

Astronomical Computing

ASTR4004 / ASTR8004

ANU – 2nd semester 2016

Dr Christoph Federrath

Lectures and Tutorials: Tuesdays and Fridays 09:15-10:45

Turbulence-regulated Star Formation

(Federrath & Klessen 2012; Padoan et al. 2014)

Turbulence → **Stars** → **Feedback**

Magnetic Fields

Dynamics
(shear)

Turbulence driven by

- MRI / shear
- Jets / outflows
- Ionization regions
- Supernova explosions
- Gravitational infall

(Mac Low & Klessen 2004)

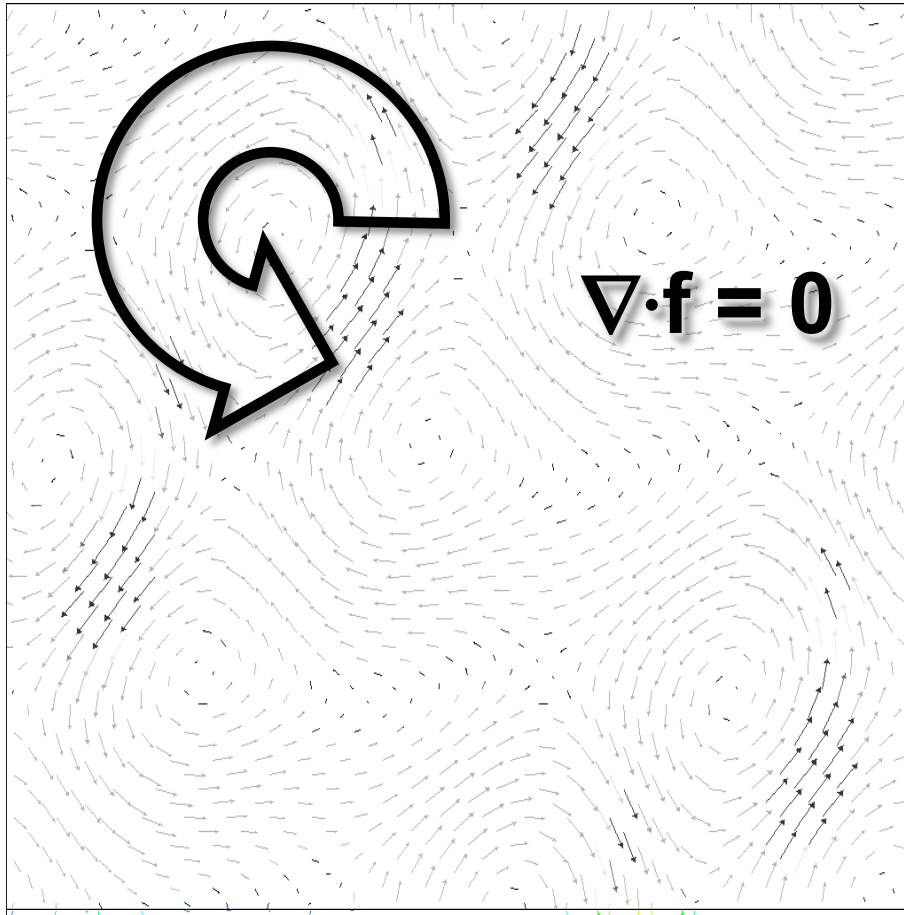
Solenoidal

Compressive

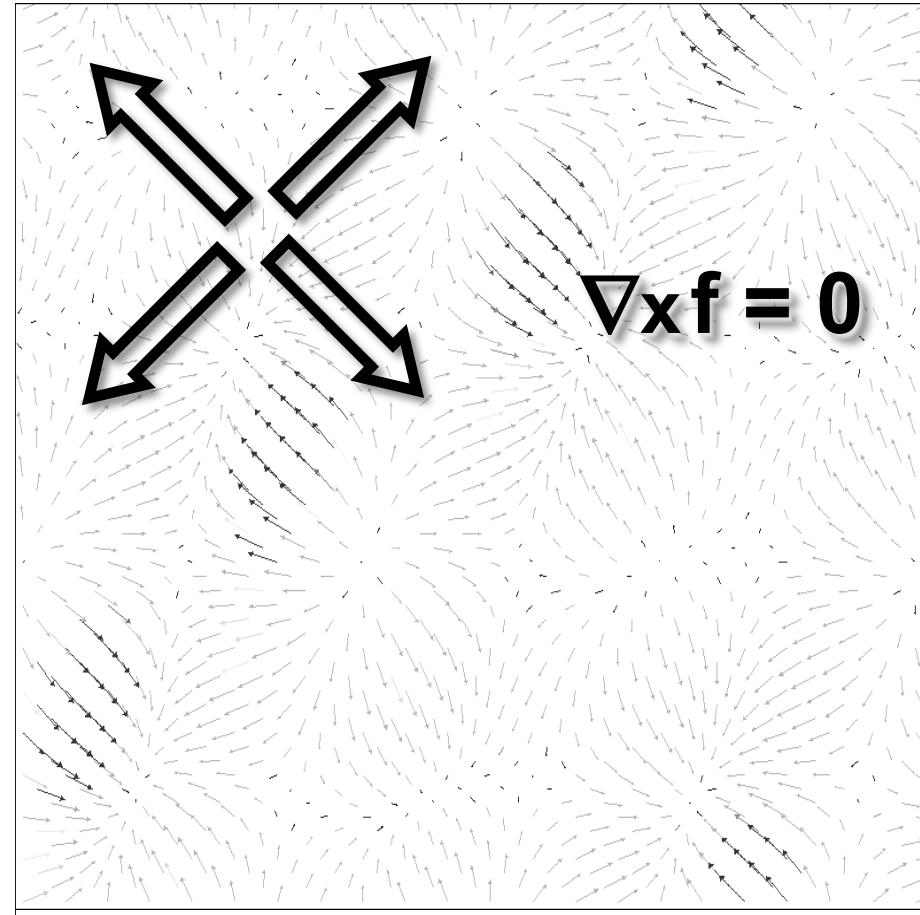
Turbulence driving – solenoidal versus compressive

Ornstein-Uhlenbeck process (stochastic process with autocorrelation time)
→ **forcing varies smoothly in space and time,**
following a well-defined random process

Solenoidal forcing



Compressive forcing



Turbulence driving – solenoidal versus compressive

solenoidal forcing

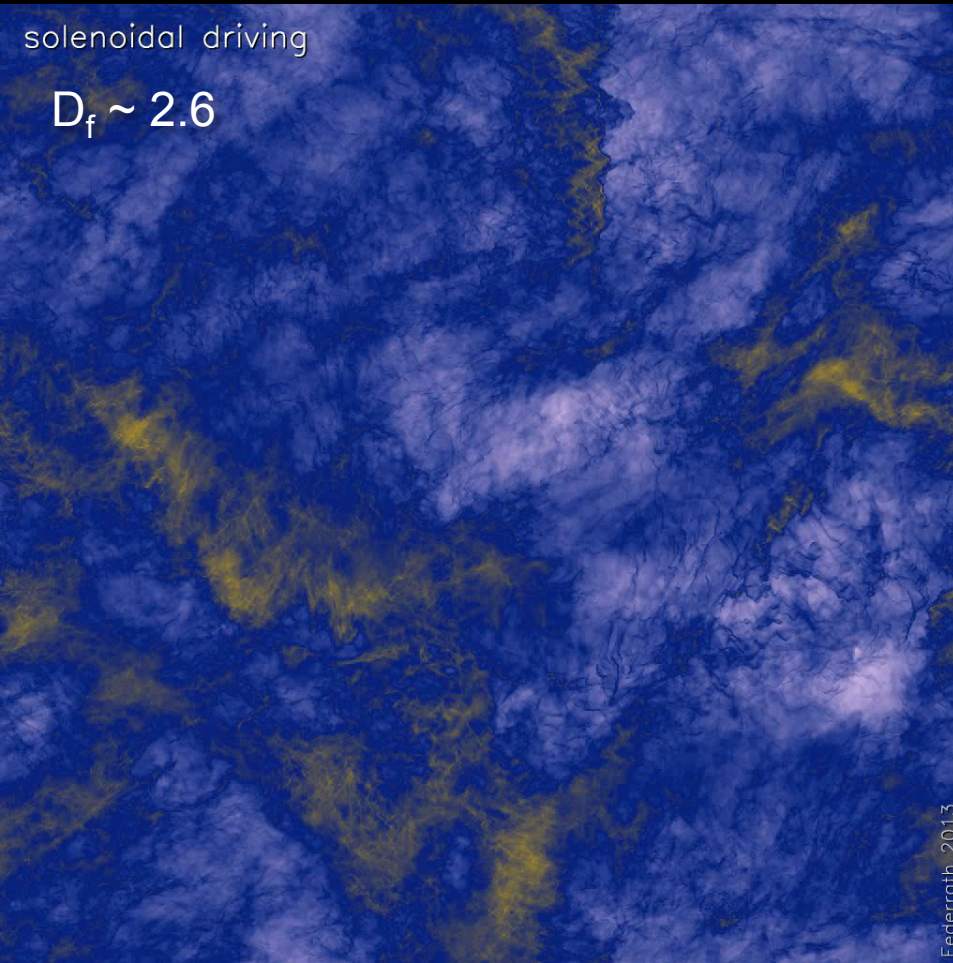
Column Density

compressive forcing

Movies available: <http://www.mso.anu.edu.au/~chfeder/pubs/supersonic/supersonic.html>

