

# Computational Physics

PHYS 6260

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## Transport Methods: Photons

Announcements:

- Progress report: Due today



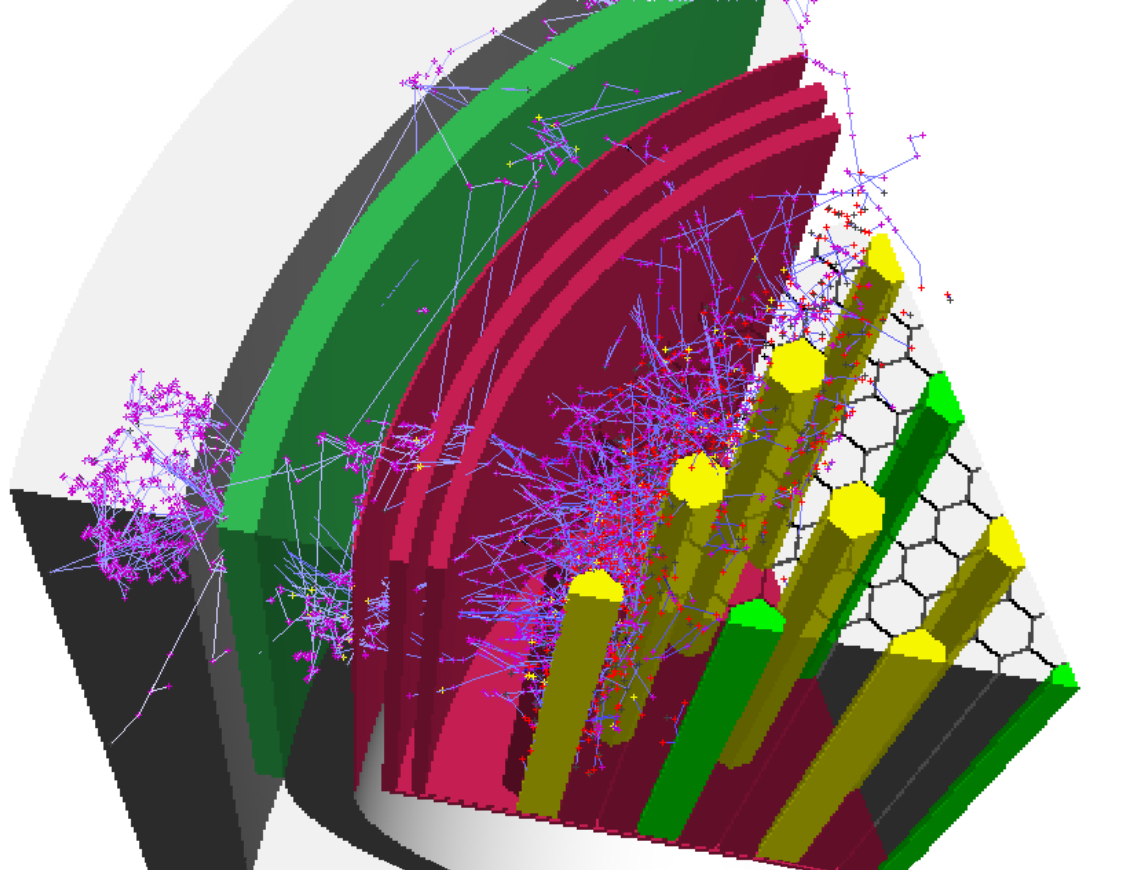
We will cover these topics

- Physics of transport
- 1D approximation
- Numerical methods for 1D transport

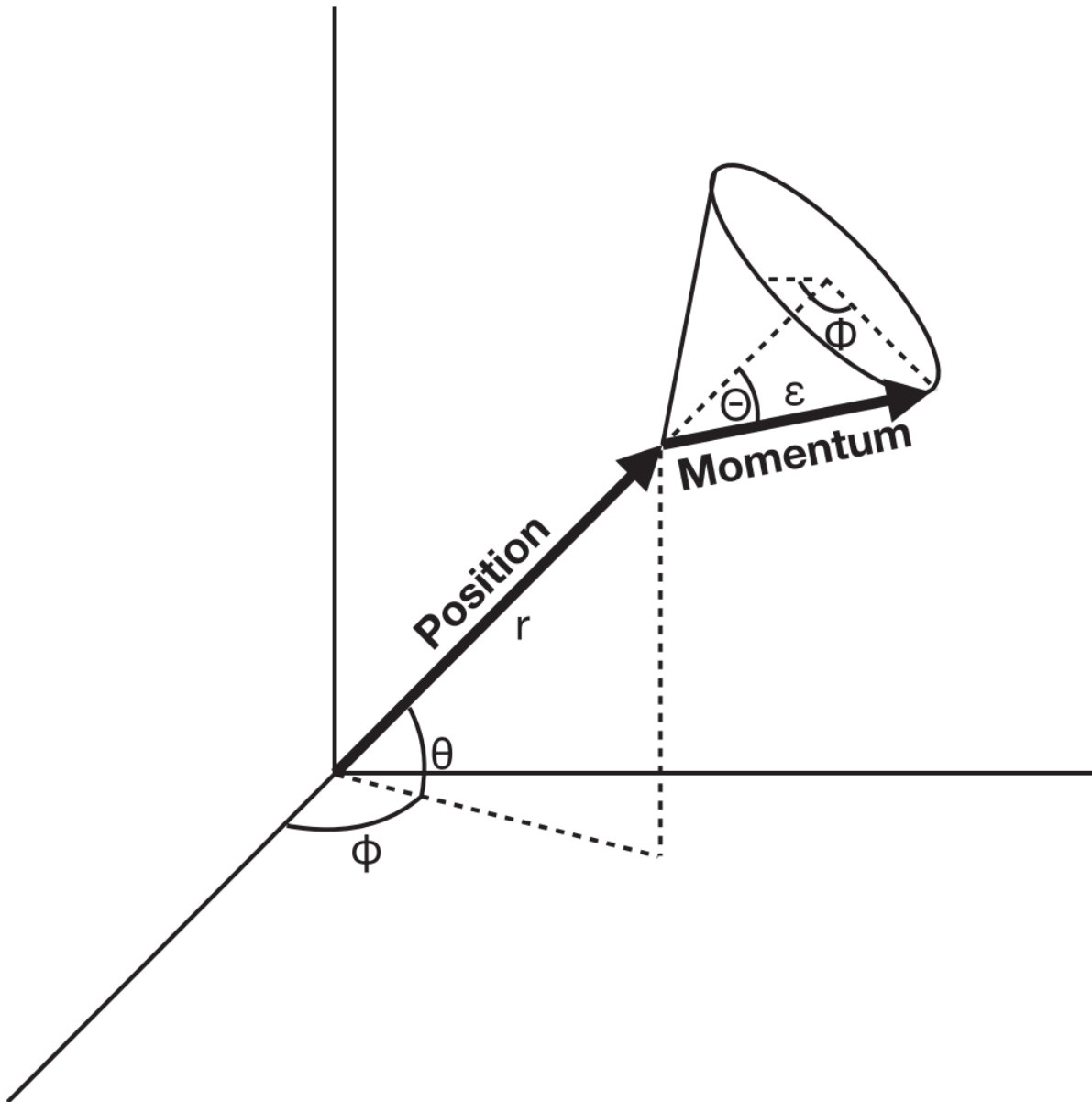
# Lecture Outline



# Physics of Transport



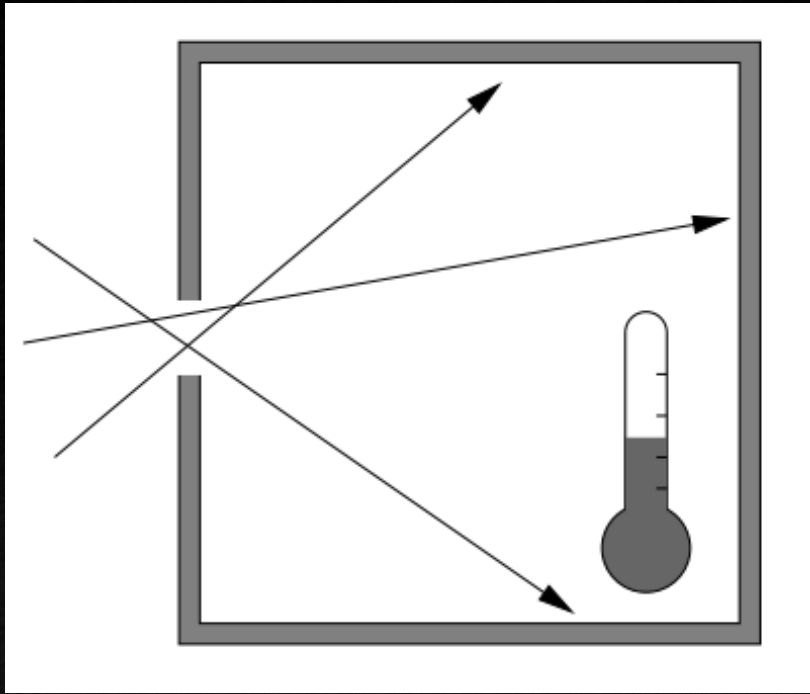
- The treatment of particle movement, scattering, absorption, production, and polarization
- Primary targets: electrons, protons, electron holes (semiconductors), neutrons, neutrinos, and photons
- Typically, the # of particles are too large to treat on a 1-to-1 basis
- Must treat as a coarsely sampled particles or as a continuous field



## Transport fundamentals

- Imagine a system of particles and their momenta
- The particle flux is dependent on position, angle, energy, and time
- Seven-dimensional problem!



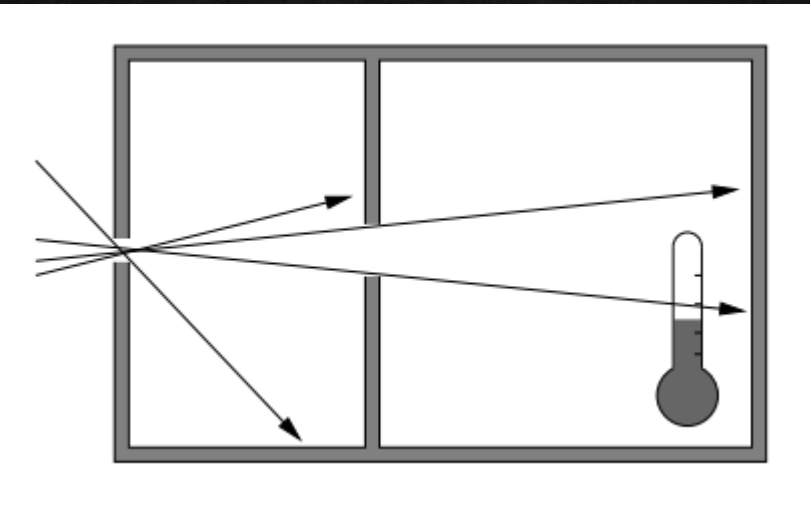


# Transport fundamentals

- Flux  $\vec{F}(\vec{x}, \nu, t)$ : energy per time per area
- Monochromatic flux  $F_\lambda, F_\nu$ : Flux per wavelength or frequency

$$F = \int_0^\infty F_\lambda d\lambda$$

$$\nu F_\nu = \lambda F_\lambda$$



- Intensity  $I, I_\nu$ : Flux per angle  

$$I(\vec{x}, \nu, \hat{n}, t) \equiv F / \Delta\Omega$$
- Radiation at some position has some directionality:  

$$I(\vec{x}, \theta, \phi, \nu, t)$$
- Convention in some fields:  $\mu \equiv \cos \theta$



