

Robust and Accurate Methods for Thermal Radiation Transport

Spherical Harmonics and Other Methods

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Recent progress has produced robust spherical harmonics methods



- Unicorns, a word that rhymes with orange, and a robust spherical harmonics method for x-ray radiation transport
 - > Only one of these things exists*
- I wouldn't have been able to say that spherical harmonics can be made robust as little as a year ago
 - > I'll talk about one method
- In this talk I'll discuss...
 - Why one might want to develop such a method,
 - > What are the roadblocks,
 - What remains to be done.
- Along the way they'll show some results
 - Numerical and analytical
- I'll also introduce a new way to solve the transport equation that looks to be efficient and accurate
 - The idea is to split the transport equation based on whether particles have collided during a time step or not.



 Specifically, in this talk we will be dealing with radiation transport in high energy density (HED) systems

> The radiation is coupled to the material through collisions and the blackbody emission

 In HED systems radiation transport is a significant contribution to the dynamics of the system

- > At high enough temperatures the radiation flux and pressure can be comparable to the hydrodynamic energy flux and pressure
- > Ignoring radiation therefore ignores much about the evolution of the system.
- As such, radiation transport is an important part of radiation hydrodynamics calculations where radiation in the system affects the system evolution

E.g. radiating shocks, inertial confinement fusion, lightning

- Unfortunately, the cost of solving the equations that govern the radiation transport can be prohibitively expensive
 - The specific intensity of radiation is described by 7 independent variables (3 space, 2 direction, 1 energy, 1 time)
 - This makes the issue of developing inexpensive and accurate transport methods critical to high fidelity simulation of rad-hydro systems.



 In this talk we'll be solving the an equation for the transport of gray x-rays coupled to an equation describing the material internal energy

$$\frac{1}{c}\partial_t I + \Omega \cdot \nabla I + \sigma_{\mathbf{a}}I = \frac{c\sigma_{\mathbf{a}}}{4\pi}aT^4$$
$$C_{\mathbf{v}}\partial_t T = c\sigma_{\mathbf{a}}\left(E_{\mathbf{r}} - aT^4\right)$$

• Where $I(\vec{r}, \Omega, t) = \text{specific intensity}, \quad T(\vec{r}, t) = \text{material temperature}$ $E_{\mathrm{r}}(\vec{r}, t) = \int_{4\pi} d\Omega I(\vec{r}, \Omega, t) = \text{radiation energy density}$ $\Omega \in \mathbb{S}_2 = \text{ a direction on the unit sphere}$ $a = \text{radiation constant}, \quad c = \text{ speed of light}$ $\sigma_{\mathrm{a}} = \text{ absorption opacity (units of inverse length)}$

No scattering or frequency dependence (for simplicity)



- Methods for solving the transport equation are generally classified according to how they treat the angular variable (Ω).
- Discrete ordinates methods (S_n) solve the transport equation along particular directions and then use a quadrature rule to compute the radiation energy density.
 - There has been a lot of work on efficient solution techniques for this method.
 - *Ray effects can be a problem*
- Monte Carlo methods sample the phase space and track particles along trajectories and stochastically model collisions and emission
 - > Implicit Monte Carlo (IMC) is the most famous and widely used of these methods.
 - > Can give excellent answers to the patient, though noise and overheating are issues
 - > Unlike Monte Carlo for linear problems, the limit of an infinite number of particles is not the exact solution (linearization, temporal, and spatial errors in IMC).
- Spherical harmonics methods (Pn) represent the angular variable using a truncated spherical harmonics expansion.
 - > Can give exponential convergence for smooth solutions
 - The truncated expansion leads to oscillations known as wave effects
 - Little work has been done on efficient solution techniques
- Flux-limited diffusion represents the transport operator with a diffusion process
 - > Particles move from high concentrations to low concentrations
 - > As a result particles flow like smoke

Why (or why not) the spherical harmonics method?



- Using a orthogonal basis should be accurate in describing the radiation intensity in many cases
 - > More accurate than pointwise estimates
- When the solution is discontinuous, however, this representation can be misleading
 - *Gibbs phenomenon (oscillations)*
- The intensity and radiation energy density should always be positive for physical reasons.
 - The oscillations in the spherical harmonics representation can make these negative!
 - > Worse these can drive the material temperature negative.
- Except for low order approaches there has been no successful method to eliminate these problems (until recently):
 - > The M_n methods expand in an exponential basis rather than a polynomial basis.
 - Above n=1 an optimization problem must be solved to find the moments.
 - Closures for the P₁ equations have been proposed
 - Minerbo, Kershaw, Levermore-Pomraning, etc.
- There are two techniques that can eliminate these negative solutions and oscillations.



