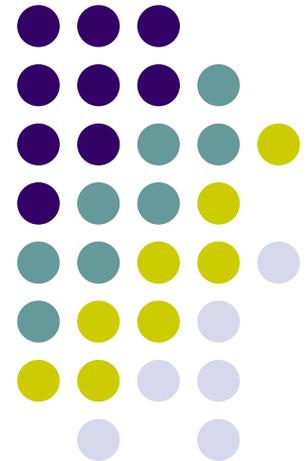
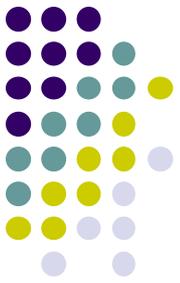


Optimized Radiative Transfer

Åke Nordlund
Niels Bohr Institute and
Center for Star and Planet Formation
University of Copenhagen

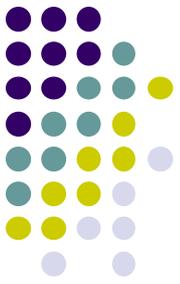


Four subtopics



1. Quantifying Kolmogorov
2. Multi-group RT
3. Optimizing and Parallelizing RT
4. Time-dependent RT

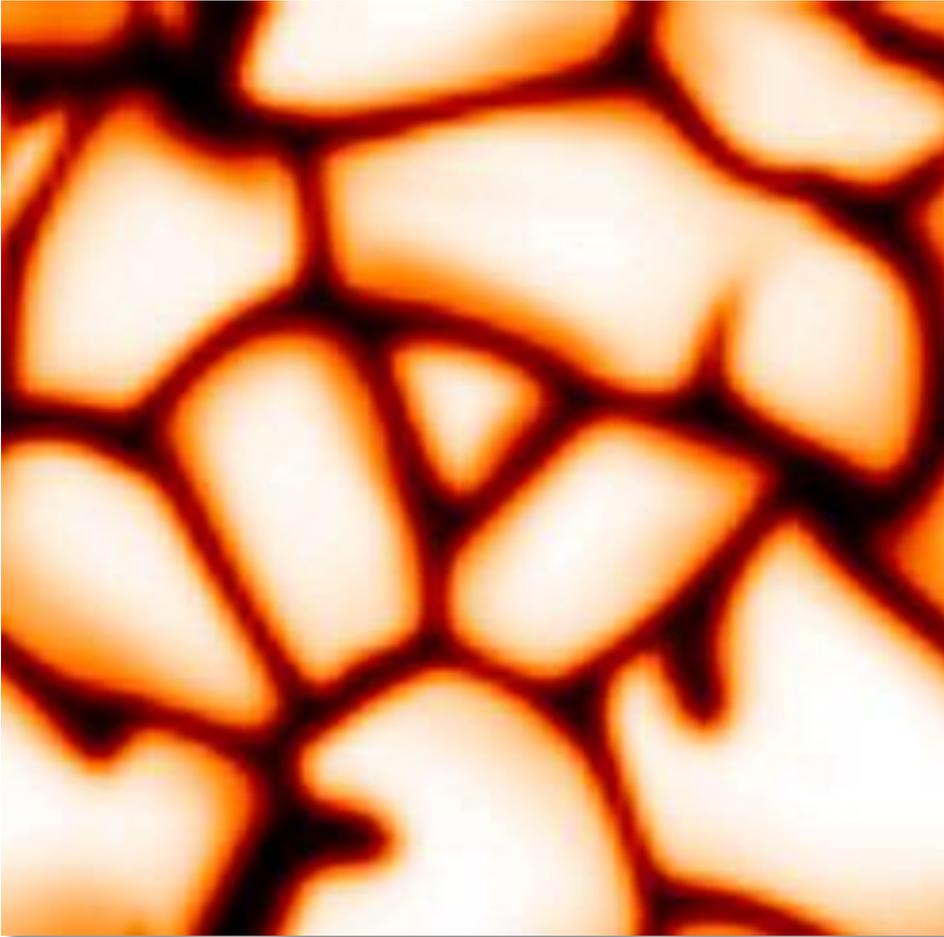
Quantifying Kolmogorov



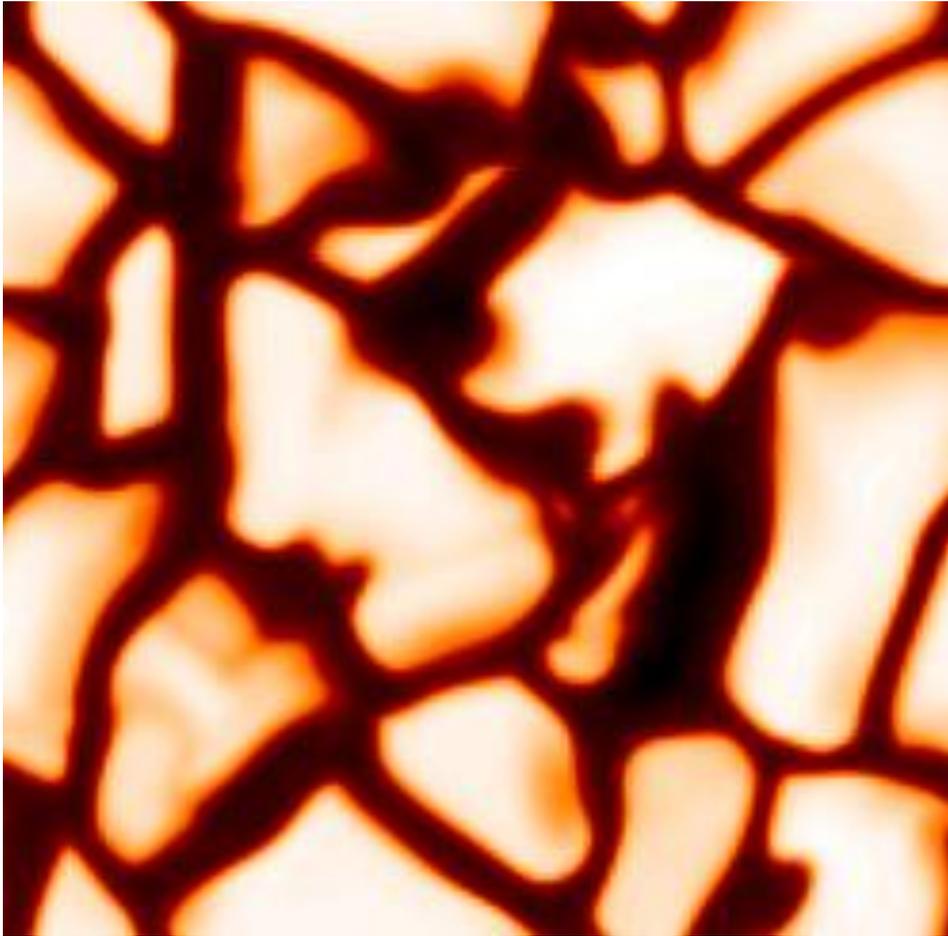
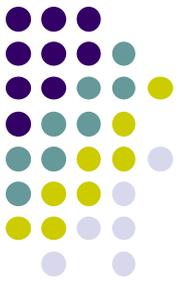
- Which resolution is "sufficient"?
- How can we know?
 - Solar convergence study
 - Can be compared **accurately** with the Sun
 - RT diagnostics

Emergent solar surface intensity

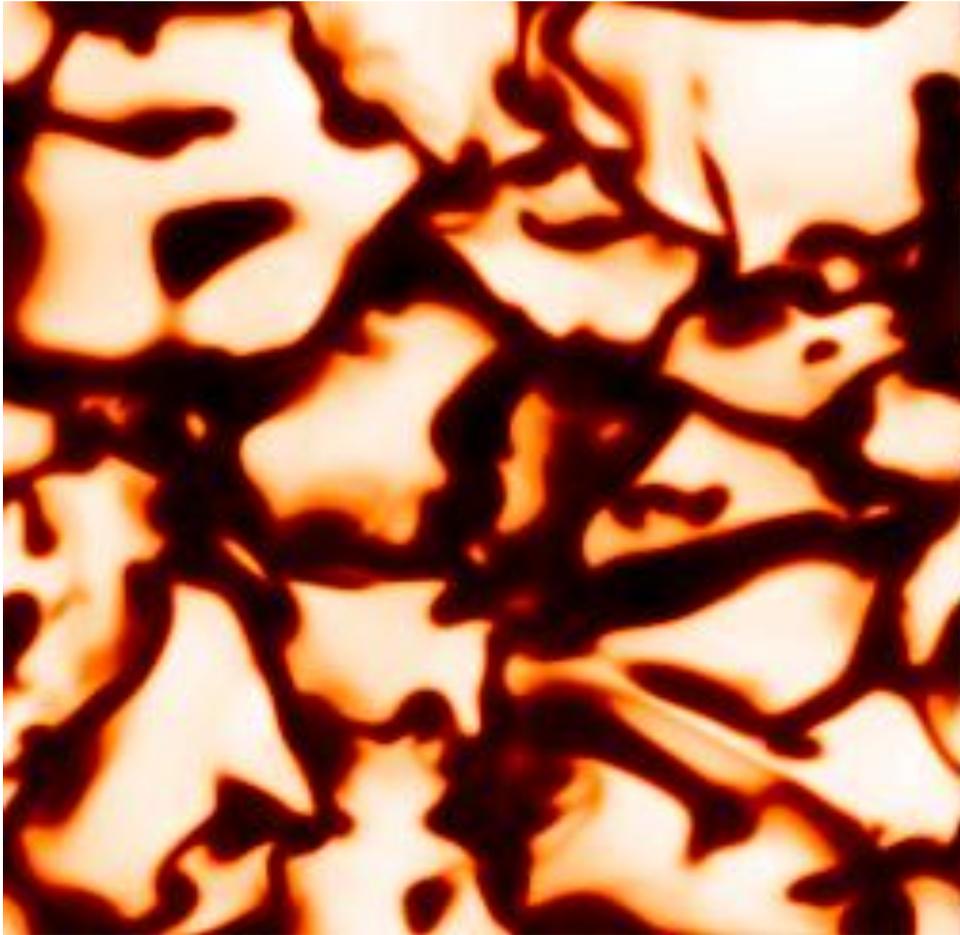
mesh size: 96 km



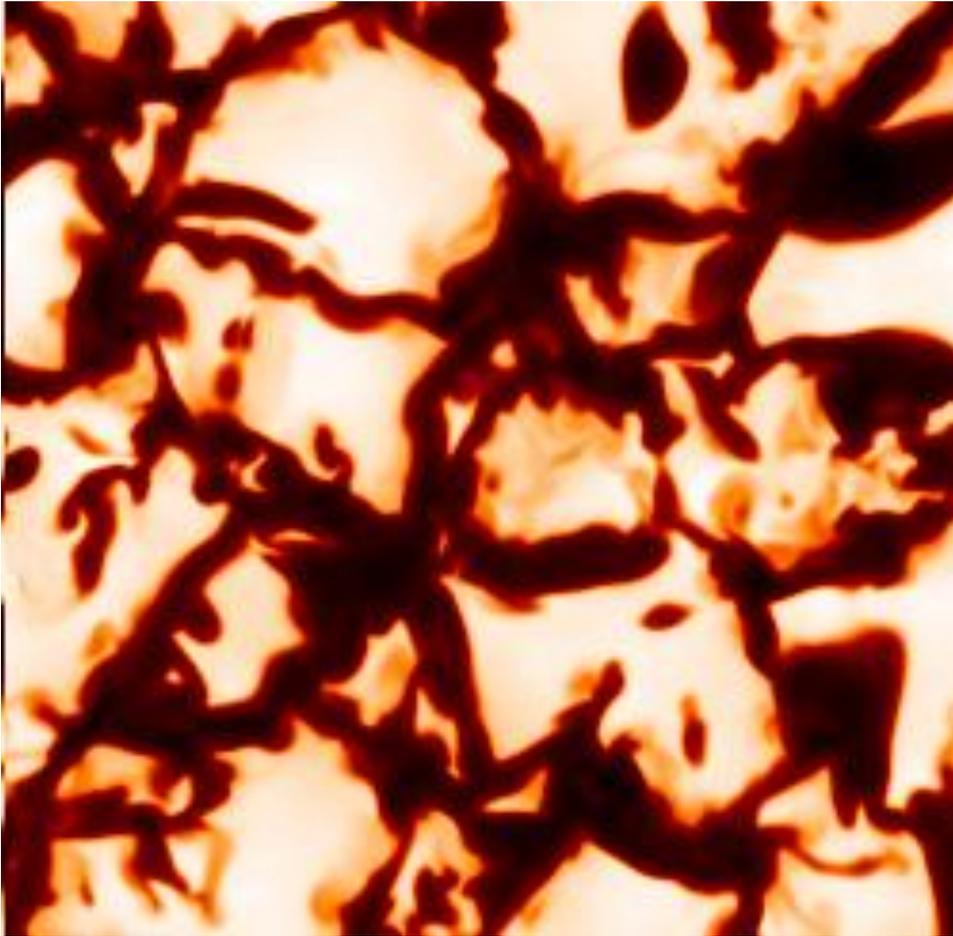
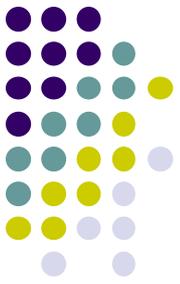
Emergent intensity mesh size: 48 km