# Transport fundamentals

- Radiation transport in one direction: **ray tracing**
- In vacuum, the intensity is constant

$$\hat{n} \cdot \nabla I_\nu(\vec{x}, \hat{n}) = 0$$

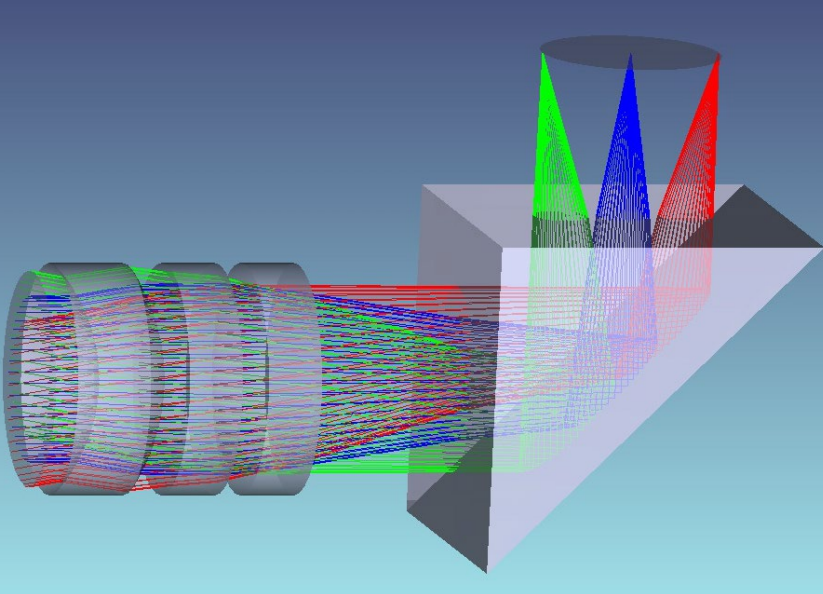
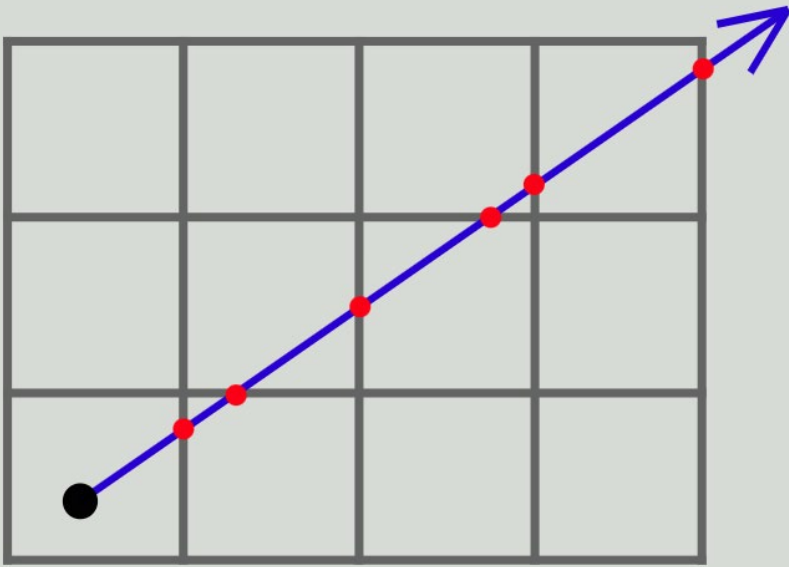
- We can write this as a differential equation along the ray

$$\frac{dI_\nu(\hat{n})}{ds} = 0$$

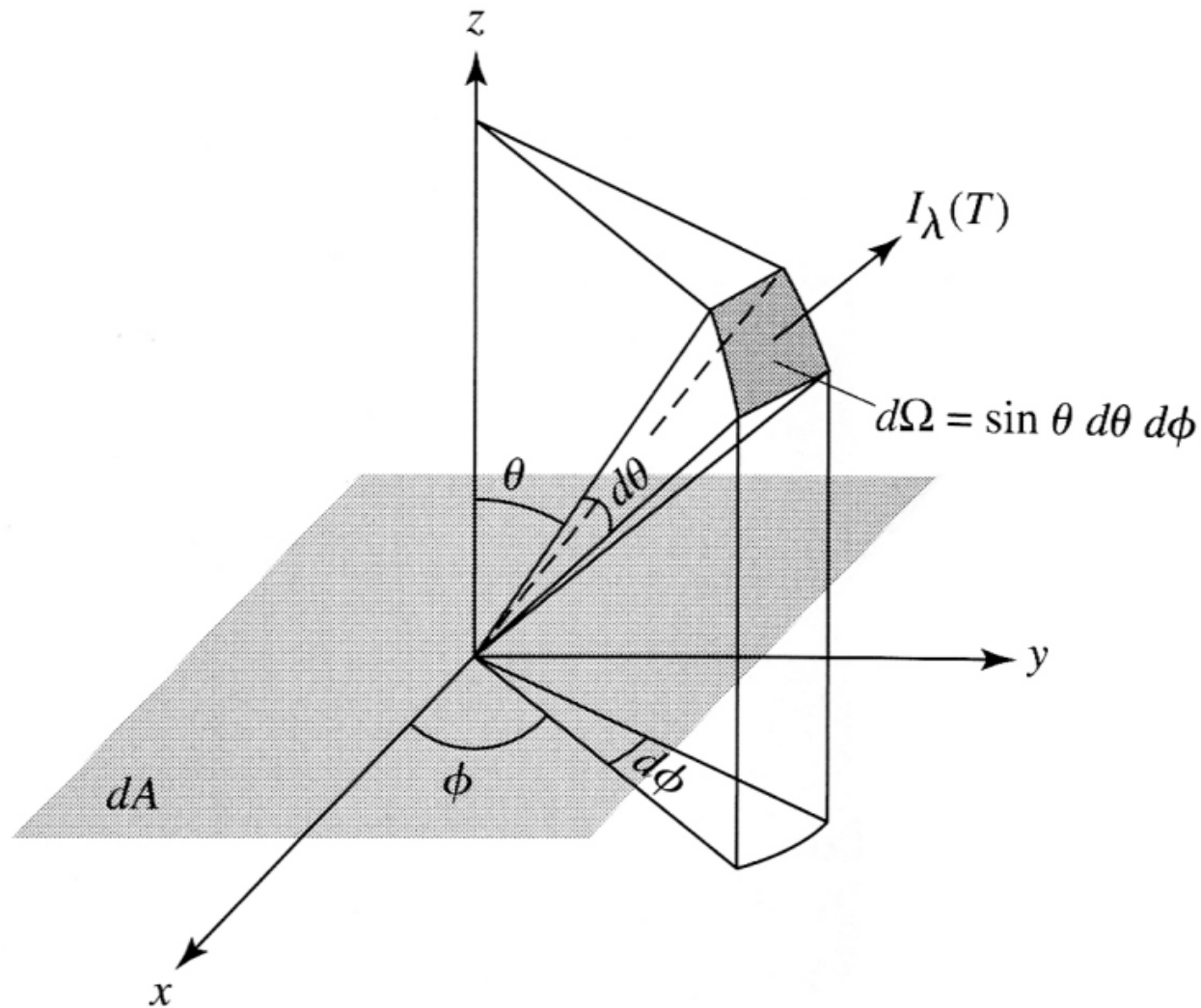
- where the ray's position is described as

$$\vec{x}(s) = \vec{x}_0 + s\hat{n}$$

- Note: Intensity is constant in pure reflection and through lenses



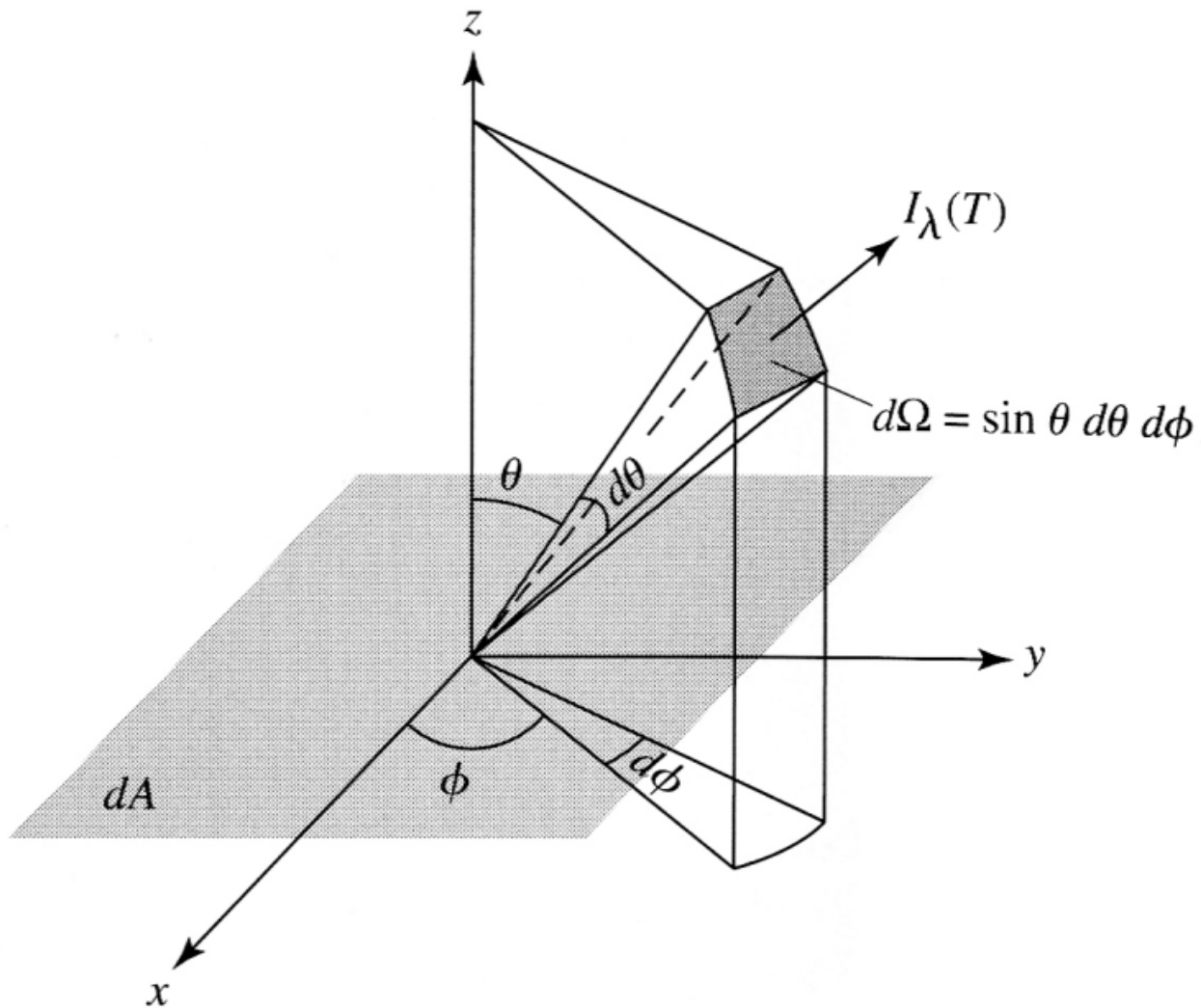




## Transport fundamentals: Moments

- The richness of angular information in the intensity makes it difficult to solve
- We can control this information by studying its moments by expanding the intensity into spherical harmonics
- We will inspect the zeroth, first, and second tensor moments of the field
- Disadvantage: Must specify an axis, breaking any possible rotational symmetries





