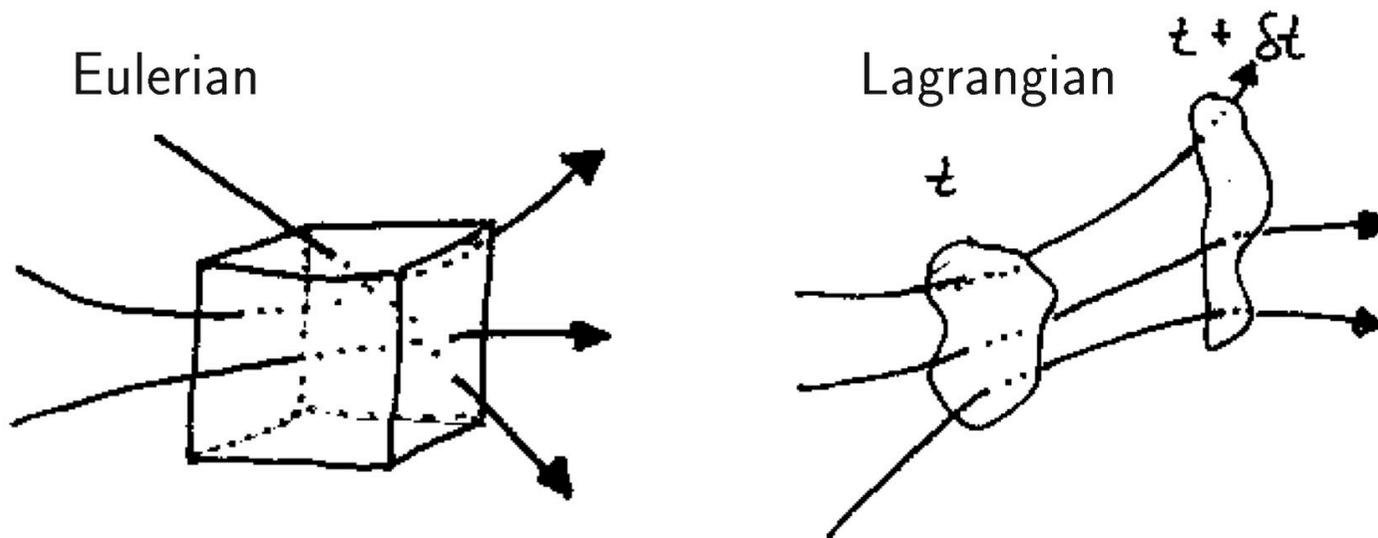
- forces between particles are short range or saturate → collective effects can be neglected
- stated differently: correlation length of particles in the system is finite (and smaller than the scales of interest)

# limitations

- shocks (scales of interest become smaller than mean free path)
- phase transitions (correlation length may become infinite)
- description of self-gravitating systems
- description of fully fractal systems

# the equations of hydrodynamics

- hydrodynamics  $\equiv$  book keeping problem  
One must keep track of the 'change' of a fluid element due to various physical processes acting on it. How do its 'properties' evolve under the influence of compression, heat sources, cooling, etc.?
- Eulerian vs. Lagrangian point of view



consider spatially fixed volume element

following motion of fluid element

- hydrodynamic equations = set of equations for the five conserved quantities ( $\rho, \rho\vec{v}, \rho\vec{v}^2/2$ ) plus closure equation (plus transport equations for 'external' forces if present, e.g. gravity, magnetic field, heat sources, etc.)

- equations of hydrodynamics

$$\frac{d\rho}{dt} = \frac{\partial\rho}{\partial t} + \vec{v} \cdot \vec{\nabla}\rho = -\rho\vec{\nabla} \cdot \vec{v} \quad (\text{continuity equation})$$

$$\frac{d\vec{v}}{dt} = \frac{\partial\vec{v}}{\partial t} + (\vec{v} \cdot \vec{\nabla})\vec{v} = -\frac{1}{\rho}\vec{\nabla}p - \vec{\nabla}\phi + \eta\vec{\nabla}^2\vec{v} + \left(\zeta + \frac{\eta}{3}\right)\vec{\nabla}(\vec{\nabla} \cdot \vec{v})$$

(Navier-Stokes equation)

$$\frac{d\epsilon}{dt} = \frac{\partial\epsilon}{\partial t} + \vec{v} \cdot \vec{\nabla}\epsilon = T\frac{ds}{dt} - \frac{p}{\rho}\vec{\nabla} \cdot \vec{v} \quad (\text{energy equation})$$

$$\vec{\nabla}^2\phi = 4\pi G\rho \quad (\text{Poisson's equation})$$

$$p = \mathcal{R}\rho T \quad (\text{equation of state})$$

$$\vec{F}_B = -\vec{\nabla} \frac{\vec{B}^2}{8\pi} + \frac{1}{4\pi} (\vec{B} \cdot \vec{\nabla}) \vec{B} \quad (\text{magnetic force})$$

$$\frac{\partial \vec{B}}{\partial t} = \vec{\nabla} \times (\vec{v} \times \vec{B}) \quad (\text{Lorentz equation})$$

$\rho$  = density,  $\vec{v}$  = velocity,  $p$  = pressure,  $\phi$  = gravitational potential,  $\zeta$  and  $\eta$  viscosity coefficients,  $\epsilon = \rho \vec{v}^2 / 2$  = kinetic energy density,  $T$  = temperature,  $s$  = entropy,  $\mathcal{R}$  = gas constant,  $\vec{B}$  = magnetic field (cgs units)

- mass transport – continuity equation

$$\frac{d\rho}{dt} = \frac{\partial\rho}{\partial t} + \vec{v} \cdot \vec{\nabla}\rho = -\rho\vec{\nabla} \cdot \vec{v}$$

(conservation of mass)

- transport equation for momentum – Navier Stokes equation

$$\frac{d\vec{v}}{dt} = \frac{\partial \vec{v}}{\partial t} + (\vec{v} \cdot \vec{\nabla}) \vec{v} = -\frac{1}{\rho} \vec{\nabla} p - \vec{\nabla} \phi + \eta \vec{\nabla}^2 \vec{v} + \left( \zeta + \frac{\eta}{3} \right) \vec{\nabla} (\vec{\nabla} \cdot \vec{v})$$

momentum change due to

→ pressure gradients:  $(-\rho^{-1} \vec{\nabla} p)$

→ (self) gravity:  $-\vec{\nabla} \phi$

→ viscous forces (internal friction, contains  $\text{div}(\partial v_i / \partial x_j)$  terms):  
 $\eta \vec{\nabla}^2 \vec{v} + \left( \zeta + \frac{\eta}{3} \right) \vec{\nabla} (\vec{\nabla} \cdot \vec{v})$

(conservation of momentum, general form of momentum transport:  $\partial_t(\rho v_i) = -\partial_j \Pi_{ij}$ )

- transport equation for internal energy

$$\frac{d\epsilon}{dt} = \frac{\partial\epsilon}{\partial t} + \vec{v} \cdot \vec{\nabla}\epsilon = T \frac{ds}{dt} - \frac{p}{\rho} \vec{\nabla} \cdot \vec{v}$$

- follows from the thermodynamic relation  $d\epsilon = T ds - p dV = T ds + p/\rho^2 d\rho$  which describes changes in  $\epsilon$  due to entropy changes and to volume changes (compression, expansion)
- for adiabatic gas the first term vanishes ( $s = \text{constant}$ )
- heating sources, cooling processes can be incorporated in  $ds$  (conservation of energy)

- closure equation – equation of state
  - general form of equation of state  $p = p(T, \rho, \dots)$
  - ideal gas:  $p = \mathcal{R}\rho T$
  - special case – isothermal gas:  $p = c_s^2 T$  (as  $\mathcal{R}T = c_s^2$ )

Note:

- in reality, computing the EOS is VERY complex!
- depends on detailed *balance* between *heating* and *cooling*
- these depend on *chemical composition* (which atomic and molecular species, dust)
- and on the ability to radiate away „cooling lines“ and black body radiation
  - > problem of *radiation transfer* (see, e.g., IPAM III)

## In general:

- the „standard way“ of solving the equations of (magneto) hydrodynamics is using finite differences on a grid
- alternative use particle-based scheme: *SPH*
- see IPAM workshop I

SPH

# concept of SPH

- 'invented' independently by Lucy (1977) and Gingold & Monaghan (1977)
- originally proposed as Monte Carlo approach to calculate the time evolution of gaseous systems
- more intuitively understood as interpolation scheme:

The fluid is represented by an ensemble of particles  $i$ , each carrying mass  $m_i$ , momentum  $m_i\vec{v}_i$ , and hydrodynamic properties (like pressure  $p_i$ , temperature  $T_i$ , internal energy  $\epsilon_i$ , entropy  $s_i$ , etc.). The time evolution is governed by the equation of motion plus additional equations to modify the hydrodynamic properties of the particles. Hydrodynamic observables are obtained by a local averaging process.

# properties of local averaging processes

- local averages  $\langle f(\vec{r}) \rangle$  for any quantity  $f(\vec{r})$  can be obtained by convolution with an appropriate smoothing function  $W(\vec{r}, \vec{h})$ :

$$\langle f(\vec{r}) \rangle \equiv \int f(\vec{r}') W(\vec{r} - \vec{r}', \vec{h}) d^3 r' .$$

the function  $W(\vec{r}, \vec{h})$  is called smoothing kernel

- the kernel must satisfy the following two conditions:

$$\int W(\vec{r}, \vec{h}) d^3 r = 1 \quad \text{and} \quad \langle f(\vec{r}) \rangle \longrightarrow f(\vec{r}) \quad \text{for} \quad \vec{h} \rightarrow 0$$

the kernel  $W$  therefore follows the same definitions as Dirac's delta function  $\delta(\vec{r})$ :  $\lim_{h \rightarrow 0} W(\vec{r}, h) = \delta(\vec{r})$ .

- most SPH implementations use spherical kernel functions

$$W(\vec{r}, \vec{h}) \equiv W(r, h) \quad \text{with} \quad r = |\vec{r}| \quad \text{and} \quad h = |\vec{h}| .$$

(one could also use triaxial kernels, e.g. Martel et al. 1995)

# properties of local averaging processes

- as the kernel function  $W$  can be seen as approximation to the  $\delta$ -function for small but finite  $h$  we can expand the averaged function  $\langle f(\vec{r}) \rangle$  into a Taylor series for  $h$  to obtain an estimate for  $f(\vec{r})$ ; if  $W$  is an even function, the first order term vanishes and the errors are second order in  $h$

$$\langle f(\vec{r}) \rangle = f(\vec{r}) + \mathcal{O}(h^2)$$

this holds for functions  $f$  that are smooth and do not exhibit steep gradients over the size of  $W$  ( $\rightarrow$  problems in shocks).

