

Solving the 3D steady Radiative Transfer Equation with FreeFem++

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16th December 2015

Céfo^PRam

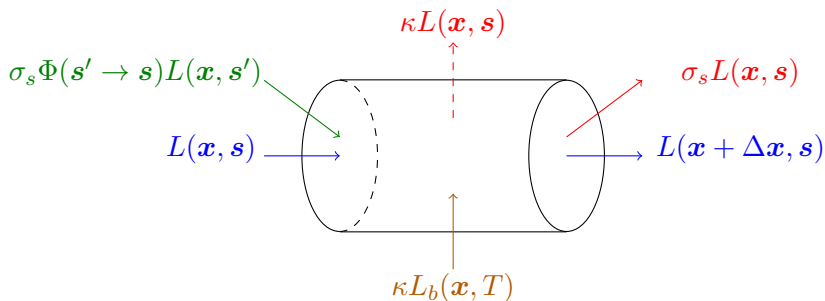


Plan

- 1 Forward Model and Weak Formulation
- 2 Iterative Method and Parallelization Strategy
- 3 Validation
- 4 Conclusion

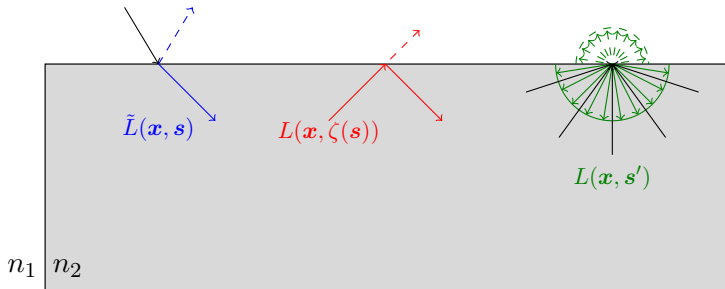
Radiative Transfer Equation

$$\underbrace{\mathbf{s} \cdot \nabla L(\mathbf{x}, \mathbf{s})}_{\text{Transport}} + \underbrace{(\kappa + \sigma_s)L(\mathbf{x}, \mathbf{s})}_{\text{Loss by absorption and scattering}} = \underbrace{\sigma_s \int_{4\pi} \Phi(\mathbf{s}' \rightarrow \mathbf{s}) L(\mathbf{x}, \mathbf{s}') \, d\mathbf{s}'}_{\text{Gain by scattering}} + \underbrace{\kappa L_b(\mathbf{x}, T)}_{\text{Emission}}$$



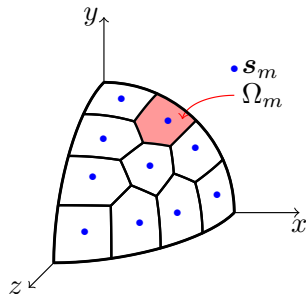
Boundary Conditions

$$L(\mathbf{x}, \mathbf{s}) = \underbrace{\tilde{L}(\mathbf{x}, \mathbf{s})}_{\text{Entering Radiance}} + (1 - \alpha) \underbrace{\rho(\mathbf{s} \cdot \mathbf{n}) L(\mathbf{x}, \zeta(\mathbf{s}))}_{\text{Specular Reflection}} + \alpha \underbrace{\frac{1 - \varepsilon}{\pi} \int_{\mathbf{s}' \cdot \mathbf{n} > 0} L(\mathbf{x}, \mathbf{s}') \mathbf{s}' \cdot \mathbf{n} \, d\mathbf{s}'}_{\text{Diffuse Reflection}}$$



Discrete Ordinate Method

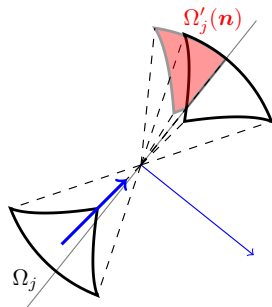
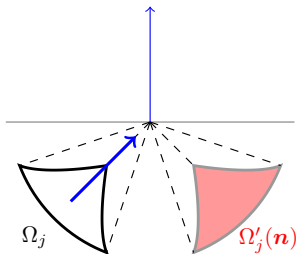
Angular Discretization