## Transport fundamentals: Moments

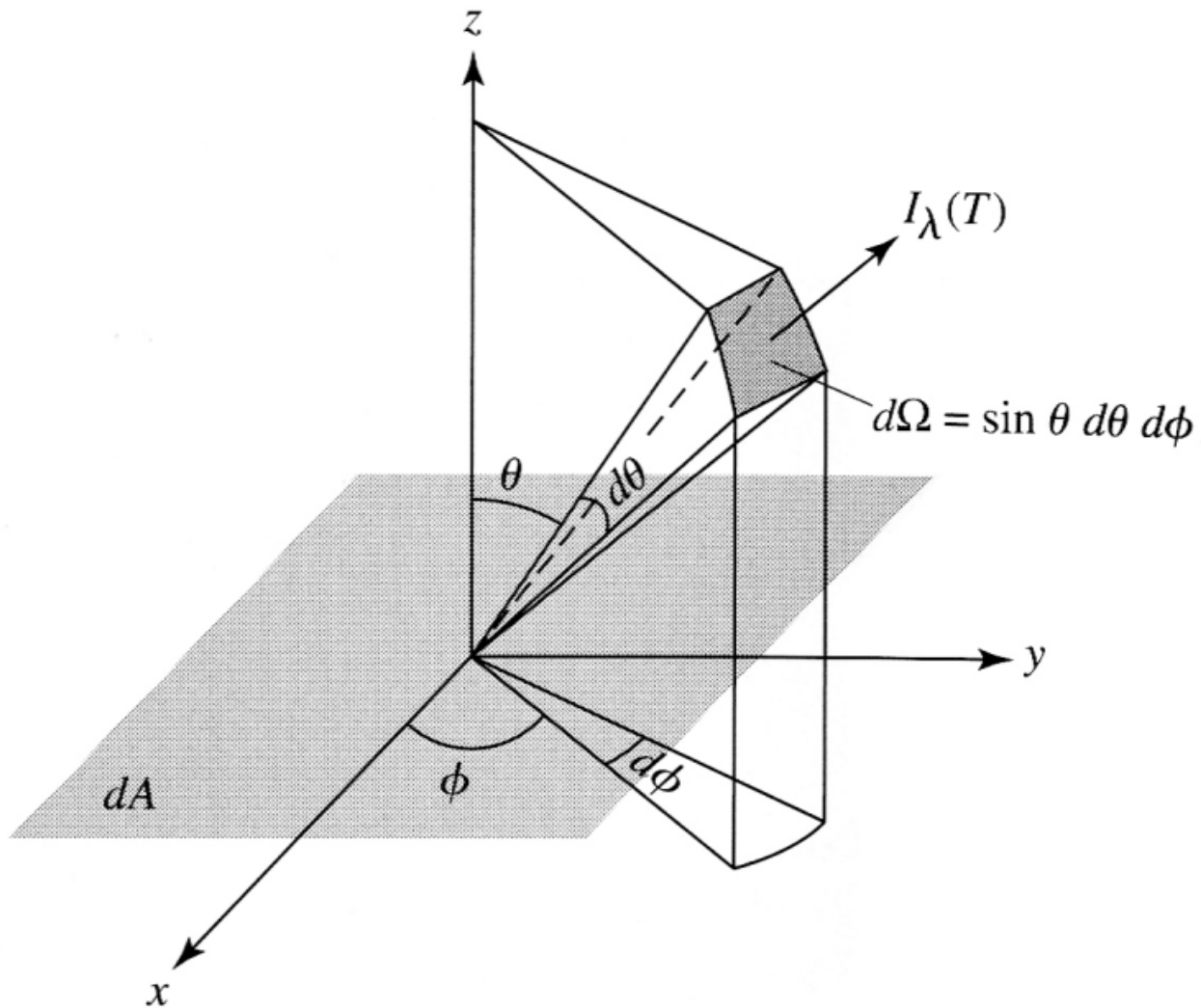
- **Zeroth moment (scalar)**: mean intensity averaged over angle

$$J_\nu = \frac{1}{4\pi} \oint I_\nu(\hat{n}) d\Omega$$

- If the intensity is homogeneous and isotropic

$$J_\nu = I_\nu$$





## Transport fundamentals: Moments

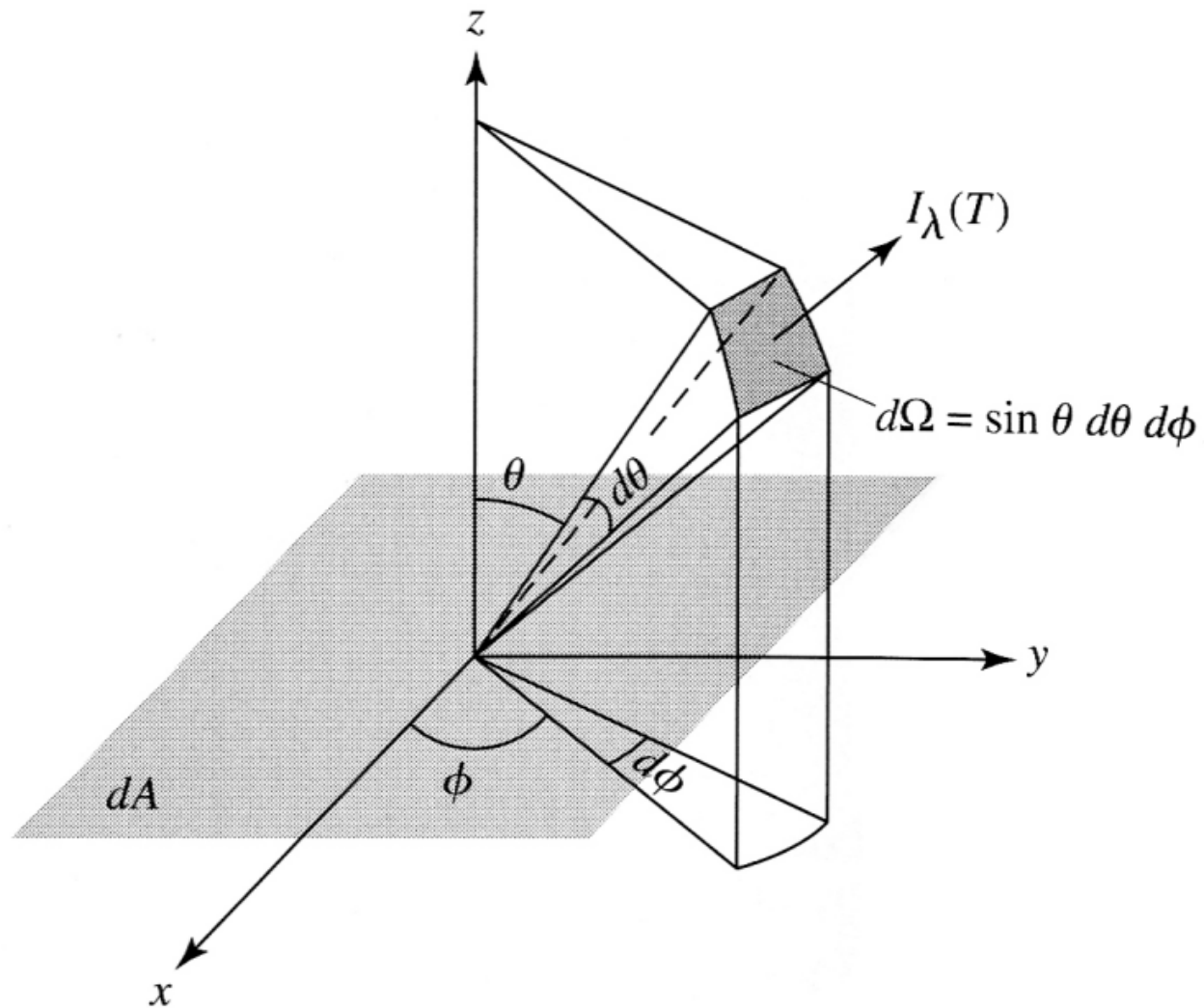
- **First moment (vector)**: average flow of energy, related to flux

$$\vec{H}_\nu = \frac{1}{4\pi} \oint I_\nu(\hat{n}) \hat{n} d\Omega$$

- $\vec{F}_\nu = 4\pi \vec{H}_\nu$
- If the intensity is homogeneous and isotropic

$$\vec{H}_\nu = 0$$





## Transport fundamentals: Moments

- **Second moment (tensor)**: in radiation transport, this is related to the radiation pressure tensor

$$\mathcal{K}_\nu = \frac{1}{4\pi} \oint I_\nu(\hat{n}) \hat{n} \hat{n} d\Omega$$

- Symmetric rank-2 tensor
- If the intensity is homogeneous and isotropic

$$\mathcal{K}_\nu = \frac{1}{3} \mathbb{I} J_\nu$$

- Here  $\mathbb{I}$  is the unit rank-2 tensor



# Transport fundamentals: Moments

- We can write the moments more explicitly in terms of  $\mu \equiv \cos \theta$

$$J_\nu = \frac{1}{4\pi} \oint I_\nu(\hat{n}) d\Omega$$

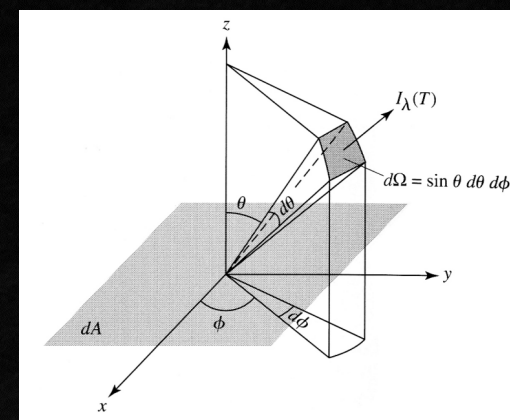
$$\vec{H}_\nu = \frac{1}{4\pi} \oint I_\nu(\hat{n}) \hat{n} d\Omega$$

$$\mathcal{K}_\nu = \frac{1}{4\pi} \oint I_\nu(\hat{n}) \hat{n} \hat{n} d\Omega$$

$$J_\nu = \frac{1}{4\pi} \int_{-1}^{+1} d\mu \int_0^{2\pi} d\phi I_\nu(\mu, \phi)$$

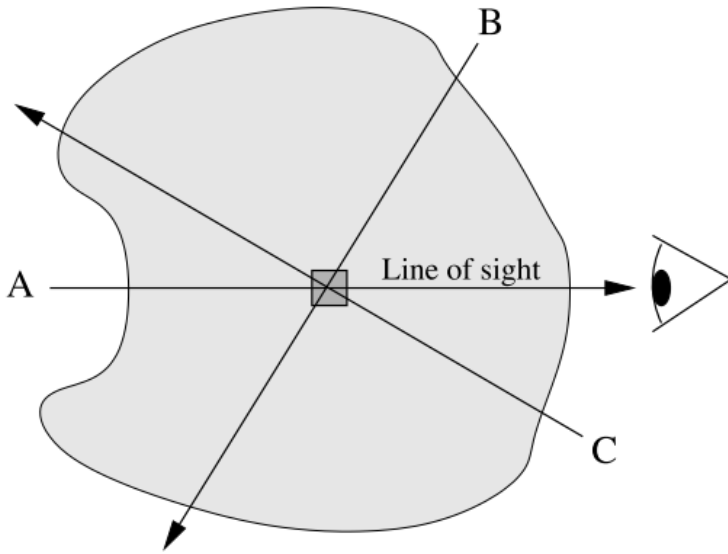
$$H_\nu^i = \frac{1}{4\pi} \int_{-1}^{+1} d\mu \int_0^{2\pi} d\phi I_\nu(\mu, \phi) n^i$$

$$K_\nu^{ij} = \frac{1}{4\pi} \int_{-1}^{+1} d\mu \int_0^{2\pi} d\phi I_\nu(\mu, \phi) n^i n^j$$