(more specifically the expansion is  $\langle f(\vec{r}) \rangle = f(\vec{r}) + \kappa h^2 \vec{\nabla}^2 f(\vec{r}) + \mathcal{O}(h^3)$ )

# properties of local averaging processes

- within its intrinsic accuracy, the smoothing process therefore is a linear function with respect to summation and multiplication:

$$\langle f(\vec{r}) + g(\vec{r}) \rangle = \langle f(\vec{r}) \rangle + \langle g(\vec{r}) \rangle$$

$$\langle f(\vec{r}) \cdot g(\vec{r}) \rangle = \langle f(\vec{r}) \rangle \cdot \langle g(\vec{r}) \rangle$$

(one follows from the linearity of integration with respect to summation, and two is true to  $\mathcal{O}(h^2)$ )

- derivatives can be ‘drawn into’ the averaging process:

$$\frac{d}{dt} \langle f(\vec{r}) \rangle = \left\langle \frac{d}{dt} f(\vec{r}) \right\rangle$$

$$\vec{\nabla} \langle f(\vec{r}) \rangle = \langle \vec{\nabla} f(\vec{r}) \rangle$$

Furthermore, the spatial derivative of  $f$  can be transformed into a spatial derivative of  $W$  (no need for finite differences or grid):

$$\vec{\nabla} \langle f(\vec{r}) \rangle = \langle \vec{\nabla} f(\vec{r}) \rangle = \int f(\vec{r}') \vec{\nabla} W(|\vec{r} - \vec{r}'|, h) d^3 r' .$$

(shown by integrating by parts and assuming that the surface term vanishes; if the solution space is extended far enough, either the function  $f$  itself or the kernel approach zero)

# properties of local averaging processes

- basic concept of SPH is a **particle representation** of the fluid  
→ *integration* transforms into *summation* over discrete set of particles; example density  $\rho$ :

$$\langle \rho(\vec{r}_i) \rangle = \sum_j m_j W(|\vec{r}_i - \vec{r}_j|, h) .$$

in this picture, the mass of each particle is smeared out over its kernel region; the density at each location is obtained by summing over the contributions of the various particles → ***smoothed particle hydrodynamics!***

# the kernel function

- different functions meet the requirement  $\int W(|\vec{r}|, h) d^3r = 1$   
and  $\lim_{h \rightarrow 0} \int W(|\vec{r} - \vec{r}'|, h) f(\vec{r}') d^3r' = f(\vec{r})$ :

→ Gaussian kernel:

$$W(r, h) = \frac{1}{\pi^{3/2} h^3} \exp\left(-\frac{r^2}{h^2}\right)$$

- *pro*: mathematically sound
- *pro*: derivatives exist to all orders and are smooth
- *contra*: all particles contribute to a location

→ spline functions with compact support

# the kernel function

- different functions meet the requirement  $\int W(|\vec{r}|, h) d^3r = 1$   
and  $\lim_{h \rightarrow 0} \int W(|\vec{r} - \vec{r}'|, h) f(\vec{r}') d^3r' = f(\vec{r})$ :

→ the standard kernel: **cubic spline**

with  $\xi = r/h$  it is defined as

$$W(r, h) \equiv \frac{1}{\pi h^3} \begin{cases} 1 - \frac{3}{2}\xi^2 + \frac{3}{4}\xi^3, & \text{for } 0 \leq \xi \leq 1; \\ \frac{1}{4}(2 - \xi)^3, & \text{for } 1 \leq \xi \leq 2; \\ 0, & \text{otherwise.} \end{cases}$$

- *pro*: compact support → all interactions are zero for  $r > 2h$  → number of particles involved in the average remains small (typically between 30 and 80)
- *pro*: second derivative is continuous
- *pro*: dominant error term is second order in  $h$

# the fluid equations in SPH

- there is an infinite number of possible SPH implementations of the hydrodynamic equations!
- some notation:  $h_{ij} = (h_i + h_j)/2$ ,  $\vec{r}_{ij} = \vec{r}_i - \vec{r}_j$ ,  $\vec{v}_{ij} = \vec{v}_i - \vec{v}_j$ , and  $\vec{\nabla}_i$  is the gradient with respect to the coordinates of particle  $i$ ; all measurements are taken at particle positions (e.g.  $\rho_i = \rho(\vec{r}_i)$ )
- *general form of SPH equations:*

$$\langle f_i \rangle = \sum_{j=1}^{N_i} \frac{m_j}{\rho_j} f_j W(r_{ij}, h_{ij})$$

# the fluid equations in SPH

- *density* — continuity equation (conservation of mass)

$$\rho_i = \sum_{j=1}^{N_i} m_j W(r_{ij}, h_{ij})$$

or 
$$\frac{d\rho_i}{dt} = \sum_{j=1}^{N_i} m_j \vec{v}_{ij} \cdot \vec{\nabla}_i W(r_{ij}, h_{ij})$$

(the second implementation is almost never used, see however Monaghan 1991 for an application to water waves)

## *important*

density is needed for **ALL** particles **BEFORE** computing other averaged quantities → at each timestep, SPH computations consist of **TWO** loops, first the *density* is obtained for each particle, and then in a second round, all *other* particle properties are updated.

# the fluid equations in SPH

- *pressure* is defined via the *equation of state* (for example for isothermal gas  $p_i = c_s^2 \rho_i$ )

# the fluid equations in SPH

- *velocity* — Navier Stokes equation (conservation of momentum)

$$\frac{d\vec{v}}{dt} = \frac{\partial\vec{v}}{\partial t} + (\vec{v} \cdot \vec{\nabla})\vec{v} = \sum_i \vec{F}_i = \vec{F}_{\text{pressure}} + \vec{F}_{\text{viscosity}} + \vec{F}_{\text{gravity}}$$

rate of change of momentum of fluid element depends on sum of all forces acting on it.

# the fluid equations in SPH

- *velocity* — **Navier Stokes equation** (conservation of momentum)

→ consider for now *only* pressure contributions: Euler's equation

$$\frac{d\vec{v}}{dt} = \frac{\partial\vec{v}}{\partial t} + (\vec{v} \cdot \vec{\nabla})\vec{v} = -\frac{1}{\rho} \vec{\nabla} p = -\vec{\nabla} \left( \frac{p}{\rho} \right) - \frac{p}{\rho^2} \vec{\nabla} \rho \quad (*)$$

here, the identity  $\vec{\nabla}(p\rho^{-1}) = \rho^{-1}\vec{\nabla}p - p\rho^{-2}\vec{\nabla}\rho$  is used

→ in the SPH formalism this reads as

$$\frac{d\vec{v}_i}{dt} = - \sum_{j=1}^{N_i} m_j \left( \frac{p_i}{\rho_i^2} + \frac{p_j}{\rho_j^2} \right) \vec{\nabla}_i W(r_{ij}, h_{ij})$$

where the first term in (\*) is neglected because it leads to surface terms in the averaging procedure; it is assumed that either the pressure or the kernel becomes zero at the integration border; if this is not the case *correction terms* need to be added above.

# the fluid equations in SPH

- *velocity* — **Navier Stokes equation** (conservation of momentum)  
→ the SPH implementation of the standard artificial viscosity is

$$\vec{F}_i^{\text{visc}} = - \sum_{j=1}^{N_i} m_j \Pi_{ij} \vec{\nabla}_i W(r_{ij}, h_{ij}),$$

where the viscosity tensor  $\Pi_{ij}$  is defined by

$$\Pi_{ij} = \begin{cases} (-\alpha c_{ij} \mu_{ij} + \beta \mu_{ij}^2) / \rho_{ij} & \text{for } \vec{v}_{ij} \cdot \vec{r}_{ij} \leq 0, \\ 0 & \text{for } \vec{v}_{ij} \cdot \vec{r}_{ij} > 0, \end{cases}$$

where

$$\mu_{ij} = \frac{h \vec{v}_{ij} \cdot \vec{r}_{ij}}{\vec{r}_{ij}^2 + 0.01 h^2}.$$

with  $\vec{r}_{ij} = \vec{r}_i - \vec{r}_j$ ,  $\vec{v}_{ij} = \vec{v}_i - \vec{v}_j$ , mean density  $\rho_{ij} = (\rho_i + \rho_j)/2$ , and mean sound speed  $c_{ij} = (c_i + c_j)/2$ .

# the fluid equations in SPH

- *velocity* — **Navier Stokes equation** (conservation of momentum)
  - if self-gravity is taken into account, the gravitational force needs to be added on the RHS

$$\vec{F}_G = -\vec{\nabla}\phi_i = -G \sum_{j=1}^N \frac{m_j}{r_{ij}^2} \frac{r_{ij}}{r_{ij}}$$

note that the sum needs to be taken over *ALL* particles ←  
computationally expensive

- set together, the momentum equation is

$$\frac{d\vec{v}_i}{dt} = - \sum_{j=1}^{N_i} m_j \left( \frac{p_i}{\rho_i^2} + \frac{p_j}{\rho_j^2} + \Pi_{ij} \right) \vec{\nabla}_i W(r_{ij}, h_{ij}) - \nabla \phi_i$$

# the fluid equations in SPH

- *energy equation* (conservation of momentum)

→ recall the hydrodynamic energy equation:

$$\frac{d\epsilon}{dt} = \frac{\partial\epsilon}{\partial t} + \vec{v} \cdot \vec{\nabla}\epsilon = \frac{ds}{dt} - \frac{p}{\rho} \vec{\nabla} \cdot \vec{v}$$

→ for *adiabatic* systems ( $c = \text{const}$ ) the SPH form follows as

$$\frac{d\epsilon_i}{dt} = \frac{p_i}{\rho_i^2} \sum_{j=1}^{N_i} m_j \vec{v}_{ij} \cdot \vec{\nabla}_i W(r_{ij}, h_{ij}),$$

(note that the alternative form

$$\frac{d\epsilon_i}{dt} = \frac{1}{2} \sum_{j=1}^{N_i} m_j \left( \frac{p_i}{\rho_i^2} + \frac{p_j}{\rho_j^2} \right) \vec{v}_{ij} \cdot \vec{\nabla}_i W(r_{ij}, h_{ij})$$

can lead to unphysical solutions, like negative internal energy)

# the fluid equations in SPH

- *energy equation* (conservation of momentum)

→ *dissipation* due to (artificial) viscosity leads to a term

$$\frac{d\epsilon_i}{dt} = \frac{1}{2} \sum_{j=1}^{N_i} m_j \Pi_{ij} \vec{v}_{ij} \cdot \vec{\nabla}_i W(r_{ij}, h_{ij})$$

→ the presence of *heating* sources or *cooling* processes can be incorporated into a function  $\Gamma_i$ .

