

# Simulation of rarefied gas flows by Improved TRMC method

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**Abstract.** We present some recent numerical results on Time Relaxed Monte Carlo (TRMC) methods, which is a Monte Carlo technique for the numerical solution of the Boltzmann equation (BE). The Improved Time Relaxed Monte Carlo is based on the direct sampling from McKean graphs. Such approach is tested for the solution of spatially homogeneous and non-homogeneous classical problems. A comparison with the analytical BKW solution of the BE for Maxwellian molecules is performed. The effect of the time step size for ITRMC method and replacement of selected collisions by sampling from Maxwell distribution is investigated. The new scheme is tested by computing the numerical solution of one dimensional Couette flow, in a regime near the fluid dynamic limit. As the reference solution the time-proved majorant frequency scheme of the DSMC was used for Couette flow.

**Keywords:** Boltzmann equation, Time Relaxed methods, McKean graphs

## INTRODUCTION

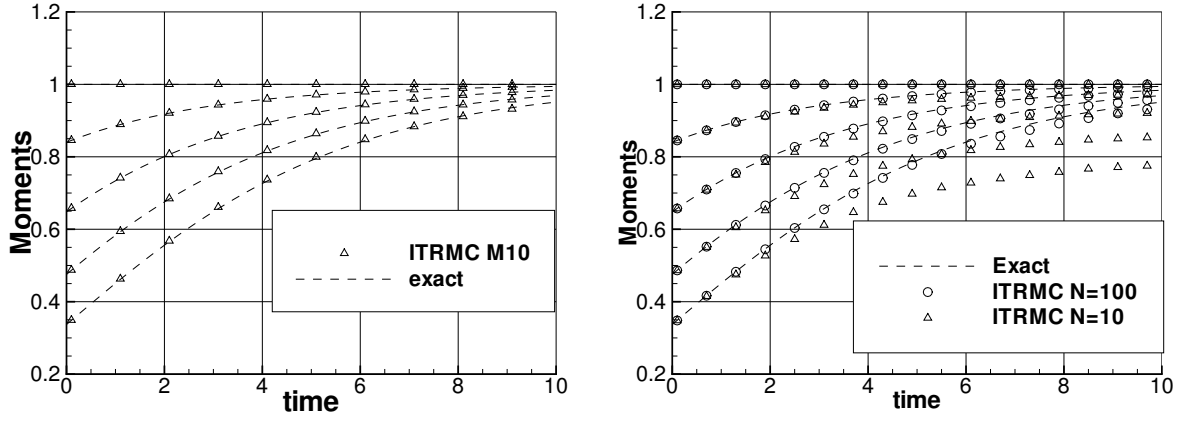
The present paper contains numerical results by improved TRMC method (ITRMC) while the theoretical bas of the method can be found in [1]. The main idea of ITRMC is sampling from McKean graphs  $G_\ell$  with replacement of well balanced graphs by Maxwellians. We assume that a splitting scheme is used, with alternation of collision and convection steps, therefore we describe the method only for homogeneous BE.

*Description of algorithm.* Here we follow the notation in [1]. Before starting simulation, we perform the following preprocessing steps:

- Define TRMC parameter  $\tau = 1 - \exp(-\mu\Delta t)$  from estimate  $\mu$  and define maximum level  $m$  (that depends on the number of particles  $N$  and  $\tau$ ), here  $\Delta t$  is time step.
- Perform selection of well-balanced graphs, calculate coefficients  $g_\ell^k$ .
- Compute number of graphs  $C_\ell$  on the level  $\ell = 1, \dots, m$  from equations  $\sum_{k=1}^m C_k g_\ell^k = N(1 - \tau)\tau^\ell$ .
- For levels  $\ell \leq \ell_0$  with negative coefficient  $C_\ell$ , compute probability of reuse  $p_\ell$ .

Correction of the method using *reuse technique* will lead to the change of number of molecules in levels, hence, the coefficients  $C_\ell$  need to be corrected as described in [1] before simulation. Then transition from time  $t_n$  to time  $t_{n+1}$  ( $\Delta t = t_{n+1} - t_n$ ) can be presented as follows. Starting from maximum level  $\ell = m, \dots, \ell_0 + 1$  we realize  $C_\ell$  McKean graphs of level  $\ell$  recursively, as follows

- select  $h$  uniformly in  $[0, \ell - 1]$
- if  $h = 0$  sample from the original distribution  $f^n(v)$
- if  $C_h > 0$  sample  $v'$  recursively from McKean graph of level  $h$
- if  $C_h < 0$  (i.e.  $h \leq \ell_0$ ) then use a stored particle at level  $h$  (if it exists) with probability  $p_h$ , otherwise generate a McKean graph of level  $h$ .
- if  $\ell - h - 1 = 0$  sample from the original distribution  $f^n(v)$
- if  $C_{\ell-h-1} > 0$  sample  $v'_*$  recursively from McKean graph of level  $\ell - h - 1$
- if  $C_{\ell-h-1} < 0$  then use a stored particle at level  $\ell - h - 1$  (if it exists) with probability  $p_{\ell-h-1}$ , otherwise generate a McKean graph of level  $\ell - h - 1$ .
- collide molecules  $(v', v'_*)$  obtaining  $(v, v_*)$ , and store  $v_*$  in the list of molecules of level  $\ell$



**FIGURE 1.** Lines from top to bottom:  $M_2, M_4, M_6, M_8$  and  $M_{10}$ . Left:  $N = 1000$ . Right:  $N = 100$  and  $N = 10$ . Time step  $\Delta t = 0.1$ .