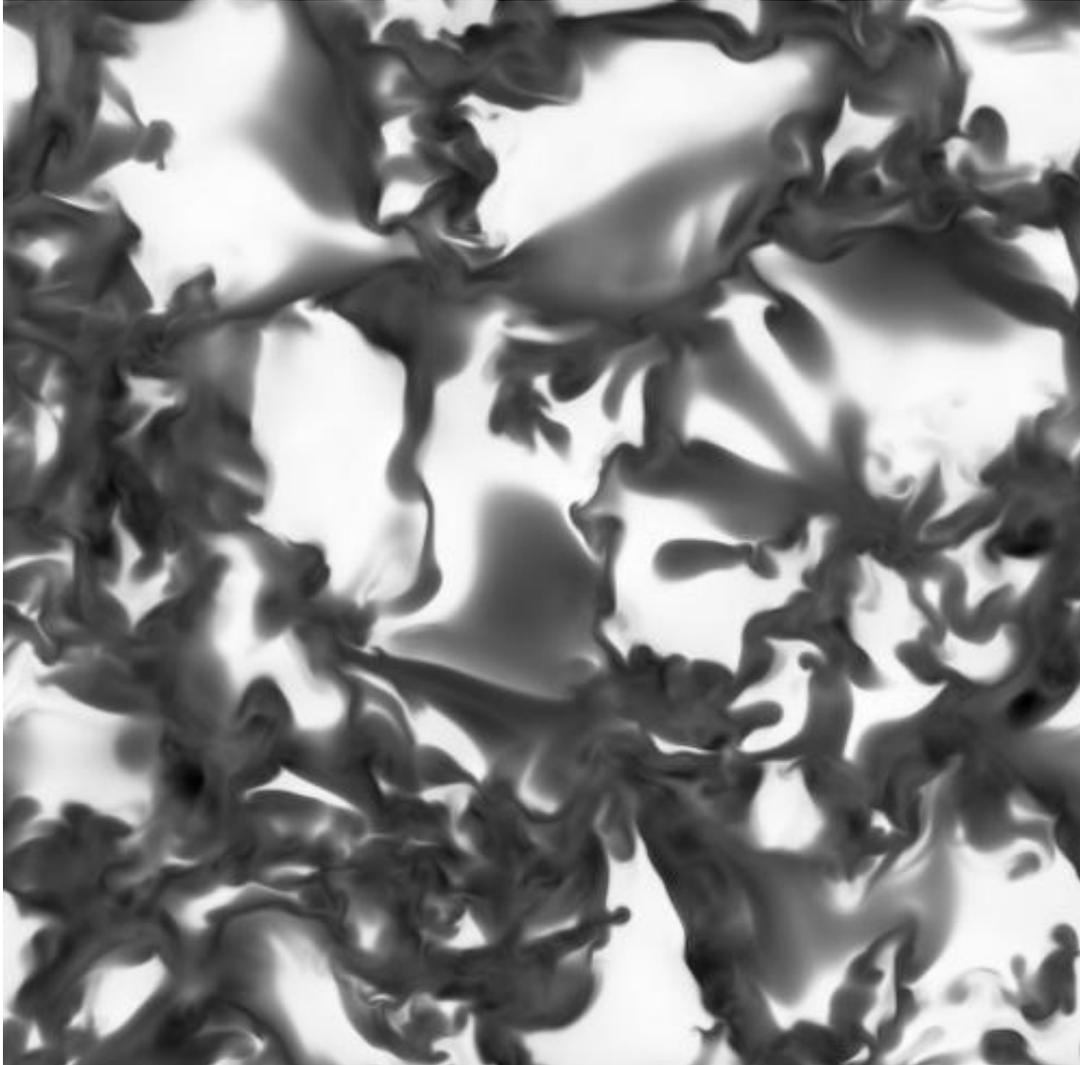
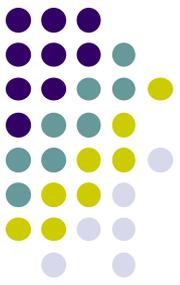
Emergent intensity mesh size: 24 km



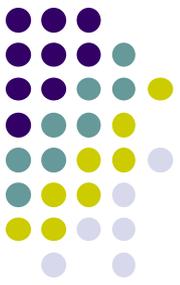
Emergent intensity mesh size: 12 km



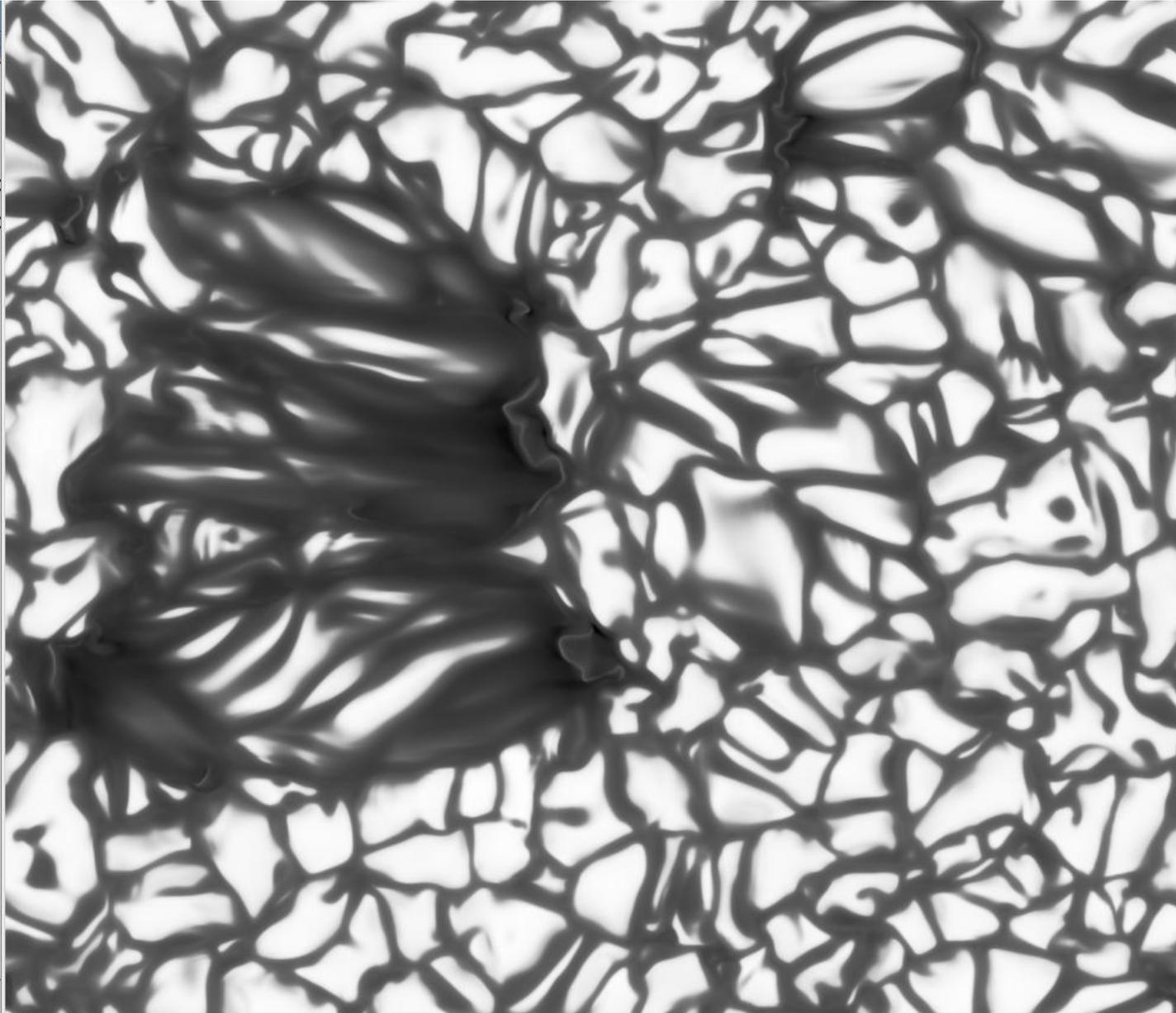
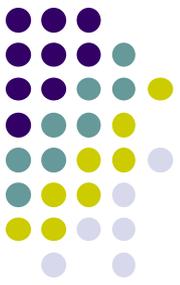
Temperature in continuum layers 12 km mesh size (504x504)



Temperature in continuum layers 6 km mesh size (1008x1008)



Active region emerging flux

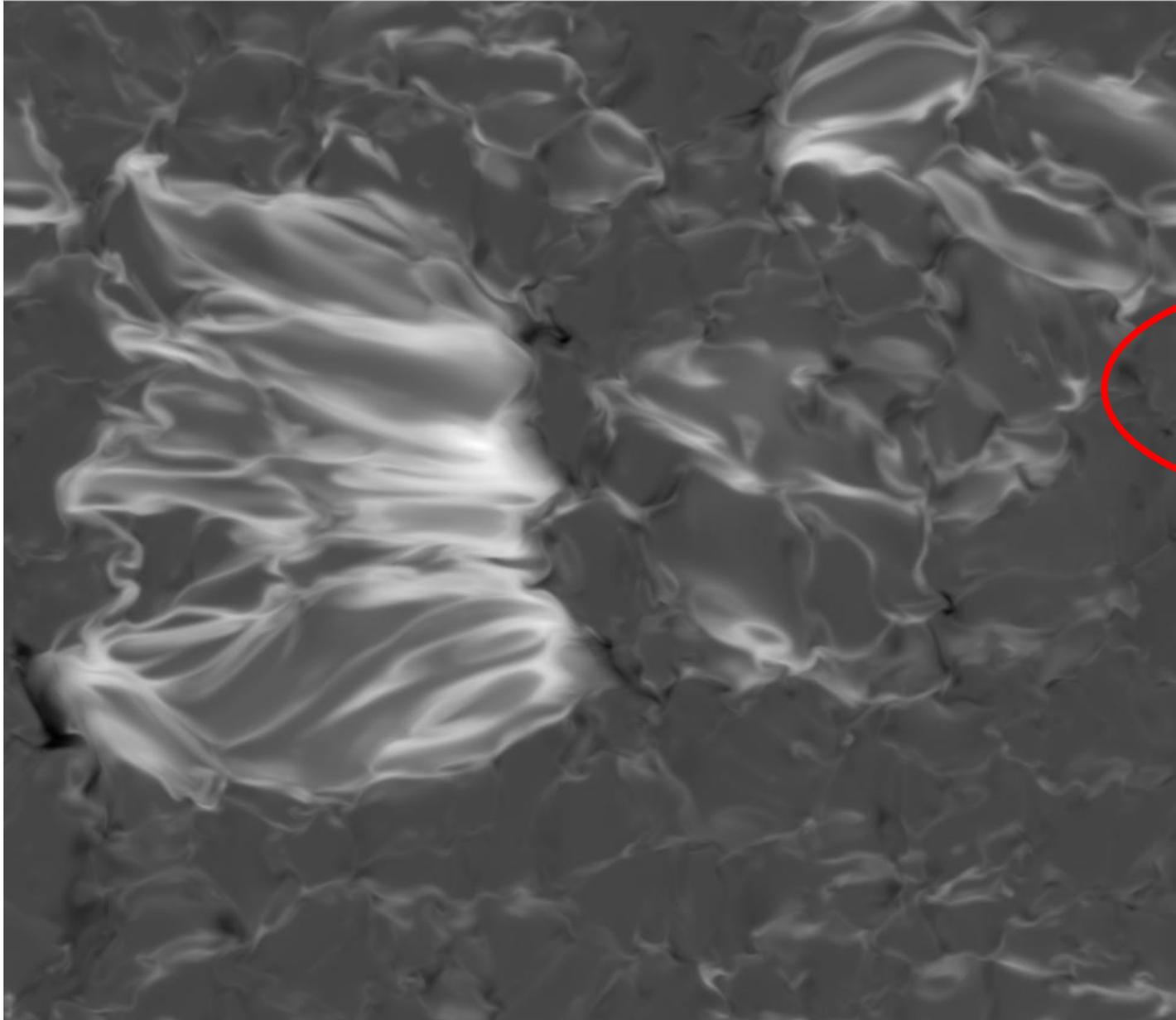


24x24x20 Mm

2000x2000x500

~12 km mesh

Active region emerging flux



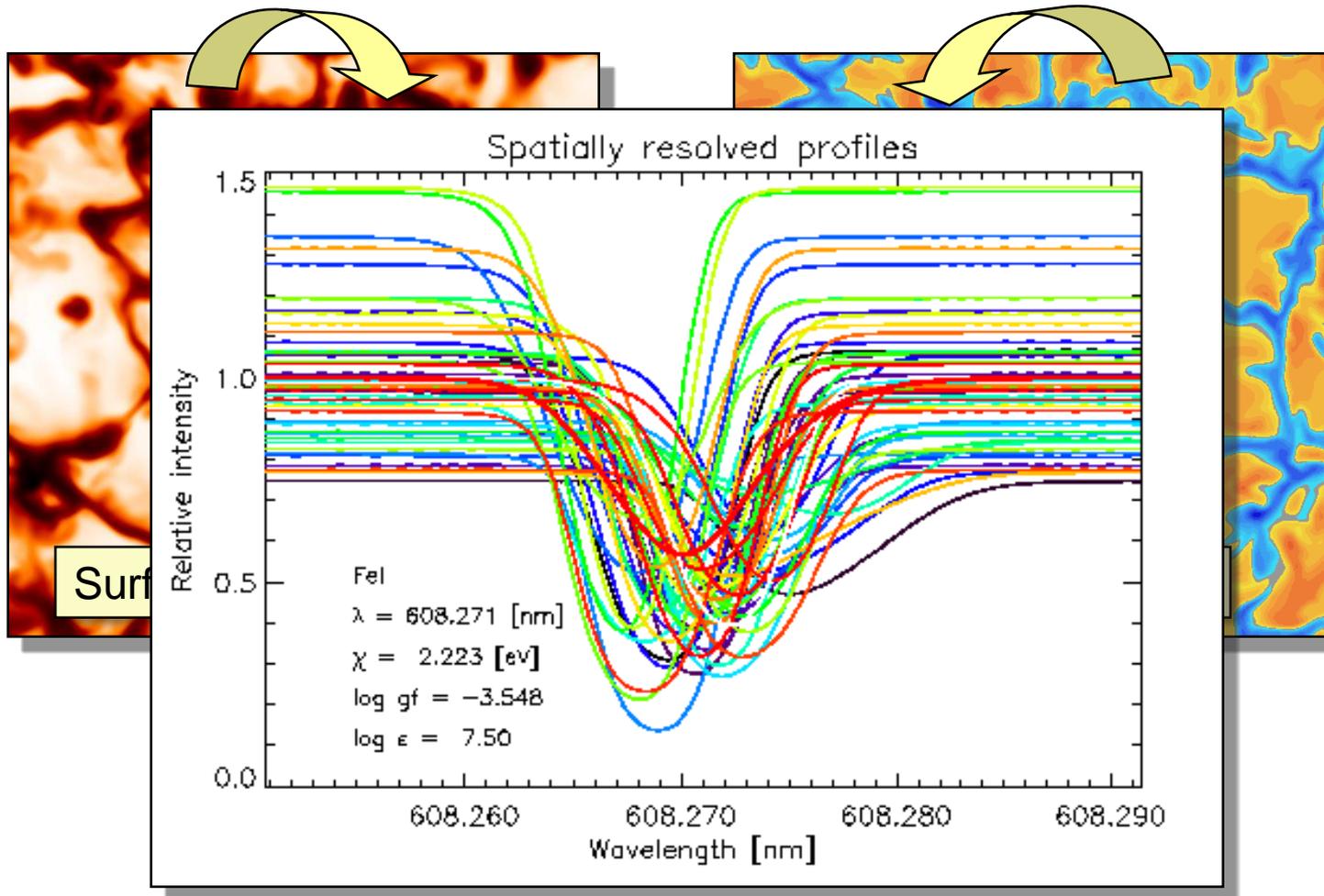
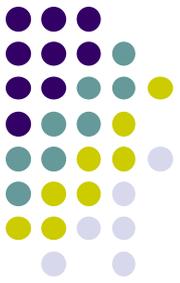
24x24x20 Mm