→ altogether:

$$\frac{d\epsilon_i}{dt} = \frac{p_i}{\rho_i^2} \sum_{j=1}^{N_i} m_j \vec{v}_{ij} \cdot \vec{\nabla}_i W_{ij} + \frac{1}{2} \sum_{j=1}^{N_i} m_j \Pi_{ij} \vec{v}_{ij} \cdot \vec{\nabla}_i W_{ij} + \Gamma_i$$

can lead to unphysical solutions, like negative internal energy)

# fully conservative formulation using Lagrange multipliers

- the Lagrangian for compressible flows which are generated by the thermal energy  $\epsilon(\rho, s)$  acts as effective potential is

$$\mathcal{L} = \int \rho \left\{ \frac{1}{2} v^2 - u(\rho, s) \right\} d^3r.$$

equations of motion follow with  $s = \text{const}$  from

$$\frac{d}{dt} \frac{\partial \mathcal{L}}{\partial \vec{v}} - \frac{\partial \mathcal{L}}{\partial \vec{r}} = 0$$

- after some SPH arithmetics, one can derive the following acceleration equation for particle  $i$

$$\frac{d\vec{v}_i}{dt} = - \sum_{j=1}^{N_i} m_j \left\{ \frac{1}{f_i \rho_i^2} p_i \vec{\nabla}_i W(r_{ij}, h_i) + \frac{1}{f_j \rho_j^2} p_j \vec{\nabla}_i W(r_{ij}, h_j) \right\}$$

where

$$f_i = \left[ 1 + \frac{h_i}{3\rho_i} \frac{\partial \rho_i}{\partial h_i} \right]$$

# Large-eddy simulations

- We use **LES** to model the large-scale dynamics
- Principal problem: only large scale flow properties
  - Reynolds number:  $Re = LV/\nu$  ( $Re_{nature} \gg Re_{model}$ )
  - dynamic range much smaller than true physical one
  - need **subgrid model** (in our case simple: only dissipation) more complex when processes (chemical reactions, nuclear burning, etc) on subgrid scale determine large-scale dynamics
- Also: stochasticity of the flow  $\Rightarrow$  unpredictable when and where “interesting things” happen
  - occurrence of localized collapse
  - location and strength of shock fronts
  - etc.

# LES with SPH

- For self-gravitating gases **SPH** is probably okay ...
  - fully Lagrangian (particles are free to move where needed)
  - good resolution in high-density regions (in collapse)
  - particle based --> good for transition from hydrodynamics to stellar dynamics
- BUT:
  - low resolution in low-density region
  - difficult to reach very high levels of refinement (however, particle splitting may be promising path)
  - dissipative and need for artificial viscosity
  - how to handle subgrid scales?

# Gravoturbulent SF with SPH

- Comparison between particle-based and grid-based methods: **SPH** vs. **ZEUS**

Klessen, Heitsch, Mac Low (2000)

Heitsch, Mac Low, Klessen (2001)

Ossenkopf, Klessen, Heitsch (2001)

- Both methods are complementary...

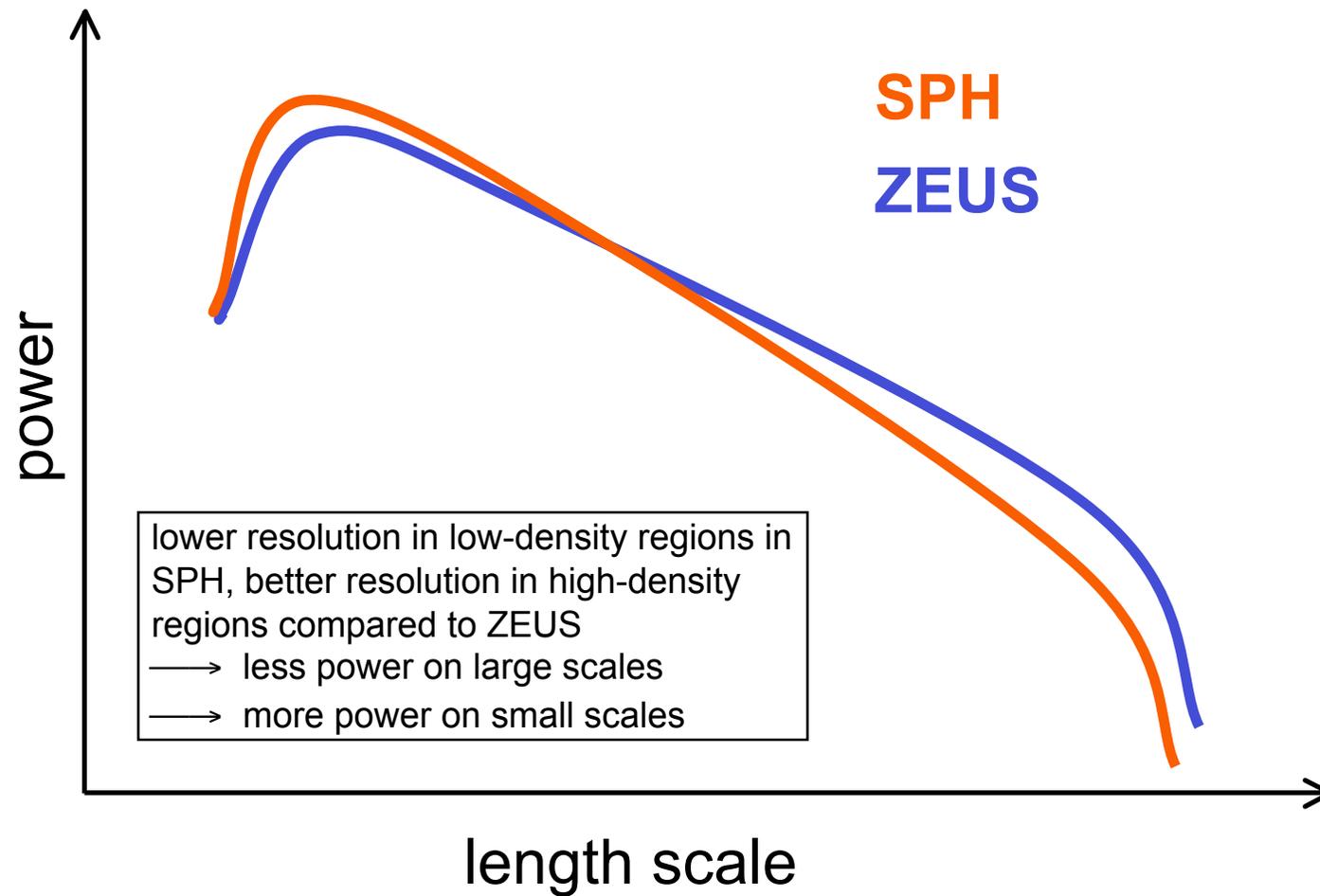
→ **Bracketing reality!**

- As a crude estimation:

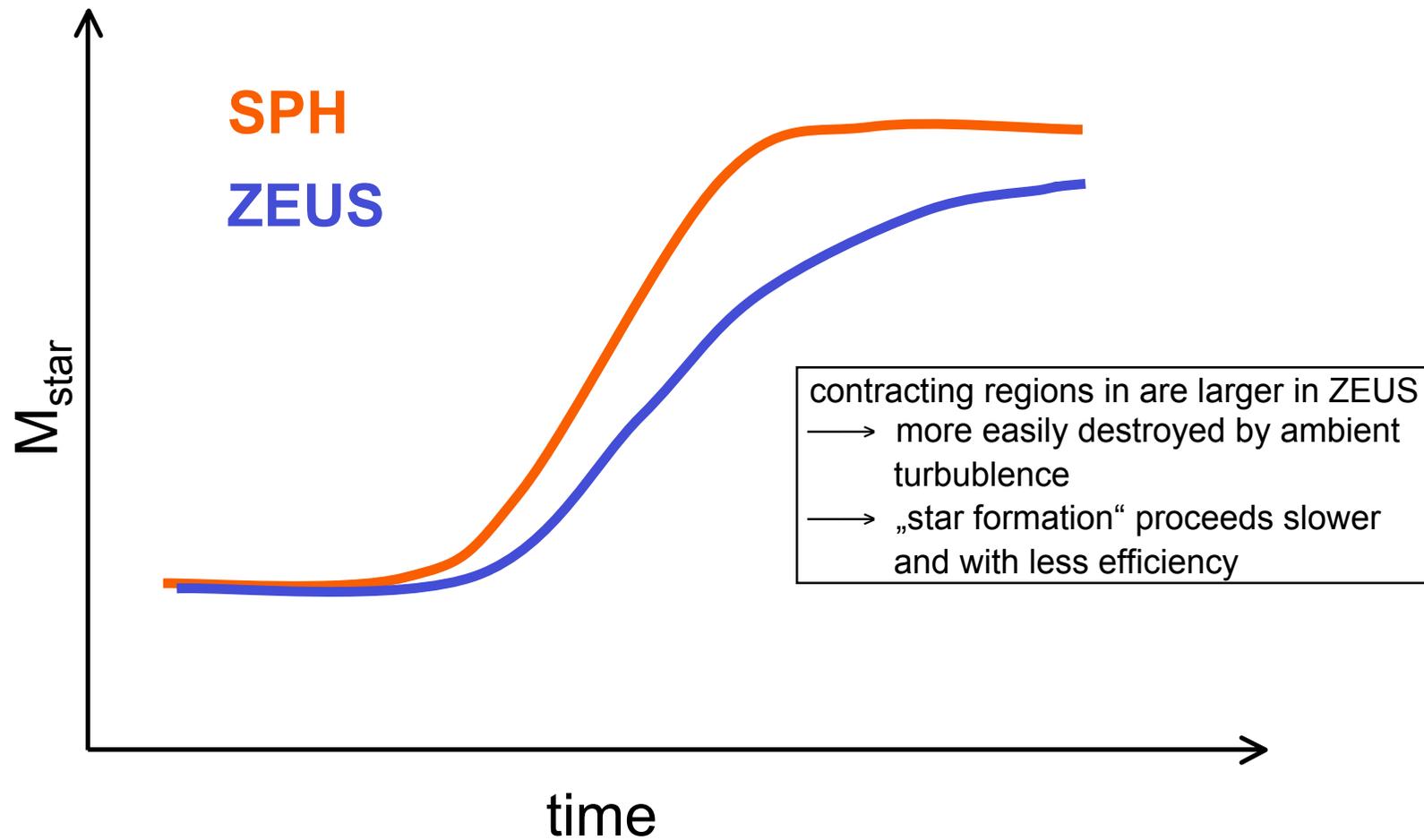
**SPH is better in high-density regions**