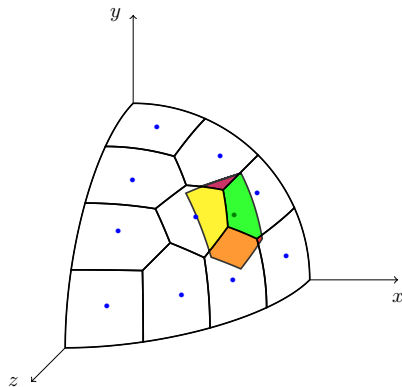
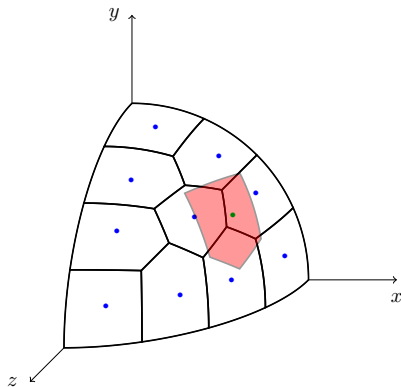
$$(\text{SDS}_m) : (s_m \cdot \nabla + \kappa + \sigma_s) L(x, s_m) - \sigma_s \sum_{j=1}^{N_d} \omega_j L(x, s_j) \Phi_{m,j} = \kappa L_b(T)$$

with $\omega_m = \text{mes } \Omega_m$

Discrete Boundary Conditions



Discrete Boundary Conditions



$$L_m(\mathbf{x}) = \tilde{L}_m + \delta_{m,m}(\mathbf{n})L_m + \sum_{j \neq m} \delta_{m,j}(\mathbf{n})L_j$$

for $\mathbf{s}_m \cdot \mathbf{n} < 0$

Weak Formulation of (SDS_m) by the SUP-G finite element methods

$$\begin{aligned}
 & \int_{\mathcal{D}} (\mathbf{s}_m \cdot \nabla L_m) (\mathbf{s}_m \cdot \nabla v) \, d\mathbf{x} - \int_{\mathcal{D}} \tilde{\beta}_m (\mathbf{s}_m \cdot \nabla L_m) v \, d\mathbf{x} \\
 & + \int_{\partial\mathcal{D}^{m+}} \tilde{\beta}_m L_m v (\mathbf{s}_m \cdot \mathbf{n}) \, d\Gamma + \int_{\partial\mathcal{D}^{m-}} \tilde{\beta}_m \delta_{m,m}(\mathbf{n}) L_m v (\mathbf{s}_m \cdot \mathbf{n}) \, d\Gamma \\
 & - \sum_{j \neq m} \left[\omega_j \Phi_{m,j} \int_{\mathcal{D}} \sigma_s L_j (\mathbf{s}_m \cdot \nabla v) \, d\mathbf{x} + \int_{\partial\mathcal{D}^{m-}} \tilde{\beta}_m \delta_{m,j}(\mathbf{n}) L_j v (\mathbf{s}_m \cdot \mathbf{n}) \, d\Gamma \right] \\
 & = - \int_{\partial\mathcal{D}^{m-}} \tilde{\beta}_m \tilde{L}_m v (\mathbf{s}_m \cdot \mathbf{n}) \, d\Gamma + \int_{\mathcal{D}} \kappa L_b (\mathbf{s}_m \cdot \nabla v) \, d\mathbf{x}
 \end{aligned}$$

$$\forall m = 1, \dots, N_d$$

Size Problem $(N_d \times N_{dof})^2$

$$\sum_{m=1}^{N_d} \left[\underset{\text{red}}{a_{m,m}(L_m, v)} + \sum_{j \neq m} \underset{\text{blue}}{a_{m,j}(L_j, v)} \right] = \sum_{m=1}^{N_d} \underset{\text{green}}{l_m(v)}$$


 $\underset{\text{red}}{A_{m,m}}$

 $\underset{\text{blue}}{A_{m,j}}$

 $\underset{\text{green}}{b_m}$

$$A = \begin{pmatrix} \text{red box} & & & \\ & \text{red box} & & \\ & & \ddots & \\ & & & \text{red box} \\ & & & & A_{m,j} \ j > m \\ & & & & & \ddots \\ & & & & & & A_{m,m} \\ & & & & & & & \ddots \\ & & & & & & & & A_{m,j} \ j < m \end{pmatrix}$$

Plan

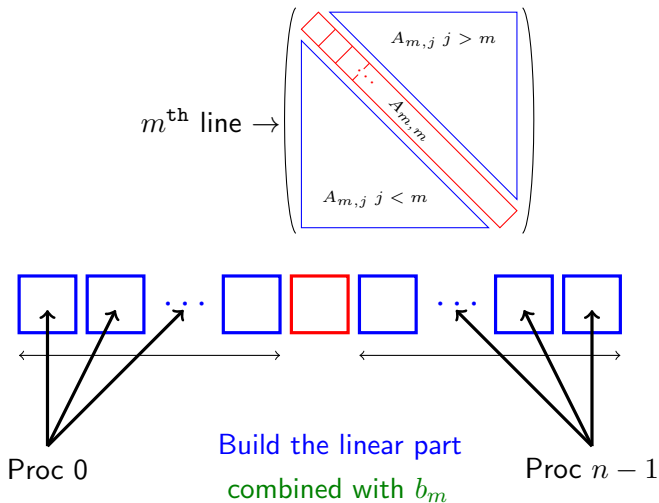
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Gauss-Siedel iterative method