- One might be tempted to say, "I'll just make my n high enough so that I avoid these negative solutions."
- It turns out that is not possible to have a finite expansion that is bulletproof to negative solutions.
- Theorem (McClarren, et al): For any finite value of *n* there exists a transport problem where the P_n solution will have a negative energy density.
- Therefore, if we want to guarantee that our solution will never go negative we have to change the expansion or the resulting equations.
- The proof of the theorem gives us a choice of what we must change.
 - The proof also relies on the plane to point transform by which we write the solution from a point source to the solution from a planar source.

McClarren et al. On solutions to the P-n equations for thermal radiative transfer. Journal of Computational Physics (2008) vol. 227 (5) pp. 2864-2885

Plane to Point Transform



◆ Consider the solution due to an infinite, pulsed, planar source at x=0.



Now we can consider the plane as being comprised of many point sources

$$E_{\rm r,plane}(x,t) = \int_{-\infty}^{\infty} dy \int_{-\infty}^{\infty} dz \, E_{\rm r,point} \left(\sqrt{x^2 + y^2 + z^2} \right)$$

$$x$$
Where $E_{\rm r,point}(r,t)$ is the solution at a distance r from a point source

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We can invert this formula to get the solution from a point source in terms of the planar solution:

$$E_{\mathrm{r,point}} = -\frac{1}{2r}\partial_x E_{\mathrm{r,plane}}(x)|_{x=r}$$

- This transform is only valid if the underlying equations are
 - > Linear
 - > Rotationally invariant

 In vacuum the solution to the P_n equations from a pulsed, planar source is a series of delta functions traveling out from the origin

$$E_{\rm r,plane} = \sum_{k=0}^{n} a_k \delta(x - v_k t)$$

- The derivative of this solution is both positive and negative
 - Therefore, the radiation energy density due to a point source will be negative somewhere.
 - > This will be the case for any finite n



- To use the plane to point transform we needed rotational invariance and linearity.
- The delta functions in the P_n solution were a result of the P_n equations being hyperbolic (information only travels at a finite speed).
- Therefore, we need to break one of these properties to ensure positivity.
- Losing linearity seems to be the best way to go
 - X-rays do travel with finite speed
 - Loss of rotational invariance can cause artifacts in the solution.
- Discrete ordinates methods are not rotationally invariant
 - > If I rotate the coordinate system, the location of the ordinates changes
 - > This results in ray effects
- Diffusion methods are not hyperbolic
- Of course this is just to guarantee positive solutions
 - We might be able to do some other tricks that make negative solutions go away when they appear.



"But my problems don't have any vacuum regions."

- Even if the problems you want to solve don't have any evacuated regions, negativity can still result
 - > On short enough time scales any material behaves like a vacuum.
 - If I look at time scales much shorter than the time for absorption and re-emission.
 - In multigroup problems, the some materials might look like a vacuum to the high energy photons.

"My problems don't have point sources"

Shadows in the solution can also lead to negative energy densities

- > A shadow looks like a step function in angular space, fitting this with spherical harmonics will lead to negative values.
- In spherical geometry in the absence of point sources, negatives should not be a major problem

> Can't have a shadow in this geometry

 Moreover, if I have very coarse spatial grids and time steps the negative parts of the solution might be smeared out.





P7 Negative Solution Examples







The Filtered P_n (FP_n) Method

McClarren and Hauck, "Robust and Accurate Filtered Spherical Harmonics Expansions for Radiative Transfer", J. Comput. Phys., 229, 16, 5597-5614, 2010. McClarren and Hauck, "Simulating Radiative Transfer with Filtered Spherical Harmonics", Phys Ltr. A, 374,22, 2290-2296, 2010.

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• The standard P_n reconstruction of the specific intensity is

$$I \approx \sum_{l=0}^{n} \sum_{-l}^{l} Y_{l}^{m}(\Omega) I_{l}^{m} \quad \text{where} \quad I_{l}^{m} = \int_{4\pi} I(\Omega) \bar{Y}_{l}^{m}(\Omega) \, d\Omega$$

This representation is usually derived by a straightforward expansion.