solenoidal driving

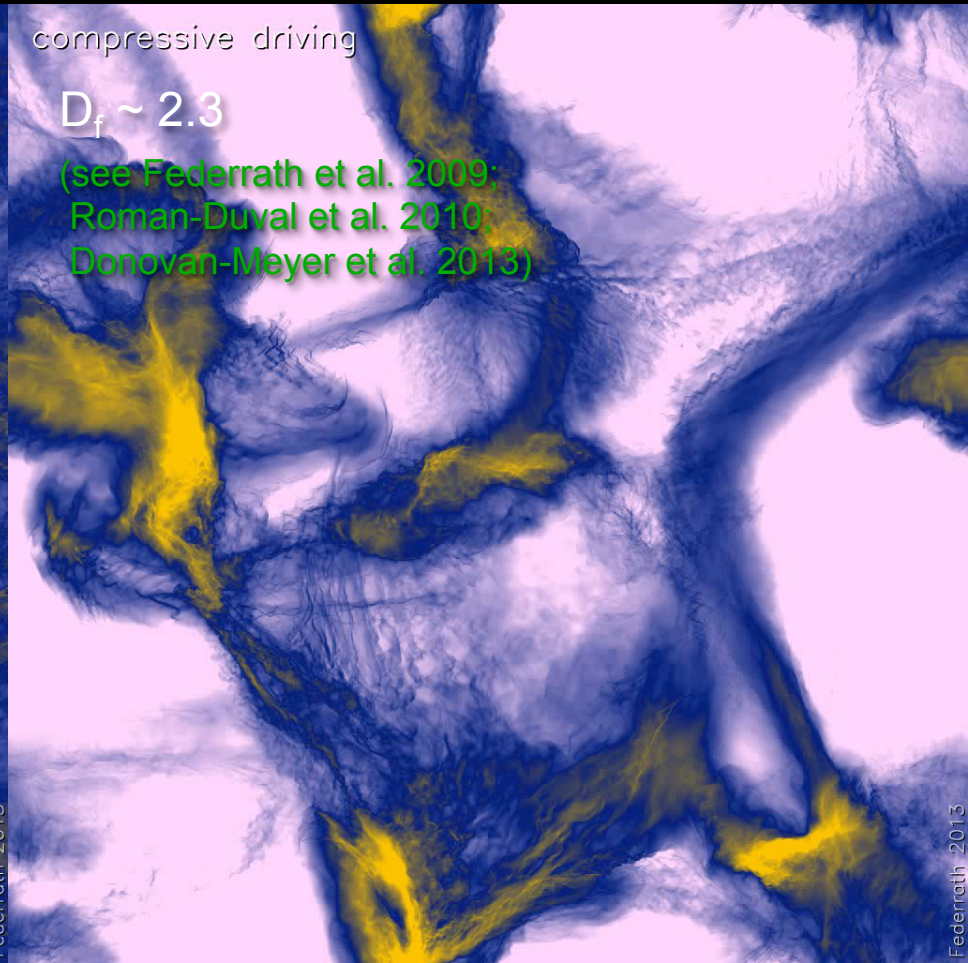
$D_f \sim 2.6$



compressive driving

$D_f \sim 2.3$

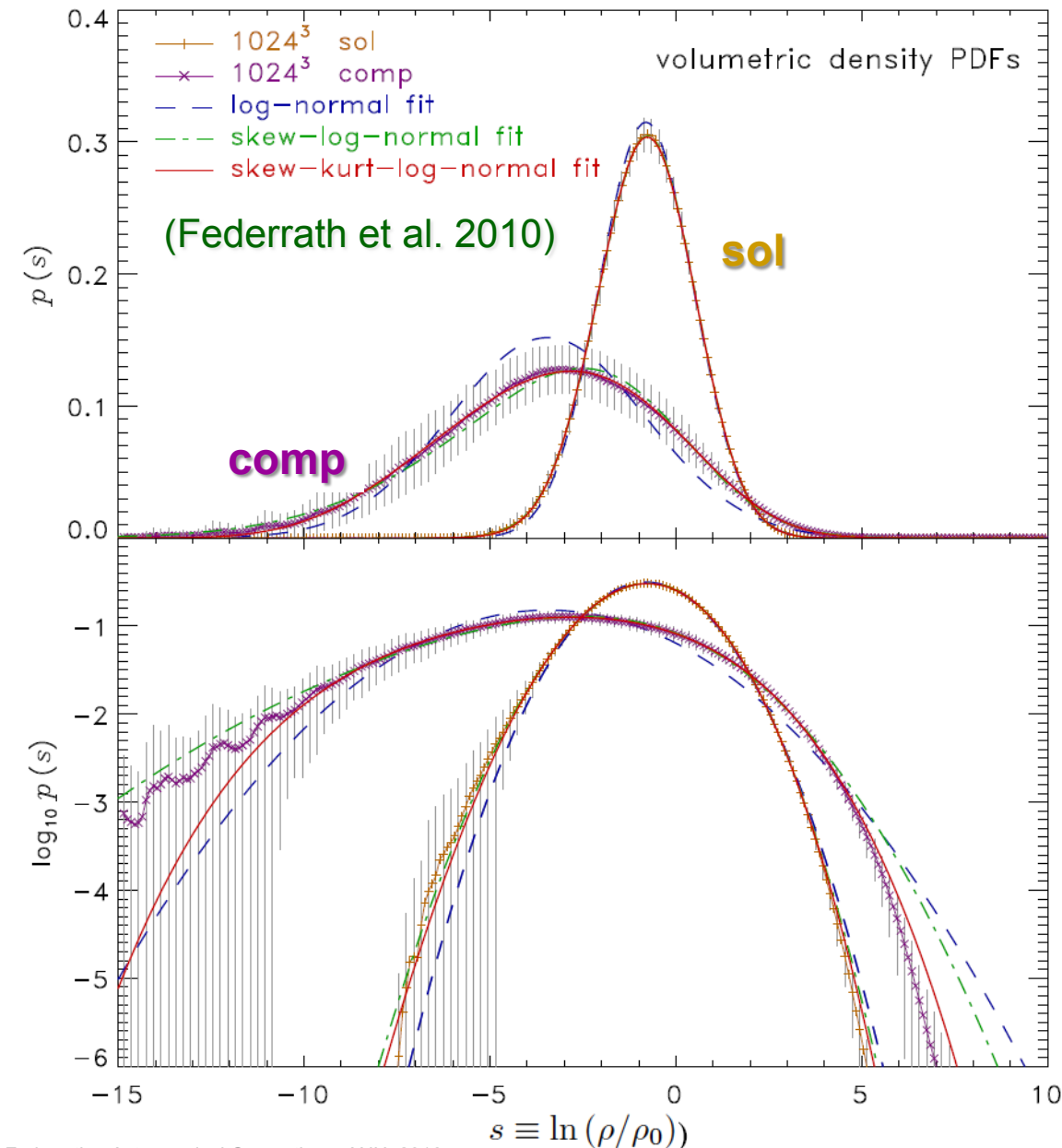
(see Federrath et al. 2009;
Roman-Duval et al. 2010;
Donovan-Meyer et al. 2013)



Compressive forcing produces stronger density enhancements

(Federrath 2013, MNRAS 436, 1245: Supersonic turbulence @ 4096³ grid cells)

The density PDF



Density PDF

log-normal:

$$p_s ds = \frac{1}{\sqrt{2\pi\sigma_s^2}} \exp \left[-\frac{(s - \langle s \rangle)^2}{2\sigma_s^2} \right] ds$$

$$s \equiv \ln(\rho/\rho_0)$$

Vazquez-Semadeni (1994); Padoan et al. (1997);
Ostriker et al. (2001); Hopkins (2013)

$$\sigma_s^2 = \ln(1 + b^2 \mathcal{M}^2)$$



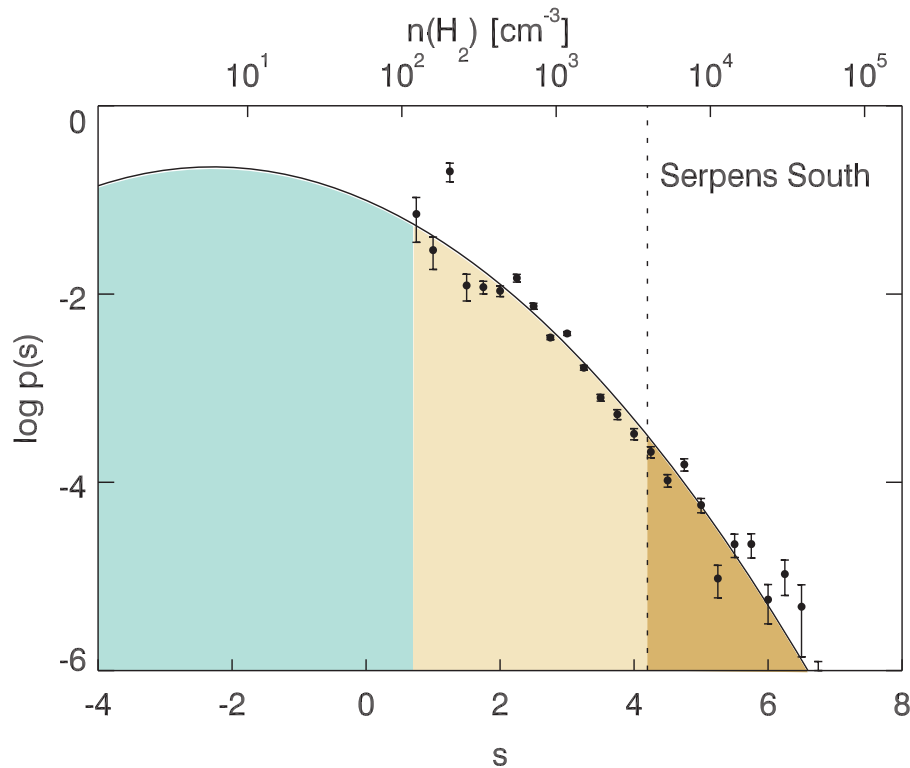
$b = 1/3$ (sol)

$b = 1$ (comp)

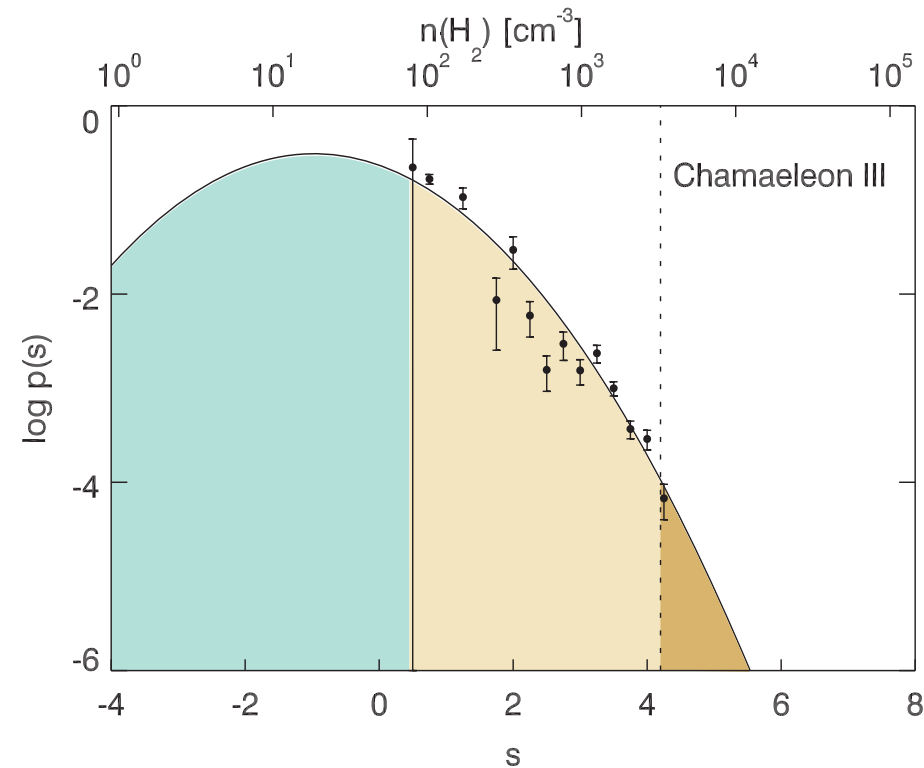
Federrath et al. (2008, 2010);
Price et al. (2011); Konstandin et al. (2012);
Molina et al. (2012); Federrath & Banerjee
(2014); Nolan et al. (2015)

PDF → The dense gas fraction

Active star formation



No star formation



Kainulainen, Federrath, Henning (2014, *Science* 344, 183)

Power-law tails →
gravitational collapse

Schneider et al. 2012–2015; Federrath & Klessen 2013;
Girichidis et al. 2014; Sadavoy et al. 2014; Myers 2015; Cunningham et al., in prep.

2D → 3D
conversion

(Brunt et al. 2010a,b)

Turbulence \rightarrow Density PDF

Density PDF \rightarrow Star Formation Rate

Why is star formation so inefficient?