2000x2000x500

~12 km mesh

Synthetic spectral lines

Asplund et al (2002)



Spatially resolved spectral line profiles

Spectral line, with and w/o convective velocity field

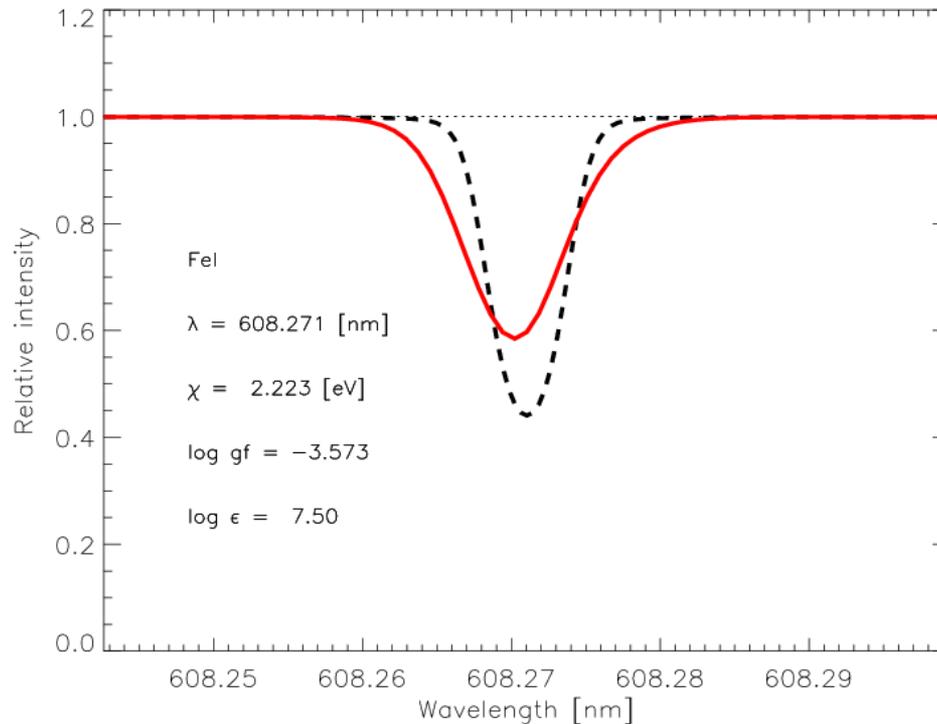
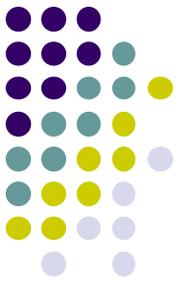
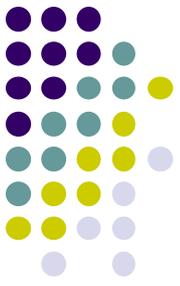


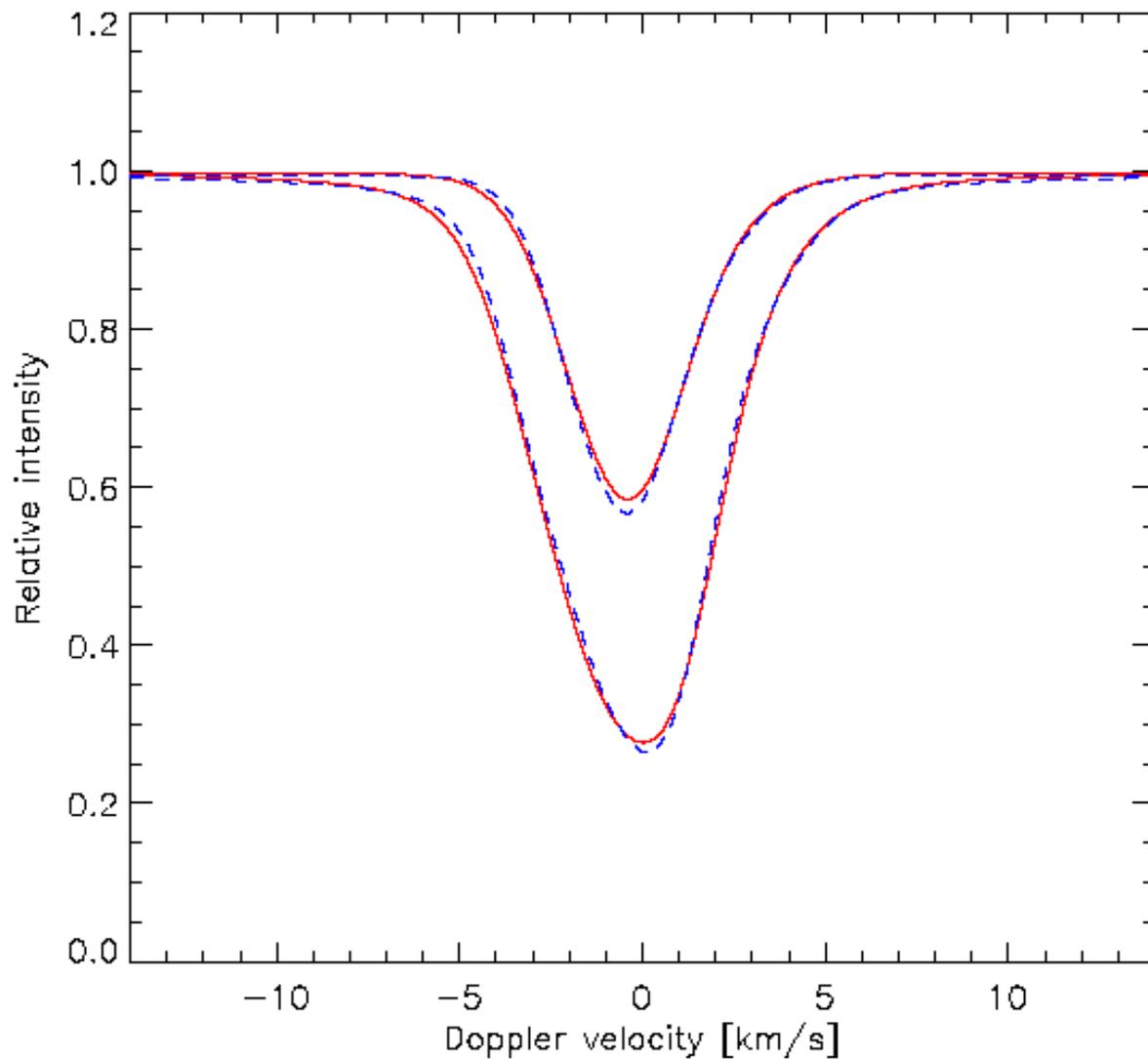
Figure 28: The predicted spatially and temporally averaged 3D LTE solar line profile of a typical Fe I line (solid line) compared with the corresponding calculation when ignoring all Doppler shifts arising from the photospheric velocity field (dashed line), demonstrating the importance of convective line broadening. The latter profile closely resembles 1D line profiles without application of the fudge parameters micro- and macroturbulence.

Synthetic spectral lines

Asplund et al (2002)



- Spectral line widths measure **velocity amplitudes**
- Convective blue-shifts and line shapes measure **temperature – velocity correlations**
- The total energy flux is what it is (\Rightarrow the solar luminosity)
 - **No free parameters!**
 - **Teff, log g, chemical abundancies \Rightarrow the Sun!**



**3-D resolution:
50x50x82 &
200x200x82**

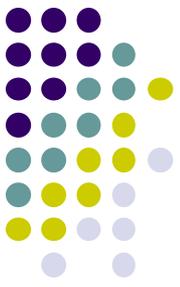
Fig. 5. The predicted Fe I 608.2 (weaker) and 621.9 nm (stronger) lines at two different resolutions of the solar convection simulation: $200 \times 200 \times 82$ (solid) and $50 \times 50 \times 82$ (dashed). All profiles have been computed with $\log \epsilon_{\text{Fe}} = 7.50$

This is a wonderful case; a test of the 'very large R_e ' limit!

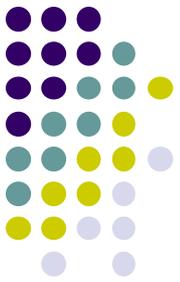


- The Sun:
 - has a **huge R_e** , and
 - knows how to 'compute' convection correctly
- The models:
 - have **only moderate R_e** , but
 - have realistic EOS, and detailed radiative transfer
 - "no free parameters"; fixed at solar values
- **The models and the Sun agree to fraction of %!**
 - Dravins & ÅN (1990), Asplund et al (2000)

Why is this evidence that nothing happens at $Re = 10^{xx}$?

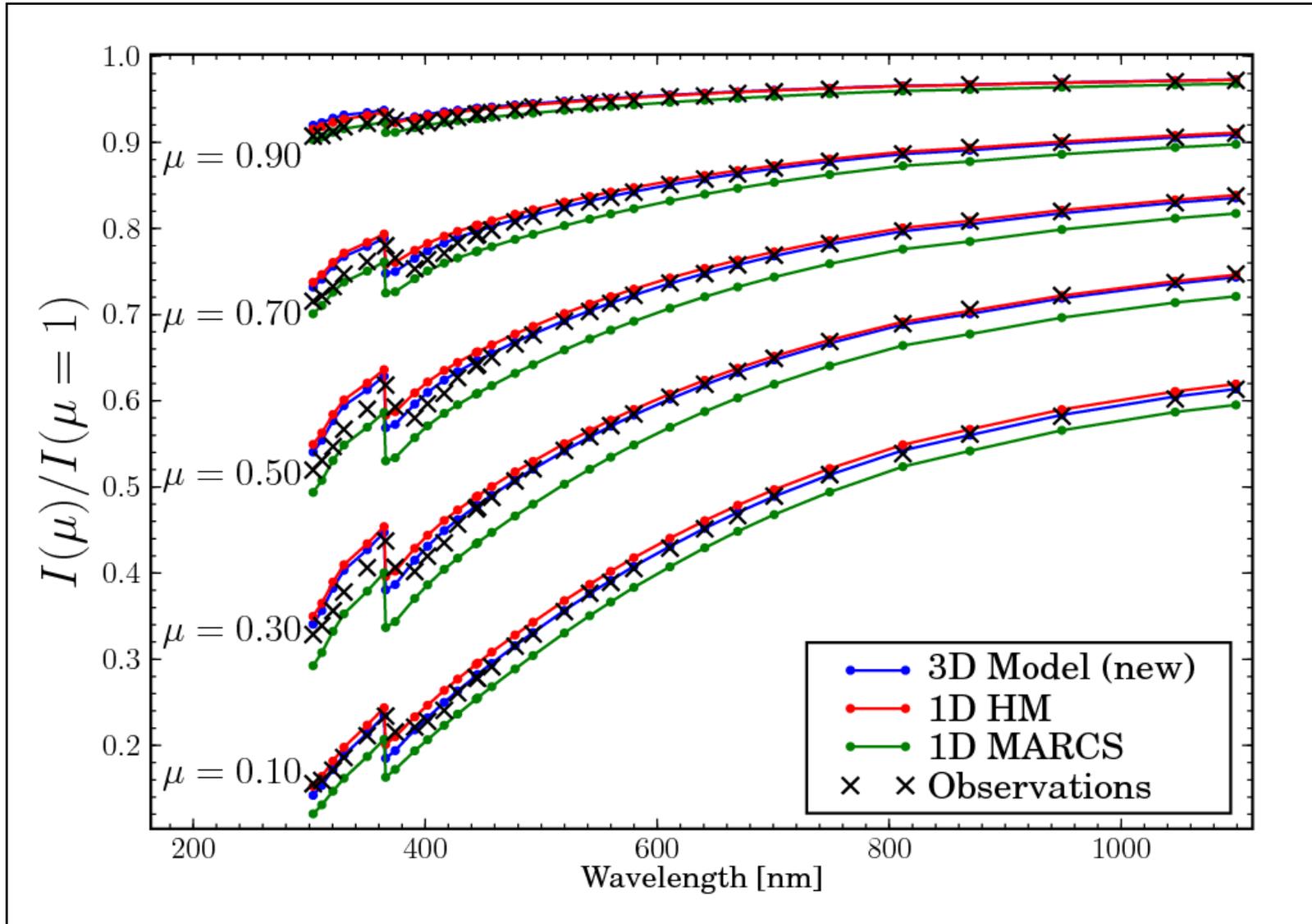


- What if turbulent dissipation had a transition to values different from those at moderate Re ?
- The result would be a different balance btw buoyancy work and turbulent dissipation
 - Less dissipation \Rightarrow higher velocity, lower ΔT
 - More dissipation \Rightarrow lower velocity, higher ΔT
- Both line widths and line shifts would change!
 - **Would be inconsistent with observations!**



Multi-group Radiative Transfer

Pereira, Asplund & Trampedach (2009, in prep.)