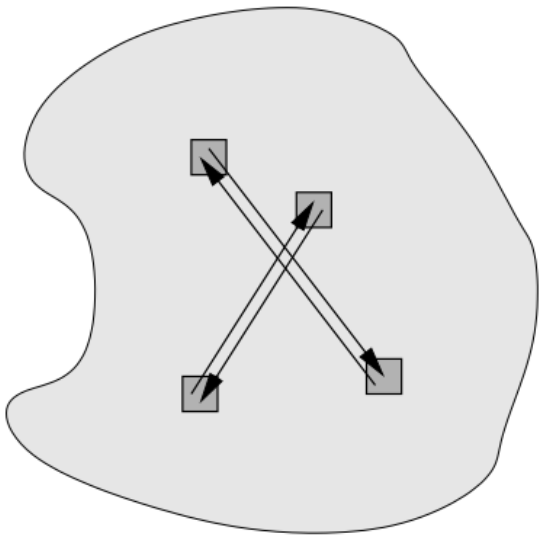




Ray coupling



Radiative cell coupling



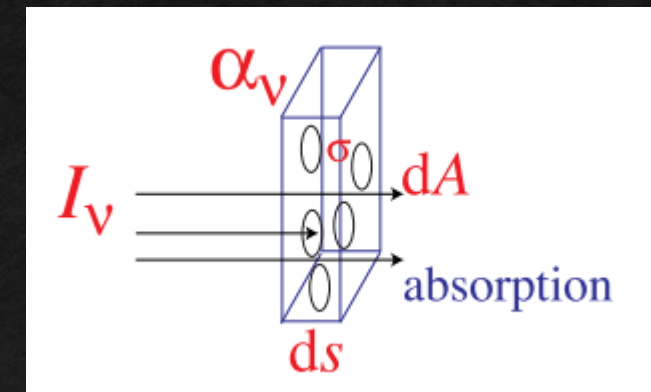
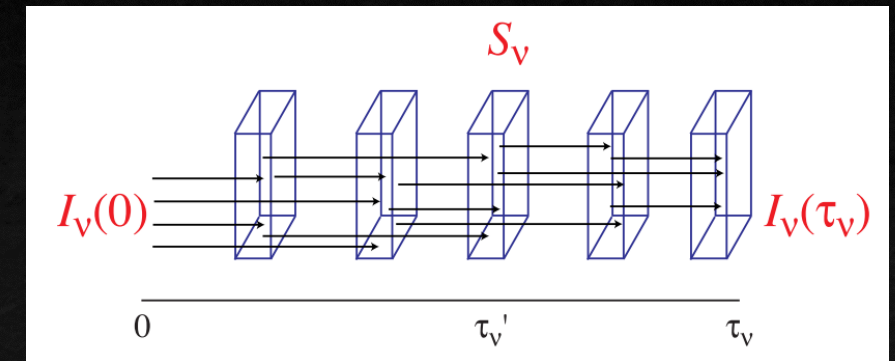
# Why transport is difficult

- Transport is difficult because we don't know the emissivity  $j_\nu$  and/or extinction  $\alpha_\nu$  coefficients in advance
- However the radiation intensity  $I_\nu(\vec{x}, \hat{n})$  can affect them and we need to calculate both
- This is a “chicken or egg” problem  $\rightarrow$  to compute  $I_\nu$  we need  $\alpha_\nu$  and  $j_\nu$ , and vice versa.
- Furthermore in the line of sight A (the problem of interest), radiation from directions B and C will affect the gas parcel where these directions intersect
- Lastly, each cell will affect each other



# Radiative transfer equation (RTE)

- We will be now specializing toward the application of radiation, but the methods are general and can be applied to other transport equations
- Instead of a ray traveling in vacuum, consider a system that produces and absorbs photons
- **Absorption**: consider a species (e.g. atom, molecule) that absorbs a photon by excitation or ionization
- At some photon energy, the absorber has some cross-section  $\sigma$



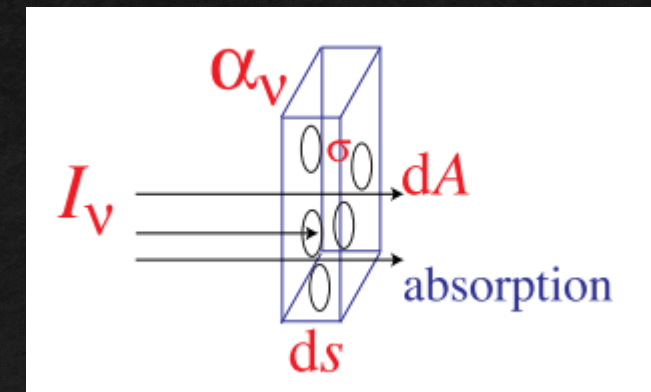
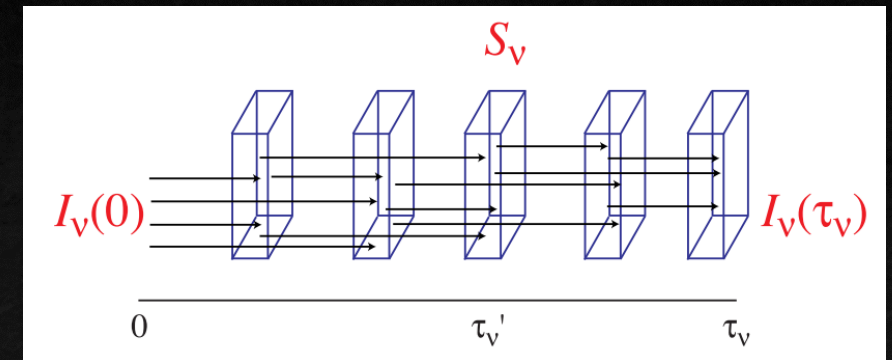


# Radiative transfer equation (RTE)

- Given a number density  $n$ , the covering fraction

$$dA_{abs} = \sigma dN = \sigma n dV = \sigma n dA ds$$

- Absorption within this volume is random
- We can quantify the distance a photon travels before absorption as the **mean free path**  $l_{mfp}$ 
  - Function of position and energy
- The extinction coefficient  $\alpha_v = 1/l_{mfp}$  is used in the RTE





# Radiative transfer equation (RTE)

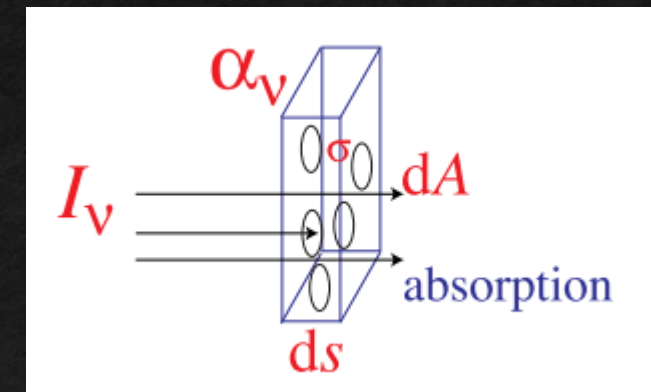
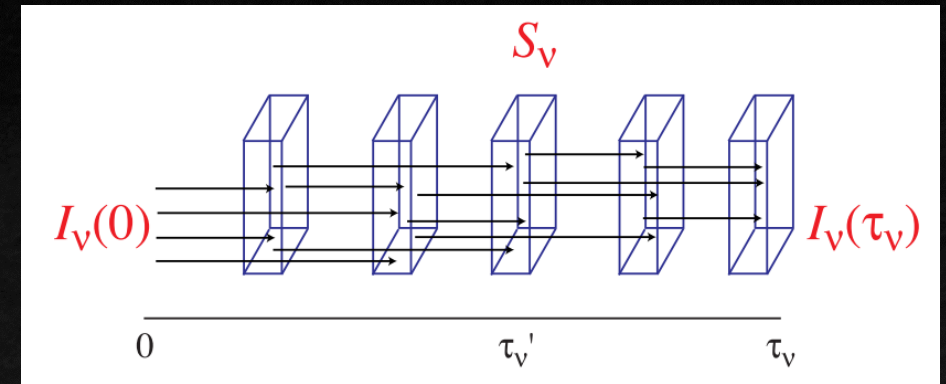
- The extinction coefficient  $\alpha_v = 1/l_{mfp}$  is used in the RTE
- With absorption only, the intensity along a ray behaves as

$$\frac{dI_v(\hat{n}, s)}{ds} = -\alpha_v(s)I_v(\hat{n}, s)$$

- That has the integral form

$$I_v(\hat{n}, s_1) = I_v(\hat{n}, s_0) \exp[-\tau_v(s_0, s_1)]$$

- Here  $\tau_v = \int_{s_0}^{s_1} \alpha_v ds$  is called the optical depth





# Radiative transfer equation (RTE)

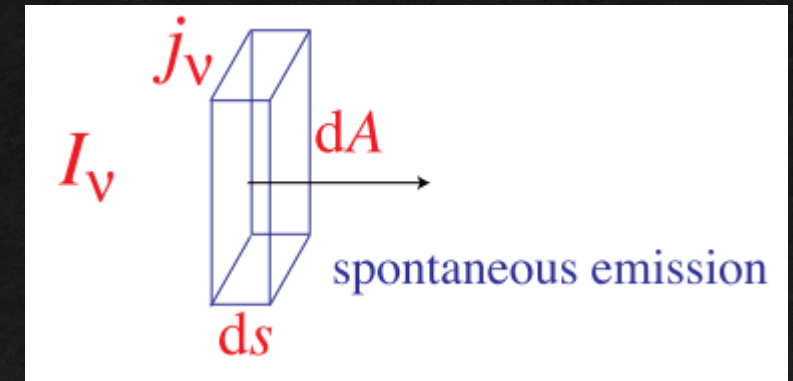
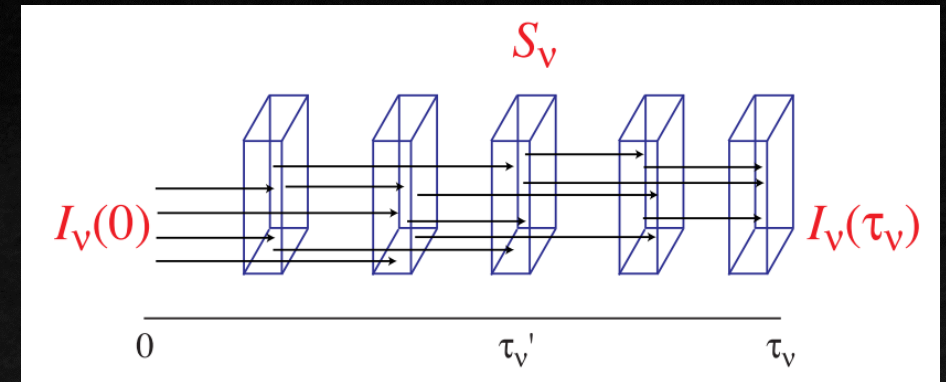
- We can now introduce emission of photons into the RTE through the emissivity  $j_\nu(s)$