Density PDF is key for star formation theories:

- **Initial Mass Function** (Padoan & Nordlund 02, Hennebelle & Chabrier 08,09,
- **Star Formation Efficiency** (Elmegreen 08, Federrath & Klessen 13)
- **Kennicutt-Schmidt relation** (Elmegreen 02, Krumholz & McKee 05, Tassis 07, Ostriker+10, Elmegreen 11, Veltchev+11, Hopkins 12, Federrath 13, Salim+15)
- **Star Formation Rate** (Krumholz & McKee 05, Padoan & Nordlund 11, Renaud+12, Federrath & Klessen 2012)

All based on integrals over the turbulent density PDF

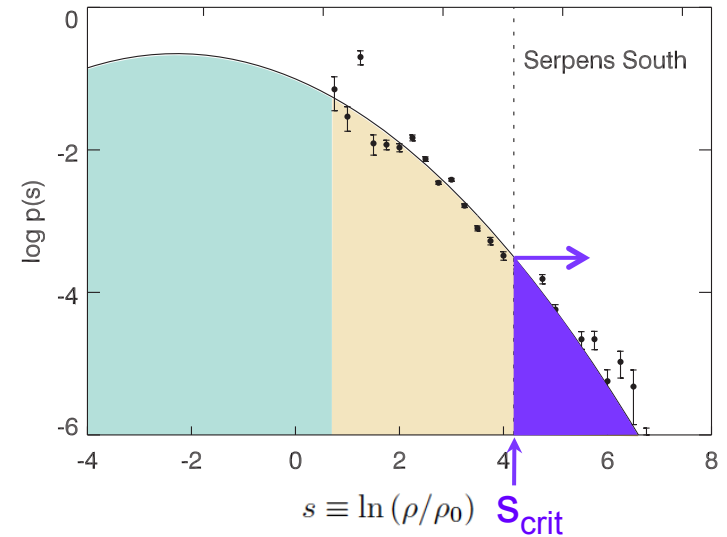
$$\text{SFR}_{\text{ff}} = \frac{\epsilon_{\text{core}}}{\phi_t} \int_{x_{\text{crit}}}^{\infty} x p(x) dx$$

Krumholz & McKee (2005), Padoan & Nordlund (2011); Hennebelle & Chabrier (2011,2013)

Statistical Theory for the Star Formation Rate:

SFR ~ Mass/time

$$\text{SFR}_{\text{ff}} = \epsilon \int_{s_{\text{crit}}}^{\infty} \overbrace{\frac{t_{\text{ff}}(\rho_0)}{t_{\text{ff}}(\rho)}}^{\text{freefall time}} \overbrace{\frac{\rho}{\rho_0}}^{\text{mass fraction}} p(s) ds$$



Hennebelle & Chabrier (2011) : “multi-freefall model”

Statistical Theory for the Star Formation Rate:

SFR ~ Mass/time **freefall time** **mass fraction**

$$\begin{aligned} \text{SFR}_{\text{ff}} &= \epsilon \int_{s_{\text{crit}}}^{\infty} \overbrace{\frac{t_{\text{ff}}(\rho_0)}{t_{\text{ff}}(\rho)}}^{\text{freefall time}} \overbrace{\frac{\rho}{\rho_0}}^{\text{mass fraction}} p(s) \, ds = \epsilon \int_{s_{\text{crit}}}^{\infty} \exp\left(\frac{3}{2}s\right) p(s) \, ds \\ &= \frac{\epsilon}{2} \exp\left(\frac{3}{8}\sigma_s^2\right) \left[1 + \text{erf}\left(\frac{\sigma_s^2 - s_{\text{crit}}}{\sqrt{2}\sigma_s^2}\right) \right] \end{aligned}$$

$$p(s) = \frac{1}{\sqrt{2\pi\sigma_s^2}} \exp\left(-\frac{(s - s_0)^2}{2\sigma_s^2}\right)$$

$$s = \ln(\rho/\rho_0) \quad t_{\text{ff}}(\rho) = \left(\frac{3\pi}{32G\rho}\right)^{1/2}$$

Hennebelle & Chabrier (2011) : “multi-freefall model”

Statistical Theory for the Star Formation Rate:

SFR ~ Mass/time **freefall time** **mass fraction**

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Hennebelle & Chabrier (2011) : “multi-freefall model”

From sonic and Jeans scales:

$$s_{\text{crit}} \propto \ln(\alpha_{\text{vir}} \mathcal{M}^2)$$

(Krumholz & McKee 2005, Padoan & Nordlund 2011)

$$\text{SFR}_{\text{ff}} = \text{SFR}_{\text{ff}}(\alpha_{\text{vir}}, b, \mathcal{M})$$

$2E_{\text{kin}}/E_{\text{grav}}$

forcing

Mach number

$$\sigma_s^2 = \ln(1 + b^2 \mathcal{M}^2)$$

(e.g., Federrath et al. 2008)

Federrath & Klessen (2012)

Density PDF \rightarrow Star Formation Rate

$$\text{SFR}_{\text{ff}} = \text{SFR}_{\text{ff}}(\alpha_{\text{vir}}, b, \mathcal{M})$$

$$2E_{\text{kin}}/E_{\text{grav}}$$

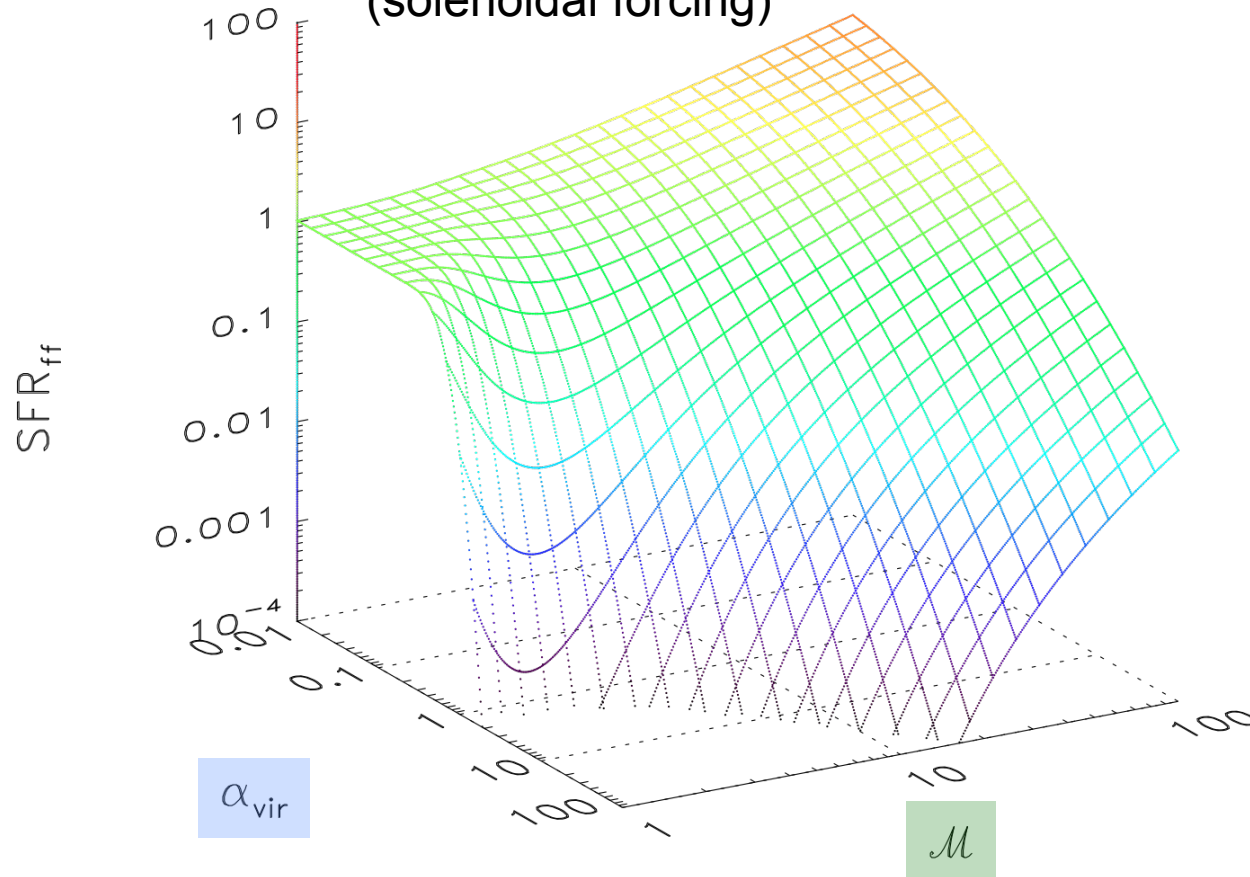
forcing

Mach number

forcing parameter ($b=0.33$)

multi-freefall

(solenoidal forcing)



Density PDF \rightarrow Star Formation Rate

$$\text{SFR}_{\text{ff}} = \text{SFR}_{\text{ff}}(\alpha_{\text{vir}}, b, \mathcal{M})$$

$$2E_{\text{kin}}/E_{\text{grav}}$$

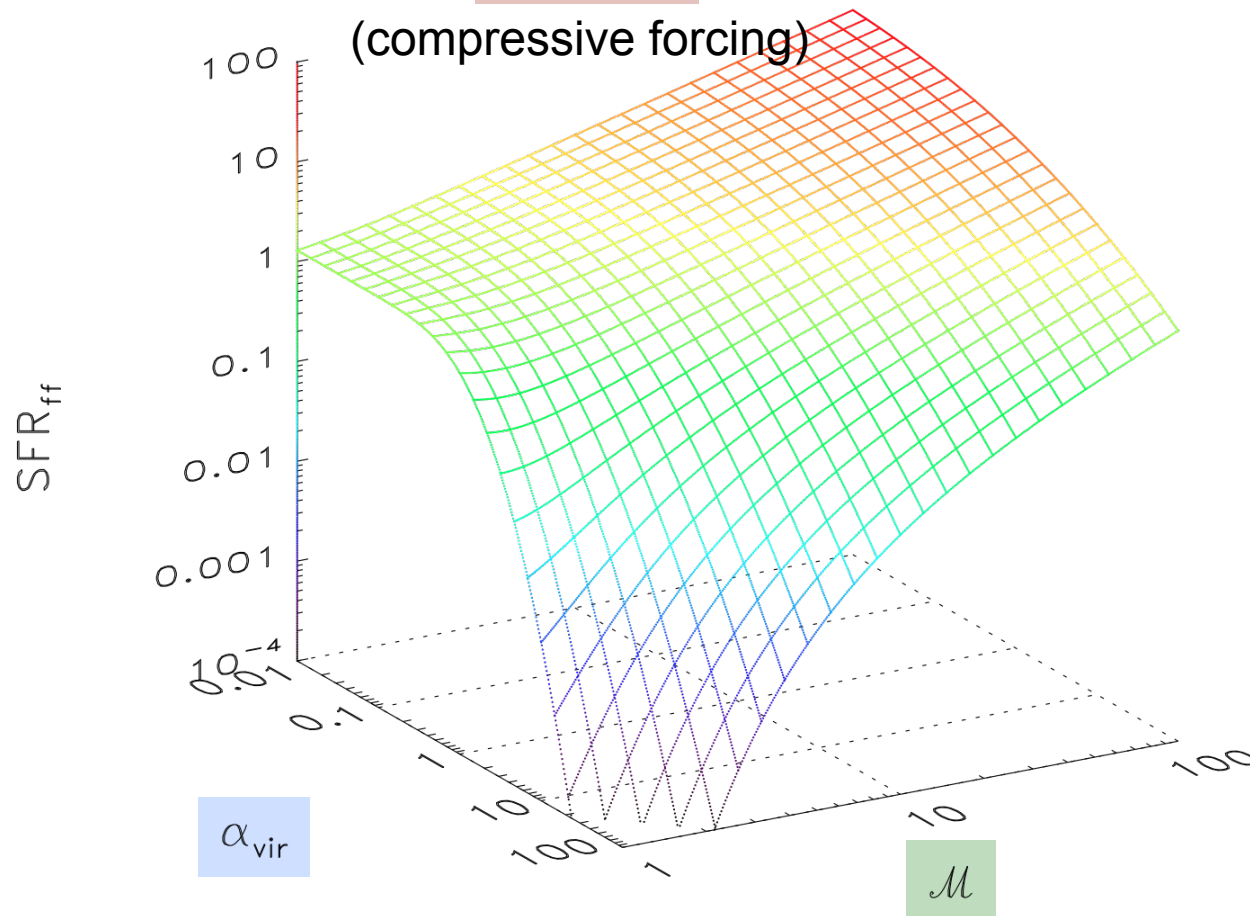
forcing

Mach number

forcing parameter ($b=1.00$)

multi-freefall

(compressive forcing)