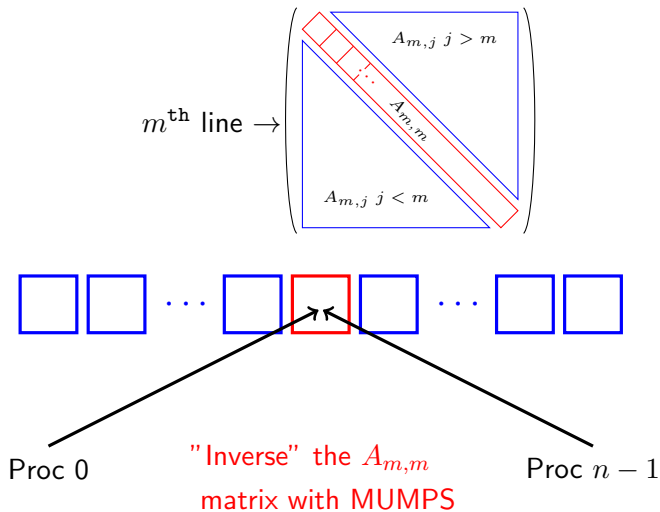
$$\sum_{m=1}^{N_d} \left[a_{m,m}(L_m^{N+1}, v) + \sum_{j < m} a_{m,j}(L_j^{N+1}, v) + \sum_{j > m} a_{m,j}(L_j^N, v) \right] = \sum_{m=1}^{N_d} l_m(v)$$

$$\begin{pmatrix} \text{red box} \\ A_{m,m} \\ \text{blue box} \\ A_{m,j} \ j < m \end{pmatrix} \begin{pmatrix} L_1^{N+1} \\ \vdots \\ L_{N_d}^{N+1} \end{pmatrix} = \begin{pmatrix} \text{blue box} \\ -A_{m,j} \ j > m \end{pmatrix} \begin{pmatrix} L_1^N \\ \vdots \\ L_{N_d}^N \end{pmatrix} + \begin{pmatrix} b_1 \\ \vdots \\ b_{N_d} \end{pmatrix}$$

Parallelization



Parallelization



Building matrices $A_{m,m}$ in FreeFem++

```

varf bil1(L,v)=
int3d(Mh)((s1*dx(L)+s2*dy(L)+s3*dz(L))
*(s1*dx(v)+s2*dy(v)+s3*dz(v))
-(kap+sig*(1-Pp))*(s1*dx(L)+s2*dy(L)+s3*dz(L))*v
)
+int2d(Mh)(
(kap+sig*(1-Pp))*L*vh*(s1*N.x+s2*N.y+s3*N.z)
*(s1*N.x+s2*N.y+s3*N.z>=-10.^-10)
)
+int2d(Mh,g1)(
(kap+sig*(1-Pp))*F1(Np,N.x,N.y,N.z,Np)*L*v
)
+int2d(Mh,g2)(
(kap+sig*(1-Pp))*F2(Np,N.x,N.y,N.z,Np)*L*v
);

```

Building "matrices" $-A_{m,j}$ in FreeFem++

```

varf bil2(L,v)=
-int3d(Mh0)(
    -sig*Ps*(s1*dx(v)+s2*dy(v)+s3*dz(v))*Ln
)
-int2d(Mh0,g1)(
    +(kap+sig*(1-Pp))*F1(Np,N.x,N.y,N.z,Ns)*Ln*v
)
-int2d(Mh0,g2)(
    +(kap+sig*(1-Pp))*F2(Np,N.x,N.y,N.z,Ns)*Ln*v
)
;

```

Building "matrices" $-A_{m,j}$ in FreeFem++

```

varf bil2(L,v)=
-int3d(Mh0)(
  -sig*Ps*(s1*dx(v)+s2*dy(v)+s3*dz(v))*Ln
)
-int2d(Mh0,g1)(
  +(kap+sig*(1-Pp))*F1(Np,N.x,N.y,N.z,Ns)*Ln*v
)
-int2d(Mh0,g2)(
  +(kap+sig*(1-Pp))*F2(Np,N.x,N.y,N.z,Ns)*Ln*v
)
;