**ZEUS is better in low-density regions**

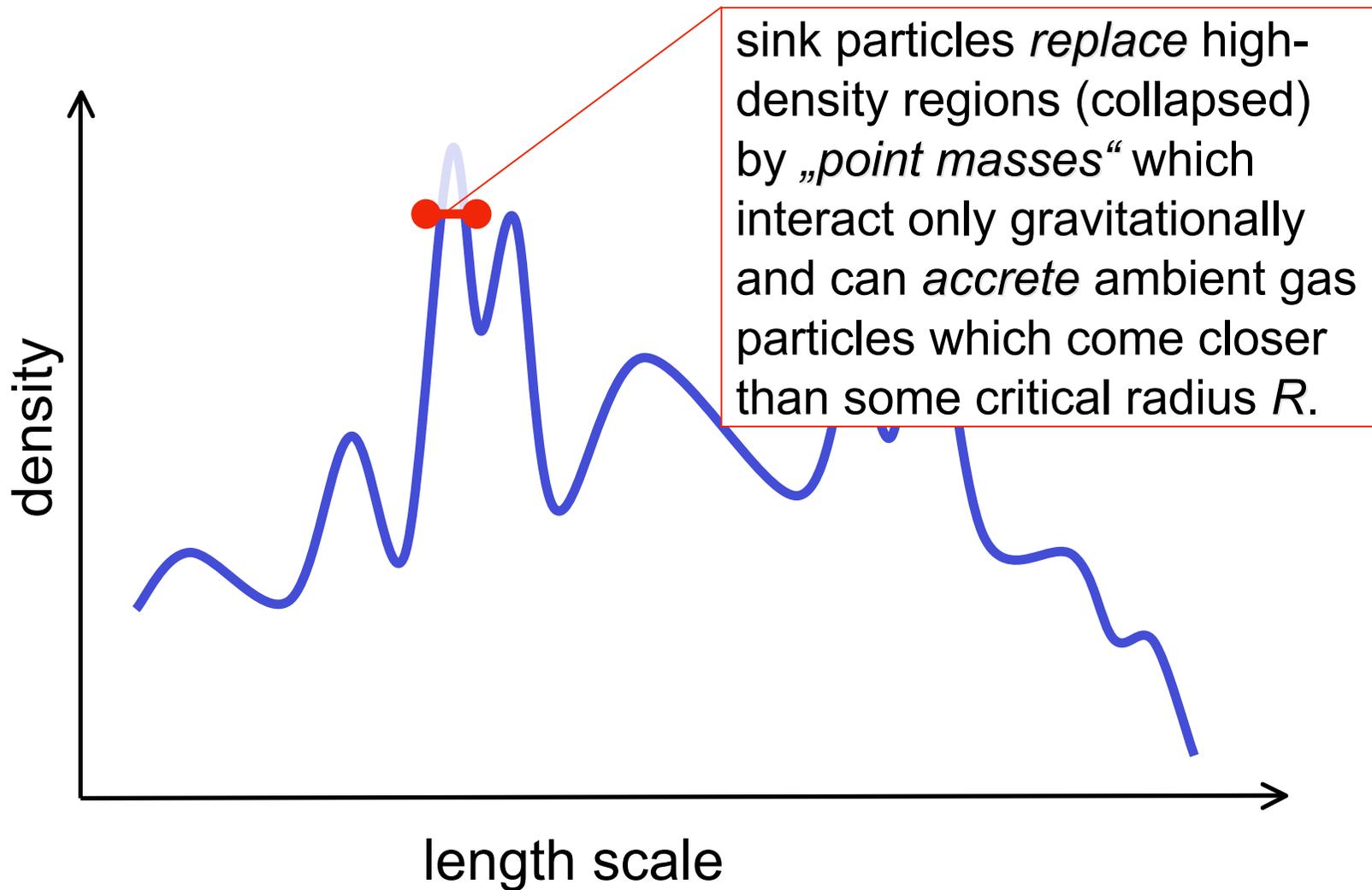
# SPH vs. ZEUS



# SPH vs. ZEUS

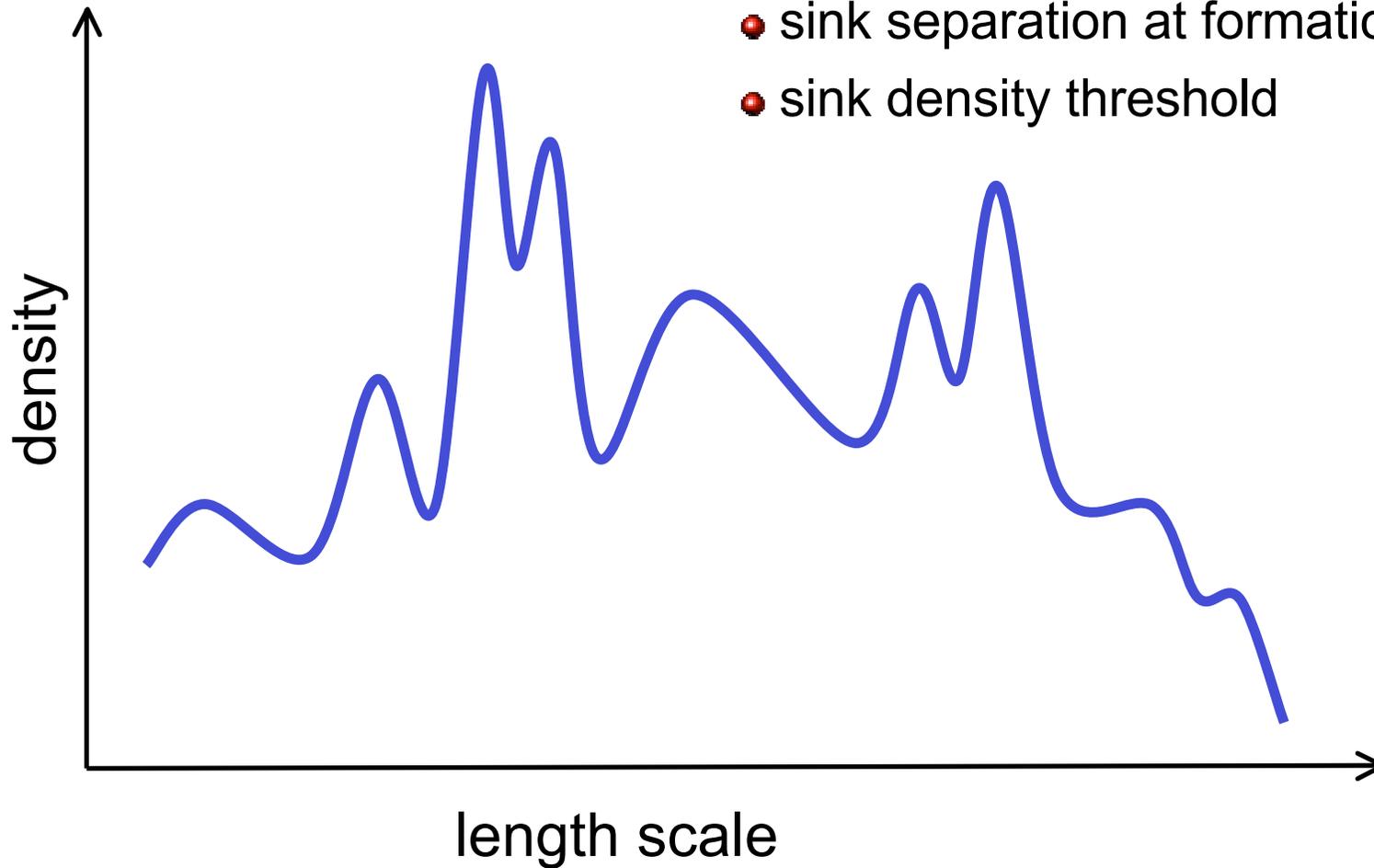


# SPH with sink particles I



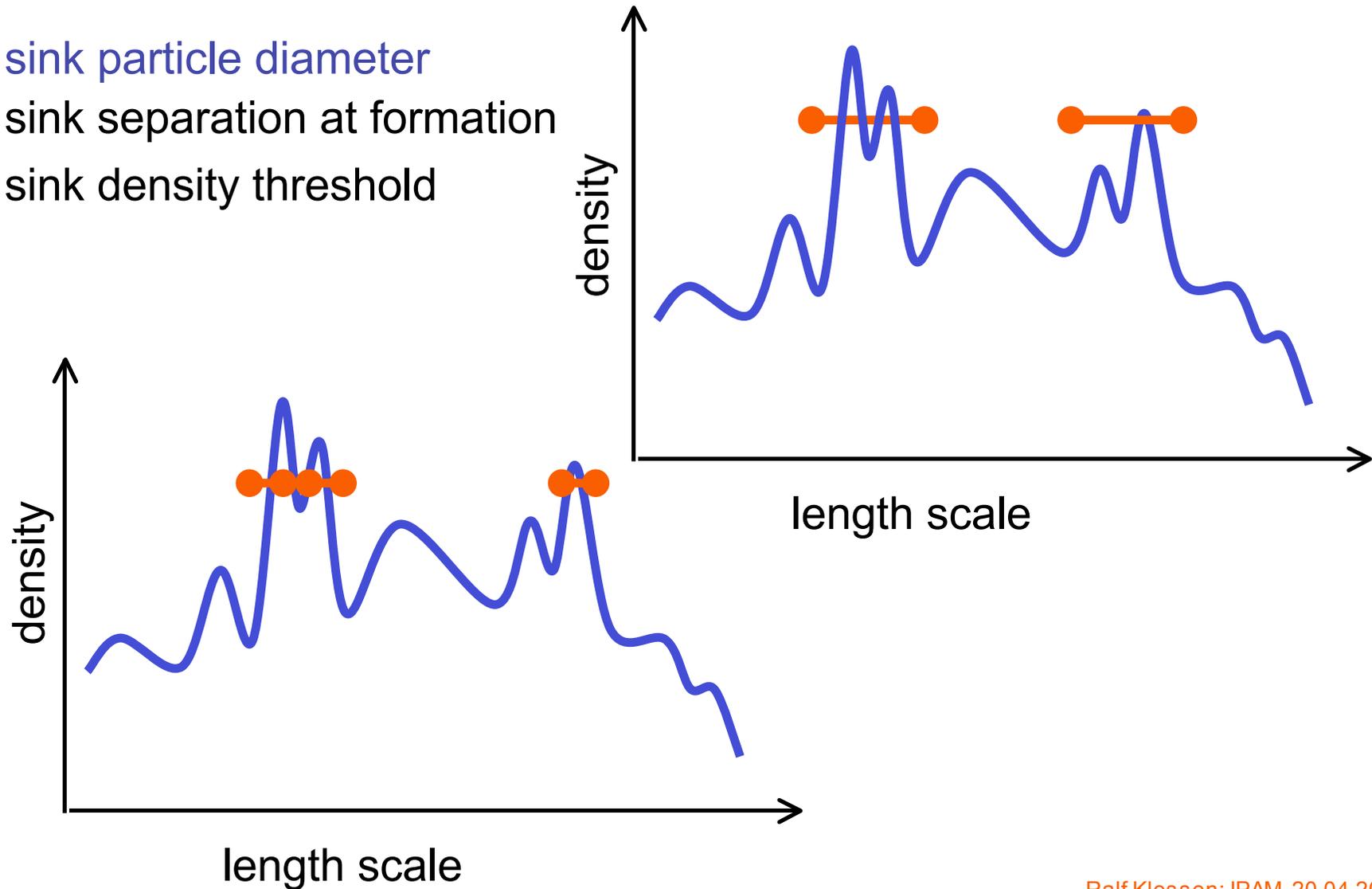
# SPH with sink particles I

- sink particle diameter
- sink separation at formation
- sink density threshold



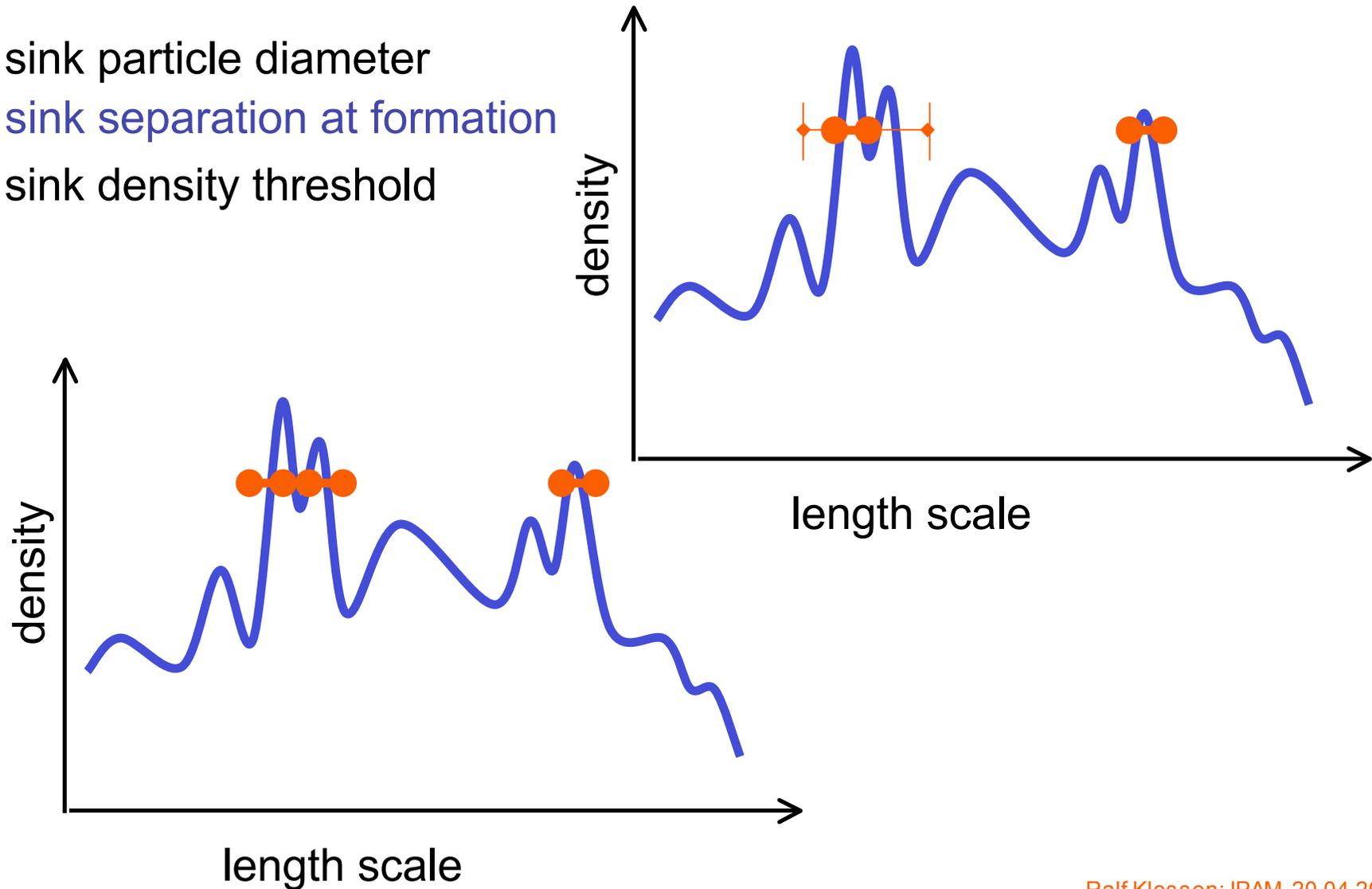
# SPH with sink particles II

- sink particle diameter
- sink separation at formation
- sink density threshold



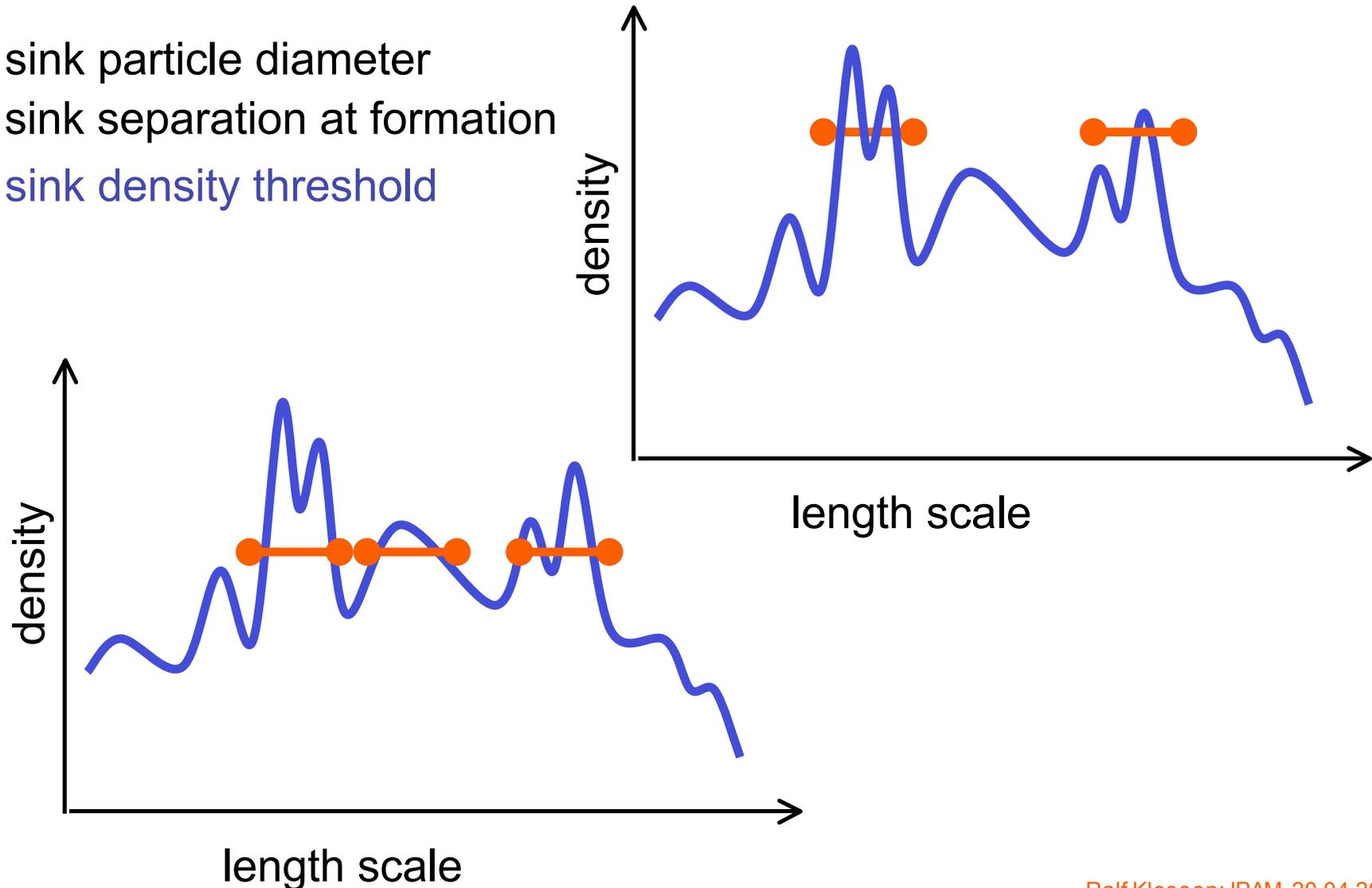
