# A HIGH-ORDER LOW-ORDER ALGORITHM WITH EXPONENTIALLY-CONVERGENT MONTE CARLO FOR THERMAL RADIATIVE TRANSFER PROBLEMS

#### A Dissertation

by

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#### DOCTOR OF PHILOSOPHY

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#### ABSTRACT

We have implemented a new high-order low-order (HOLO) algorithm for solving thermal radiative transfer problems. The low-order (LO) system is based on spatial and angular moments of the transport equation and a linear-discontinuous finite-element spatial representation, producing equations similar to the standard  $S_2$  equations. The LO solver is fully implicit in time and efficiently resolves the non-linear temperature dependence at each time step. The HO solver utilizes exponentially-convergent Monte Carlo (ECMC) to give a globally accurate solution for the angular intensity to a fixed-source, pure absorber transport problem. This global solution is used to compute consistency terms, which require the HO and LO solutions to converge towards the same solution. The use of ECMC allows for the efficient reduction of statistical noise in the MC solution, reducing inaccuracies introduced through the LO consistency terms. We compare results with an implicit Monte Carlo (IMC) code for one-dimensional, gray test problems and demonstrate the efficiency of ECMC over standard Monte Carlo in this HOLO algorithm.

#### **DEDICATION**

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#### ACKNOWLEDGEMENTS

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## NOMENCLATURE

B/CS Bryan/College Station

HSUS Humane Society of the United States

P Pressure

T Time

TVA Tennessee Valley Authority

TxDOT Texas Department of Transportation

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#### 0.1 Preservation of the Discrete Maximum Principle

An important property for a discretization of the TRT equations is preservation of the discrete maximum principle (MP). The maximum principle states that the material temperature and mean intensity in the interior of the domain should be bounded by the solution at the boundaries of the domain, in the absense of interior energy sources [?, ?]. The analytic solution to the TRT equations satisfies a maximum principle [?], so we desire numerical approximations that preserve the MP in a discrete sense, for each time step. For IMC simulations, violation of the maximum principle results in the material temperature being artificially higher than the boundary conditions and sources should physically allow. As discussed in Sec. ??, IMC can violate the MP due to the approximate linearization of the emission source in the time discretization; it is not truly implicit in time. We expect our method, with a fully implicit time discretization, to preserve the MP with sufficient convergence of the nonlinear emission source [?].

To numerically demonstrate that our method preserves the MP, we have simulated problems similar to those in [?]. We modify the Marshak wave problem in Sec. ??, by decreasing  $c_v$  and increasing  $\sigma_a$ , to produce a problem which results in MP violations for IMC at various fixed time step sizes. The spatial and temporal discretization determine the occurrence of MP violations for IMC. In particular, if time steps are too large or spatial mesh cells are too small, IMC will demonstrate MP violations [?]. Here, we have kept the spatial mesh size fixed and increased time step to make MP violations occur. The material specifications for the problem are given in Table 1. The domain width is 2.0 cm with  $N_c = 150$  uniform spatial mesh cells. The radiation and material energies are initially in equilibrium at 0.01 keV, before an isotropic boundary source of 1 keV is applied at the left boundary at t = 0. The simulation

is ran unitl t = 0.1 sh.

The material and radiation temperature are plotted for an IMC simulation with  $\Delta t = 0.025$  sh in Figure 1. Figure 2 depicts the material temperature for various time step sizes and a fixed mesh size of 150 equally spaced cells. All IMC simulations used 100,000 histories per time step. As demonstrated in Fig. 1, the material temperature exceeds the specified boundary temperature and is artificially hotter than the radiation temperature. This artificial "temperature spike" also leads to a slower propagation of the wave [?]. As shown in Fig. 2, as larger timestep sizes are taken the nonphysical results worsen. It is noted that although the final solution for  $\Delta t = 0.0001$  sh obeys the MP, during the first few time steps the temperature spikes are present.

The simulations are repeated with the same specifications for the HOLO method. All HOLO simulations used a fixed mesh of 8  $\mu$  cells by 150 x cells, 3 batches per time step, and 6,000 histories per batch. As seen in Figure 3, the TRT solution does not violate the maximum principle. For these simulations, it was necessary to use a damped Newton's method to converge the solutions. A damping factor of 0.5 was used for all these simulations, and found to stably converge.