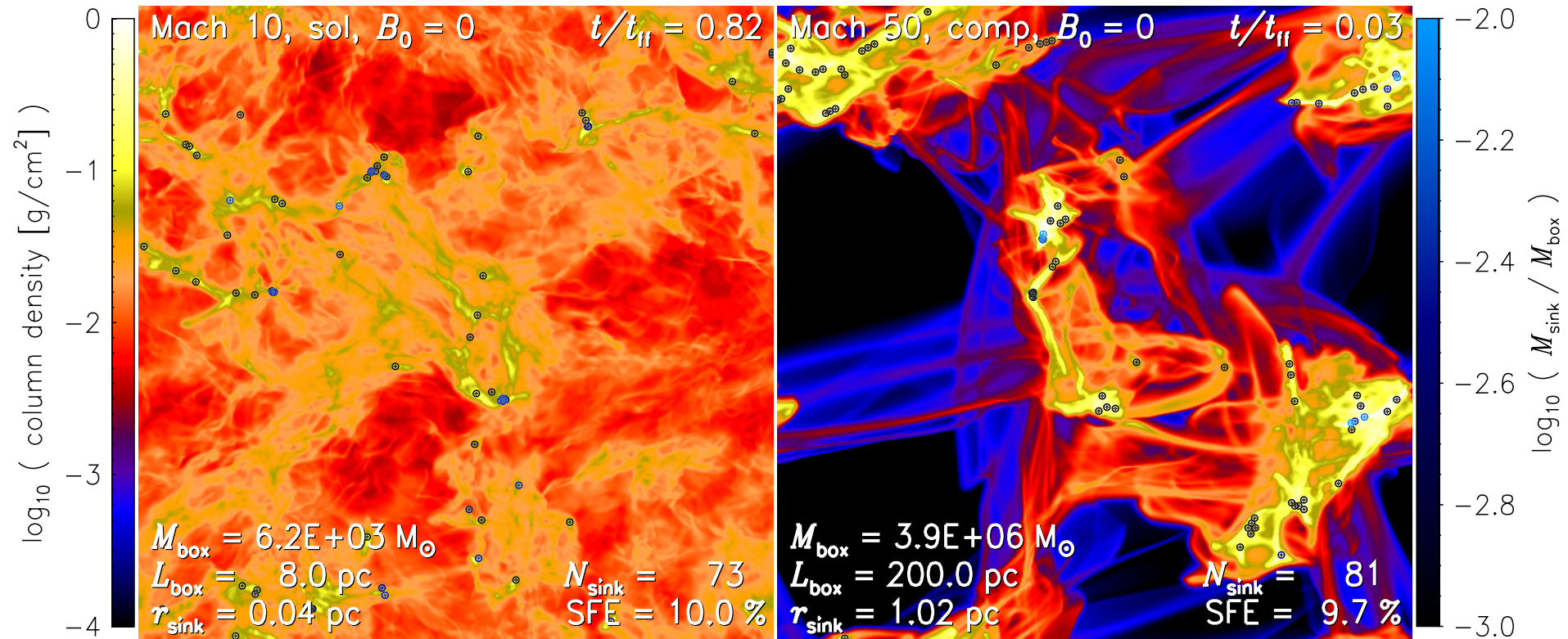
Density PDF → Star Formation Rate

Numerical Simulation varying the turbulent Mach number:

Movies available: <http://www.mso.anu.edu.au/~chfeder/pubs/sfr/sfr.html>

Mach 10 solenoidal driving

Mach 50 compressive driving



SFR_{ff} (simulation) = **0.14**

x52

SFR_{ff} (simulation) = **7.3**

SFR_{ff} (theory) = **0.15**

x52

SFR_{ff} (theory) = **7.8**

Theory and Simulations agree well.

Federrath & Klessen (2012)

The Star Formation Rate – Magnetic fields

Statistical Theory for the Star Formation Rate:

SFR ~ Mass/time freefall time mass fraction

$$\begin{aligned} \text{SFR}_{\text{ff}} &= \epsilon \int_{s_{\text{crit}}}^{\infty} \frac{t_{\text{ff}}(\rho_0)}{t_{\text{ff}}(\rho)} \frac{\rho}{\rho_0} p(s) \, ds = \epsilon \int_{s_{\text{crit}}}^{\infty} \exp\left(\frac{3}{2}s\right) p(s) \, ds \\ &= \frac{\epsilon}{2} \exp\left(\frac{3}{8}\sigma_s^2\right) \left[1 + \text{erf}\left(\frac{\sigma_s^2 - s_{\text{crit}}}{\sqrt{2}\sigma_s^2}\right) \right] \end{aligned}$$

$$p(s) = \frac{1}{\sqrt{2\pi\sigma_s^2}} \exp\left(-\frac{(s - s_0)^2}{2\sigma_s^2}\right)$$

$$s = \ln(\rho/\rho_0) \quad t_{\text{ff}}(\rho) = \left(\frac{3\pi}{32G\rho}\right)^{1/2}$$

MAGNETIC FIELD:

$$P_{\text{th}} \rightarrow P_{\text{th}} + P_{\text{mag}} \quad \mathcal{M} \rightarrow \mathcal{M} (1 + \beta^{-1})^{-1/2}$$

$$s_{\text{crit}} \propto \ln\left(\alpha_{\text{vir}} \mathcal{M}^2 \frac{\beta}{\beta + 1}\right)$$

$$\sigma_s^2 = \ln\left(1 + b^2 \mathcal{M}^2 \frac{\beta}{\beta + 1}\right)$$

$$\text{SFR}_{\text{ff}} = \text{SFR}_{\text{ff}}(\alpha_{\text{vir}}, b, \mathcal{M}, \beta)$$

(Padoan & Nordlund 2011; Molina et al. 2012)

$2E_{\text{kin}}/E_{\text{grav}}$

forcing

Mach number

plasma $\beta = P_{\text{th}}/P_{\text{mag}}$

Federrath & Klessen (2012)

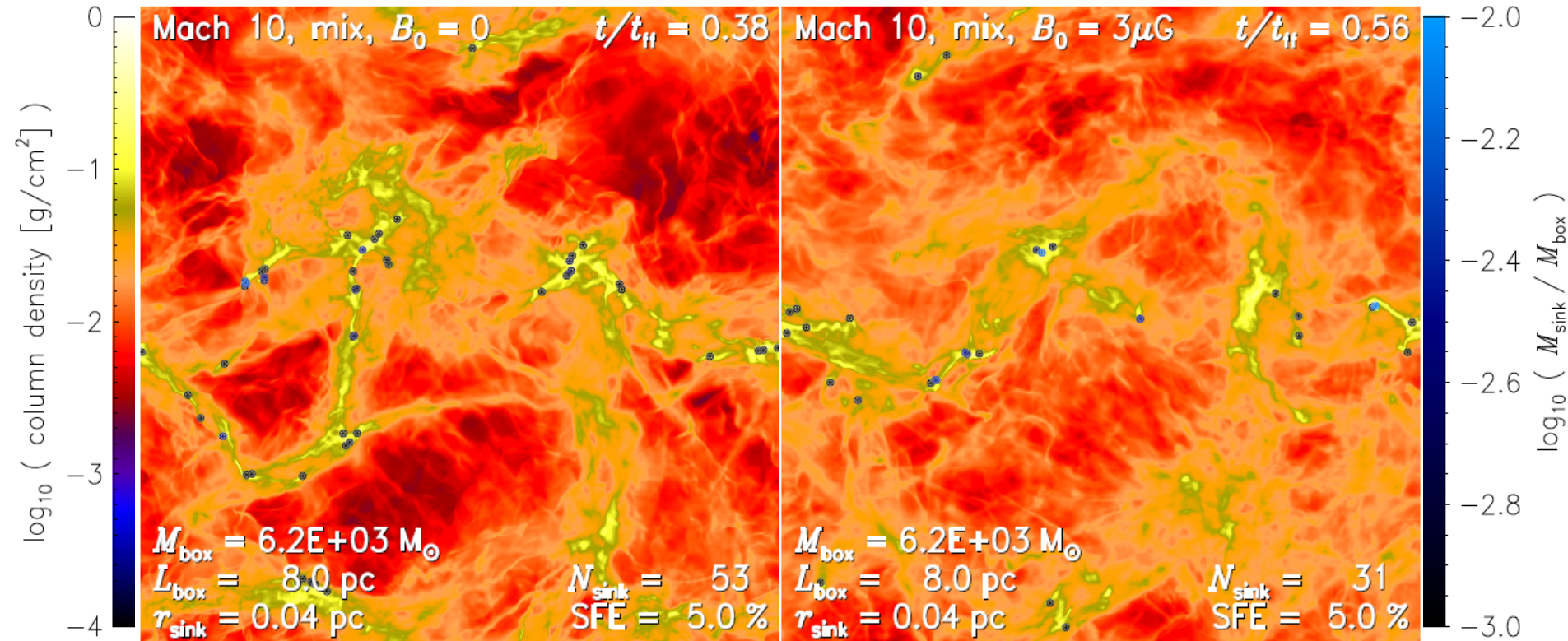
The Star Formation Rate – Magnetic fields

Numerical Test at Mach 10 with mixed forcing

Movies available: <http://www.mso.anu.edu.au/~chfeder/pubs/sfr/sfr.html>

$B=0$ ($M_A=\infty$, $\beta=\infty$)

$B=3\mu\text{G}$ ($M_A=2.7$, $\beta=0.2$)



$\text{SFR}_{\text{ff}}(\text{simulation}) = 0.46$

$\times 0.63$

$\text{SFR}_{\text{ff}}(\text{simulation}) = 0.29$

$\text{SFR}_{\text{ff}}(\text{theory}) = 0.45$

$\times 0.40$

$\text{SFR}_{\text{ff}}(\text{theory}) = 0.18$

Magnetic field reduces SFR and fragmentation (by factor ~2).