• It is possible to derive this form as the result of an variational problem

Minimize the functional
$$\mathcal{J} = \int_{4\pi} \left(I(\Omega) - \sum_{l=0}^{n} \sum_{-l}^{l} Y_{l}^{m}(\Omega) I_{l}^{m} \right)^{2} d\Omega$$

over the I_l^m functions.

- The solution to this problem gives the standard expansion.
- This optimization problem tells us that the P_n expansion minimizes the square of the error

Truncating a spherical harmonic series: is it wise?





"Truncating a [spherical harmonics] series is a rather stupid idea." John P. Boyd, *Chebyshev and Fourier Spectral Methods*





- As alluded to earlier, the Gibbs errors near sharp features are the reasons truncating is *unwise*.
- In Boyd's book he uses this figure (from geophysics) to illustrate his point





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 A standard spherical harmonics expansion can't capture the flat ocean next to the mountain

Making the fish rather unhappy

- In transport these errors give us the negative solutions.
- The answer is to change the expansion so that these errors are eliminated (or at least reduced).



If we change the variational problem to minimize

$$\mathcal{J} = \int_{4\pi} \left[\left(I(\Omega) - \sum_{l=0}^{n} \sum_{-l}^{l} Y_l^m(\Omega) \hat{I}_l^m \right)^2 + \alpha \left(\nabla_{\Omega}^2 \sum_{l=0}^{n} \sum_{-l}^{l} Y_l^m(\Omega) \hat{I}_l^m \right)^2 \right] \, d\Omega$$

where $\alpha > 0$ is a parameter called the filter strength.

- This new functional penalizes oscillations because it includes the derivative.
- The resulting expansion is termed a filtered spherical harmonics expansion.
- The solution to the above problem is

$$\hat{I}_{l}^{m} = \frac{I_{l}^{m}}{1 + \alpha l^{2}(l+1)^{2}}$$

 The filtered expansion is the standard expansion where the coefficients are forced to decrease as / increases.



$$\hat{I}_{l}^{m} = \frac{I_{l}^{m}}{1 + \alpha l^{2} (l+1)^{2}}$$

- In the limit of zero filter strength the standard expansion is recovered.
- We still truncate the expansion at some order
 - The moments before the truncation will be decaying
- The zeroth moment is not affected by the filter
 - Number of particles is preserved.
- The equation of how to choose the filter strength has not been addressed
 - Picking a large filter strength would kill oscillations but might adversely affect the solution.
- If the filter strength is not picked as a function of the moments, then negative solutions could arise
 - The filtered expansion and resulting equations are still rotationally invariant and hyperbolic.
 - > We'll see that this isn't necessary in most problems.





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Choosing the Filter Strength



- We want to choose the filter strength that
 - > Minimizes oscillations
 - > While doing the least damage to the solution.
- The examples demonstrated that the strength should decrease as the order of the expansion is increased.
- Also, the filter is most needed in regions of free streaming (i.e. where the material opacity is small).
 - Absorption and re-emission by the material relaxes the intensity towards an isotropic distribution.
- With these in mind we choose the following form

$$\alpha = \frac{\omega}{n^2 (\sigma_{\rm a} L + n)^2}$$

L is a characteristic length (to make the strength dimensionless), n is the order of the expansion, and ω is a user defined, positive parameter

- This form preserves the equilibrium diffusion limit
 - > Specifically, for ϵ small and positive

$$\sigma_{\rm a} = O(\epsilon^{-1}) \rightarrow \alpha = O(\epsilon^2)$$



- To date the filtered Pn expansion has been implemented by adding a source term to the standard Pn equations.
- For an explicit code the source term basically acts as applying the filter to the expansion after every time step.
- When solved implicitly, the source acts as a forward peaked scattering term.
- The results I'll show here use
 - > A bilinear discontinuous Galerkin finite element spatial discretization
 - Second-order semi-implicit time integration
- For the filter strength we set
 - ▶ L=1 cm
 - $\succ \omega = c\Delta t / \Delta x$
- These parameters were used in all computations.