Table 2 demonstrates the LO Newton iteration counts for the HOLO method. For reference, the solution at  $\Delta t = 0.00001$  sh requires no damping. Clearly damping increases the number of iteration counts per step as the Newton solve is taking more conservative steps, but the overall increase is not dramatic.

NO FIXUP APPLIED, NEWTON CONVERGENCE OF 10e-06. MODIFIED MARSHAK WAVE PROBLEM.

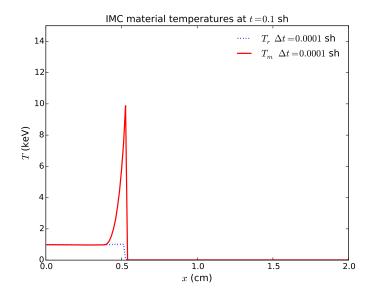


Figure 1: Simulation of MP violation problem with IMC method and  $\Delta t = 0.001$  sh.

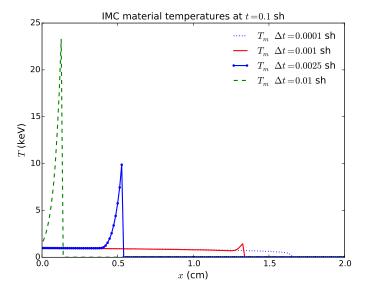


Figure 2: Simulation of MP violation problem with IMC method for various time step sizes.

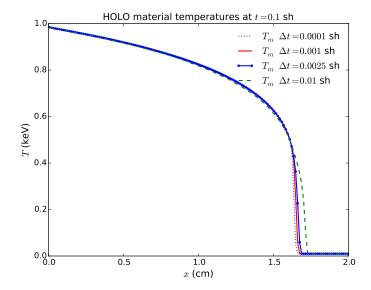


Figure 3: Simulation of MP violation problem with HOLO-ECMC method for various time step sizes.

Table 1: Problem specifications for maximum principle violation. Absorption cross section has form  $\sigma_a = \sigma_{a,0}/T^3$ .

$\sigma_{a,0} \; (\mathrm{cm}^{-1} \; \mathrm{keV}^3)$	4.0
$\sigma_s~({\rm cm}^{-1})$	0.0
$\rho~({\rm g~cm^{-3}})$	1.0
$c_v \; (\mathrm{jks/keV-g})$	0.0081181

Table 2: Comparison of LO Newton iterations for different time step sizes and MP problem. For  $\Delta t = 0.1$ , damping has  $\zeta = 1$ . For all other cases  $\zeta = 0.5$ .

$\Delta t$	Avg. Iters / Time Step
$\sigma_s \ (\mathrm{cm}^{-1})$	0.0
$\rho \; (\mathrm{g} \; \mathrm{cm}^{-3})$	1.0
$c_v \text{ (jks/keV-g)}$	0.0081181

An isotropic incident intensity of 0.150 keV is applied at x=0; the incident intensity on the right boundary is  $2.5 \times 10^{-5}$  keV. The material properties are  $\rho=1$  g cm<sup>-3</sup> and  $c_v=0.013784$  jks/keV-g. The absorption cross section varies as  $\sigma(T)=0.001~\rho~T^{-3}~(\text{cm}^{-1})$ . The simulation was advanced until t=5 sh (1 sh  $\equiv 10^{-8}$  s) with a fixed time step size of 0.001 sh. For comparison purposes, we have not used adaptive mesh refinement, only performed one HOLO iteration per time step, and use a fixed 3 HO batches with equal number of histories per batch. A relative tolerance of  $10^{-6}$  for the change in  $\phi(x)$  and T(x) was used for the LO newton solver for all results. Radiation energy distributions are plotted as an equivalent temperature given by  $T_r=(\phi/(ac))^{0.25}$ . Cell-averaged quantities are plotted. Although isotropic scattering can be included in the LO solver with this method [?], we have only considered problems with  $\sigma_s=0$  here.

# APPENDIX A

## FIRST APPENDIX

Text for the Appendix follows.



Figure A.1: TAMU figure

## APPENDIX B

### SECOND APPENDIX WITH A LONGER TITLE - MUCH LONGER IN FACT

Text for the Appendix follows.



Figure B.1: TAMU figure

## B.1 Appendix Section