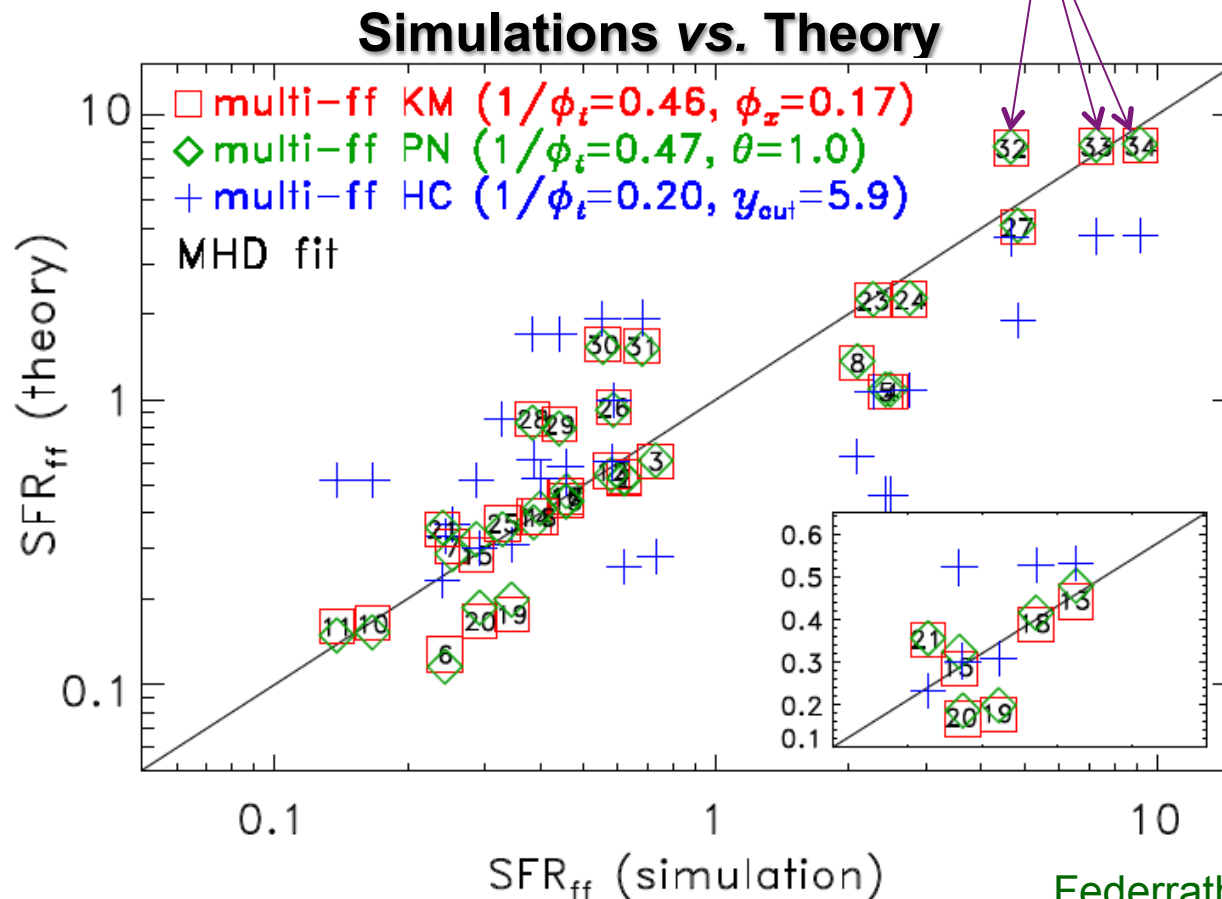
Federrath & Klessen (2012); see also Padoan & Nordlund (2011), Padoan et al. (2012)

The Star Formation Rate

Simulation study with

- cloud masses of $300 - 4 \times 10^6 M_{\odot}$
- solenoidal, mixed, and compressive forcing
- sonic Mach numbers 3 – 50
- Alfvén Mach numbers 1 – infinity

Convergence with numerical resolution



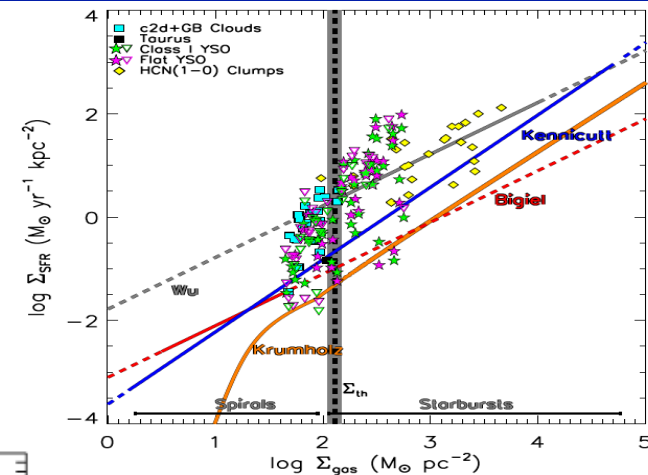
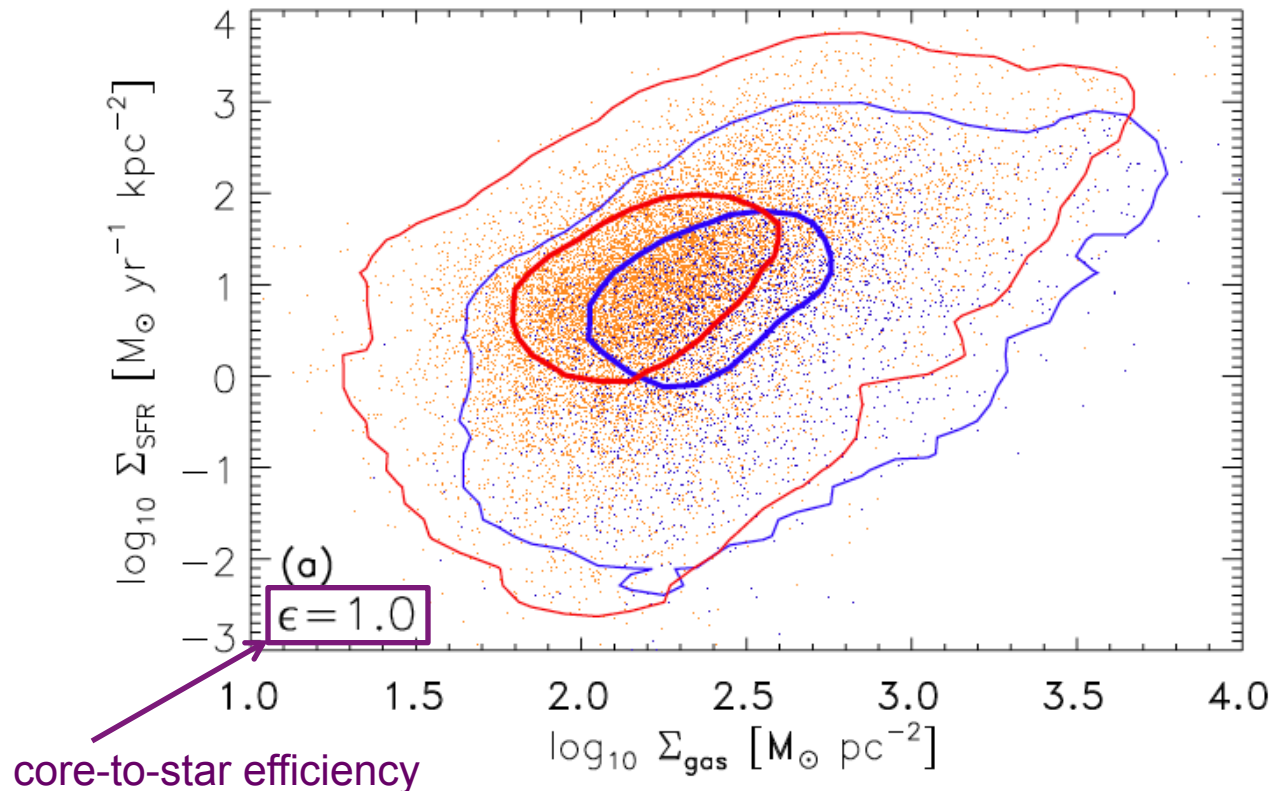
Federrath & Klessen (2012)

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Simulation study with

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- Alfvén Mach numbers 1 – infinity

Simulations vs. Observations



(Heiderman et al. 2010)

SFEs ~ 1-10% (Evans+2009;
Burkert & Hartmann 2013;
Federrath & Klessen 2013)

— GRAVTURB SFE=10%
— GRAVTURB SFE= 1%

Taurus ■
Class I YSO ☆▽
Flat YSO ☆▽
HCN(1-0) Clumps ◇
C2D+GB Clouds □

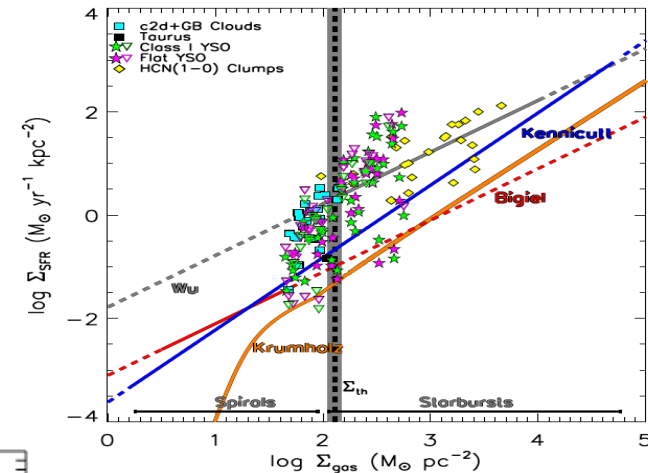
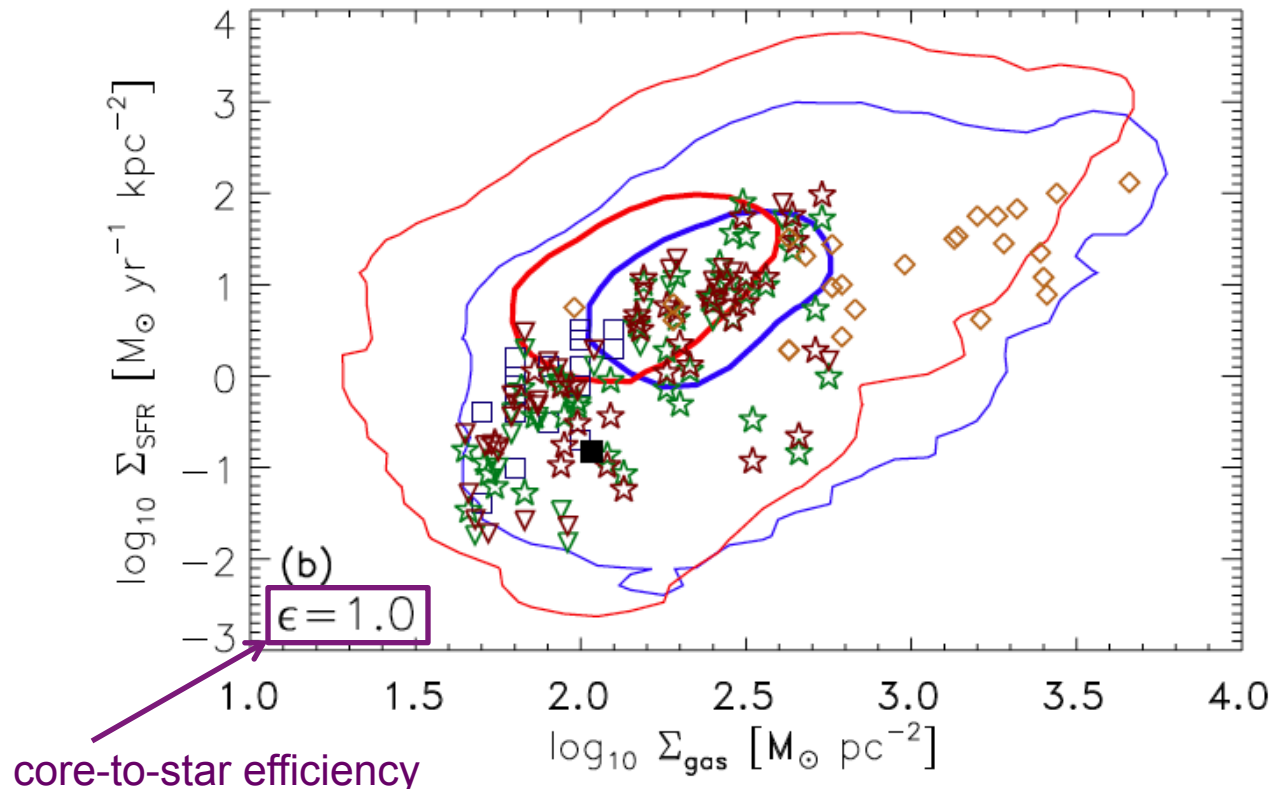
Federrath & Klessen (2012)