Pulsed Line Source Results



- The first problem we solve is a 2-D Cartesian problem
 - > initial condition $I(\vec{r}, \Omega, 0) = \delta(x)\delta(y)$
 - > Pure scattering medium.
- There is an analytic transport solution to this problem (Ganapol).
- This is a hard problem
 - Delta function of uncollided particles
 - Smooth region of collided particles
- Both P_n and S_n methods have a hard time with this problem.
 - Gibbs errors and ray effect respectively



Analytic Radiation Energy Density at t = 1/c



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Lineout at t=1/c





- The location of the oscillations is changing
- The FP_n solutions are converging
 - Location of hump moving to 1
- S_n hard to tell



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- P₂

 $\leftrightarrow P_5$ $\rightarrow P_7$

Transport

Cartesian Hohlraum problem



- A Hohlraum like configuration in x-y geometry
 - > Vacuum region (white)
 - $\succ \sigma_{\rm a} = 100 T^{-3}$ for T in keV (blue)
 - Constant specific heat
 - Using the standard P_n method
 - The material temperature went negative
 - > This caused the simulation to crash
- We'll compare
 - ► IMC
 - $\succ S_n$
 - \succ FP_n
 - > FLD
- In the solution we expect to see a shadow behind the center block
 - > Until the walls heat up



Problem Layout



0 0.1 0.9 0.9 0.1 0.2 0.8 0.8 0.2 0.3 0.7 0.7 0.3 0.4 0.6 0.4 0.6 IMC^{№ 0.5} 0.5 FP_7 N 0.5 0.5 0.6 0.4 0.6 0.4 0.7 0.3 0.7 0.3 0.8 0.8 0.2 0.2 0.9 0.9 0.1 0.1 0 1 0 1 0.2 0.4 0.8 0.6 1 0 0.2 0.4 0.6 0.8 1 х х 0 0 0.9 0.1 0.1 0.9 0.8 0.2 0.2 0.8 0.7 0.3 0.7 0.3 0.6 0.4 0.4 0.6 N 0.5 0.5 S_8 N 0.5 FLD 0.5 0.6 0.4 0.6 0.4 0.7 0.3 0.7 0.3 0.8 0.2 0.8 0.2 0.9 0.1 0.9 0.1 1 0 0 1 0.2 0 0.4 0.6 0.8 1 0.2 0.4 0.6 0.8 1 х х

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T_{mat} Hohlraum Results at t=0.1 sh



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• Gibbs Errors are a problem with spherical harmonics methods

- > Using a filter on the expansion addresses this problem
- \bullet On two challenging problems the FP_n method performed well
 - > It was clearly the best method on the line source problem.
 - **Gave comparable accuracy to IMC on the hohlraum problem**
- This method deserves strong consideration as a deterministic transport option.
- Still some investigation to be performed
 - > Multigroup: group dependent filters
 - RZ and 3D geometry
 - > Time dependent filters
 - Efficient numerical methods



A Collisional Splitting Scheme for Radiation Transport

There are two important limits of the transport equation.



• When there is no scattering or emission, the directions of particle travel don't talk to each other 1

$$\frac{1}{c}\partial_t I + \Omega \cdot \nabla I + \sigma_{\rm a} I = Q$$

> The solution at r is just an integral from the source Q to r

The opposite case where absorption/emission dominates leads to a diffusion equation for the material temperature

$$C_{\rm v}\partial_t T + a\partial_t T^4 = \nabla \frac{ac}{3\sigma_{\rm a}} \nabla T^4$$

- How one solves the equation in each case would be different
- In the streaming dominated case
 - *Ray tracing, integral transport, etc.*
- In the diffusion case
 - > Low order transport (P_1, S_2)
 - > Flux-limited diffusion
- Many problems have regions of both types or are intermediate
 - > The hohlraum problem we talked about above had both regions
 - > Different groups might be thin or thick in a multifrequency calculation



• Takes a method that works well in one limit and tries to fix it in the other.

Not a lot of success in doing this.

- Implicit Monte Carlo is efficient in optically thin media
 - Inefficient in a diffusive medium due to tracking lots of collisions.
 - > Discrete Diffusion MC and other approaches attempt to address this
- Discrete Ordinates methods
 - > Have ray effects in thin regions
 - Ray effect mitigation techniques are not very robust
 - Biased quadrature sets can help.
 - It optically thick regions, the solutions can be more expensive.
- Spherical Harmonics works in thick problems
 - Gibbs errors in streaming dominated regions
 - *Filtered expansions attempt to address this.*
- Flux-limited diffusion
 - Can work well in thick problems
- Other methods exist, but not works well in all problems.