$$\frac{dI_\nu(\hat{n}, s)}{ds} = j_\nu(s) - \alpha_\nu(s)I_\nu(\hat{n}, s)$$

- We can also define the source function  $S_\nu \equiv j_\nu / \alpha_\nu$  so that

$$\frac{dI_\nu(\hat{n}, s)}{ds} = \alpha_\nu(s)[S_\nu(s) - I_\nu(\hat{n}, s)]$$

- In local thermal equilibrium, the source function is the Planck function





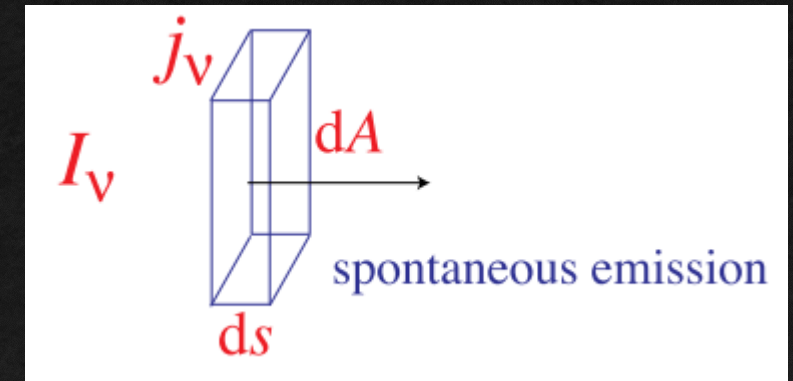
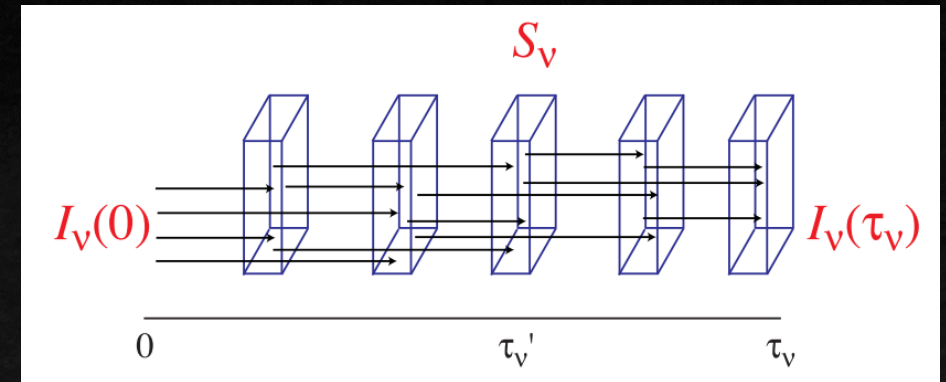
# Radiative transfer equation (RTE)

- Here the integral form is

$$I_\nu(\hat{n}, s_1) = I_\nu(\hat{n}, s_0) \exp[-\tau_\nu(s_0, s_1)] + \int_{s_0}^{s_1} j_\nu(s) \exp[-\tau_\nu(s, s_1)] ds$$

- The general 3D form of the RTE is

$$\hat{n} \cdot \nabla I_\nu(\vec{x}, \hat{n}) = j_\nu(\vec{x}) - \alpha_\nu(\vec{x}) I_\nu(\vec{x}, \hat{n})$$

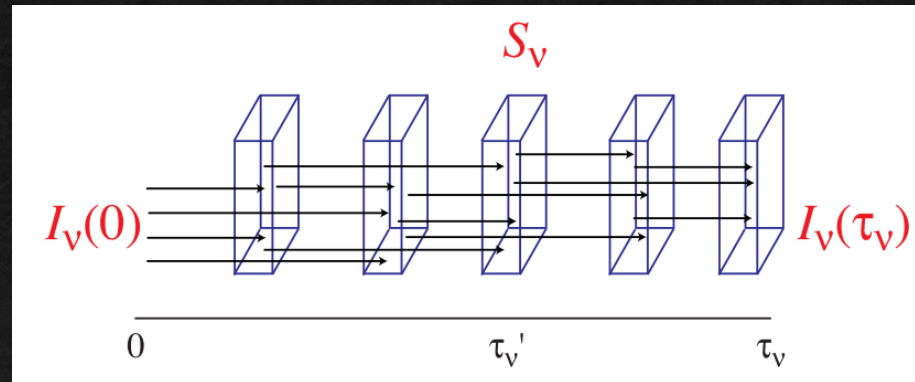




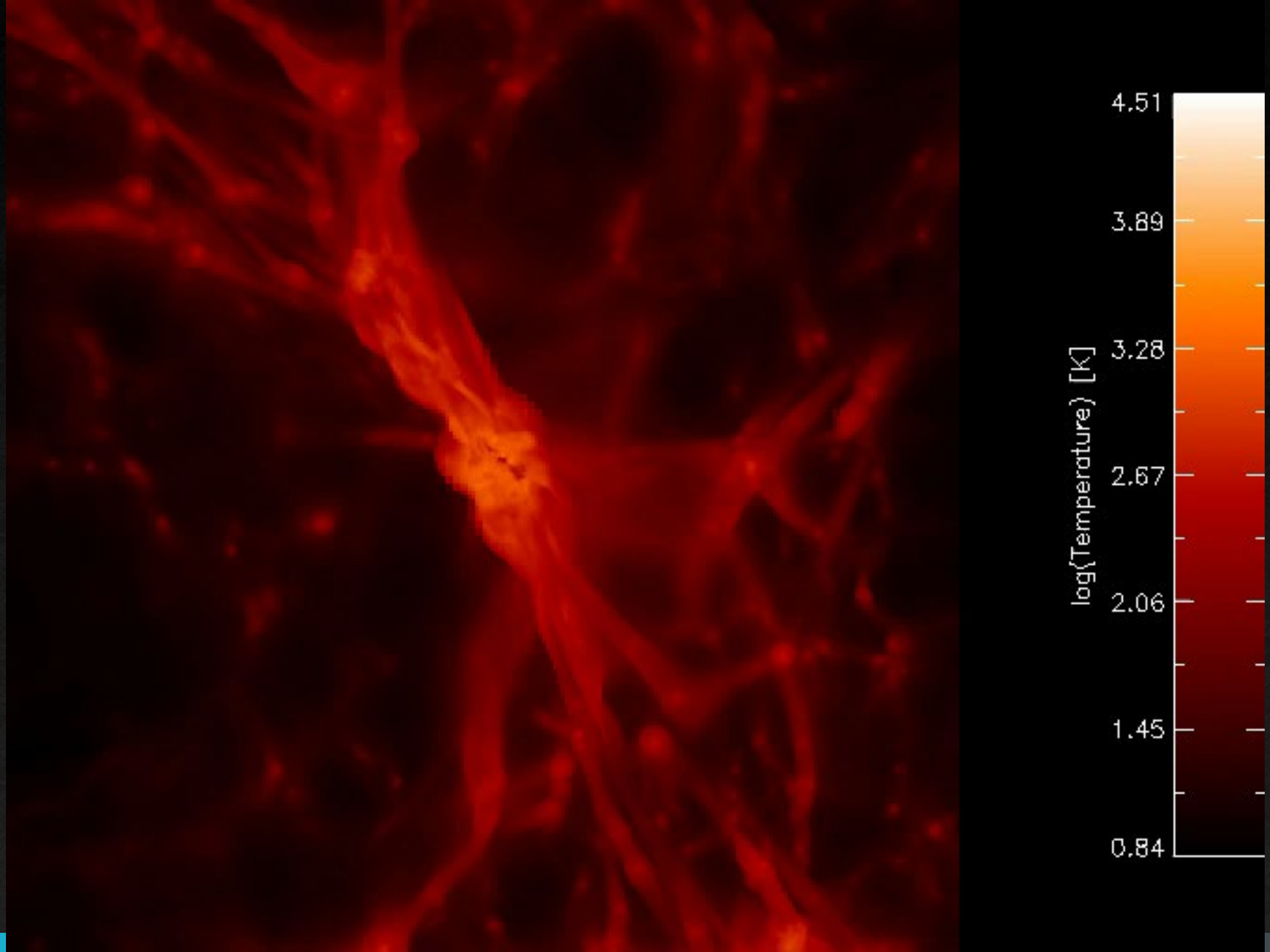
# Radiative transfer equation (RTE)

- So far, we've been considering the time-independent case
- If the system is evolving or we want to forward model it, the RTE becomes

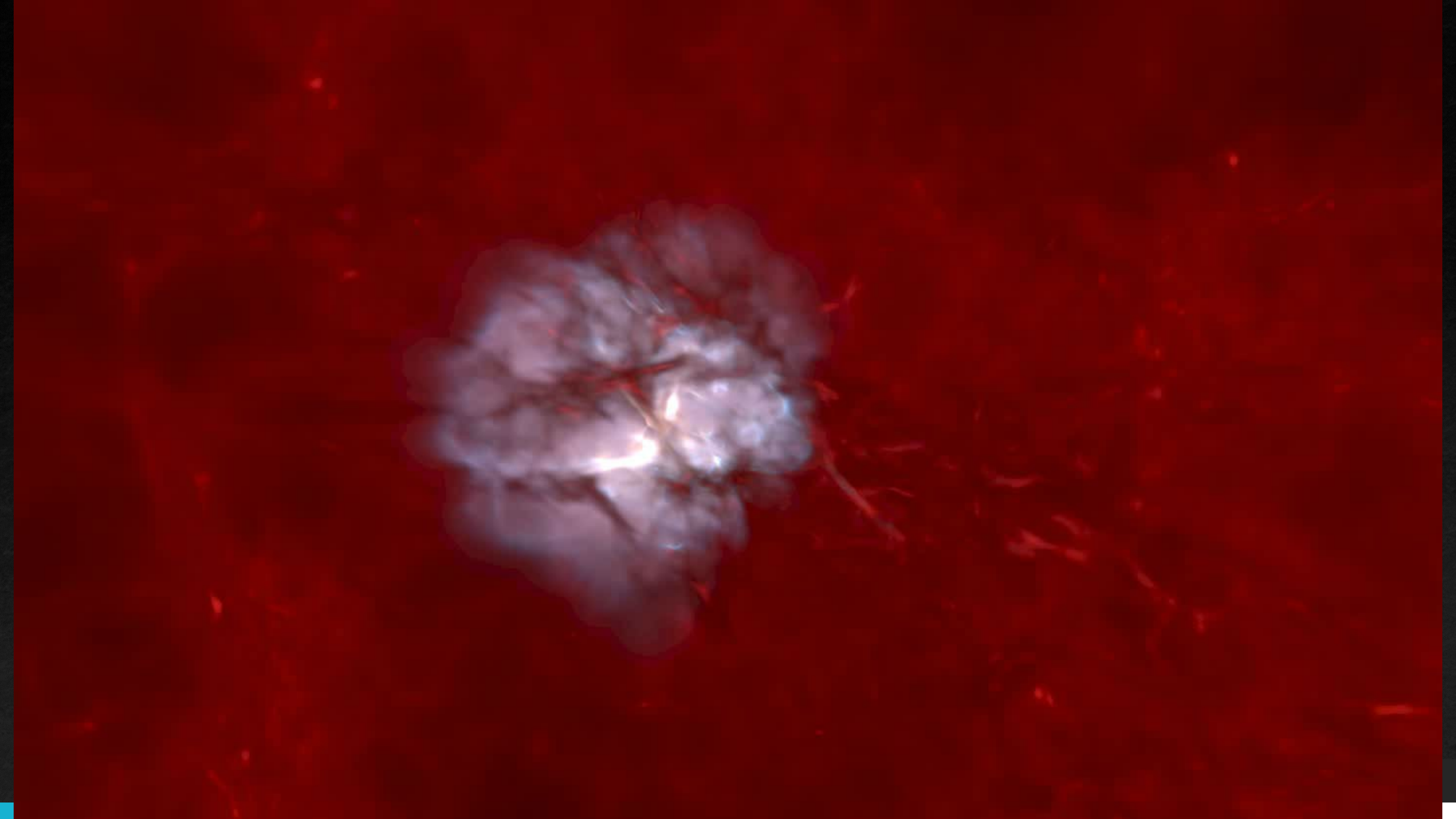
$$\frac{1}{c} \frac{\partial I_\nu(\hat{n}, s, t)}{\partial t} + \frac{\partial I_\nu(\hat{n}, s, t)}{\partial s} = j_\nu(s) - \alpha_\nu(s) I_\nu(\hat{n}, s, t)$$