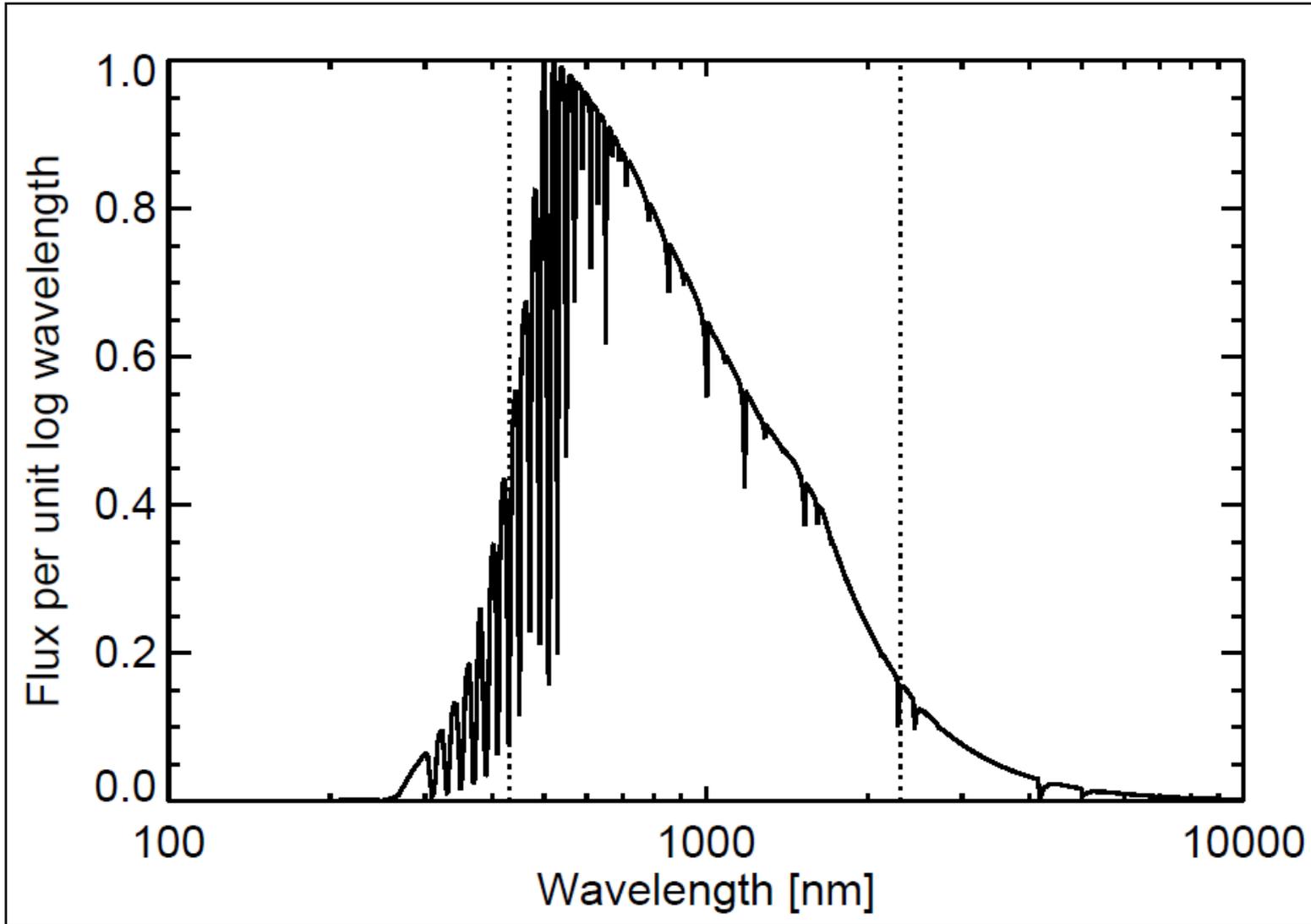
Basic radiative transfer; frequency dependence



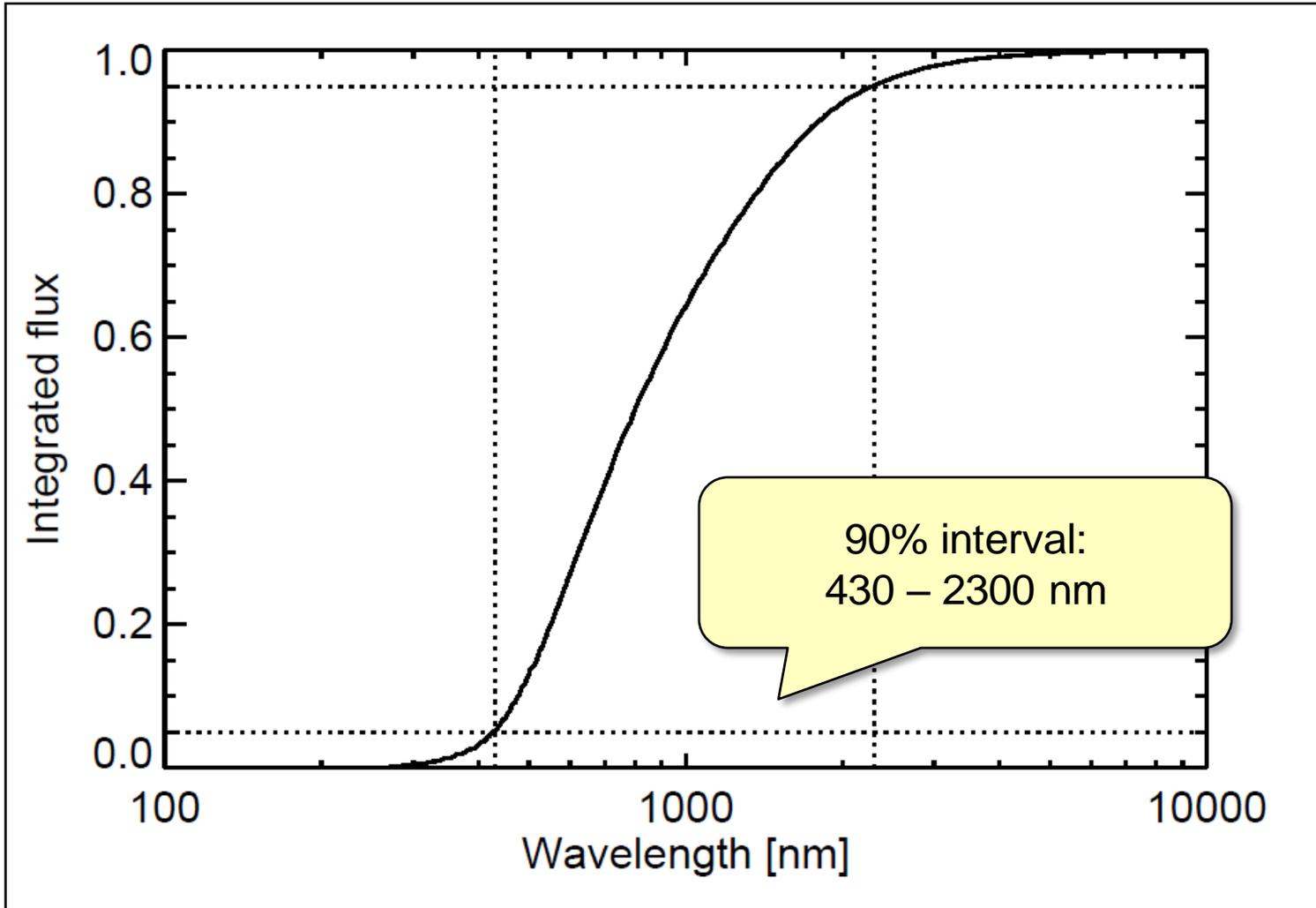
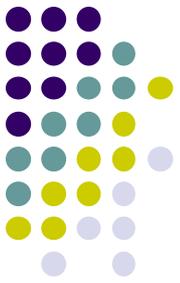
$$Q_{rad} = \int_{\nu} \rho K_{\nu} (J_{\nu} - S_{\nu}) d\nu$$

- The mean intensity **J - S**
 - goes inversely as the square of the opacity at large optical depth (diffusion limit)
 - is \sim independent of opacity at low optical depth

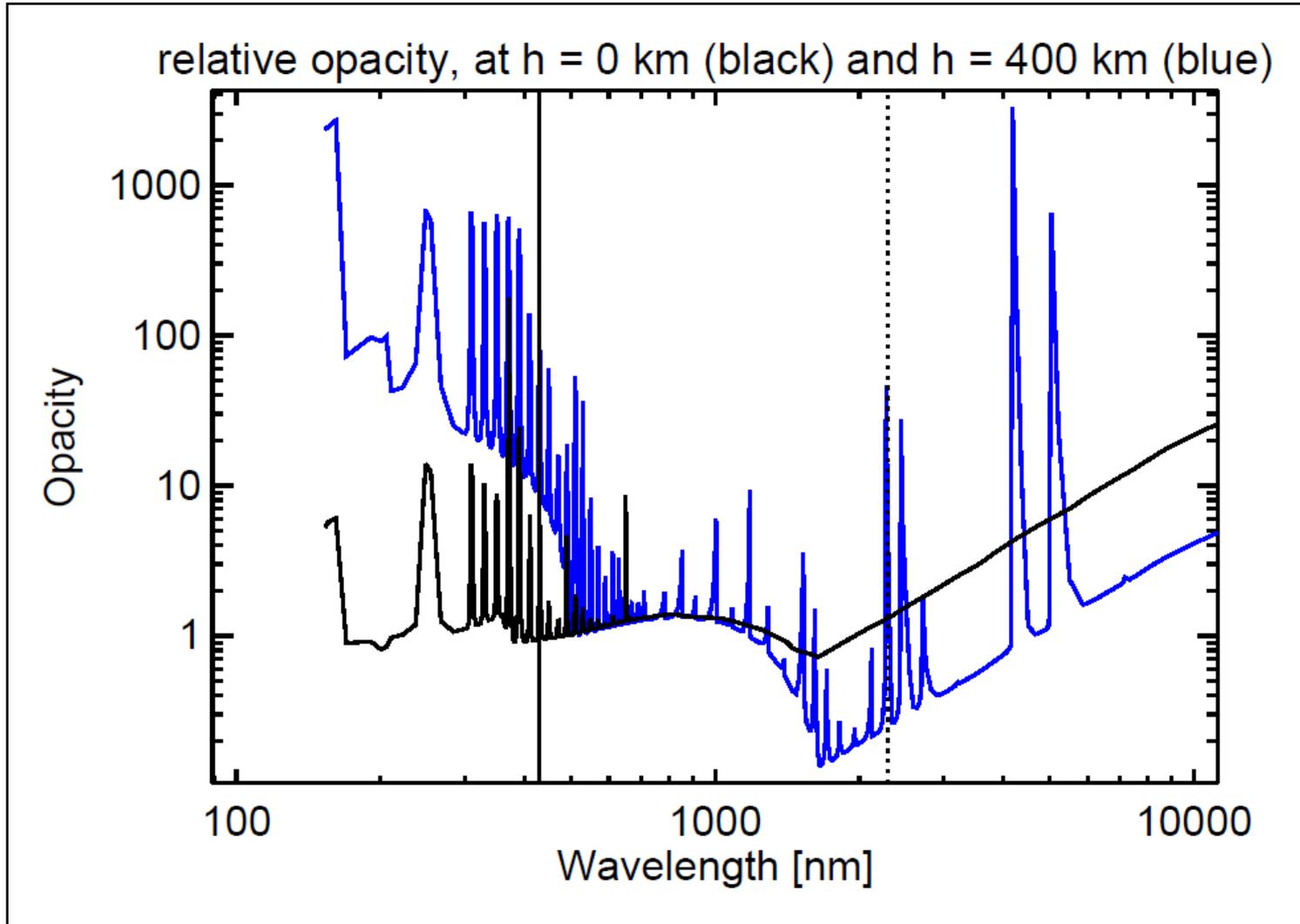
Solar flux; energy per unit log interval