# SPH with sink particles III

- sink particle diameter
- sink separation at formation
- sink density threshold



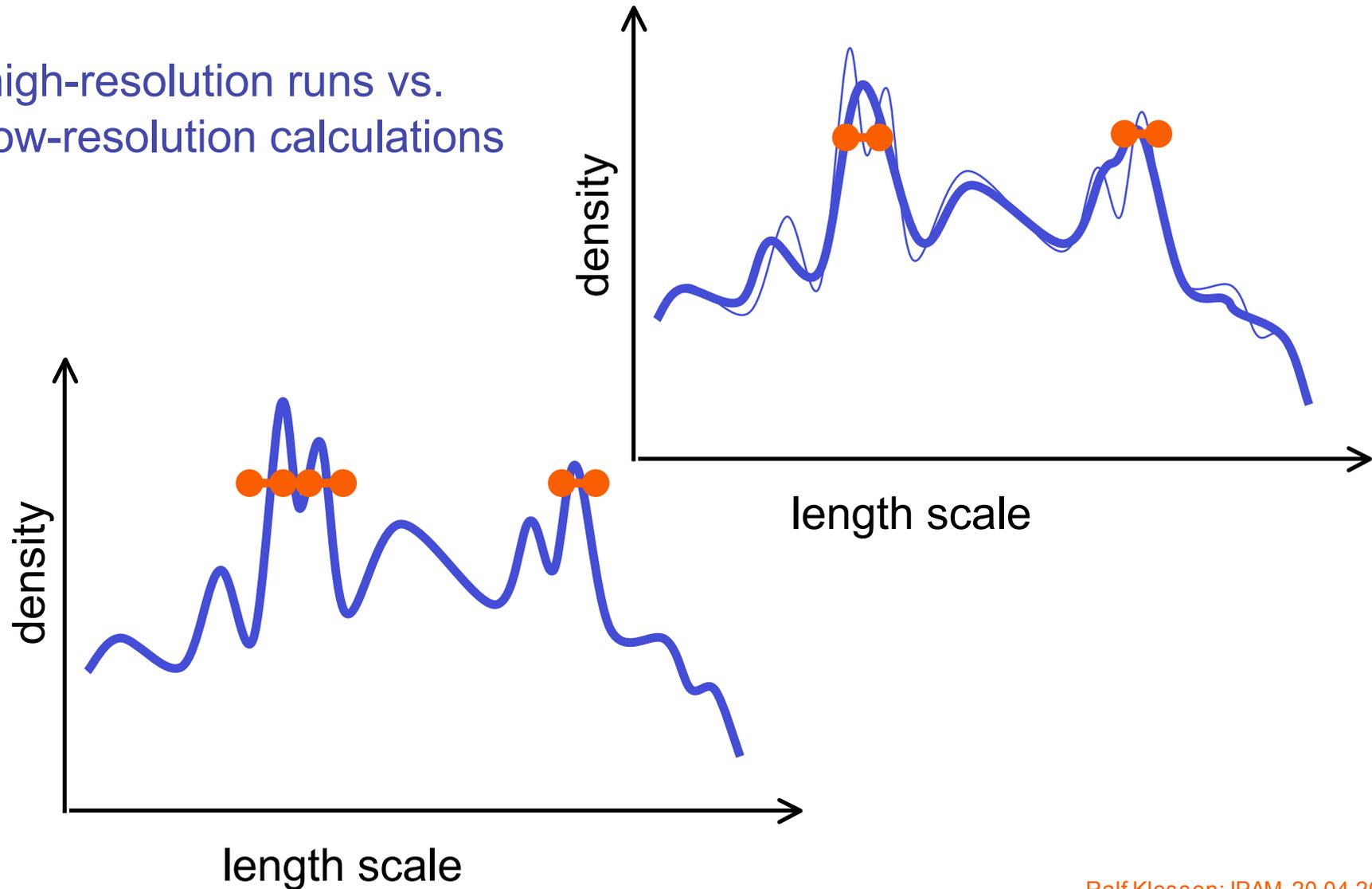
# SPH with sink particles IV

- sink particle diameter
- sink separation at formation
- sink density threshold



# SPH with sink particles V

high-resolution runs vs.  
low-resolution calculations



# Some final remarks...

- *GRAVOTURBULENT STAR FORMATION:*

This dynamic theory can explain and reproduce many features of star-forming regions on small as well as on large galactic scales.