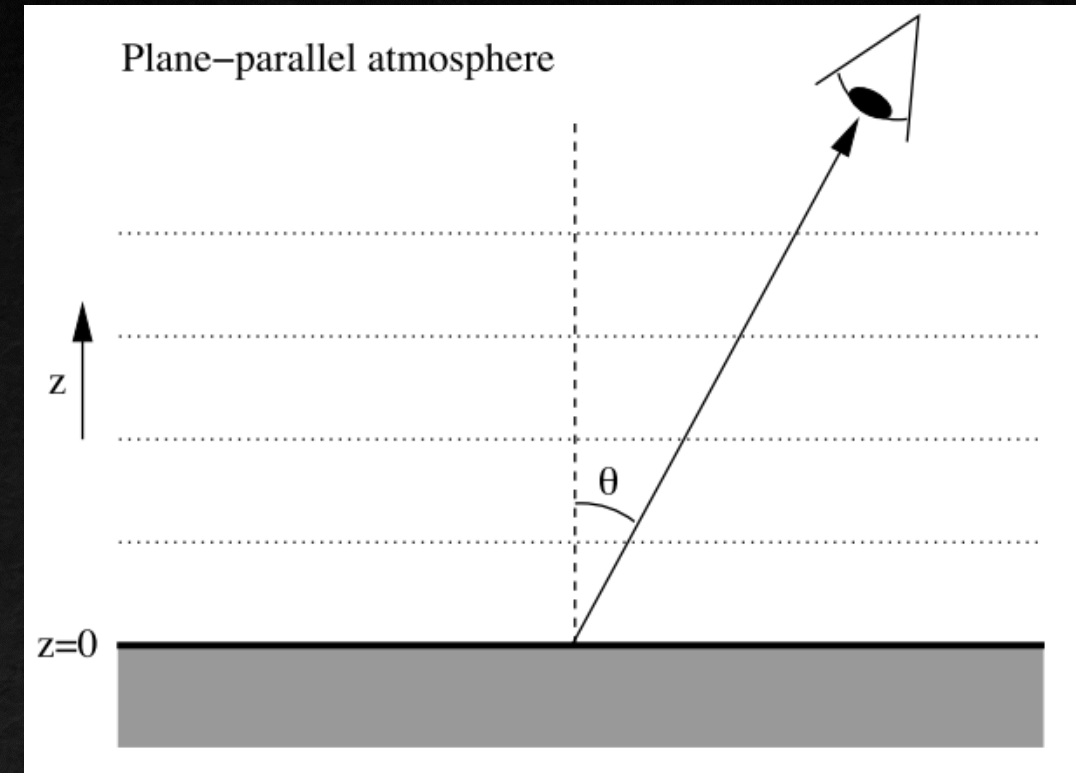






# 1D plane-parallel radiative transfer

- In some systems, we can identify symmetries to reduce the dimensionality
- In a plane-parallel system, the only spatial dependence is in the  $z$ -direction
- This symmetric also has rotational symmetry, dropping the dependence on  $\phi$
- Leaves only a 3D problem: height  $z$ , angle coordinate  $\mu \equiv \cos \theta$ , frequency  $\nu$

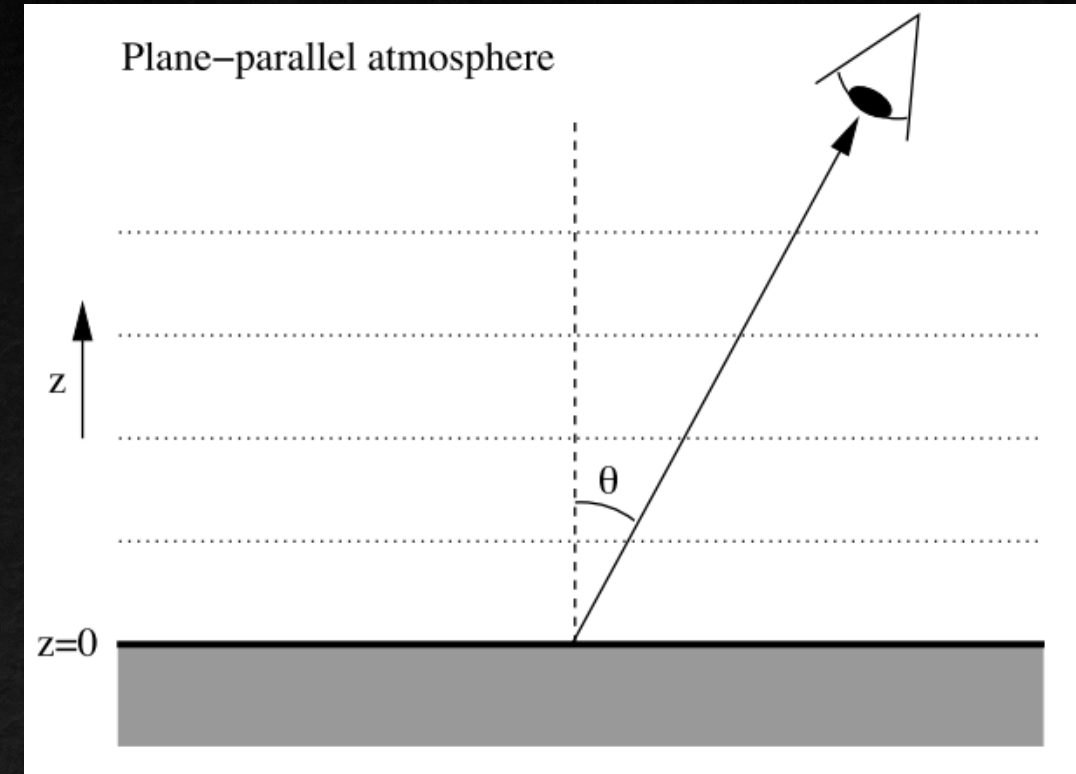




# 1D plane-parallel radiative transfer

- The  $\partial/\partial x$  and  $\partial/\partial y$  operators yield zeros, and  $d/ds$  becomes  $\mu d/dz$
- Thus the RTE in a plane-parallel problem transforms into

$$\mu \frac{dI_\nu(z, \mu)}{dz} = \alpha_\mu(z) [S_\nu(z) - I_\nu(z, \mu)]$$





# 1D plane-parallel radiative transfer

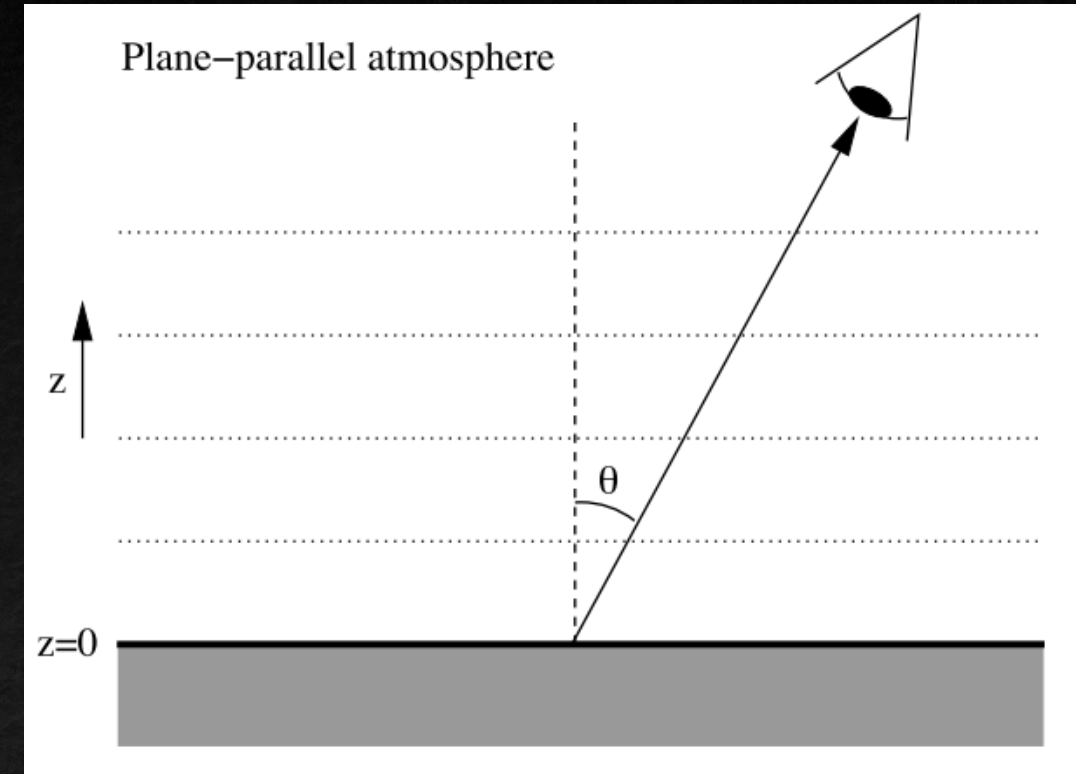
$$\mu \frac{dI_\nu(z, \mu)}{dz} = \alpha_\mu(z) [S_\nu(z) - I_\nu(z, \mu)]$$