The Star Formation Rate

Simulation study with

- cloud masses of $300 - 4 \times 10^6 M_{\odot}$
- solenoidal, mixed, and compressive forcing
- sonic Mach numbers 3 – 50
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Simulations vs. Observations



(Heiderman et al. 2010)

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— GRAVITURB SFE=10%
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Taurus ■
Class I YSO ★
Flat YSO ★
HCN(1-0) Clumps ◇
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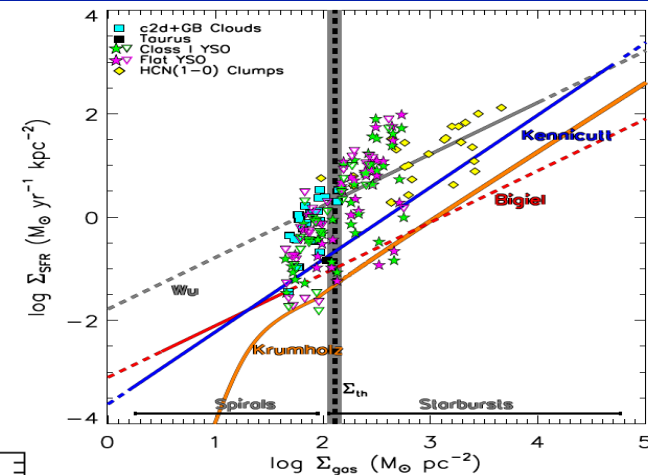
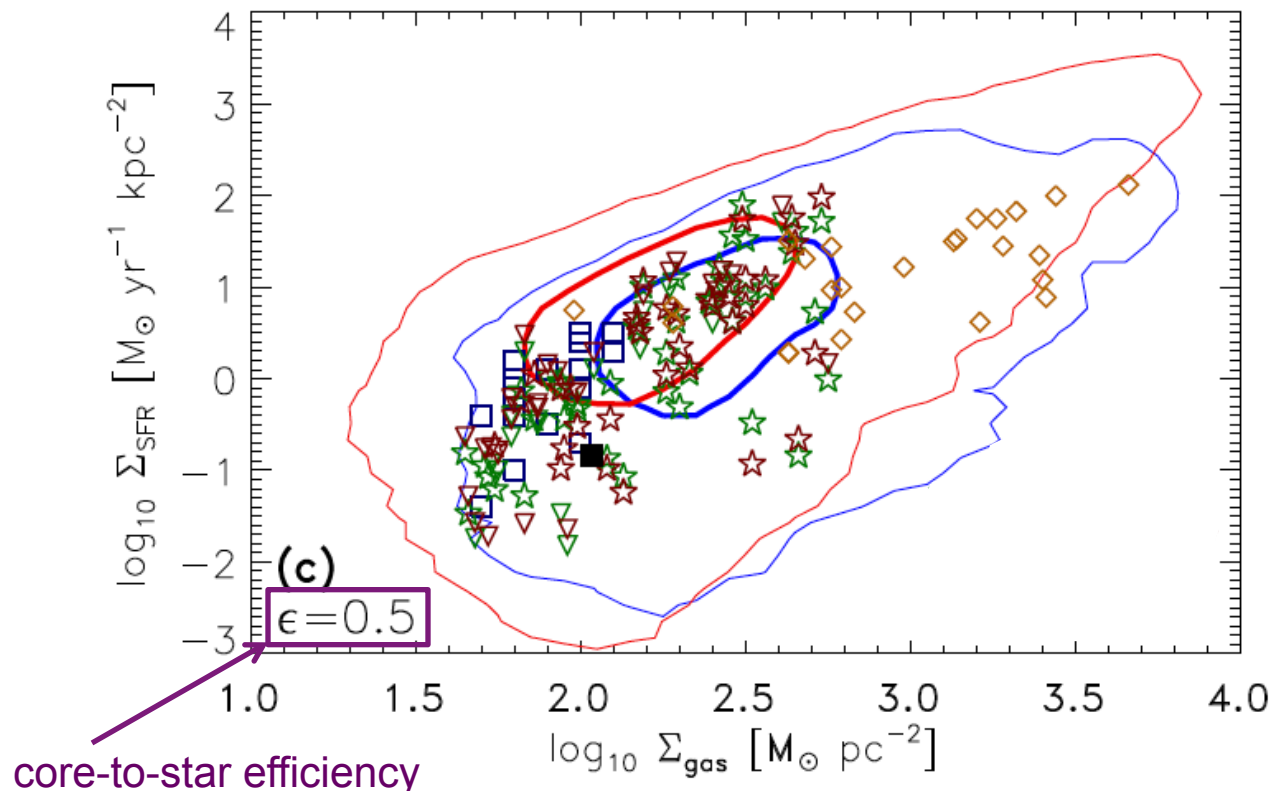
Federrath & Klessen (2012)

The Star Formation Rate

Simulation study with

- cloud masses of $300 - 4 \times 10^6 M_{\odot}$
- solenoidal, mixed, and compressive forcing
- sonic Mach numbers 3 – 50
- Alfvén Mach numbers 1 – infinity

Simulations vs. Observations



(Heiderman et al. 2010)

SFEs $\sim 1\text{-}10\%$ (Evans+2009;
Burkert & Hartmann 2013;
Federrath & Klessen 2013)

— GRAPTURB SFE=10%
— GRAPTURB SFE= 1%

Taurus ■
Class I YSO ★
Flat YSO ★
HCN(1-0) Clumps ◇
C2D+GB Clouds □

Federrath & Klessen (2012)

Turbulence \rightarrow Density PDF

Density PDF \rightarrow Star Formation Rate

Why is star formation so inefficient?

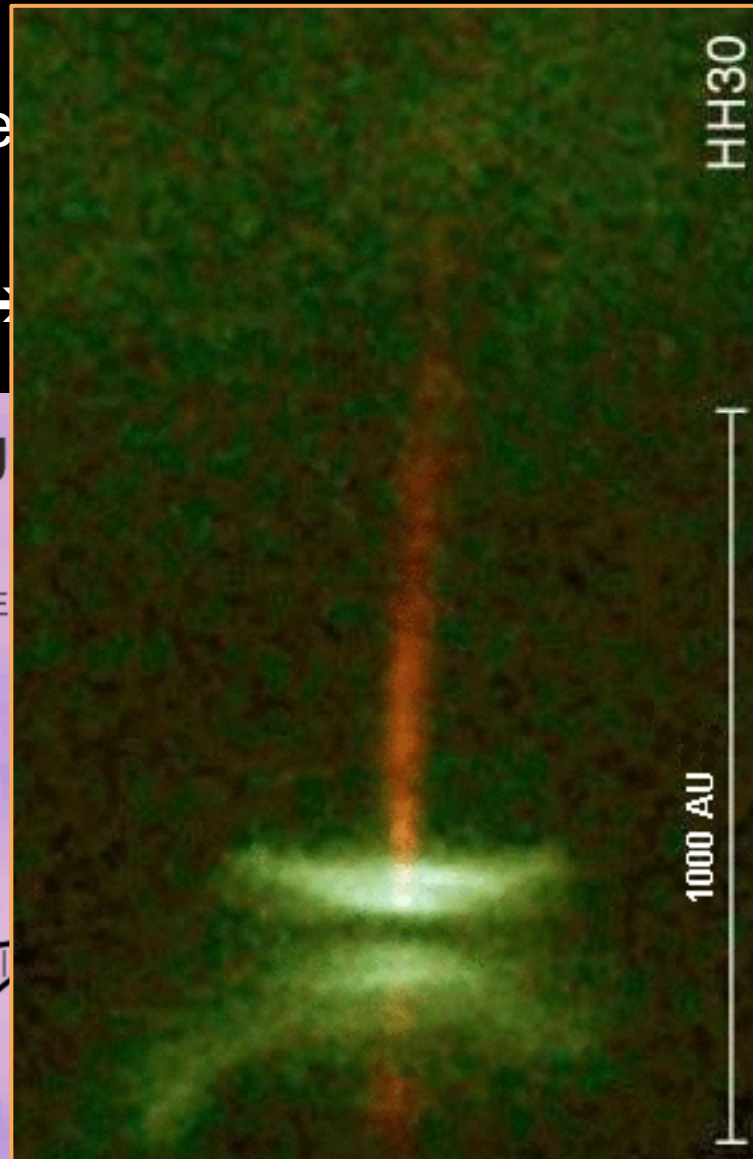
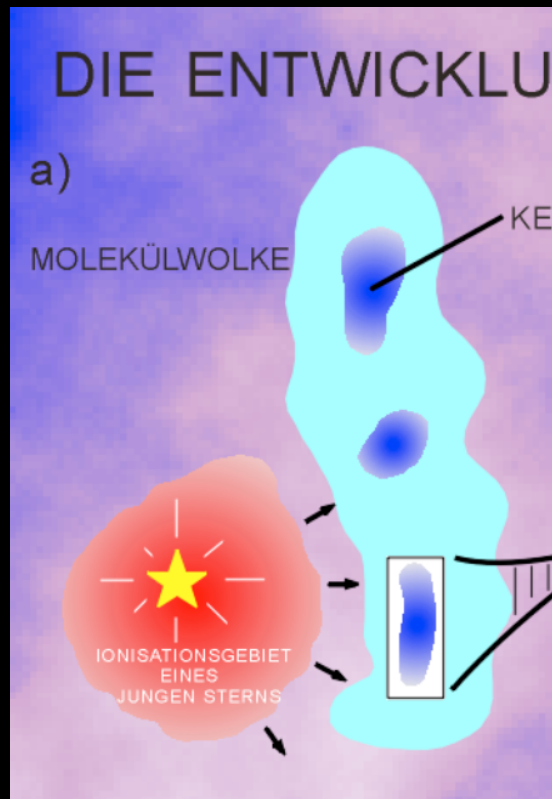


Turbulence → **Stars** → **Feedback**

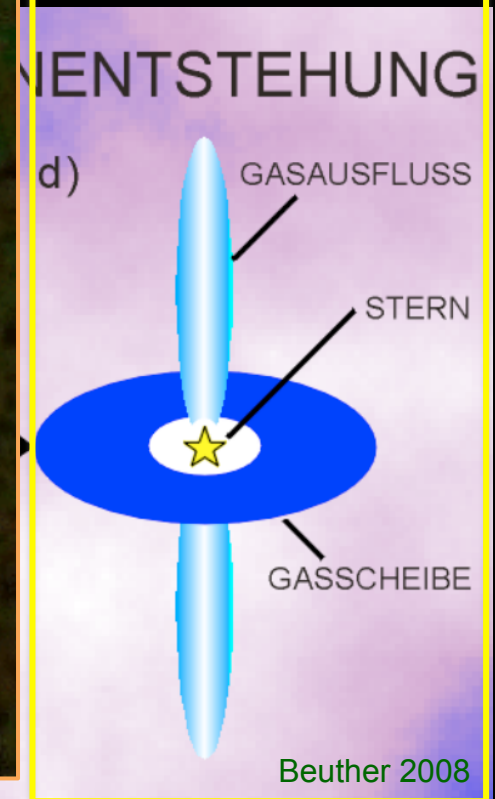
The diagram illustrates a cycle in star formation. It features three blue arrows: a straight arrow from 'Turbulence' to 'Stars', another straight arrow from 'Stars' to 'Feedback', and a long, curved arrow pointing from 'Feedback' back to 'Turbulence', completing the loop.