 Consider the transport equation with the emission source linearized over a time step

$$\frac{I^{n+1} - I^n}{c\Delta t} + \Omega \cdot \nabla I^{n+1} + \sigma_{a}I^{n+1} = \frac{(1-f)\sigma_{a}c}{4\pi}E_{r}^{n+1} + \frac{f\sigma_{a}}{4\pi}acT_{n}^{4}$$

 \blacklozenge Now, write the intensity as $I = I_u + I_c$ and rearrange the equations

$$\begin{split} \Omega\cdot\nabla I_{u}^{n+1} + \sigma_{\mathrm{a}}^{*}I_{u}^{n+1} &= \frac{f\sigma_{\mathrm{a}}}{4\pi}acT_{n}^{4} + \frac{I_{u}^{n} + I_{c}^{n}}{c\Delta t} \\ \Omega\cdot\nabla I_{c}^{n+1} + \sigma_{\mathrm{a}}^{*}I_{c}^{n+1} &= \frac{(1-f)\sigma_{\mathrm{a}}c}{4\pi}\left(E_{\mathrm{r,c}}^{n+1} + E_{\mathrm{r,u}}^{n+1}\right) \end{split}$$
 where $\sigma_{\mathrm{a}}^{*} = \sigma_{\mathrm{a}} + \frac{1}{c\Delta t}$

These split equations have split the transport problem into

- > A pure absorber equation for particles that have not collided during the time step
- An equation with an isotropic source for particles that have collided during the time step.



- The first equation can be solved using a method that is accurate and efficient for pure absorber problems
 - > Monte Carlo (won't have to track multiple collisions)
 - High order discrete ordinates (one transport sweep)
 - Ray tracing, etc.
- The solution to the second equation should be close to isotropic
 - *Use a low order transport method (or diffusion) to solve it*
- Only one equation contributes in the limits
 - > In the free streaming limit only the uncollided equation contributes
 - > In the diffusion limit only the collided equation matters
- We then can get transport effects nearly for free
 - In one sweep or history per particle
- Can get arbitrary accuracy:
 - > Have the flexibility to solve either piece with as accurate a method as I want.
- The split can be generalized into an arbitrary number of steps
 - > Instead of doing one collision then the collided equation, I could do more
- This split could be easily implemented in existing codes
 - > IMC code with a DDMC option (Use IMC on uncollided, DDMC for collided)
 - > S_n code with diffusion preconditioning



- The quasi-diffusion method (Goldin 1964) uses discrete ordinates to compute the particle pressure tensor,
 - > This particle pressure is used to close the diffusion equation.
 - > In principle this method solves the full transport equation
 - *Computing the pressure cannot be done in one transport sweep.*
- Diffusion-Monte Carlo methods have been proposed
 - Simulate the particles with Monte Carlo until they enter a diffusive region, then make them "diffusion" particles.
 - > Treating the interfaces between regions is tricky.
- Using the discrete ordinates equations to inform diffusion has been proposed for gas cooled nuclear reactors (Larsen 2009)
 - Under certain conditions one can compute an anisotropic diffusion tensor using one or several transport sweeps.
- Splitting the method based on whether or not a particle has collided is new.

Example: Flux-limited Diffusion for the collided equation



• We can solve the system via the following procedure:

> Solve the uncollided equation via ray tracing or high order S_n

$$\Omega \cdot \nabla I_u^{n+1} + \sigma_{\mathbf{a}}^* I_u^{n+1} = \frac{f\sigma_{\mathbf{a}}}{4\pi} a c T_n^4 + \frac{I_u^n + I_c^n}{c\Delta t}$$

> Then compute
$$E_{{
m r},u}^n=rac{1}{c}\int_{4\pi}I_u^{n+1}\,d\Omega$$

> Then solve the diffusion equation with a flux limiter

$$-\nabla \cdot D^{n} \nabla E_{\mathbf{r},c}^{n+1} + \left(f \sigma_{\mathbf{a}} + \frac{1}{c\Delta t} \right) E_{\mathbf{r},c}^{n+1} = (1-f) \sigma_{\mathbf{a}} E_{\mathbf{r},u}^{n+1}$$
$$D^{n} = \left((3\sigma_{\mathbf{a}}^{*})^{2} + \frac{|\nabla E_{\mathbf{r}}^{n}|^{2}}{(E_{\mathbf{r}}^{n})^{2}} \right)^{1/2}$$

> Finally, compute

$$I_{c}^{n+1} = \frac{1}{4\pi c} E_{r,c}^{n+1} - \frac{1}{3\sigma_{a}^{*}c} \Omega \cdot \nabla E_{r,c}^{n+1}$$



