# Solution of the Boltzmann equation for light transport 

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## Definitions

Wanted: photon's flux L
Method: transport Boltzman equation
Notations: time (t), position (r), direction ( $\hat{s}$ )

Scattering indicatrix

$$
\frac{1}{c} \frac{\partial L(\vec{r}, t, \hat{s})}{\partial t}+\hat{s} \cdot \nabla L(\vec{r}, t, \hat{s})+\mu_{t} L(\vec{r}, t, \hat{s})=S(\vec{r}, t, \hat{s})+\mu_{s} \int d \hat{s} g\left(\hat{s}, \hat{s}^{\prime}\right) L\left(\vec{r}, t, \hat{s}^{\prime}\right)
$$



Free propagation term
$\mu_{t}=\mu_{a}+\mu_{s}, \mu_{s}=1 / l_{s}, \mu_{a}=1 / l_{a}$

Scattering length

Absorption length

## Existing solution schemes

| Method | References | Issue |
| :--- | :--- | :--- |
| Monte Carlo methods | Standard MC <br> method | extreme CPU for low flux (too few photons <br> hit the detector). |
| Expansion in spherical <br> harmonics. | $[1]$ | Problem with $g=1-\varepsilon(\varepsilon-$ small) |
| Lattice method <br> (discretisation $)$ | $[2]$ | Memory and time of calculation |

- [1] - Andr'e Liemert, Alwin Kienle «Infinite space Green's function of the time-dependent radiative transfer equation»
- [2] - Kausar Banoo «DIRECT SOLUTION OF THE BOLTZMANN TRANSPORT EQUATION IN NANOSCALE SI DEVICES»


## Problem with MC method



## Our method

- Equivalent integral equation

$$
\begin{aligned}
L(r, t, \hat{s}) & =c \int_{0}^{t} d t^{\prime} e^{-c \mu_{t}\left(t-t^{\prime}\right)} S\left(r-c \hat{s}\left(t-t^{\prime}\right), t^{\prime}, \hat{s}\right)+c \mu_{s} \int_{0}^{t} d t^{\prime} e^{-c \mu_{t}\left(t-t^{\prime}\right)} \hat{V}_{\hat{s}^{\prime}} L\left(r-c \hat{s}\left(t-t^{\prime}\right), t^{\prime}, \hat{s}^{\prime}\right) \\
\hat{V}_{\hat{s} \hat{s}^{\prime}} f\left(\hat{s}^{\prime}\right) & \equiv \int_{4 \pi} d \hat{s}^{\prime} P\left(\hat{s}, \hat{s}^{\prime}\right) f\left(\hat{s}^{\prime}\right)
\end{aligned}
$$

- Successive approximations

$$
\begin{aligned}
L^{(n)}(r, t, \hat{s}) & =c \int_{0}^{t} d t^{\prime} e^{-c \mu_{t}\left(t-t^{\prime}\right)} S\left(r-c \hat{s}\left(t-t^{\prime}\right), t^{\prime}, \hat{s}\right) \\
& +c \mu_{s} \int_{0}^{t} d t^{\prime} e^{-c \mu_{t}\left(t-t^{\prime}\right)} \hat{V}_{\hat{s} \hat{s}^{\prime}} L^{(n-1)}\left(r-c \hat{s}\left(t-t^{\prime}\right), t^{\prime}, \hat{s}^{\prime}\right)
\end{aligned}
$$

Each iteration corresponds to additional photon scattering in the medium

Diagrammatic interpretations: A- without scattering, B - a single scattering, C - a double scattering, D - a triple scattering




C


D

## General expression

- Point-like source: $S(r, t, \hat{s})=\delta^{3}(r) \delta(t) \delta^{2}\left(\hat{s}-\hat{s}_{0}\right)$
- The general formula for an arbitrary order:
$\Delta L^{(N)}=\frac{\left(\mu_{s} c t\right)^{N}}{N!} e^{-\mu_{t} c t} \cdot N!\int_{0}^{1} d \xi_{N} \ldots \int_{0}^{1} d \xi_{1} \int_{\mathbb{S}^{2}} d \hat{s}_{N-1} p\left(\hat{s}_{N}, \hat{s}_{N-1}\right) \ldots \int_{\mathbb{S}^{2}} d \hat{s}_{1} p\left(\hat{s}_{1}, \hat{s}_{0}\right) \prod_{k=1}^{N}\left(1-\xi_{k}\right)^{k-1} c \delta^{3}\left(r-c t \hat{s}_{e f f}\right)$
where $\quad \hat{s}_{e f f}=\sum_{k=0}^{n} \hat{s}_{n-k}\left(1-\xi_{n}\right) \ldots\left(1-\xi_{n-k+1}\right) \xi_{n-k}$.
- The formula can be read: $\Delta L^{(N)}=\underbrace{e^{-\mu_{a} c t}}_{\text {absorption }} \cdot \underbrace{P_{N}\left(\mu_{s} c t\right)}_{\text {Poisson }} \cdot \underbrace{f_{N}(r, \hat{s}, t)}_{\text {scattering }}$
- The solution is a singular function inappropriate for numerical calculation

$$
L^{(0)}(r, t, \hat{s})=c e^{-c \mu_{t} t} \frac{\delta(r-c t)}{r^{2}} \delta^{2}\left(\hat{r}-\hat{s}_{0}\right) \delta^{2}\left(\hat{s}-\hat{s}_{0}\right)
$$