```

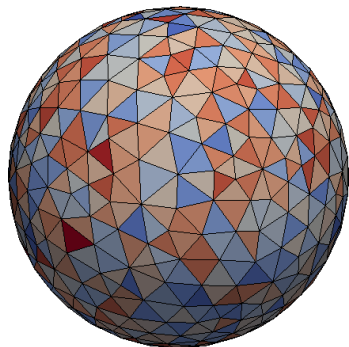

F2 function

```

func real F2(int Np, real Nx, real Ny, real Nz, int Ns)
{
    int NumNorm;
    for (int iNorm=0; iNorm<NbNormal; iNorm++) {
        if (abs(Nx-norm(iNorm,0))<10.^-5
            && abs(Ny-norm(iNorm,1))<10.^-5
            && abs(Nz-norm(iNorm,2))<10.^-5){
            NumNorm=iNorm;
            break;
        }
    }
    return Delta2(NumNorm*Nd+Ns, Np);
}

```

CPU time



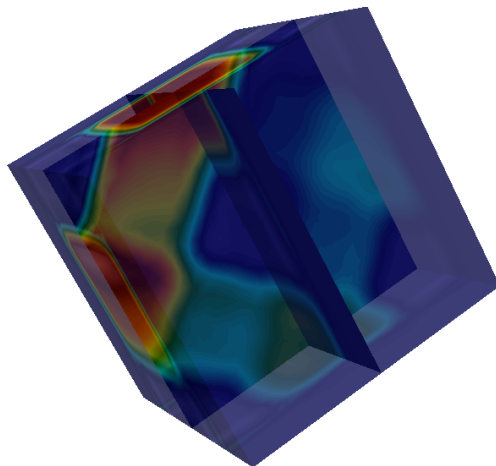
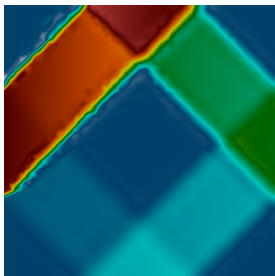
- 761 vertices
- 3088 tetrahedrons
- 980 triangles
- 4183 numElements
- \mathbb{P}_1 basis
- 48 directions
- 8 proc

| | With F1/F2 | Without F1/F2 |
|---------------|---------------|---------------|
| CPU/iteration | $\simeq 800s$ | $\simeq 50s$ |

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2D and 3D code

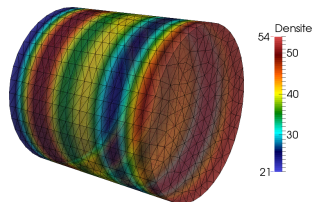
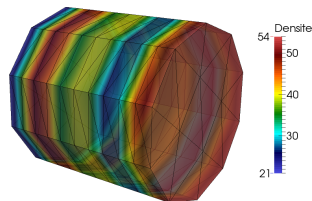
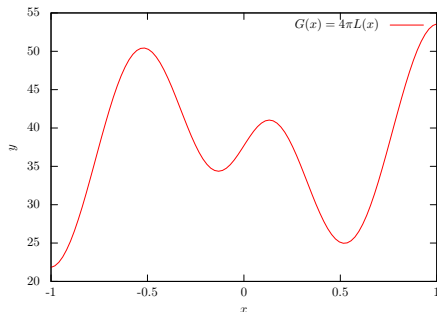


2D : Discontinuous Galerkin (DG) and SUP-G

3D : SUP-G

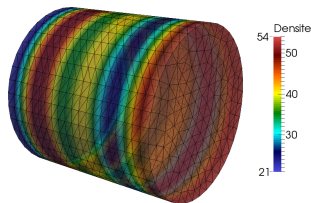
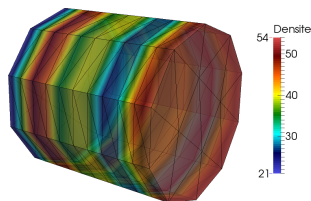
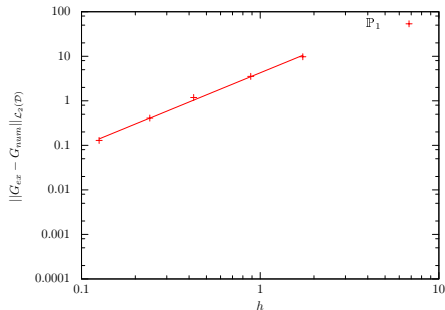
Analytical Validation

$$\left\{ \begin{array}{l} L(\mathbf{x}) = \arctan(\pi x) \cos(2\pi x) + 3 \\ \kappa L_b = \mathbf{s} \cdot \nabla L(\mathbf{x}) + \kappa L(\mathbf{x}) \\ G(\mathbf{x}) = \int_{4\pi} L(\mathbf{x}, \mathbf{s}) \, d\Omega(\mathbf{s}) = 4\pi L(\mathbf{x}) \\ \kappa = 0.5\text{cm}^{-1}, \quad \sigma_s = 1\text{cm}^{-1}, \quad g = 0.8 \end{array} \right.$$