The

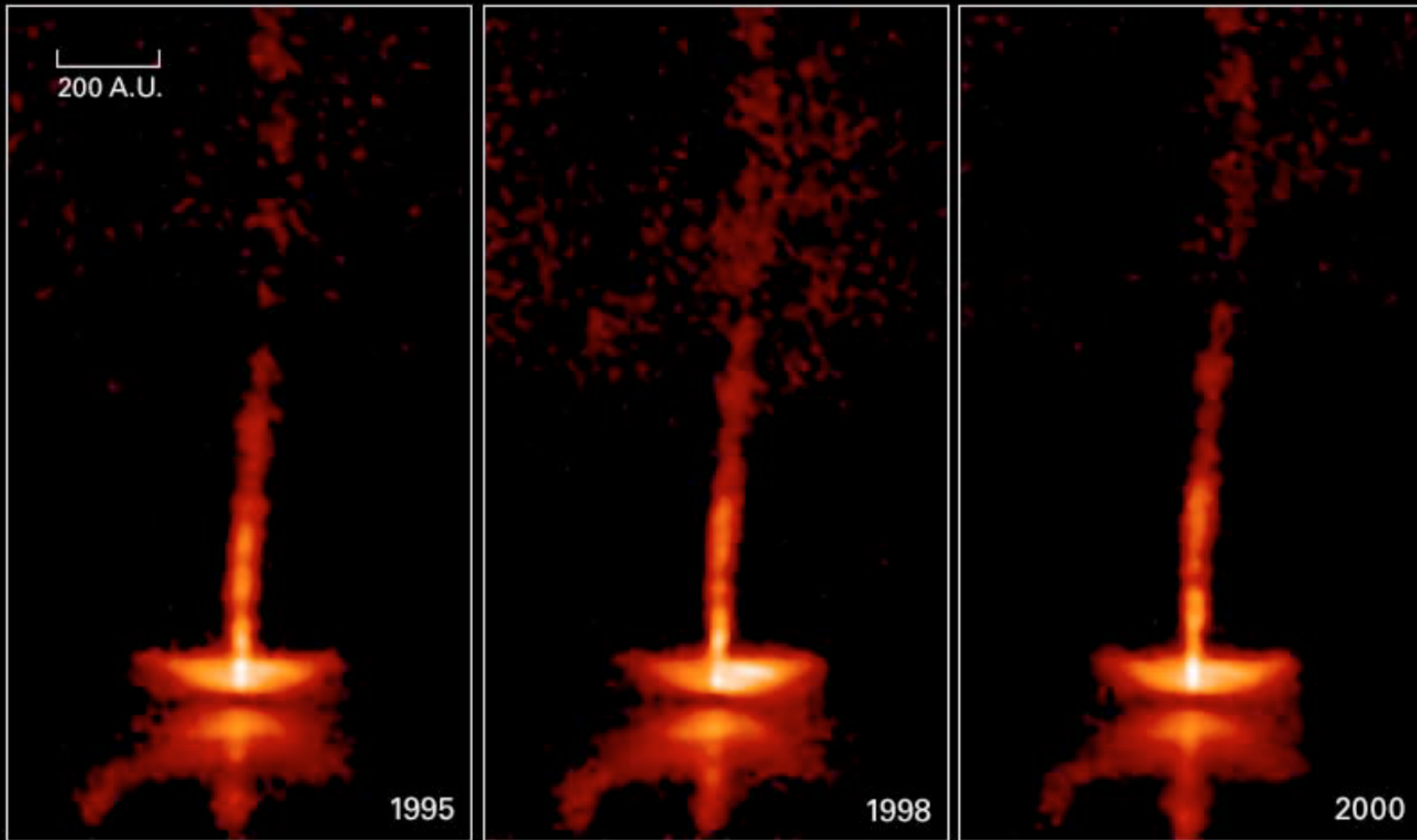
Clouds



Jet / Outflow



Jets and Outflows



The Dynamic HH 30 Disk and Jet

HST • WFPC2

NASA and A. Watson (Instituto de Astronomía, UNAM, Mexico) • STScI-PRC00-32b

Star Formation – Outflow/Jet Feedback

NGC1333

Image credit: Gutermuth & Porras



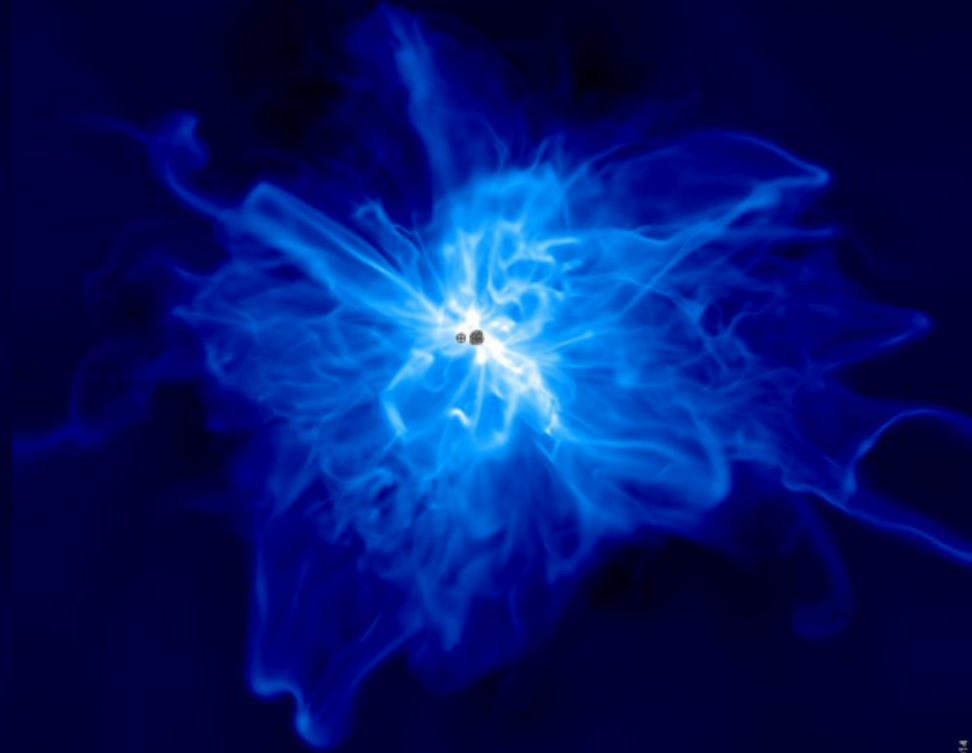
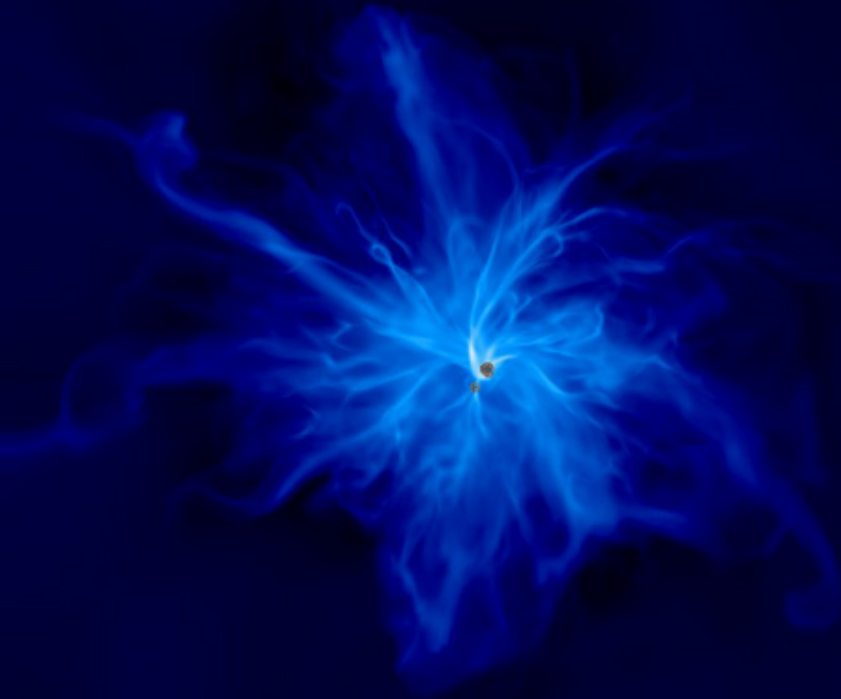
Star Formation – Outflow/Jet Feedback

Movies available: http://www.mso.anu.edu.au/~chfeder/pubs/outflow_model/outflow_model.html