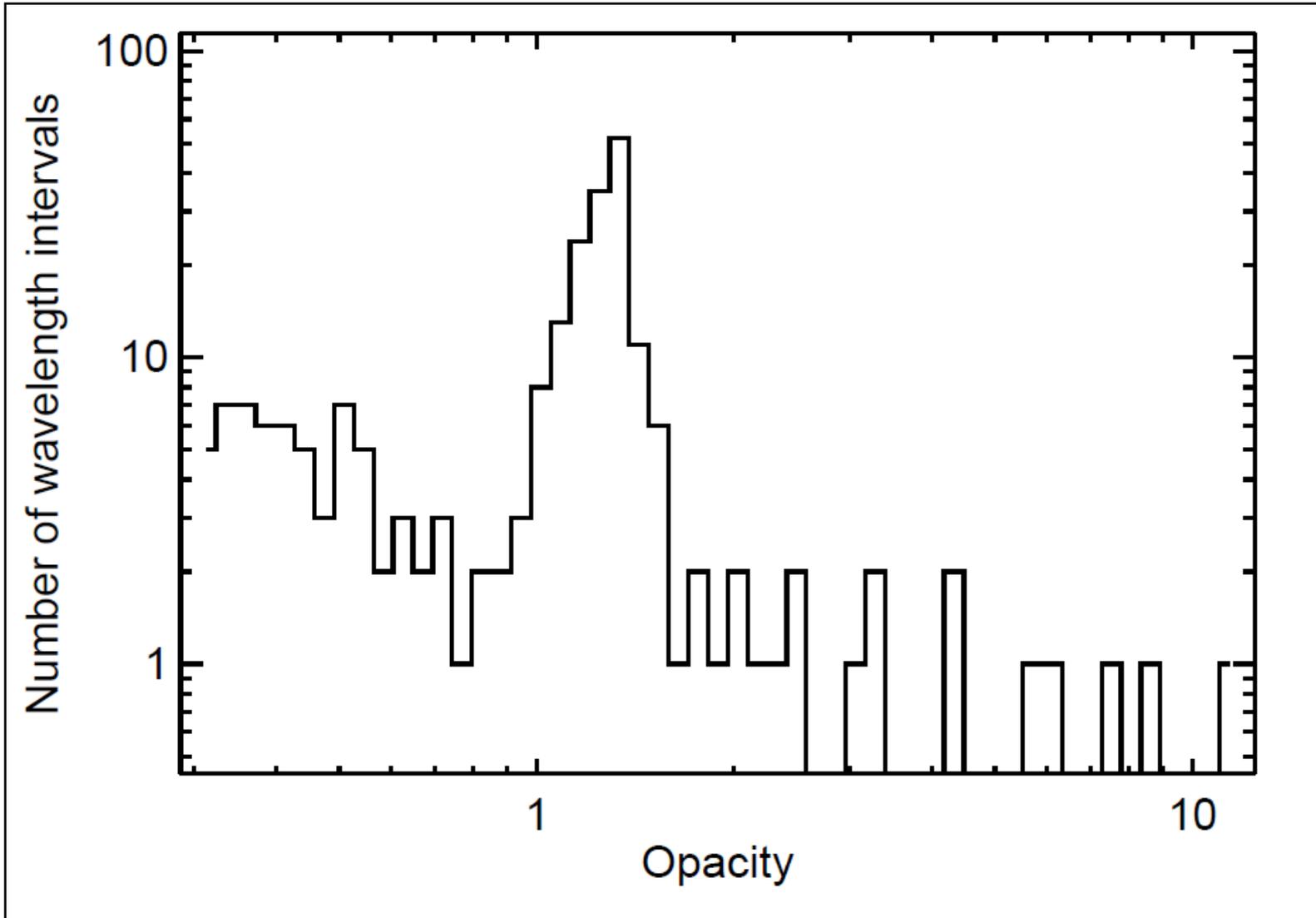
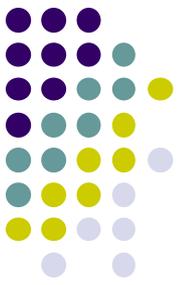
Integrated solar flux



Wavelength dependencies at $h=0$ and $h=400$ km

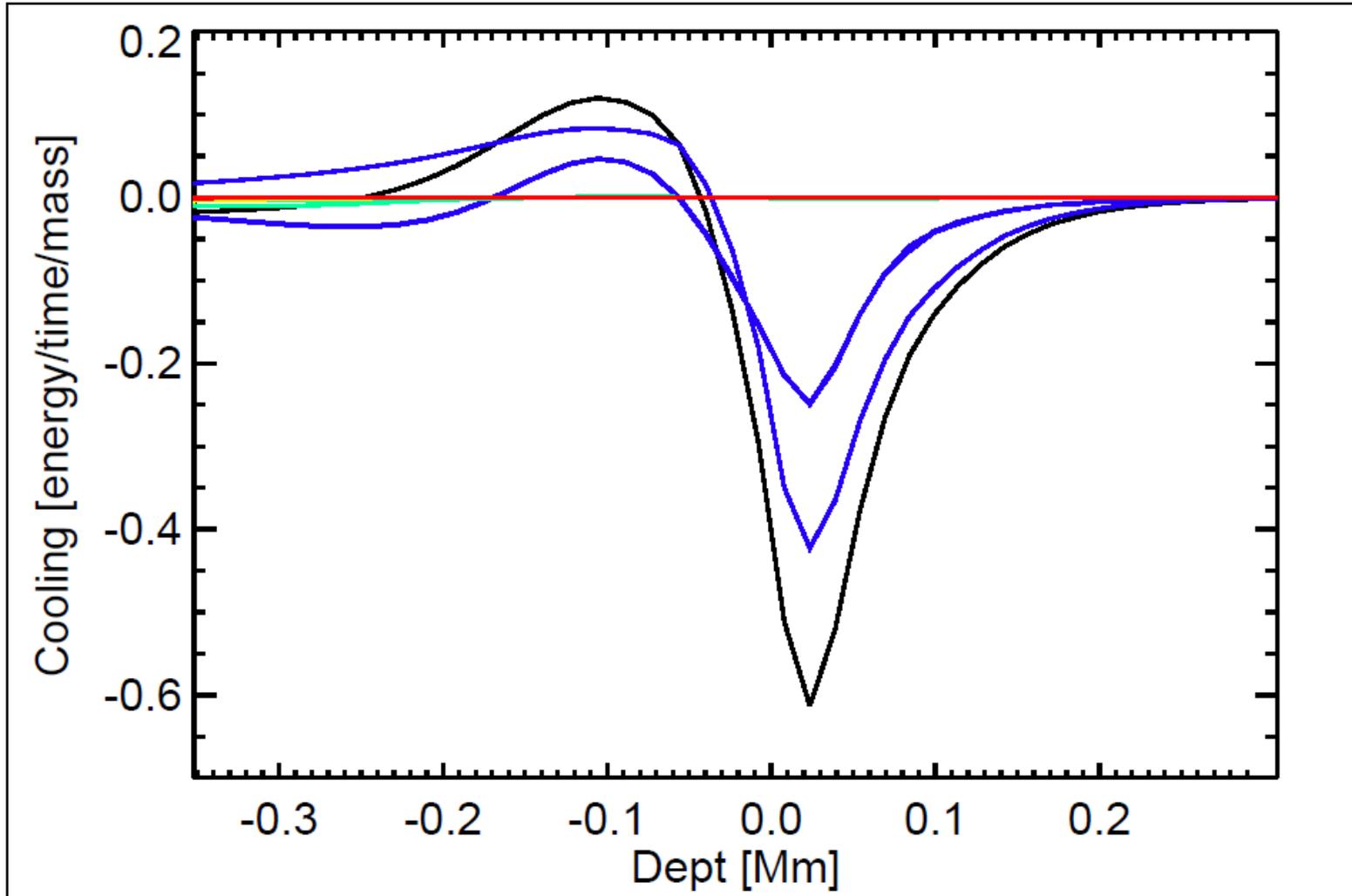
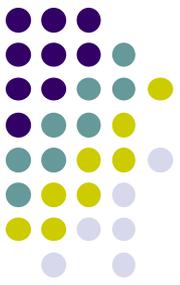


Histogram of opacities in 90% flux interval, monochr. $\tau = 1$

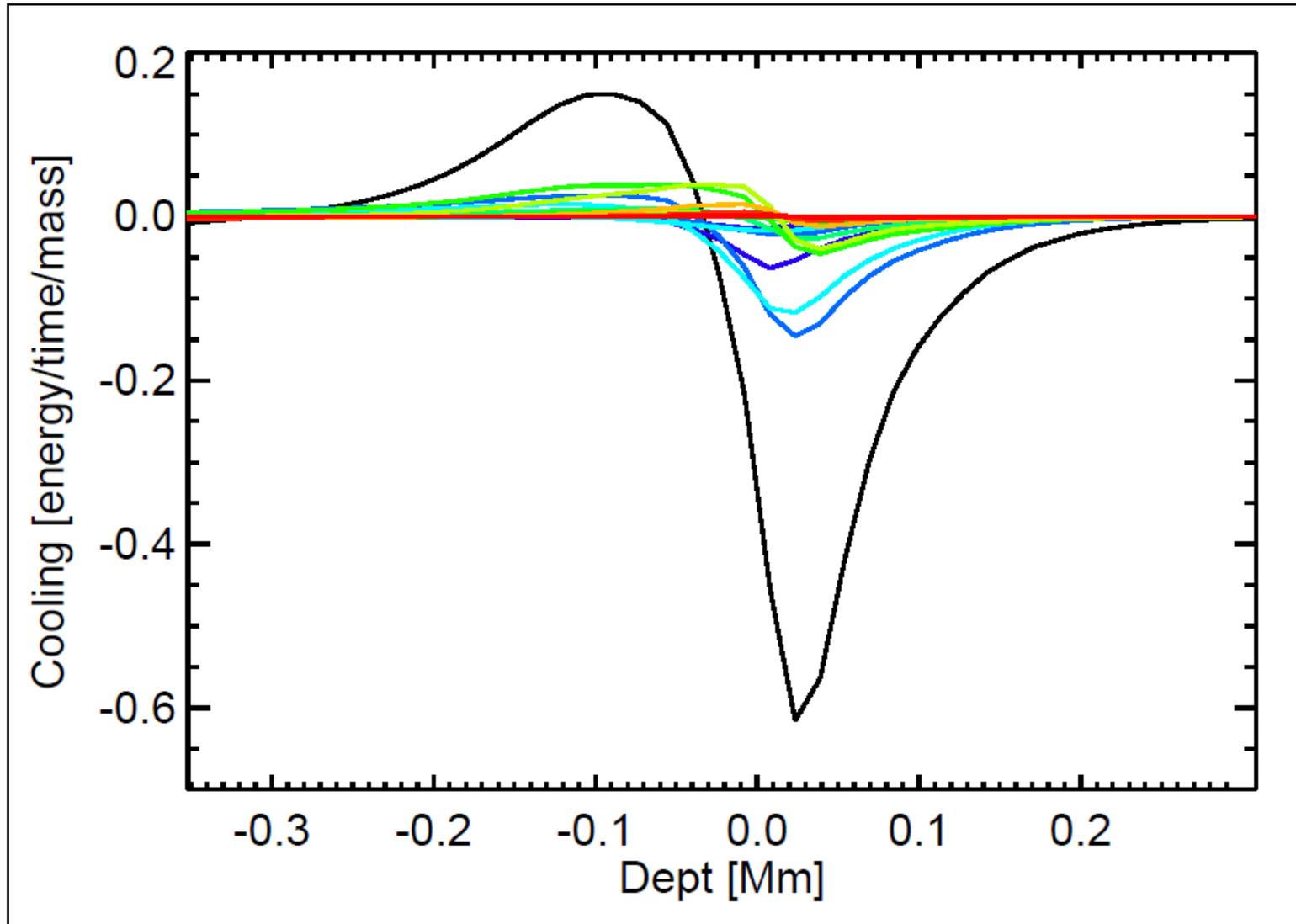
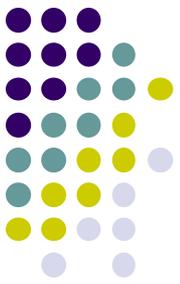


Bin contributions;

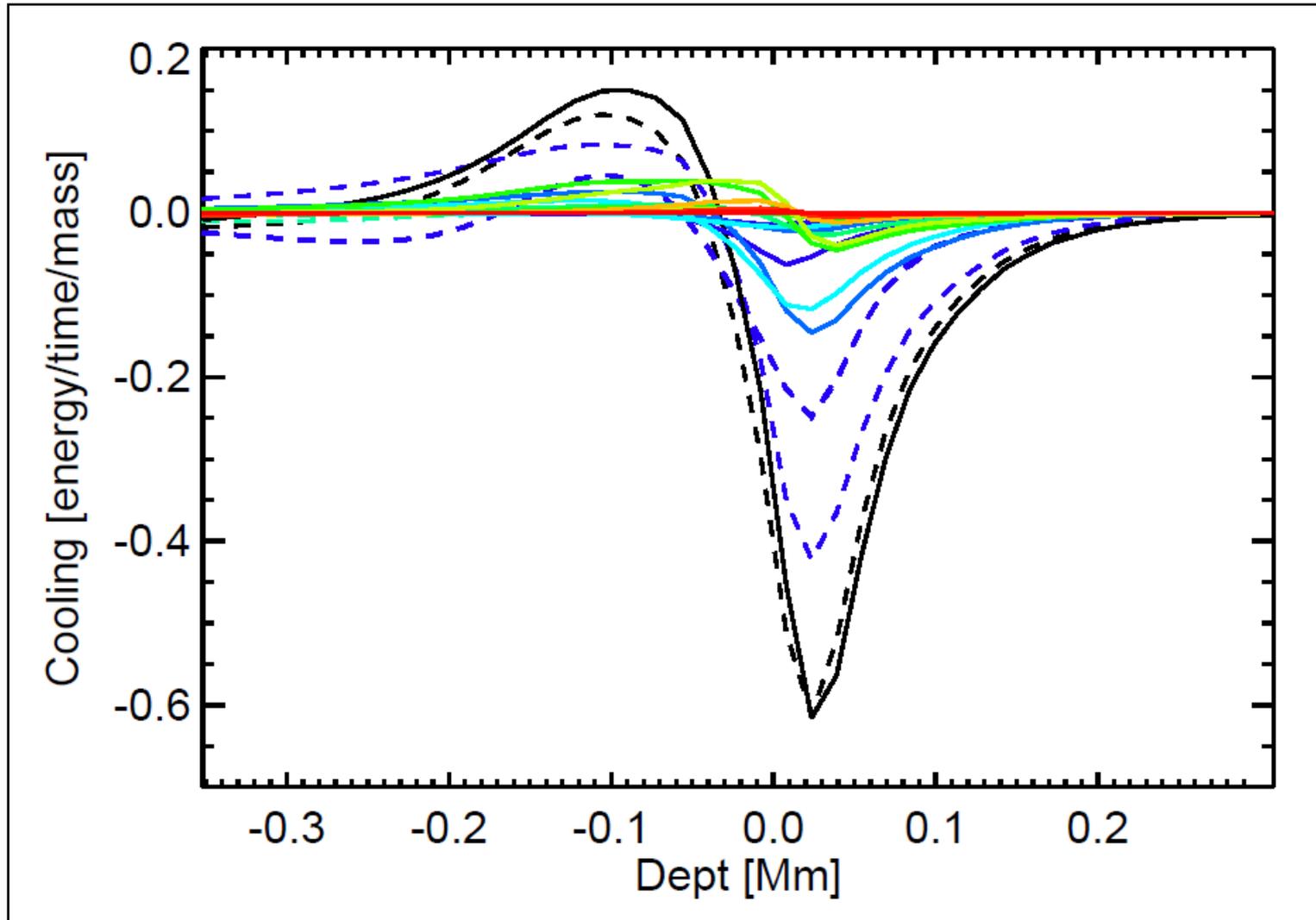
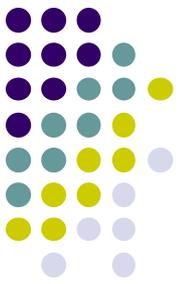
4 bins (black = sum, blue = bin1)