Use $\hat{s}_{0}=(0,0,1)$

## Observed quantities

- Calculate an observable: number of photons hitting a sphere with radius R and acceptance epsilon

$$
\Delta F_{i}^{(N)}=\int_{T_{i}}^{T_{i+1}} \frac{d t}{T_{i+1}-T_{i}} \int_{\mathbb{S}^{2}} d \hat{s}_{N} \Delta L^{(N)} \cdot \underbrace{\epsilon\left(\hat{s}_{N}, n_{S}, t\right)}_{\text {acceptance }} \cdot \underbrace{\Theta\left(-\left(n_{S}, \hat{s}_{N}\right)\right)}_{\text {direction }}
$$



## Vegas

- For $\mathrm{N}^{\text {th }}$ order we had to calculate 3N integrals. For these purposes, we use the VEGAS integration method.
- This is a very powerful method for calculating multivariate integrals.
- Vegas is very effective for cases where we have a function with a sharp peak under the integrals


## Scattering indicatrix

- We will use as a scattering function the Henyey-Greenstein function. This is a universal scattering function that describes a huge number of types of scattering, ranging from isotropic $(\mathrm{g}=0)$ to completely anisotropic ( $\mathrm{g}=1$ ).



## Results

- First, let's compare between RTE and Monte Carlo(photon tracing method) for different points and different asymmetry parameter.






## Good approximation for number of photons

Comparison of approximation and full calculation


- The zero order is calculated completely analytically.
- For the first and second order, an approximation was obtained that works very well For definiteness, I took the point $(3,0,10)$.
$\Delta N_{\text {hit }}^{(1)}=2 \frac{\mu_{s}}{\mu_{t}} \cdot\left(e^{\mu_{s} s t_{i}}-e^{\left.\mu_{s} c t_{i+1}\right)}\right) \cdot p\left(x_{0}\right) \cdot \frac{1}{d \cdot y^{2}} \cdot \Theta\left(t_{i}-r / c\right)$
$\Delta N_{h i t}^{(2)}=2 \frac{\mu_{s}}{\mu_{t}} \cdot\left(e^{\mu_{s} c t_{i}}-e^{\mu_{s}\left(t_{+1}\right)}\right) \cdot p\left(x_{0}\right) \cdot \frac{1}{d \cdot y^{2}} \cdot\left(\mu_{s} c t_{i}\right) \cdot \Theta\left(t_{i}-r / c\right)$
$\vec{y}=\vec{r}-c \hat{s}_{0} t_{i}$
$d=t_{i+1}-t_{i}$
$x_{0}=1-\left(\vec{y}, \hat{s}_{0}\right) / y^{2}$



## Monte Carlo method with fixed start and end points (FastRTE)

- We can use Vegas like Monte Carlo generator
- Vegas, after integration, stores all the photon trajectories (and the corresponding weights) for which it calculated the value of the integral.
- We can integrate our entire function not in narrow bins, but in one large bin, and then recalculate the result using only those trajectories whose time is in the bin we need.
- So essentially, thanks to Vegas, we have a Monte Carlo method that drags a photon from one fixed point to another FIXED point (so we can remove problem of MC method from slide 3).



## Calculation time

| Method | Monte Carlo | RTE (full <br> integration) | Approximation |
| :--- | :--- | :--- | :--- |
| Time <br> (for relative error $=0.001$ ) | Depends on calculation <br> accuracy <br> $10^{9}$ events- 1h 43m | Depends on <br> calculation <br> accuracy <br> (about 1.5 half <br> for higher <br> orders) | instantly |

## Conclusions

- A semi-analytical method for calculating the light flux has been obtained.
- A way to perform Monte Carlo calculation with fixed ends is obtained.
- Approximations for the light flux for the first and second order in scattering are obtained

Thank you for your attention

## Shadow effect



- In fair photon transport, explicit absorption is taken into account (the photon is absorbed and is not taken into account in further dragging).
- In RTE this effect is not explicitly taken into account (due to the fact that the calculation scheme does not allow it to be taken into account explicitly)


Spectrum broadening.


- If the radius of the OM is small, then a very large number of photons is required
- To increase statistics, the radius of the OM is increased, then the resulting flows are recalculated to a smaller radius. As a result, there is a broadening of the spectrum, which was not originally.