No outflows

With outflows

$t/t_{\text{ff}} = 1.50$



$N_{\text{sink}} = 23$

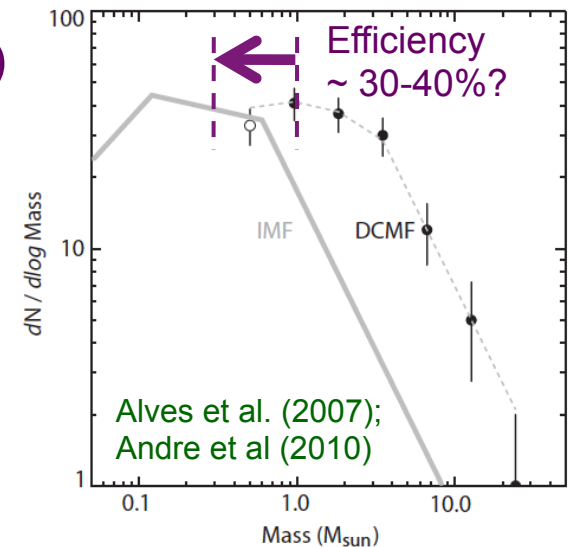
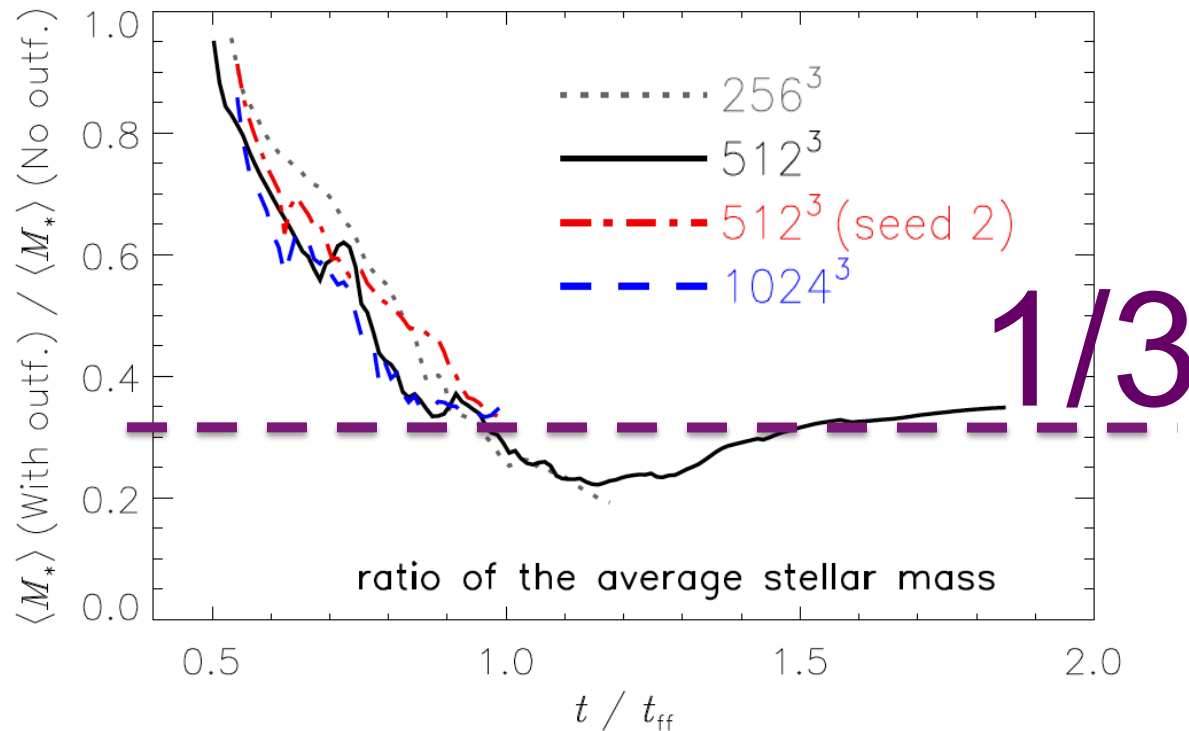
SFE = 87.6%

$N_{\text{sink}} = 49$

SFE = 59.0%

Federrath et al. 2014, ApJ 790, 128

The role of outflow/jet feedback for star cluster formation

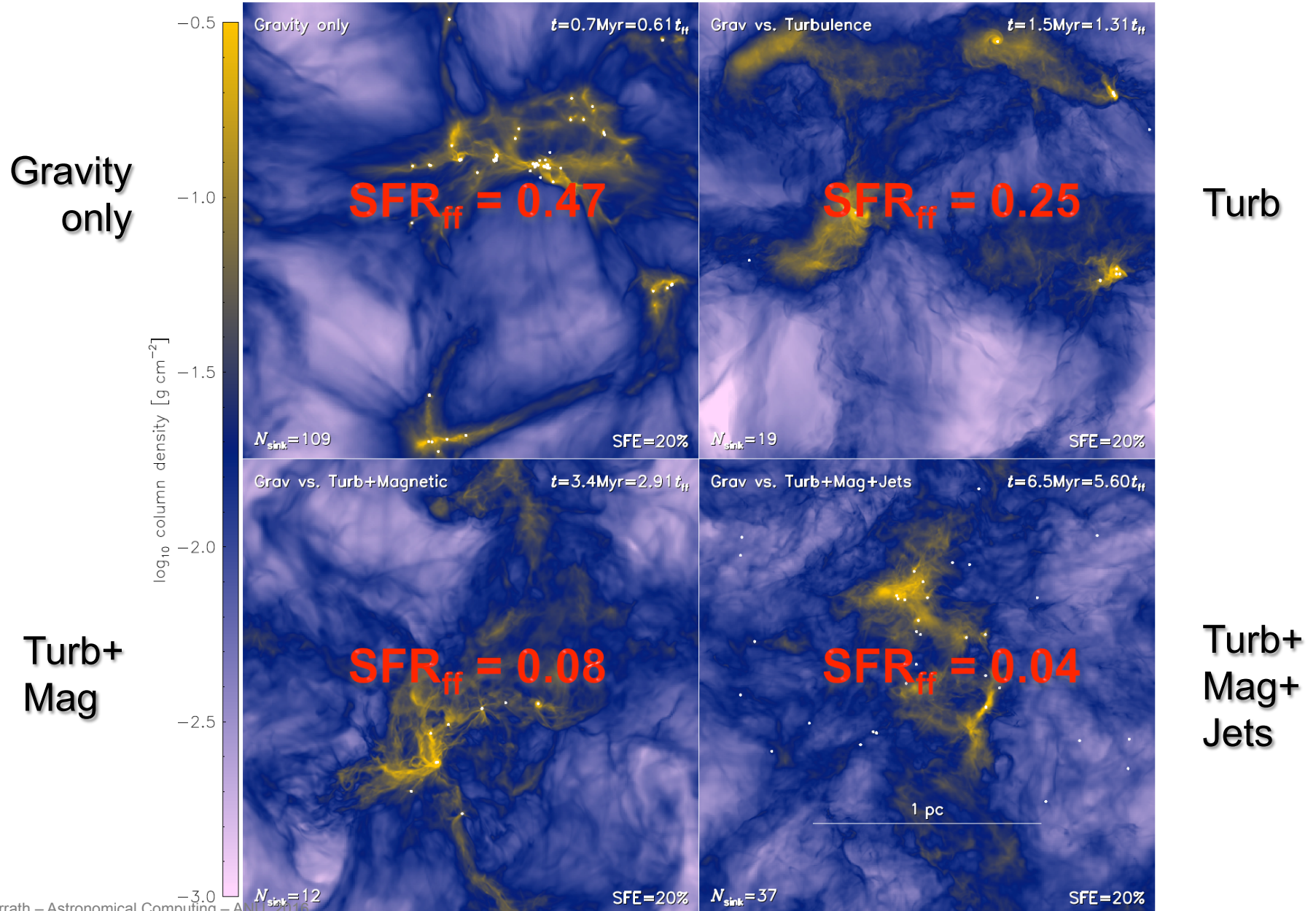


RESULTS:

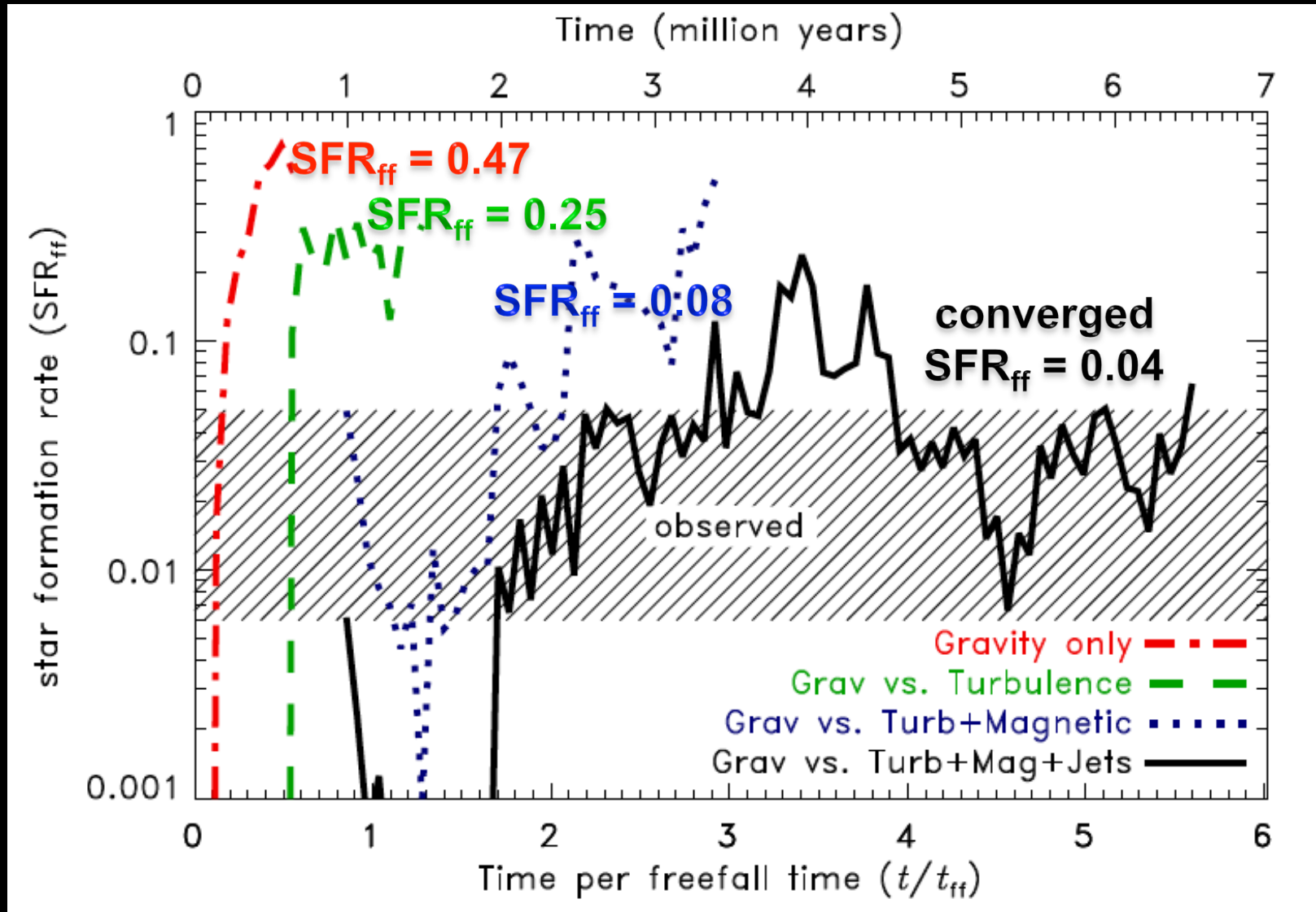
- Outflow/Jet feedback reduces the SFR by factor ~ 2
- Outflow/Jet feedback reduces average star mass by factor ~ 3

Why is Star Formation is so Inefficient?

Movies available: http://www.mso.anu.edu.au/~chfeder/pubs/ineff_sf/ineff_sf.html



Star Formation is Inefficient



- **Supersonic, magnetized turbulence** is key for **star formation**
 - SFR from density PDF depends on **virial parameter**, **forcing parameter**, **Mach number**, **plasma beta**
 - Very good agreement between theory, simulations and observations
- **Jet/outflow feedback** in star cluster formation:
 - Star formation rate reduced by $\sim 2x$
 - Average star mass reduced by $\sim 3x \rightarrow$ **Initial Mass Function!**
- Star Formation is **inefficient** \rightarrow
Only combination of **Turb+Mag+Feedback** gives realistic SFRs

Astronomical Computing

Introduction to Bash and shell scripting

Bash is a shell program designed to listen to my commands and do what I tell it to.

Bash is a simple tool in a vast toolbox of programs that lets me interact with my system using a text-based interface.

Distinguish *Interactive* and *Non-interactive* mode

Useful shell commands:

grep, rsync, redirect stdout/stderr, top, tail, cat, wc, nohup, screen, nice

Good Bash introduction: <http://guide.bash.academy>

Astronomical Computing

ASTR4004 / ASTR8004

*NEXT (FRIDAY 05/08): plotting with gnuplot,
remote computing (ssh, scp, rsync, nohup, ...)*