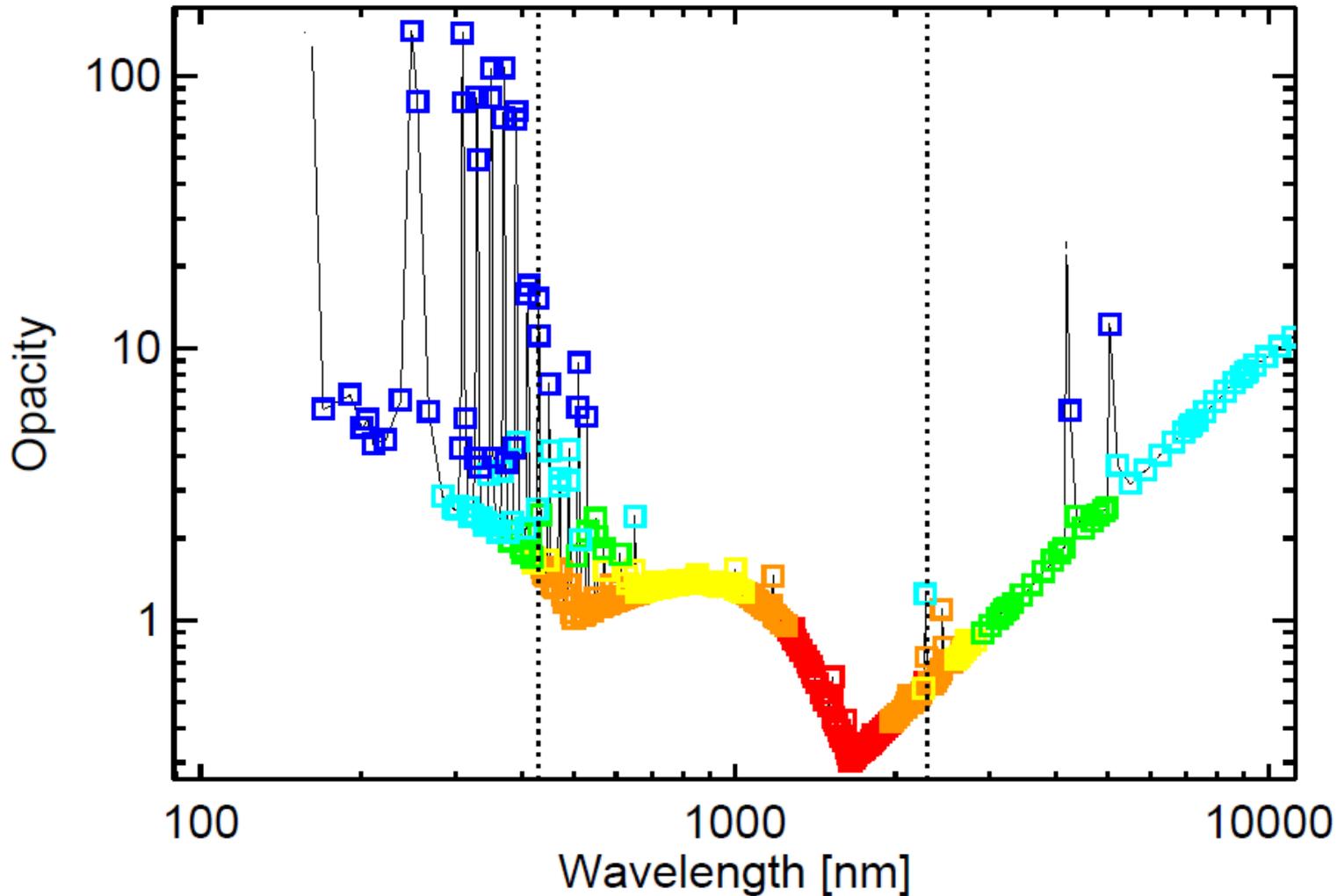
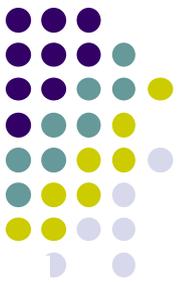
Bin contributions; 9 bins (black=sum, blue=bin1)

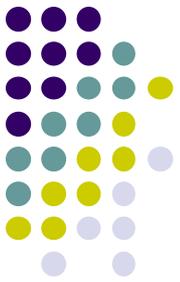


Bin contributions; 4 bins (dashed); 9 bins (full)



Bins as a function of wavelength





Optimizing and Parallelizing Radiative Transfer

Overview and C

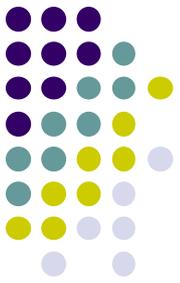
- Topic: how to compute
formal problem

S is a completely general source function
– can contain angle-scattering, frequency redistribution, etc.!

$$\frac{dI}{d\tau} = S - I$$

as rapidly and accurately as possible

- The bottom line result is that, on typical current CPUs (Intel, Opteron) this should not take more than about ***5-10 nanoseconds*** per mesh point, frequency and angle!



Applications

- Ray tracing, diagnostics
- 3-D scattering and & NLTE problems
- Temperature equilibria
- Dynamical evolution with RT

Optimizing steps



- Speed up table lookup
 - Use linear interpolation
 - increased table size
 - Use cache-efficiency table order
 - increased table size again...
- Speed up interpolations
 - Use long characteristics!
 - re-use interpolation weights
- Speed up RT formal solvers
 - Use redundant indices
 - re-use exponential factors



Impact

- In any and all such problems, the faster the method \Rightarrow ***the more angles and frequencies!***
- Of course, computing κ , τ , and \mathbf{S} takes time also..

A reasonable goal is to be able to afford of the order of **50-100 angle-frequencies** per HD/MHD mesh point for a **doubling of the computing time**, on problems where every mesh point is a source!

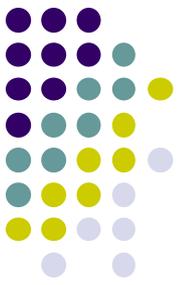
Formal solution



$$I(\tau) = I_0 e^{-|\tau - \tau_0|} + \int S(\tau') e^{-|\tau - \tau'|} d\tau'$$

- Doubly useful:
 1. As a direct method
 - Very accurate, if $S()$ is piecewise parabolic
 - But ***not*** the fastest method!
 2. As a basis for **domain decomposition**
 - Add 'remote' contributions separately!
 - Expensive part is ***entirely local!***

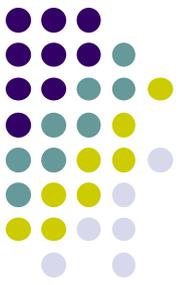
But, let's first look at direct integration



- Depending on CPU-type sometimes "only" a factor 1.5 slower, sometimes a factor 5!
 - Accuracy comes in also; is resolution given by other factors or not?
- So, in general this method is based on "just" integrating

$$I(\tau_{i+1}) = I(\tau_i) + \int_{\tau_i}^{\tau_{i+1}} S(\tau') d\tau'$$

Accurate optical depth increments



- Accurate optical depth calculation is often forgotten. Three alternatives:

- trapezoidal (common choice – not the best!)

$$\Delta \tau_{i+1/2} = 1/2 (\kappa_i + \kappa_{i+1}) \Delta s$$

- integral of exponential (better)

$$\Delta \tau_{i+1/2} = (\kappa_{i+1} - \kappa_i) / \ln(\kappa_{i+1} / \kappa_i) \Delta s$$

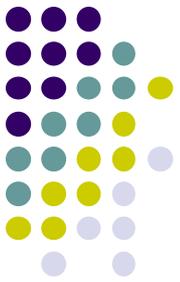
- spline integral (best)

$$\Delta \tau_{i+1/2} = 1/2 \left\{ \kappa_{i+1} \left(1 + \frac{1}{6} d_{i+1} \Delta s \right) + \kappa_i \left(1 - \frac{1}{6} d_{i+1} \Delta s \right) \right\} \Delta s$$

A note about speed vs. accuracy on modern CPUs



- Employing more accurate – e.g. higher order – expressions is generally advantageous
- **Cache speed vs. memory speed** \Rightarrow relatively little extra time needed for extra operations
 - better load/store/compute balance
- Improvements in precision are paid back **3-fold** (diagnostics) or **4-fold** (dynamics)



Accuracy requirements?

- For temperature balance, the next term is **need solutions for** at large optical
 - $S(\tau)$ must be at parabolic), since the $\tau \rightarrow \infty$ are

Note that the 1st derivative term vanishes in the sum!

$$I^+(\tau_i) = S(\tau_i) - S'(\tau_i) + S''(\tau_i) + \dots$$

$$I^-(\tau_i) = S(\tau_i) + S'(\tau_i) + S''(\tau_i) + \dots$$

Lower orders are not just inaccurate but *wrong!*



- Doing, for example

$$I(\tau_{i+1}) = I(\tau_i)(1 - e^{-\Delta\tau}) + S(\tau_{i+1/2})e^{-\Delta\tau}$$

would lead to incorrect heating/cooling – catastrophically bad in optically thick regions!



Dual direction methods (1)

- The transfer equation for $I^+(\tau)$, the intensity in the direction of increasing optical depth, is

$$\frac{dI^+}{d\tau} = S - I^+$$

and in the opposite direction (still expressed in the same τ) it is

$$\frac{dI^-}{d\tau} = I^- - S$$

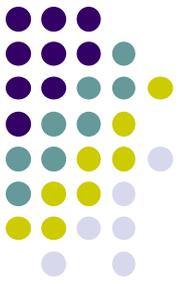
Why dual directions?



- Saves a factor of two in computing common factors!

Using the net intensity

$$Q = I - S$$



It is almost always the *difference between the intensity and the source function*, e.g. $Q^+ = I^+ - S$ that we need. It obeys

$$\frac{dQ^+}{d\tau} = -\frac{dS}{d\tau} - Q^+$$

while for the net intensity Q^- in the opposite direction,

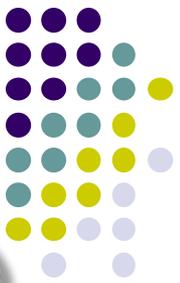
$$\frac{dQ^-}{d\tau} = Q^- - \frac{dS}{d\tau}$$

Why net intensity?



- Since $S'(\tau)$ and $S''(\tau)$ are anyway needed, nothing is lost, but **precision is maintained** at arbitrarily large $\Delta\tau$

Formal solutions: Integral method



For a locally quadratic a at some discrete point τ_i

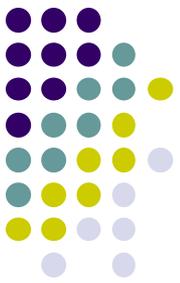
Note the asymptotic behavior as $\Delta\tau \rightarrow \infty$!

$$Q^+(\tau_i) = Q^+(\tau_{i-1}) e^{-\Delta\tau} + S'(\tau_i) (1 - e^{-\Delta\tau})$$

Note also that this goes seamlessly to the standard case $S=0$!

and, in the opposite direction,

$$Q^-(\tau_i) = Q^-(\tau_{i+1}) e^{-\Delta\tau} - S'(\tau_i) (1 - e^{-\Delta\tau}) + S''(\tau_i) [(1 - e^{-\Delta\tau}) \Delta\tau e^{-\Delta\tau}]$$



Direct solution, integral form

- Three coefficients needed (may be reused!)

```
-----  
Coefficients, direct method  
-----  
do iy=2,my  
  ds(iy) = (s(iy)-s(iy-1))/dtau(iy)  
end do
```

```
-----  
Coefficients, IF method: (1e) +1a+2m  
-----  
do iy=2,my  
  ds(iy) = (s(iy)-s(iy-1))/dtau(iy)  
  if (dtau(iy) > 15.) then  
    exp0 = 0.  
  end if  
end do
```

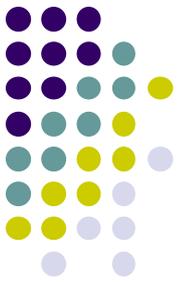
```
-----  
Incoming rays (2a+3m)  
-----
```

```
qminus(1) = Q0  
do iy=2,my  
  qminus(iy) = qminus(iy-1)*ex0(iy)-dsdtau(iy)*ex1(iy)+d2sdtau2(iy)*ex2(iy)  
end do
```

```
-----  
Outgoing rays (2a+3m)  
-----
```

```
qplus(my) = Q1  
do iy=my-1,1,-1  
  qplus(iy) = qplus(iy+1)*ex0(iy+1)+dsdtau(iy)*ex1(iy+1)+d2sdtau2(iy)*ex2(iy+1)  
  q(iy) = 0.5*(qplus(iy)+qminus(iy))  
end do  
q(my) = 0.5*(qplus(my)+qminus(my))
```

The Feautrier Method (this goes way back in RT!)