- Some open questions:

- role of magnetic fields?
- role of thermodynamic state of the gas?
- what drives turbulence?
- how are small scales (local molecular clouds) connected to large-scale dynamics?
- what terminates star formation locally?

# Some final remarks...

## ● *NUMERICS:*

SPH appears able to describe gravoturbulent fragmentation and star formation in molecular clouds.

- Pro:
  - *Lagrangian* character of method.
  - can resolve *large density contrasts*.
  - good for transition from hydro- to stellar dynamics  
--> accreting sink particles describe protostars
- Con:
  - low resolution in low-density regions.
  - difficulties with shock-capturing and treating B-fields.
- Next steps:
  - particle-splitting to locally increase resolution,
  - GPM, XSPH with “physical” viscosity

# Outlook & First Examples

- **WHAT WE REALLY NEED: more physics!!**  
We need good *subgrid-scale models* for unresolved scales in our calculations.
- 2 Examples:
  - LOCAL SCALES: so far, we use dumb sink particles to protostellar collapse --> we do not know how the star “inside” forms and how it backreacts onto the ambient environment  
--> combine 3D hydro with 1D/2D PMS models
  - GALACTIC SCALES: can gravoturbulent models give us some handle on star-formation efficiency?  
--> some thoughts...

# Example 1

# Towards a complete picture...

## COMBINE:

- **3D** hydrodynamic simulations of the *turbulent fragmentation* of *entire molecular cloud regions*.

(using SPH with GRAPE: Klessen & Burkert 2000, 2001, Klessen, Heitsch & Mac Low 2000, Klessen 2001b)

## WITH:

- detailed **2D** hydrodynamic modelling of *protostellar accretion disks*. (e.g. Yorke & Bodenheimer 1999)

→ with rad. transfer → **SED,  $T_{bol}$ ,  $L_{bol}$  etc.**

## AND/OR:

- implicit **1D** radiation-hydrodynamic scheme with time-dependent convection and D network following the *collapse of individual cores towards the MS* (Wuchterl & Tscharnuter 2002)  
→ **PMS tracks, absolute stellar ages for cluster stars**

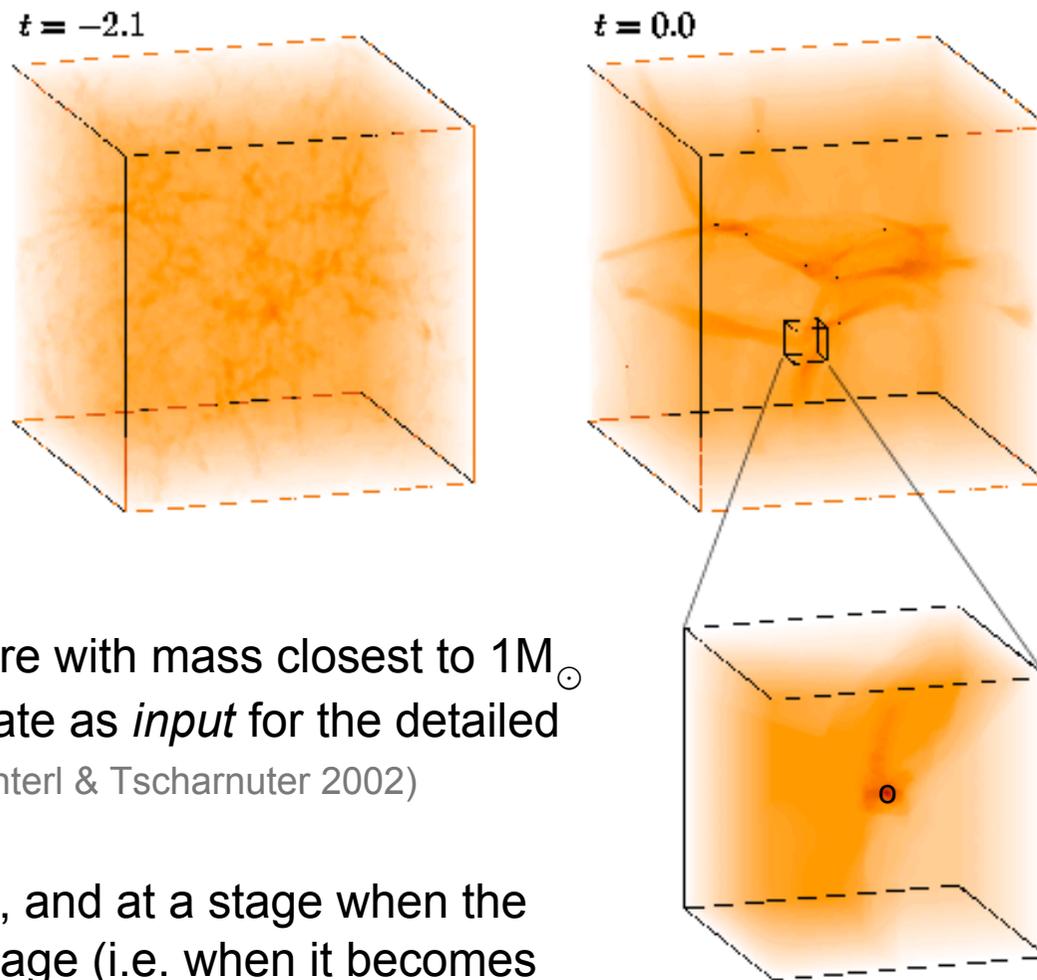
# Formation of a $1M_{\odot}$ star

Dynamical evolution of a molecular cloud region of size  $(0.32\text{pc})^3$  containing  $200 M_{\odot}$  of gas  
(from Klessen & Burkert 2000)

Within two free-fall times the system builds up a *cluster* of deeply embedded accreting *protostellar cores*.

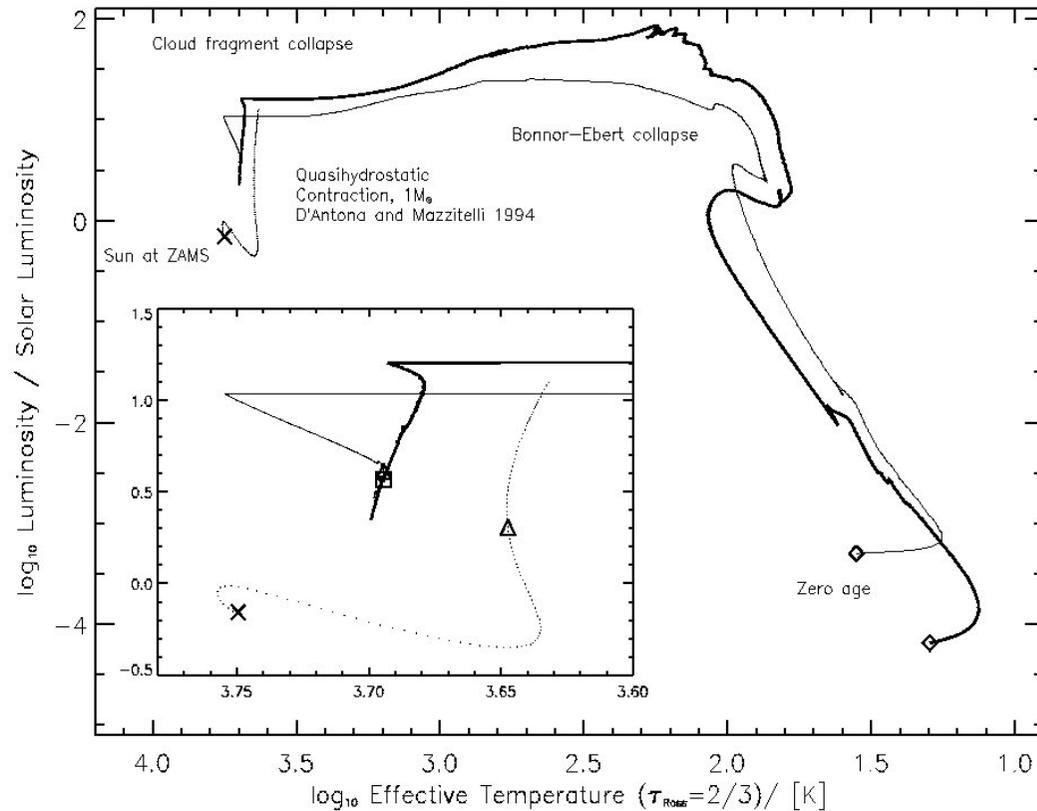
We select the protostellar core with mass closest to  $1M_{\odot}$  and use its mass accretion rate as *input* for the detailed 1D-RHD calculation (see Wuchterl & Tscharnuter 2002)

The system is shown initially, and at a stage when the  $1M_{\odot}$ -fragment reaches zero age (i.e. when it becomes optically thick for the first time).



(from Wuchterl & Klessen 2001)

# PMS tracks



- core in cluster environment
- isolated Bonnor-Ebert core
- ⋯ D'Antona & Mazzitelli track

For ages less than  $10^6$  years, different collapse conditions lead to different evolutionary tracks. Later the dynamical tracks converge.

There are large differences to the hydrostatic track, due to different stellar structure.

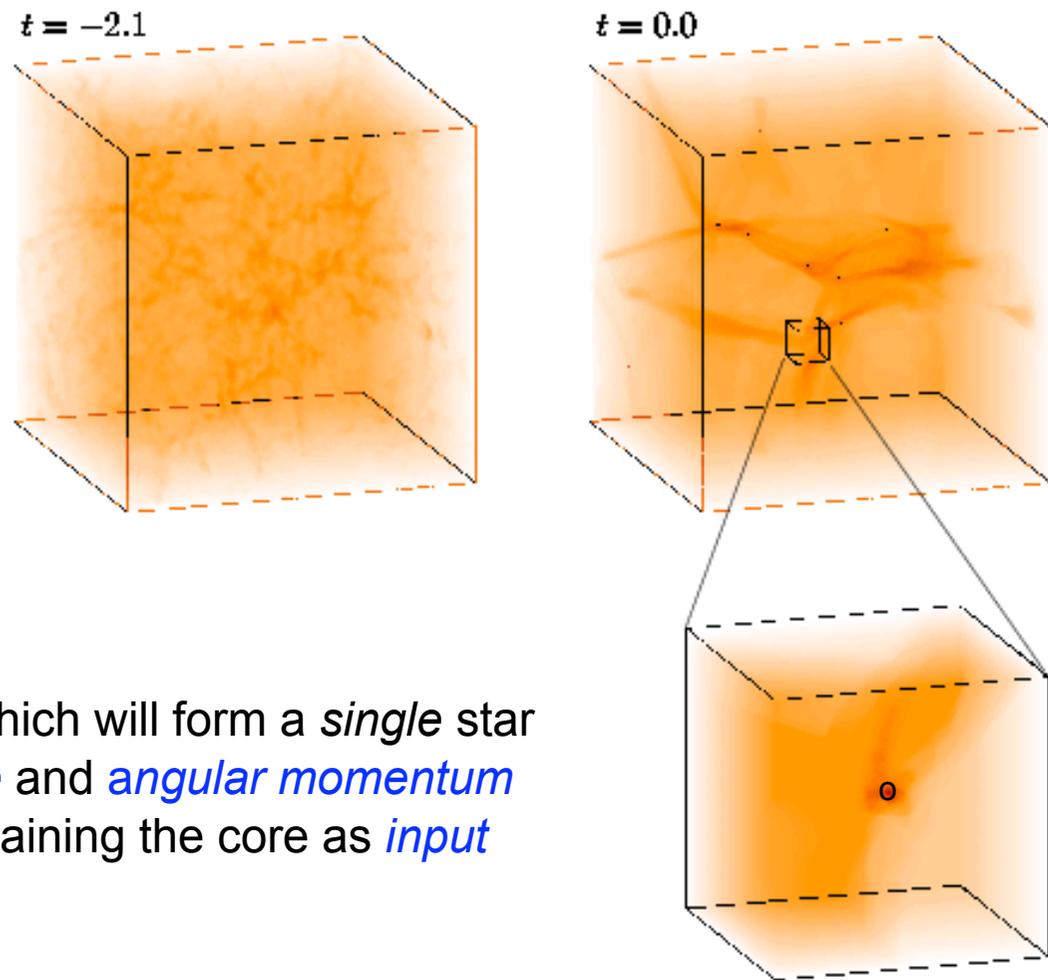
(from Wuchterl & Klessen 2001)