Initial 2-D Results for Linear Transport

- A Hohlraum like configuration in x-y geometry
 - > Vacuum region (white)
 - Strong scattering (blue)
- To solve this problem we generally need to have very high angular accuracy to capture the correct solution.
- The results demonstrate that we only need high order treatments in the uncollided part to get good answers.



$$\succ S_{20}$$

- > FLD
- > Split S₂₀/FLD



Problem Layout

2-D Results at t = 1.3/c





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• Given that this is a simple implementation with first-order spatial discretizations,

- *it is hard to say that this new method is going to revolutionize transport calculations.*
- We did observe, however, that the Split solution only spent 10% of the solution time solving the uncollided part
 - This is notable because for this 10% effort all of the features of the high-order transport solution were captured.
 - > How this will work in other problems is an open question.
- Still a lot to look into
 - > We did not analyze how material interfaces behave
 - These might require an asymptotic preserving method.
 - > Boundary conditions we not discussed
 - The most straightforward implementation is to have all incoming particles treated as uncollided
 - Reflecting boundaries?
 - *Better time accuracy*
 - Higher order integration is desireable in some problems
 - TBDF-2 and other robust scheme should apply to this technique
 - To make the split more accurate we could use Strang splitting
 - > I only used high order S_n to solve the uncollided equation
 - Need to look at Monte Carlo and integral techniques for this equation.

New methods for HED radiative transfer are being developed



- The spherical harmonics method, in its standard form, has robustness issues
 - Gibbs errors lead to negative energy densities
 - > These errors also hurt accuracy of method
 - > Negative solutions can arise regardless of order of expansion
- By applying a filter to the spherical harmonics expansion
 - > The robustness issues are addressed
 - > Accuracy is greatly improved
 - Comparable with IMC on a hohlraum problem
- Initial work looking at splitting the transport equation based on collisions during a time step look promising
 - > Split the solution during a time step into
 - A pure absorber problem
 - A scattering problem with isotropic source
 - > Get transport effects for a fraction of the cost
- Combining these developments could be fruitful.
- Still work to be done
 - > The future looks bright.



Thank you for listening



The Positive P_n (PP_n) Method

Hauck and McClarren, The Positive Pn Method, SIAM Journal on Scientific Computing, in press

The Positive P_n method guarantees a positive solution

 The standard spherical harmonics reconstruction is the solution to an optimization problem

Given a set of spherical harmonic moments

$$I_l^m = \int_{4\pi} Y_l^m(\Omega) I(\Omega) \, d\Omega \quad 0 \le l \le n, \, -n \le m \le n$$

minimize:
$$\int_{4\pi} f(\Omega)^2 d\Omega$$

subject to:
$$\int_{4\pi} f(\Omega) Y_l^m(\Omega) d\Omega = I_l^m \quad 0 \le l \le n, \ -n \le m \le n$$

• The solution to this problem is $f(\Omega) = \sum_{l=0}^{n} \sum_{m=-l}^{l} I_l^m Y_l^m(\Omega)$

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The Positive P_n method guarantees a positive solution

We modify the optimization problem to guarantee a positive reconstruction

minimize:
$$\int_{4\pi} f(\Omega)^2 d\Omega$$

subject to:
$$\int_{4\pi} f(\Omega) Y_l^m(\Omega) d\Omega = I_l^m \quad 0 \le l \le n, \ -n \le m \le n$$

and $f \ge 0$

- We can't enforce the constraint everywhere (this would be an infinite number of constraints)
 - Instead we replace the integrals with a quadrature rule and enforce positivity at each quadrature point

We can then use this form of f as a closure

• We have effectively made the P_n method nonlinear and not rotationally invariant



 The positive P_n method requires solving an optimization problem in every spatial cell for every time step

- > These solves can be time consuming for large values of n
- > This problem is completely local and therefore scalable.
- One has to choose a quadrature rule and order
 - > The quadrature rule must integrate order n spherical harmonics exactly
 - Using product quadrature we found using a quadrature of order 2n was most efficient
- The value of the solution at the quadrature points does not need to be stored between time steps, only the moments.
- To guarantee that there exists a solution to the optimization problem
 - One needs to make sure that the spatial and temporal discretizations do not introduce negative solutions.
 - > To accomplish this we have used first order discretizations.