Defining

$$P = (I^+ + I^-) / 2$$

and

$$R = (I^- - I^+) / 2$$

we have

$$\frac{dP}{d\tau} = R$$

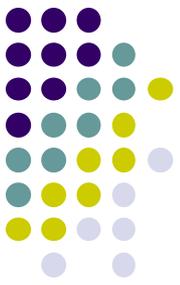
and

$$\frac{dR}{d\tau} = P - S ,$$

which leads to

$$\frac{d^2P}{d\tau^2} = P - S .$$

The Feautrier Equation for net radiative heating



At large optical depths the Feautrier formulation becomes susceptible to numerical round-off, since P approaches S . If one desires the difference $P-S$, e.g. to compute the heating / cooling due to radiation, it is advantageous to write the equation directly in terms of the difference $Q=P-S$, for which the RTE becomes

$$\frac{d^2 Q}{d\tau^2} = Q - \frac{d^2 S}{d\tau^2}.$$

At large optical depths, where Q is small, this goes to the diffusion approximation,

$$Q = \frac{d^2 S}{d\tau^2},$$

without round-off error.

Speeds of integral and Feautrier methods (dual dir!)



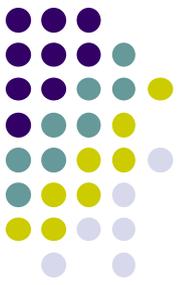
CPU type	Integral method	Feautrier method
Opteron/Intel recursive	25 ns/pt	30 ns/pt
Opteron/Intel vector (SSE)	14 ns/pt	9 ns/pt
Columbia recursive	68 ns/pt	32 ns/pt
Columbia vector	53 ns/pt	12 ns/pt

How to parallelize (Heinemann, et al. 2005; Rijkhorst et al 2005)



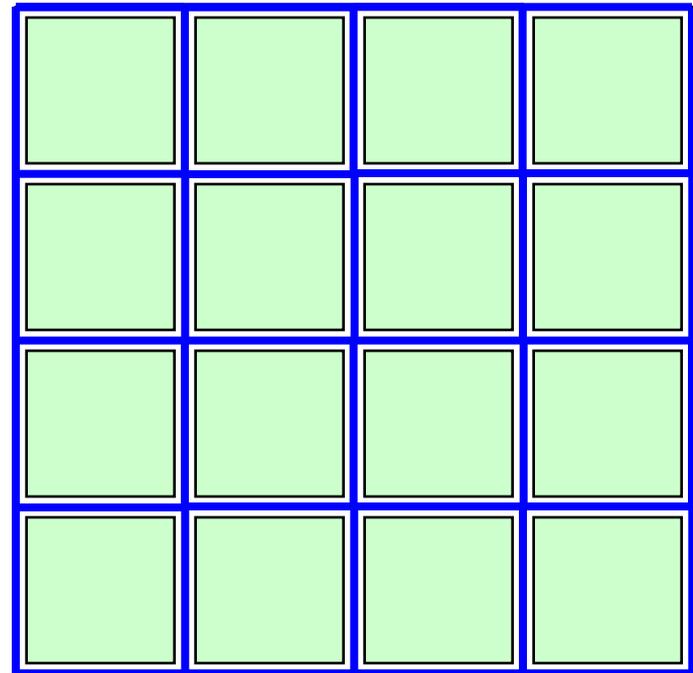
- Solve for the intensity generated internally in each domain, separately and in parallel
- Then propagate and accumulate the boundary intensities, modified only by trivial optical depth factors

About Node Wave Fronts and other parallelization aspects



- In cases where RT is handled separately it is NOT necessary to use node wave fronts – local contribution can then be scattered / gathered globally

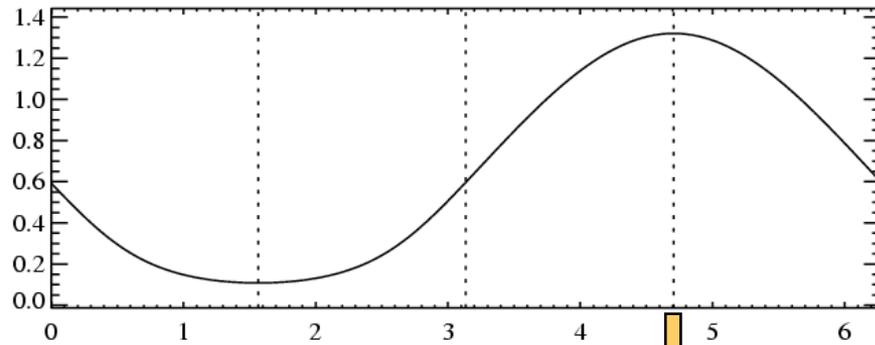
- Cf. Rijkhorst et al 2005
- Heinemann et al 2005



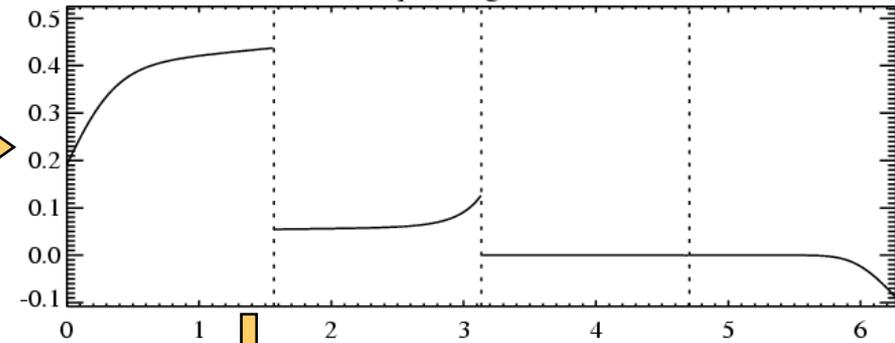
Putting it together



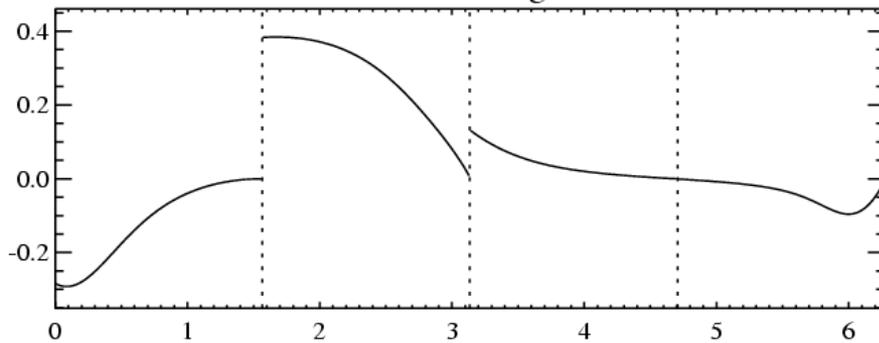
Source function



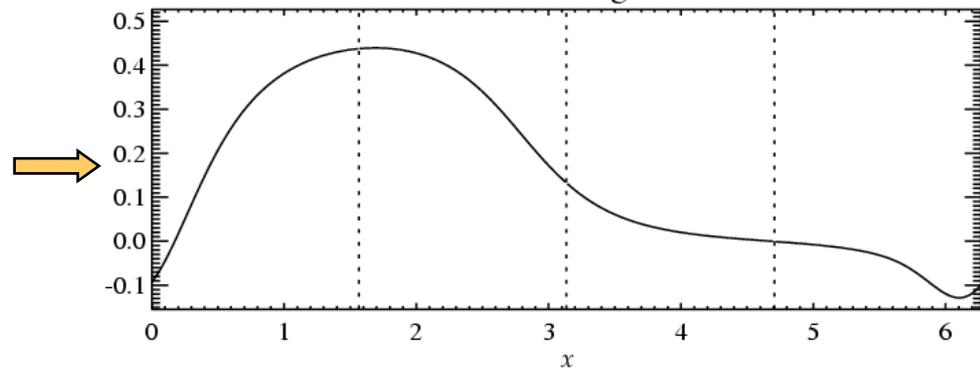
Corresponding corrections



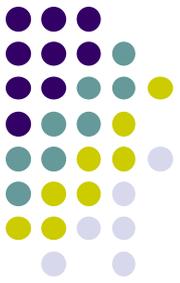
Intrinsic heating rate



Entire heating rate



The Transfer Equation & Parallelization

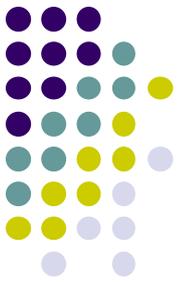


Analytic Solution:

$$I(\tau) = I_0 e^{\tau_0 - \tau} + \int_{\tau_0}^{\tau} e^{\tau' - \tau} S(\tau') d\tau'$$

Processors

The Transfer Equation & Parallelization

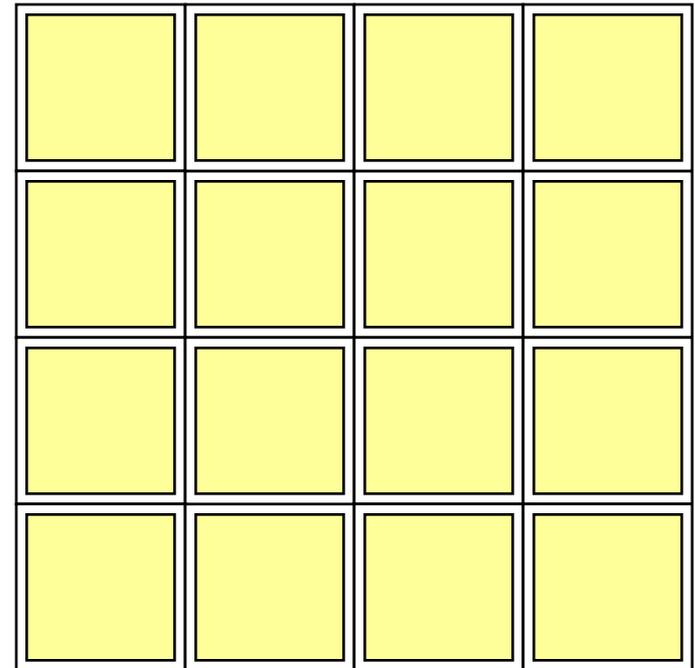


Analytic Solution:

$$I(\tau) = I_0 e^{\tau_0 - \tau} + \int_{\tau_0}^{\tau} e^{\tau' - \tau} S(\tau') d\tau'$$

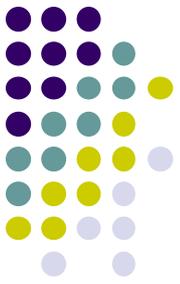
Intrinsic Calculation

Processors



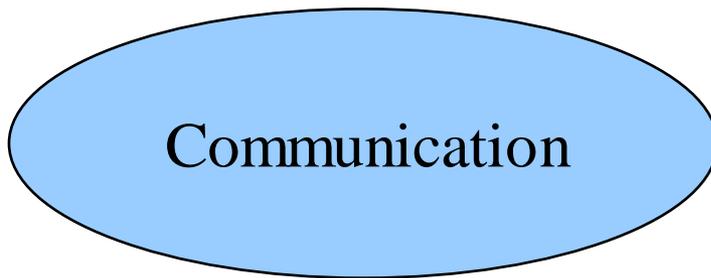
Ray direction ↗

The Transfer Equation & Parallelization

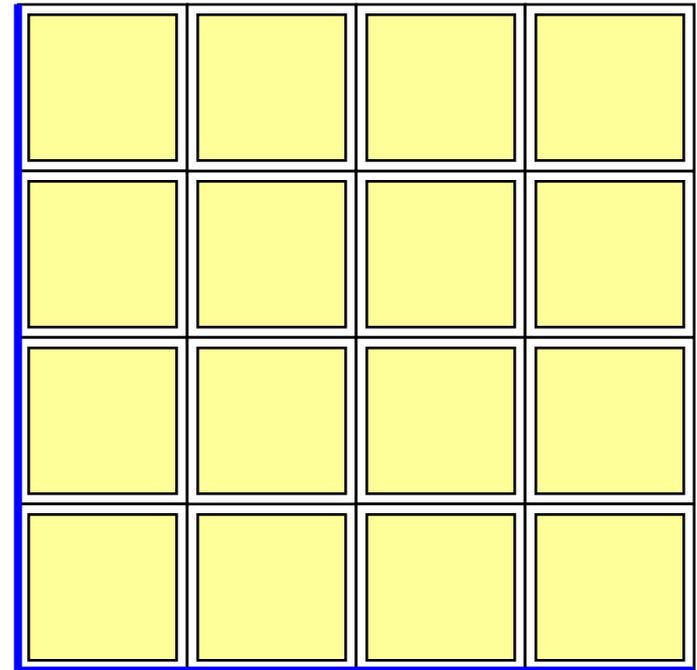


Analytic Solution:

$$I(\tau) = I_0 e^{\tau_0 - \tau} + \int_{\tau_0}^{\tau} e^{\tau' - \tau} S(\tau') d\tau'$$