# SED's of a $1 M_{\odot}$ star

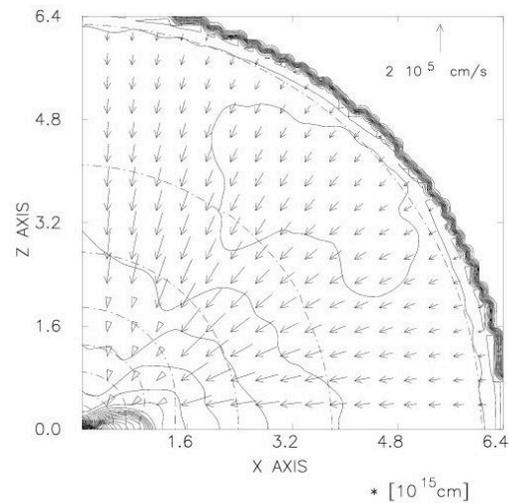
Dynamical evolution of a molecular cloud region of size  $(0.32\text{pc})^3$  containing  $200 M_{\odot}$  of gas  
(from Klessen & Burkert 2000)

Within one to two free-fall times the system builds up a *cluster* of deeply embedded accreting *protostellar cores*.

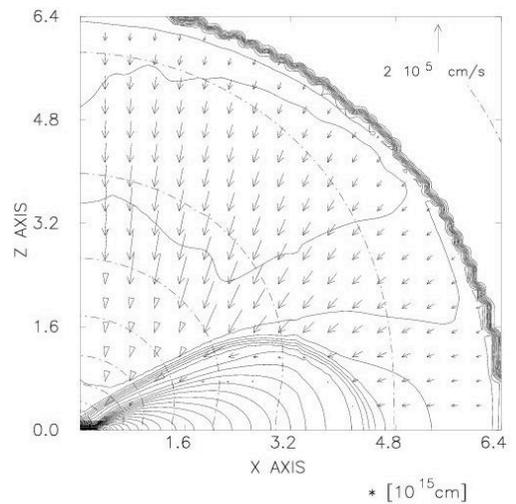
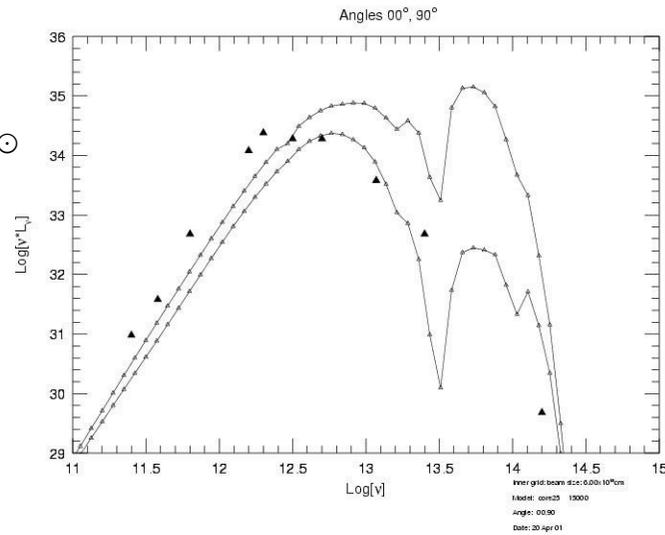
We select a protostellar core which will form a *single* star and use its *mass accretion rate* and *angular momentum gain* into a control volume containing the core as *input* for a detailed 2D calculation  
(Bodenheimer & Klessen, in preparation)



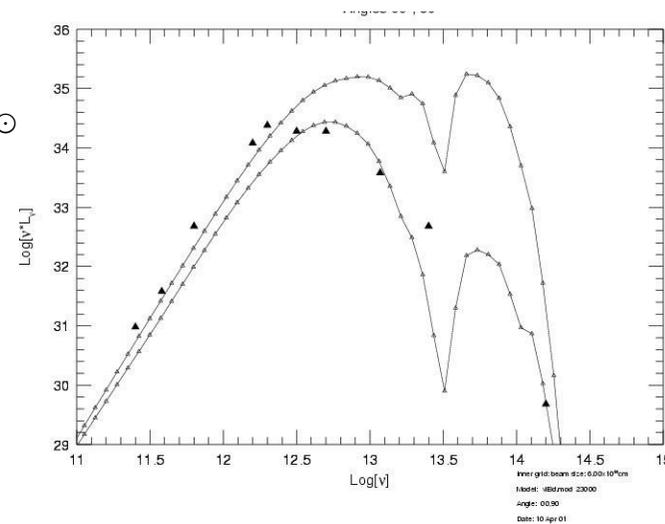
# SED's of a $1 M_{\odot}$ star



$t \approx 15000\text{yr}$   
 $M_{\text{tot}} \approx 0.75 M_{\odot}$



$t \approx 30000\text{yr}$   
 $M_{\text{tot}} \approx 0.89 M_{\odot}$



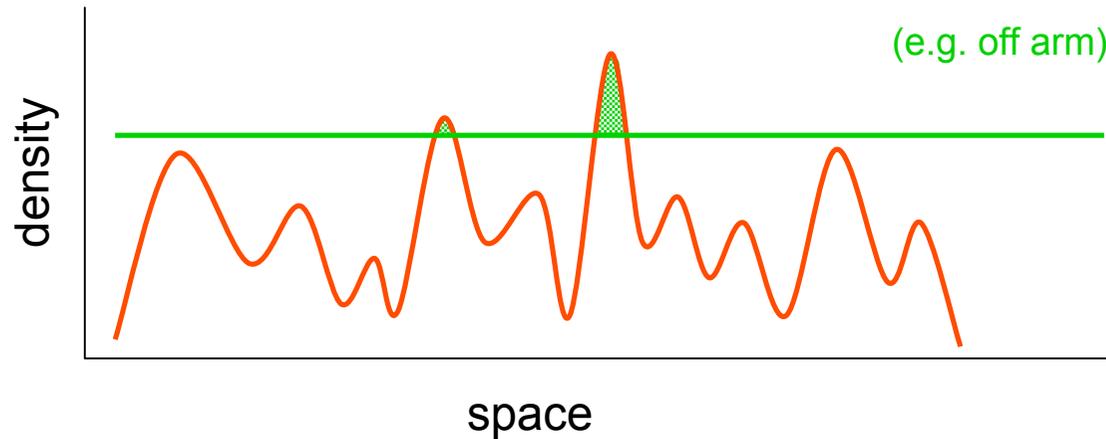
(Bodenheimer & Klessen, in preparation)

# Example 2

# Star formation on *global scales*

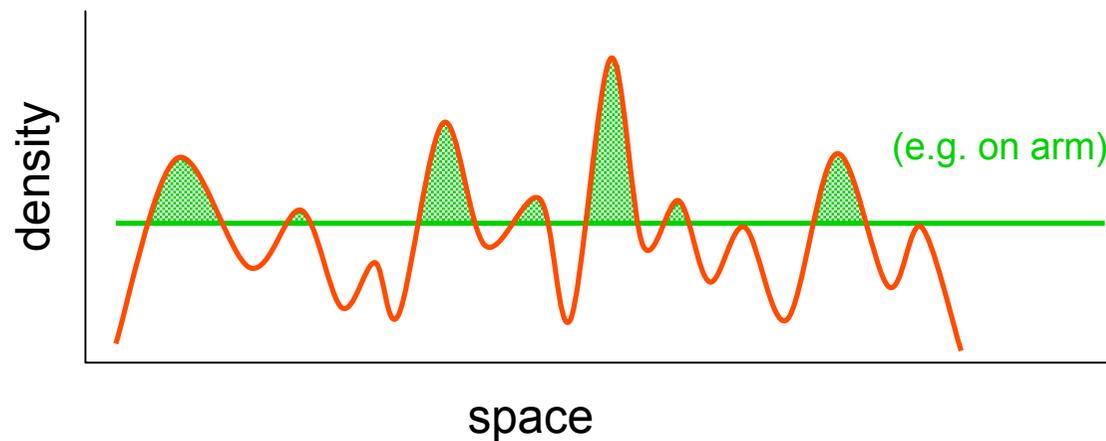
- *SF on global scales* = *formation of molecular clouds*
- MC's form at *stagnation points* of *convergent large-scale flows* (need  $\sim 0.5 \text{kpc}^3$  of gas)  $\rightarrow$  high density  $\rightarrow$  enhanced cooling  $\rightarrow$  fast  $\text{H}_2$  formation & gravitational instability  $\rightarrow$  local collapse and star formation
- External perturbations *increase* the local likelihood of MC formation (e.g. in spiral density waves, galaxy interactions, etc.)