- Moments (all scalars because we are only interested in the z-component)

$$J_\nu = \frac{1}{2} \int_{-1}^{+1} I_\nu(\mu) d\mu$$

$$H_\nu = \frac{1}{2} \int_{-1}^{+1} I_\nu(\mu) \mu d\mu$$

$$K_\nu = \frac{1}{2} \int_{-1}^{+1} I_\nu(\mu) \mu^2 d\mu$$



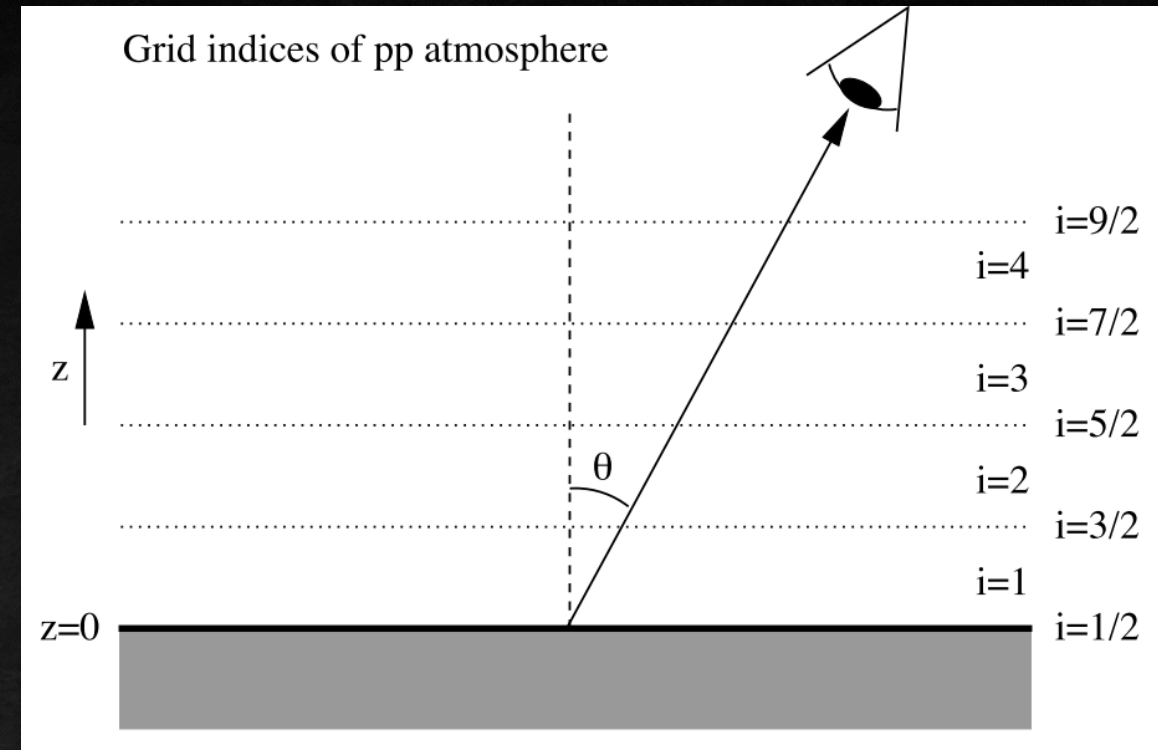


# 1D plane-parallel radiative transfer: numerical

- We want to integrate

$$\frac{dI}{ds} = j - \alpha I \equiv \alpha(S - I)$$

- We will omit  $\vec{x}, \hat{n}, \nu$  for convenience.
- Let's look at the Olson & Kunasz (1987) method
  - Assume a functional form of  $j(z)$  and  $\alpha(z)$  between the cell boundaries
  - Solve the RTE exactly between the boundaries





# 1D plane-parallel radiative transfer: numerical

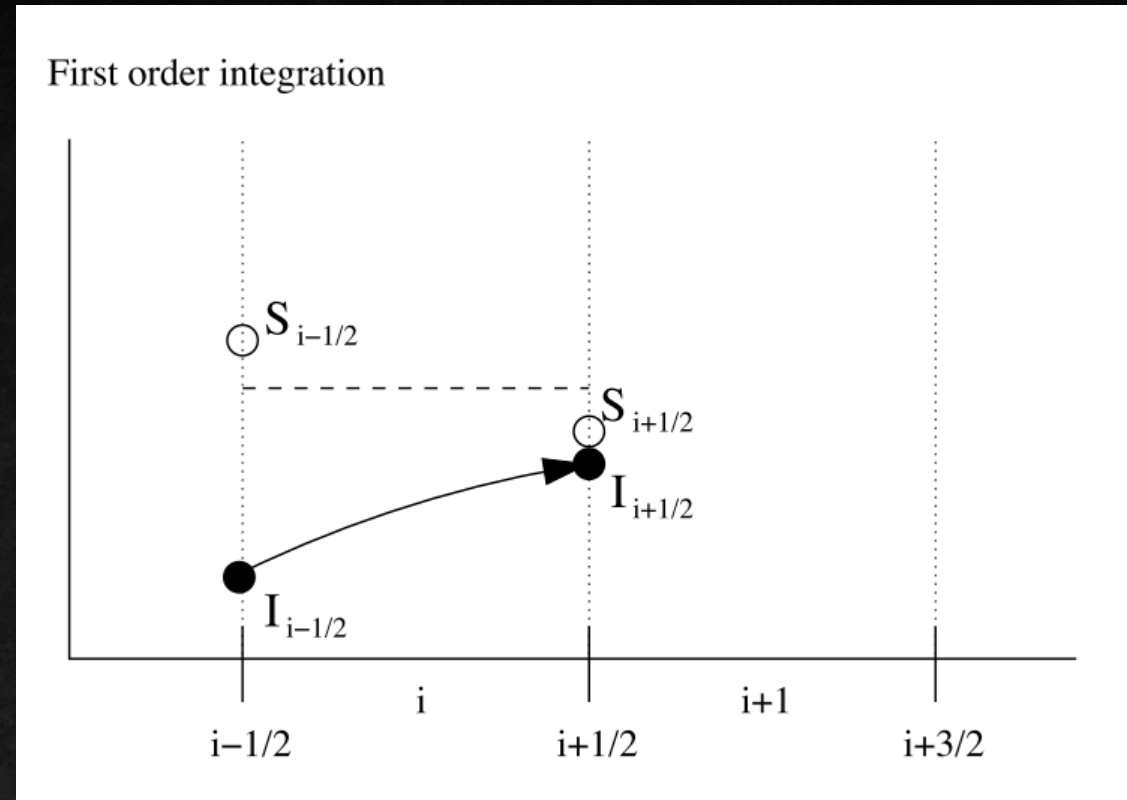
- **First order integration:** assume constant emissivity  $j$  and extinction  $\alpha$  within the cell
- For each cell  $i$ , calculate an optical depth

$$\Delta\tau_i = (s_{i+1/2} - s_{i-1/2})\alpha_i$$

- Using the source function  $S_i = j_i/\alpha_i$ , the intensity at the next cell boundary is

$$I_{i+1/2} = e^{-\Delta\tau_i} I_{i-1/2} + (1 - e^{-\Delta\tau_i})S_i$$

- Repeat for all angles  $\mu$





# 1D plane-parallel radiative transfer: numerical

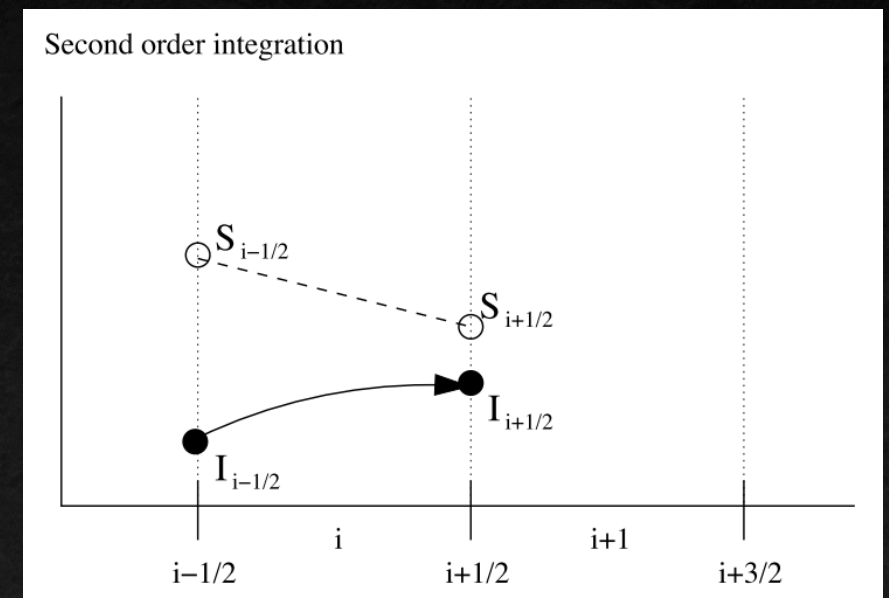
- **Second order integration**: assume linear emissivity  $j$  and extinction  $\alpha$  within the cell
- The optical depth remains the same

$$\Delta\tau_i = (s_{i+1/2} - s_{i-1/2})\alpha_i$$

- The exact solution of the RTE across the cell is

$$I_{i+1/2} = e^{-\Delta\tau_i} I_{i-1/2} + Q_i$$

$$Q_i = \left[ \frac{1 - (1 + \Delta\tau_i)e^{-\Delta\tau_i}}{\Delta\tau_i} \right] S_{i-1/2} + \left[ \frac{\Delta\tau_i - 1 + e^{-\Delta\tau_i}}{\Delta\tau_i} \right] S_{i+1/2}$$





# 1D plane-parallel radiative transfer: numerical

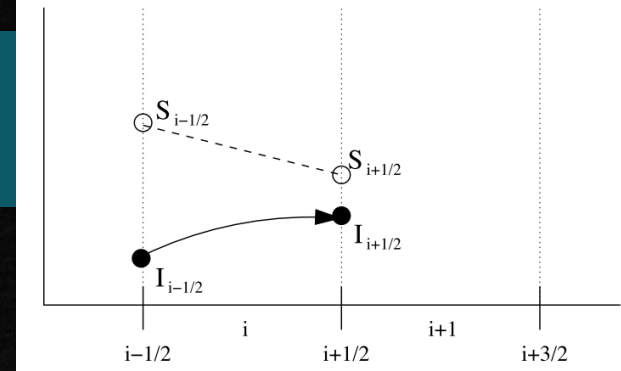
$$I_{i+1/2} = e^{-\Delta\tau_i} I_{i-1/2} + Q_i$$

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- When  $\Delta\tau_i$  is small, we need to use the limit instead of a direct evaluation to avoid divisions by zero, where

$$\lim_{\Delta\tau_i \rightarrow 0} Q_i = \frac{1}{2} \Delta\tau_i (S_{i-1/2} + S_{i+1/2})$$

Second order integration





# Monte Carlo radiative transfer

- Follow many (thousands, millions, billions) rays, solving the RTE along each path, until we have a good statistical sample of the radiation field
- Easy to understand because they simulate the motion of photons
- Easy to implement complicated microphysics in a bulk manner
- Each ray has some direction  $\hat{n}$  and current position  $\vec{x}$
- Can consider the head of the ray as a “photon packet” traveling through the domain
- Let's first look at a pure scattering problem, i.e.  $\epsilon_\nu = 0$



# MCRT: Finding the next scattering event

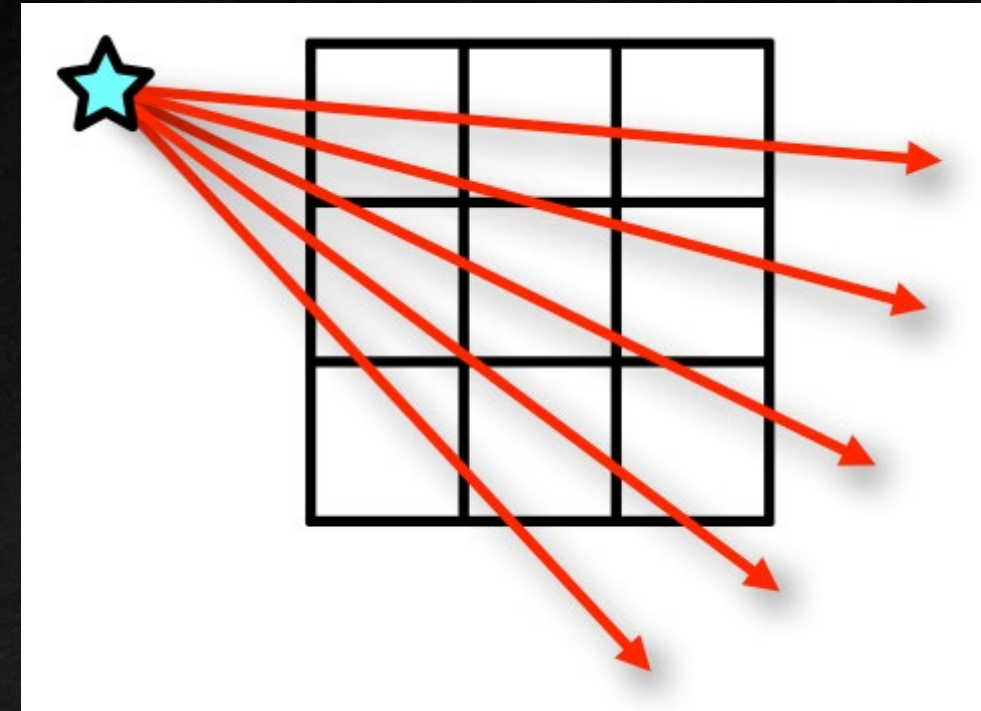
- Scattering is not a deterministic process, but it follows a Poisson distribution
- Generate a random number to find the optical depth  $\tau$  of the next scattering event, which has a PDF of
$$p(\tau) = e^{-\tau}$$
- Which can be achieved by drawing a uniform random number  $\xi \in (0,1]$  that corresponds to a random optical depth

$$\tau = -\ln \xi$$



# MCRT: Finding the next scattering event

- Ray trace through the domain points, solving the RTE in each cell, until we reach the previously determined  $\tau$
- Each cell will have some optical depth  $\Delta\tau$
- Also, a ray may exit the domain without being scattered, in which case we delete the ray and proceed to the next ray