Processors



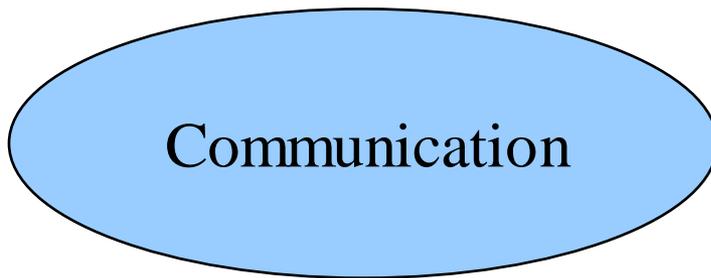
Ray direction ↗

The Transfer Equation & Parallelization

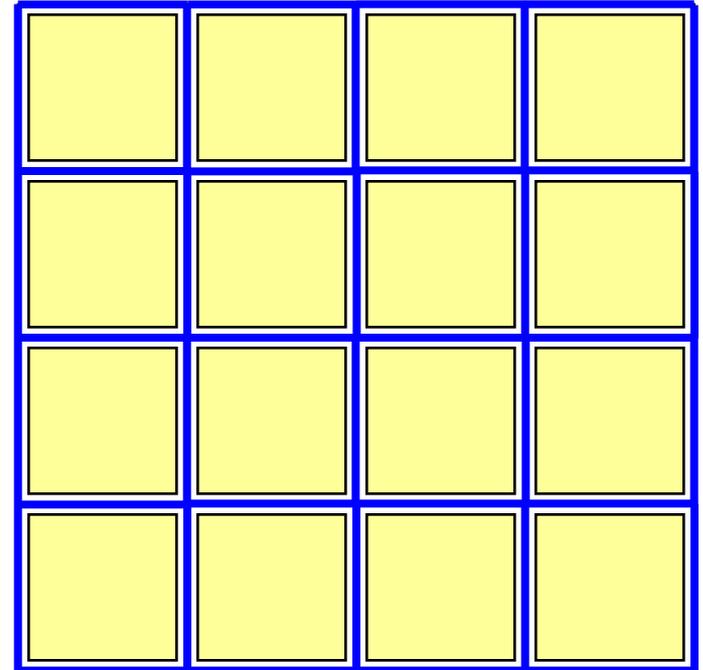


Analytic Solution:

$$I(\tau) = I_0 e^{\tau_0 - \tau} + \int_{\tau_0}^{\tau} e^{\tau' - \tau} S(\tau') d\tau'$$



Processors



Ray direction ↗

The Transfer Equation & Parallelization

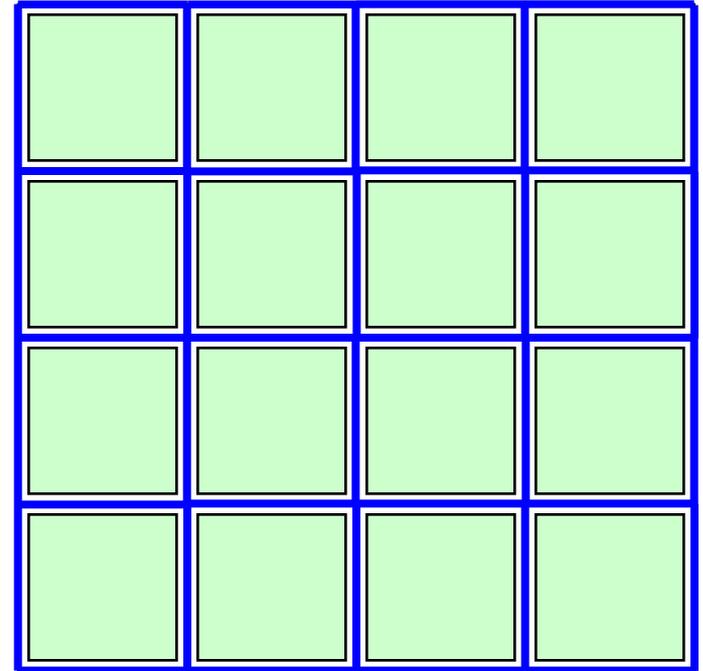


Analytic Solution:

$$I(\tau) = I_0 e^{\tau_0 - \tau} + \int_{\tau_0}^{\tau} e^{\tau' - \tau} S(\tau') d\tau'$$

Intrinsic Calculation

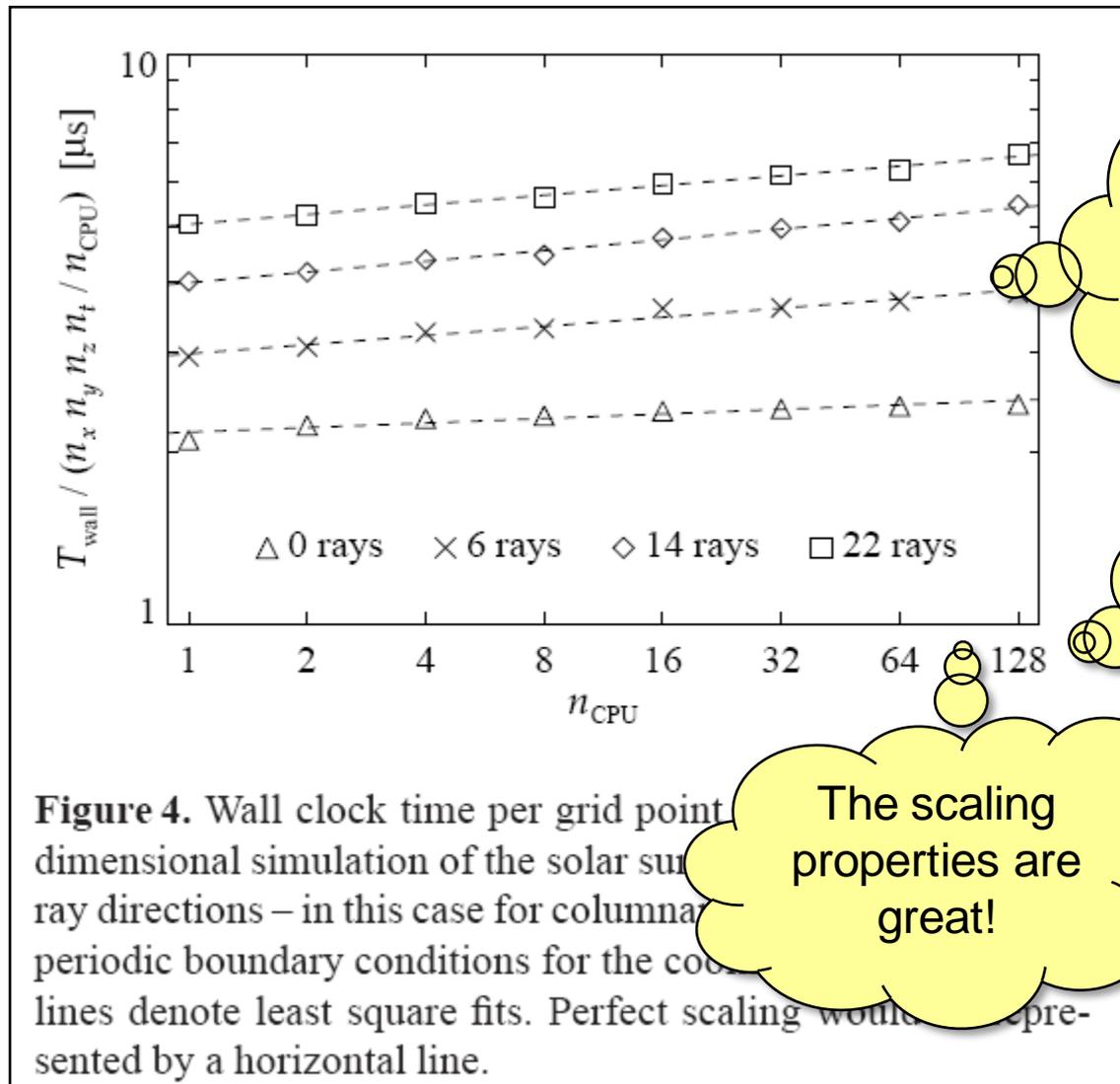
Processors



Ray direction ↗

Pencil code (Brandenburg et al)

CPU-time per ray-point



The actual RT speed has been greatly improved since!

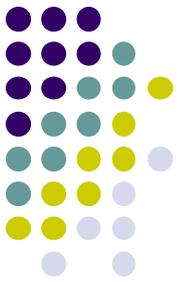
Now scales up to 2048 cores on Pleiades at NASA/Ames

The scaling properties are great!



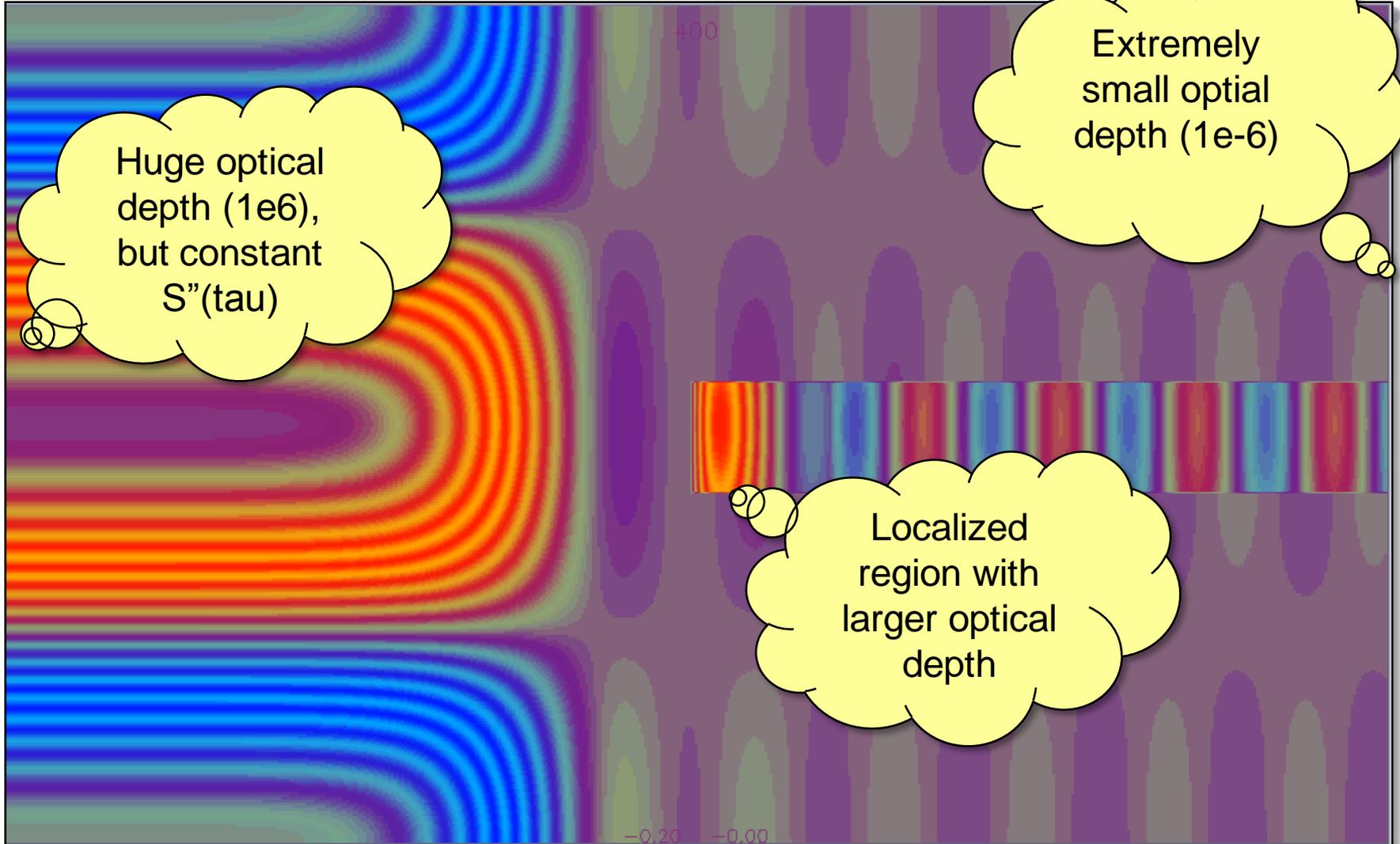
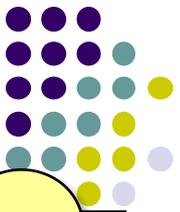
Perspective

- What we *want* to do is to include radiation, as an active ingredient and a diagnostic tool, whenever it is relevant – this is now becoming doable!
- In practice there is a **balance between realism and cost**, which may be tilted towards realism by optimizing the methods!
 - maximize number of angle-frequencies!



Time-dependent Radiative Transfer

Non-trivial demo case



Huge optical depth ($1e6$), but constant $S''(\tau)$

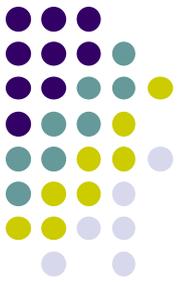
Extremely small optical depth ($1e-6$)

Localized region with larger optical depth

Summary

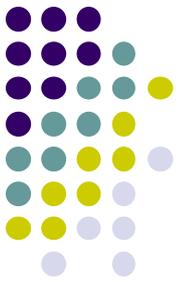


- RT is important / crucial in a number of astro-subfields
 - Cosmology, compact objects, molecular cloud formation star formation, planet formation, ...
- RT-HD and RT-MHD is ***becoming practical*** in more or less all of these circumstances
- ***Speed of computation*** (of transfer ***and*** interpolations) is of premium importance!
 - Optimal choices depend on circumstances and also surprisingly much on hardware (CPU type)



Thanks for your attention!

Acknowledgments



The results presented here were made possible by hardware grants to ÅN from the **Danish Center for Scientific Computing**, and by Columbia / Pleiades computing resource grants to Bob Stein from **NASA / NAS**.

Visualizations partly done with **VAPOR** from **NCAR**
– see www.vapor.ucar.edu