# Star formation on *global scales*



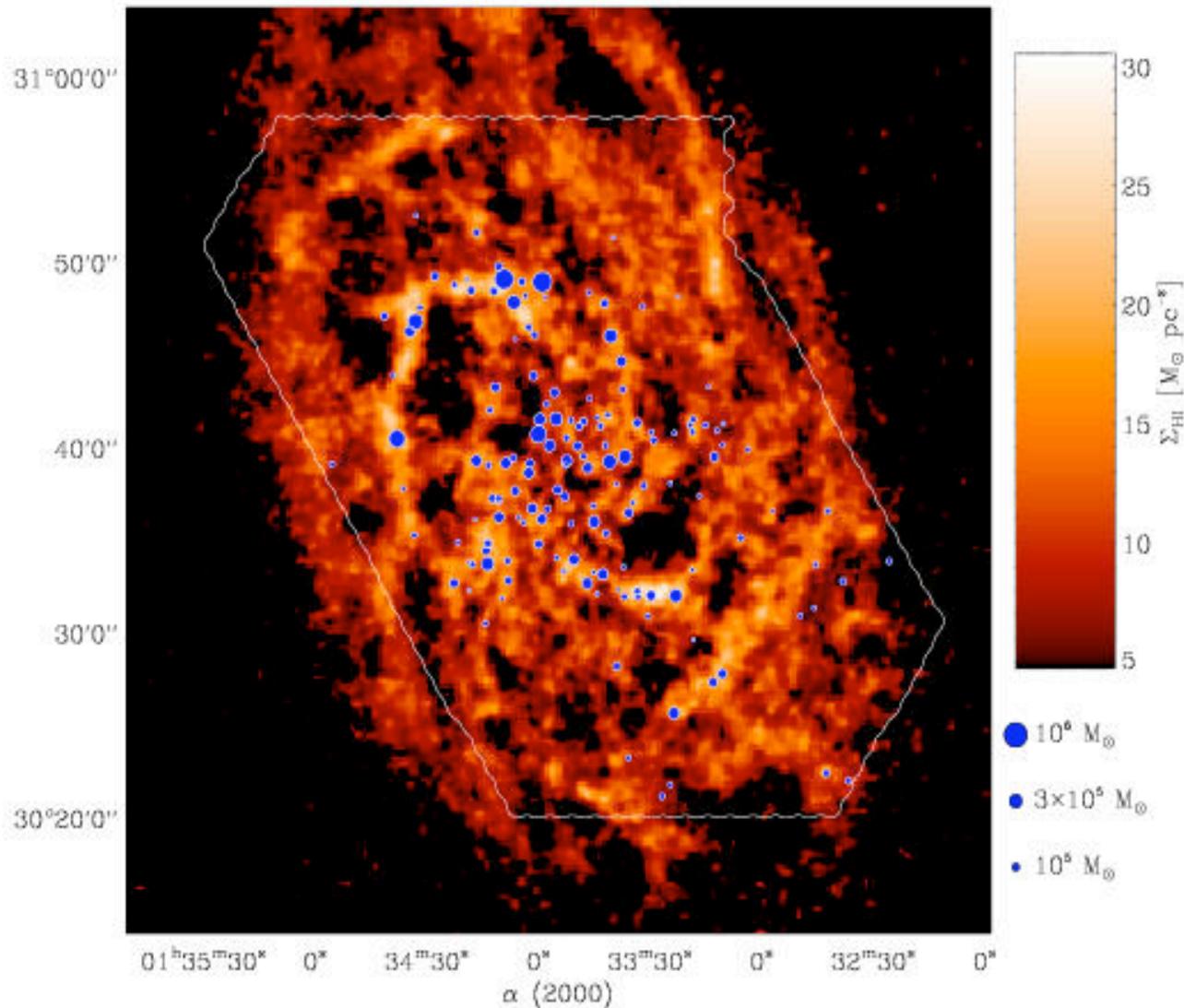
density fluctuations in warm atomic ISM caused by supersonic turbulence

some are dense enough to form H<sub>2</sub> within “reasonable timescale”  
→ molecular clouds



external perturbations (i.e. potential changes) increase likelihood

# Correlation between H<sub>2</sub> and HI



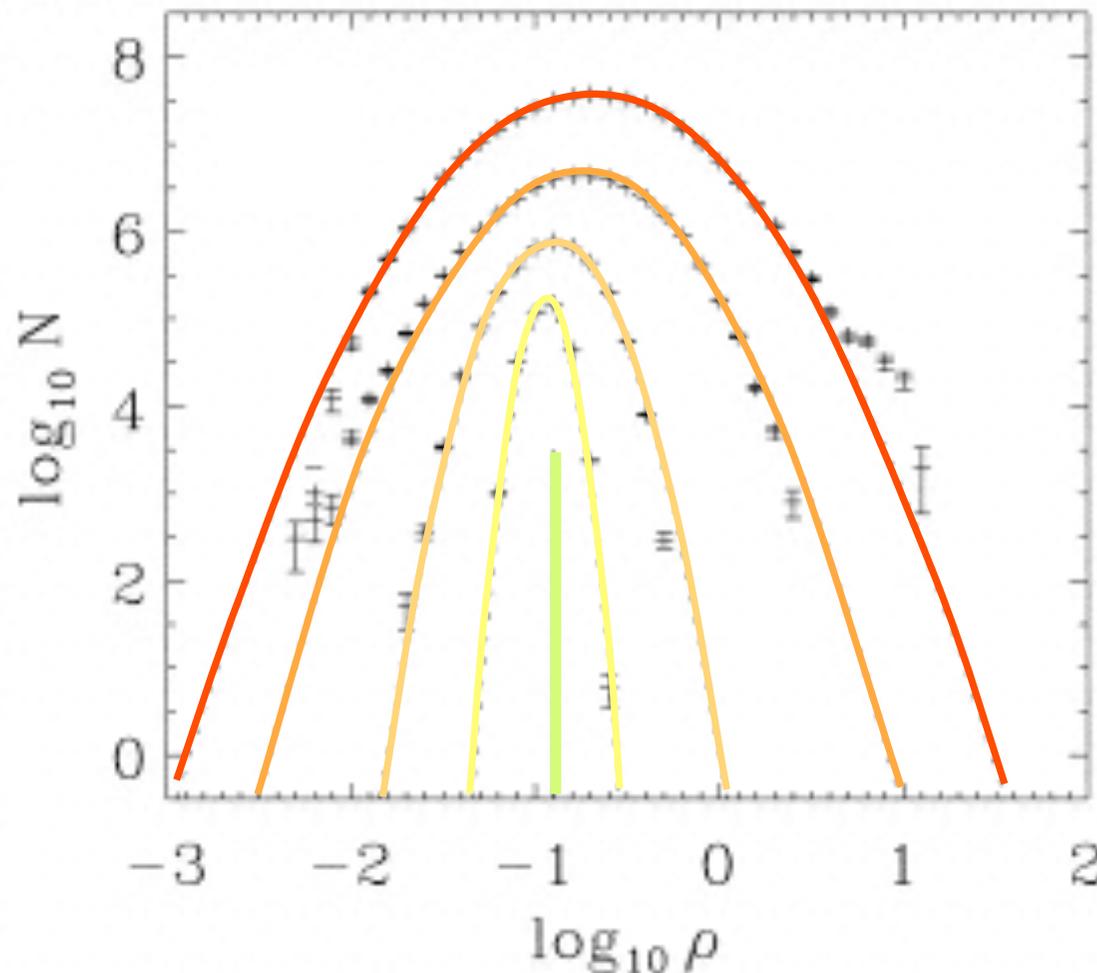
Compare H<sub>2</sub> - HI  
in M33:

- H<sub>2</sub>: BIMA-SONG Survey, see Blitz et al.
- HI: Observations with Westerbork Radio T.

H<sub>2</sub> clouds are seen  
in regions of high  
HI density  
(in spiral arms and  
filaments)

(Deul & van der Hulst 1987, Blitz et al. 2004)

# Star formation on *global scales*



probability  
distribution  
function of  
density  
( $\rho$ -pdf) for  
decaying  
supersonic  
turbulence

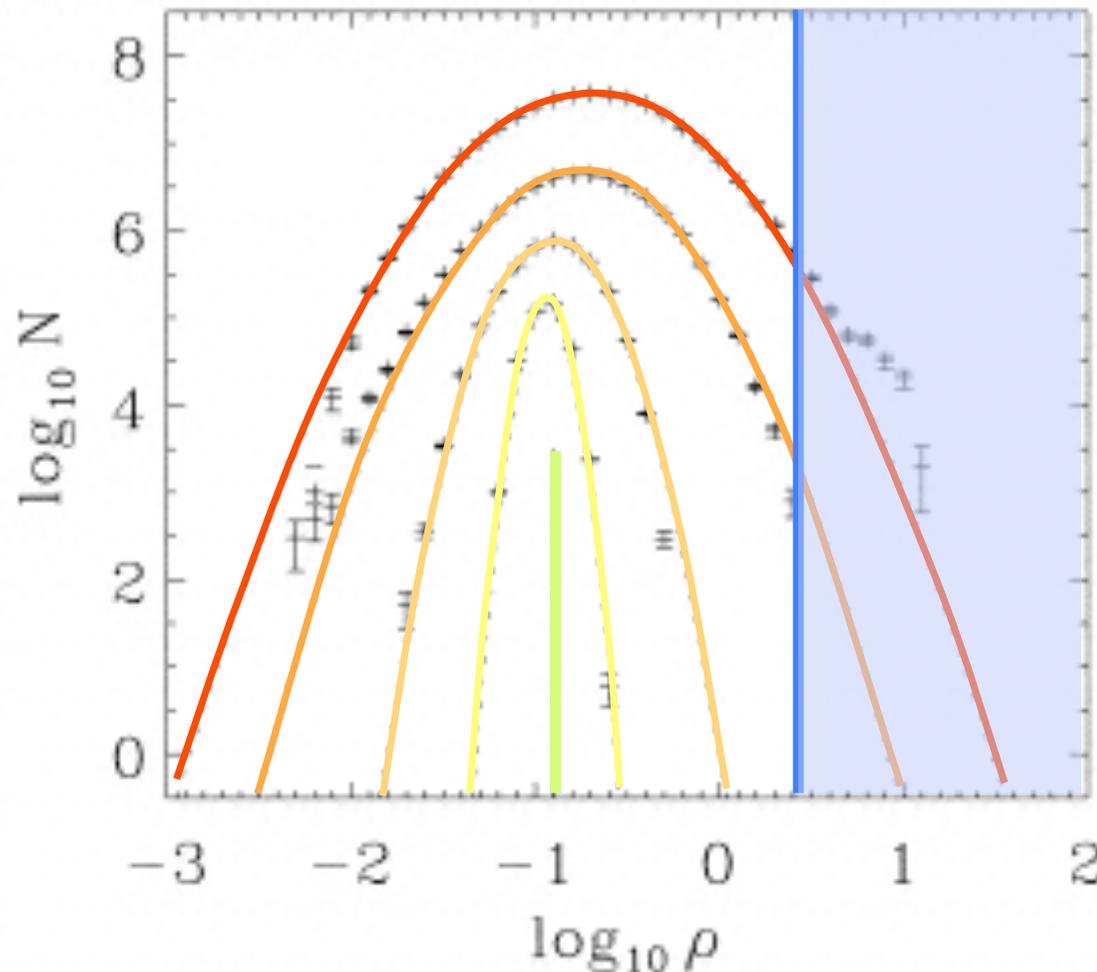
*varying rms Mach  
numbers:*

**M1** > **M2** >  
**M3** > **M4** > **0**

mass weighted  $\rho$ -pdf, each shifted by  $\Delta \log N = 1$

(from Klessen, 2001)

# Star formation on *global scales*



mass weighted  $\rho$ -pdf, each shifted by  $\Delta \log N = 1$

(from Klessen, 2001; rate from Hollenback, Werner, & Salpeter 1971)

H<sub>2</sub> formation rate:

$$\tau_{\text{H}_2} \approx \frac{1.5 \text{ Gyr}}{n_{\text{H}} / 1 \text{ cm}^{-3}}$$

For  $n_{\text{H}} \geq 100 \text{ cm}^{-3}$ ,  
H<sub>2</sub> forms within  
10 Myr, this is  
about the lifetime  
of typical MC's.

*What fraction of  
the galactic ISM  
reaches such  
densities?*

THANKS