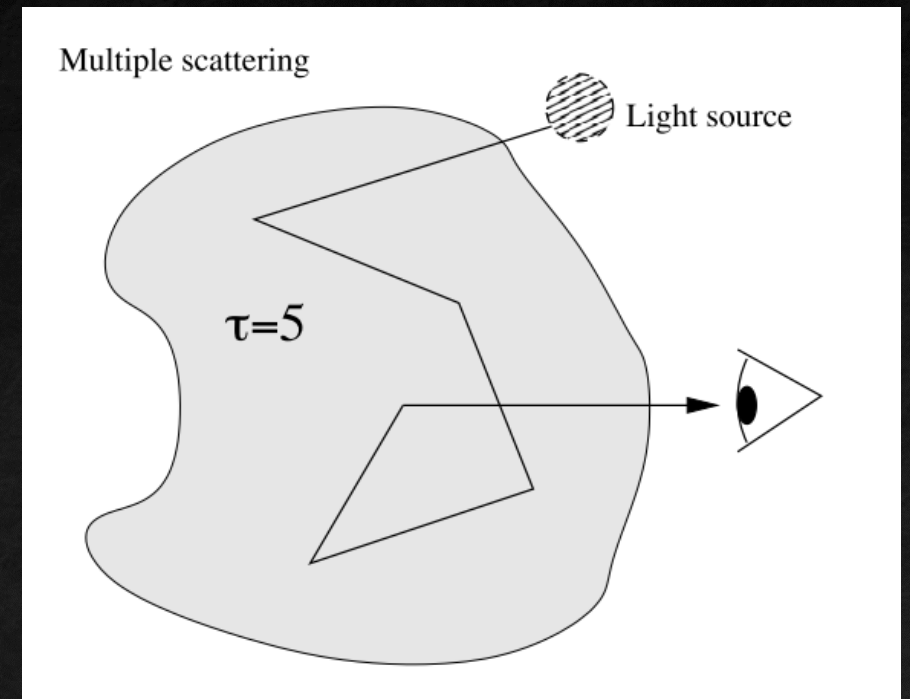


# MCRT: drawing a random scattering direction

- When we reach the cell where the scattering event occurs, a new direction must be drawn
- In the isotropic scattering case, we want the directions to be uniformly distributed around the unit sphere, giving

$$\theta = \cos^{-1}(2\xi_1 - 1), \quad \phi = 2\pi\xi_2$$

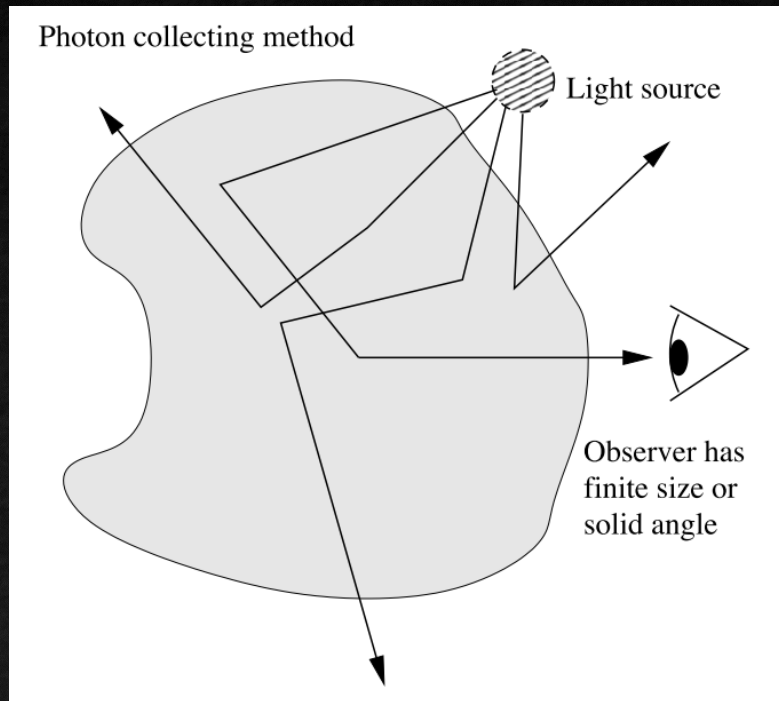
where  $\xi_i$  are uniform random numbers.



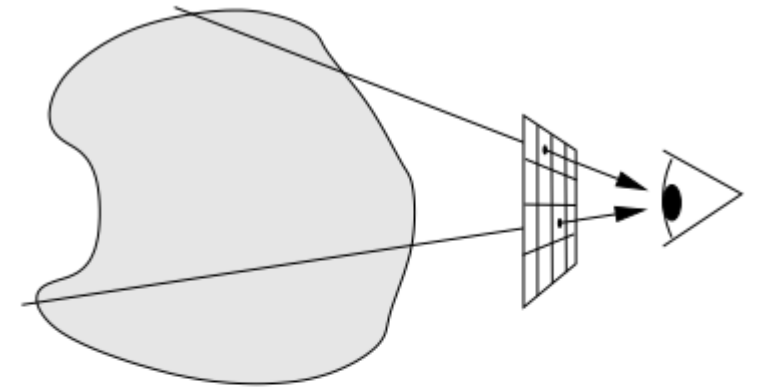


# MCRT: synthetic images

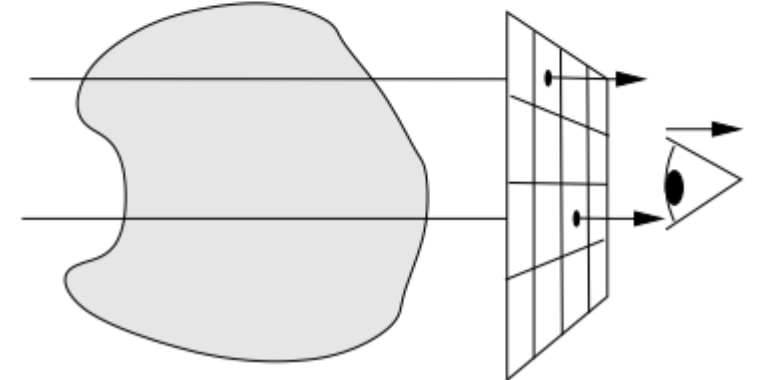
- Different methods to create images from scattered light
- In all cases, we solve the RTE along those rays
- Choose perspective depending on problem



Volume rendering of image: Local observer



Volume rendering of image: Observer at infinity



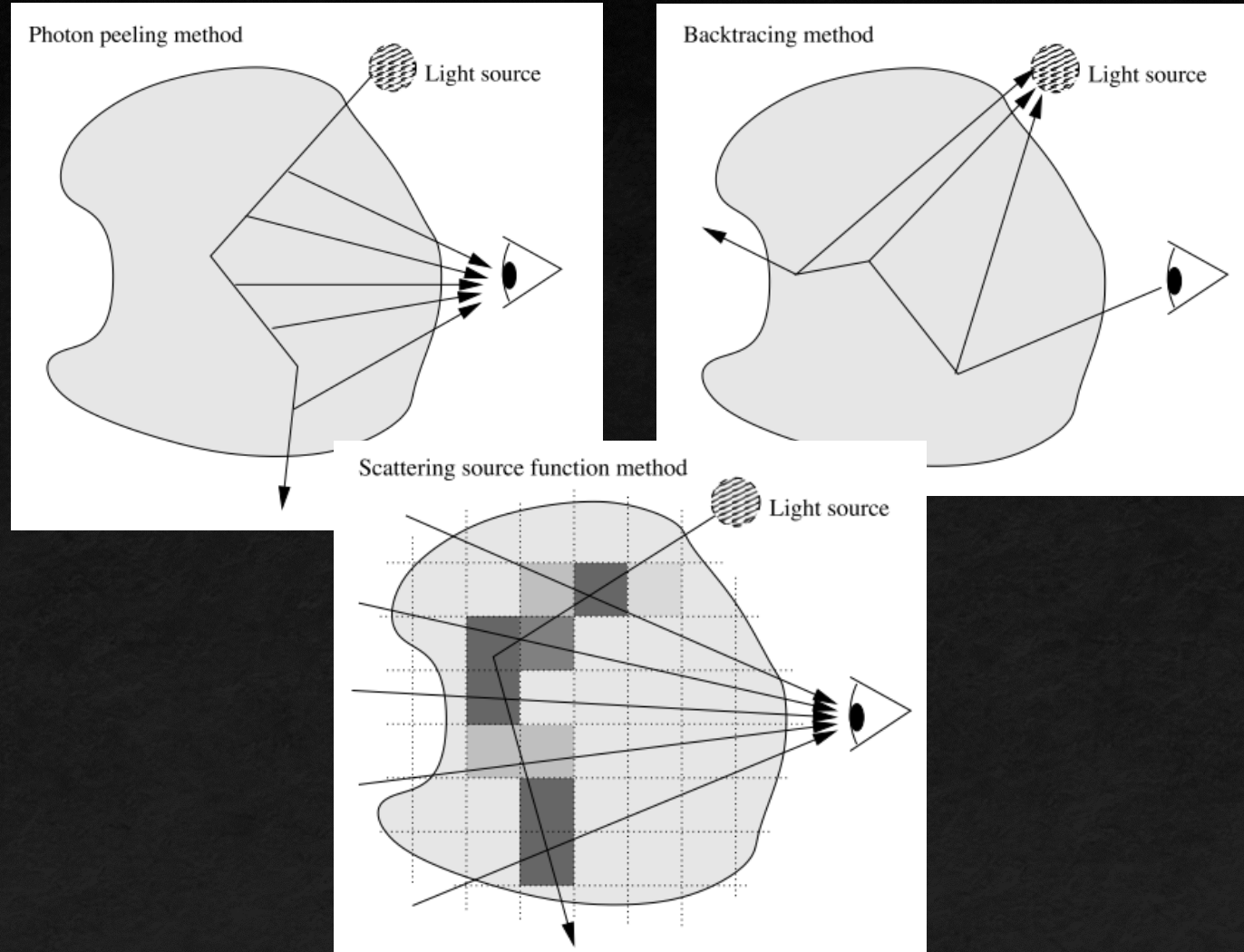


# MCRT: synthetic images

- Three popular methods

1. Photon peeling
2. Backtracing
3. Scattering source function

- Usually need  $O(10^6)$  photons to reduce MC noise









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