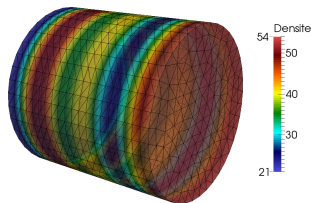
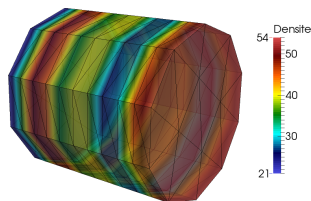
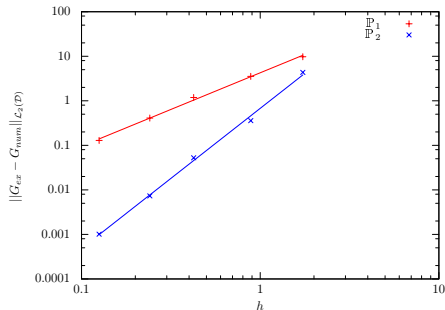
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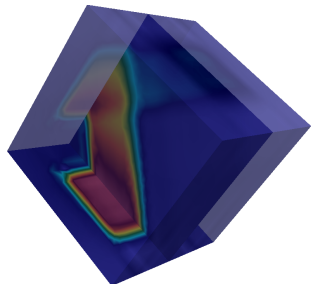


Analytical Validation

$$\left\{ \begin{array}{l} L(\mathbf{x}) = \arctan(\pi x) \cos(2\pi x) + 3 \\ \kappa L_b = \mathbf{s} \cdot \nabla L(\mathbf{x}) + \kappa L(\mathbf{x}) \\ G(\mathbf{x}) = \int_{4\pi} L(\mathbf{x}, \mathbf{s}) \, d\Omega(\mathbf{s}) = 4\pi L(\mathbf{x}) \\ \kappa = 0.5 \text{cm}^{-1}, \quad \sigma_s = 1 \text{cm}^{-1}, \quad g = 0.8 \end{array} \right.$$



Refracted pulse function on the $\frac{\pi}{4}$ direction

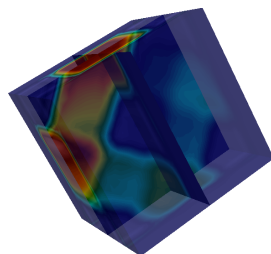


- $\kappa = 0.1\text{cm}^{-1}$
- $\sigma_s = 0.5\text{cm}^{-1}$
- $g = 0$
- $n_2 = 1.4$
- 1 000 000 photons

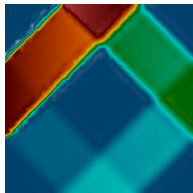
| T_{nh}/R_{nh} | FEM | $E_{\text{MC}}(X)$ | $\sigma_{\text{MC}}(X)$ |
|-------------------------|-----------------------|-----------------------|-------------------------|
| Reflectance | 1.34×10^{-1} | 1.33×10^{-1} | 6.66×10^{-4} |
| Transmittance | 1.12×10^{-1} | 1.08×10^{-1} | 6.10×10^{-4} |
| Lateral transmittance 1 | 7.64×10^{-2} | 7.55×10^{-2} | 5.18×10^{-4} |
| Lateral transmittance 2 | 7.64×10^{-2} | 7.50×10^{-2} | 5.16×10^{-4} |
| Lateral transmittance 3 | 3.47×10^{-1} | 3.26×10^{-1} | 9.19×10^{-4} |
| Lateral transmittance 4 | 7.29×10^{-2} | 6.97×10^{-2} | 4.99×10^{-4} |

Conclusion

- Solving the **RTE** with **specular reflection** on the boundary with **DG** in **2D** and with **SUP-G** in **2D** and **3D**



- **Parallelization** strategy to use the code on a laptop



- **Forward** : Find a alternative to replace the F2 functions (\mathbb{P}_0 function, emptymesh, labels, \dots)