## COMPARISON WITH BKW-SOLUTION

For Maxwell molecules the exact solution for space homogeneous Boltzmann is available. This Bobylev-Krook-Wu (BKW) solution takes the expression [3], [4]

$$f(\mathbf{v}, t) = \frac{1}{(\pi C)^{3/2}} \frac{1}{2C} \left( 5C - 3 + \frac{2(1-C)\mathbf{v}^2}{C} \right) \exp\left(-\frac{\mathbf{v}^2}{C}\right),$$

where  $C = C(t) = 1 - \frac{2}{5} \exp(-t/6)$ . The solution is defined for  $t \geq 0$ .

The analytic representation of the even moments  $M_{2k} = \int_0^\infty v^{2k} f_r(v, t) dv$  of the radial distribution function  $f_r(v, t) = 4\pi v^2 f(\mathbf{v}, t)$  is

$$M_{2k} = \frac{(2k+1)!!}{2^k} C^{k-1} (k - (k-1)C).$$

A comparison of the calculated even moments with BKW solution of the Boltzmann equation is shown in figure 1. Moments are normalized with the theoretical value of moments in  $t \rightarrow \infty$ :  $M_{2k} = (2k+1)!!/2^k$ . For large number of simulated molecules  $N = 1000$  (left plot) there is excellent agreement between analytical values of even moments and calculated moments. Smaller number of molecules (case  $N = 100$ , circles on right plot of figure 1) allows to obtain solution of the Boltzmann equation only for time  $t \lesssim 5$ . For  $t > 5$  high order moment  $M_{10}$  differs from analytical result. ITRMC simulations with  $N = 10$  allow to obtain correct result only for  $t < 2$  because deviation from analytical solution become significant already for  $t > 2$ .

## Effect of time step size

Since the decisive parameter for TRMC methods  $\tau = 1 - \exp(-\mu \Delta t)$  depends on  $\Delta t$ , it is important to determine the validity of using large time steps. In the figure 2 we present the behavior of moments for different time steps. The simulations with  $N = 100$  (left plot in Fig. 2) allow to use  $\Delta t = 1$ , while for  $\Delta t = 2$  there is an observable deviation of the moment behavior from BKW solution. The usage of  $\Delta t = 1$  for  $N = 10$  (Fig. 2, right) leads to large deviation for  $M_{10}$  already after first time iteration (for  $t = 1$ ). Consequently, the numerical solution for large  $\Delta t$  depends on the number of simulated molecules  $N$ : for small  $N$  TRMC method is more sensitive to the large time step. In practice,  $\Delta t$  can be slightly larger than  $1/\mu$  ( $\mu$  is collisional frequency).

We conclude that the finite number of particles is responsible for two different sources of approximation: the first is due to particle correlations, and persists even for small time steps; the second is due to the truncation of the Wild sum expansion; this effect vanishes as  $\Delta t \rightarrow 0$ .

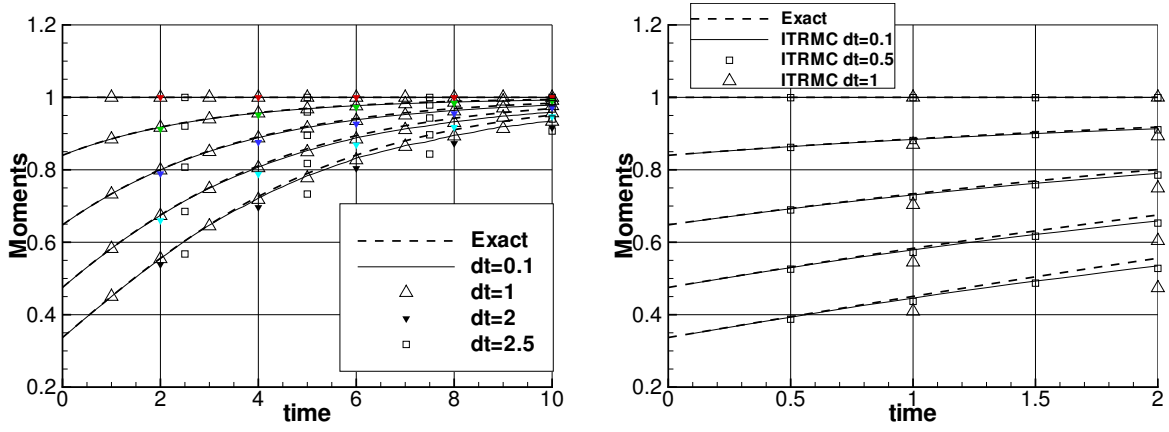


FIGURE 2. Left: Cases with  $N = 100$ . Right: Cases with  $N = 10$ .

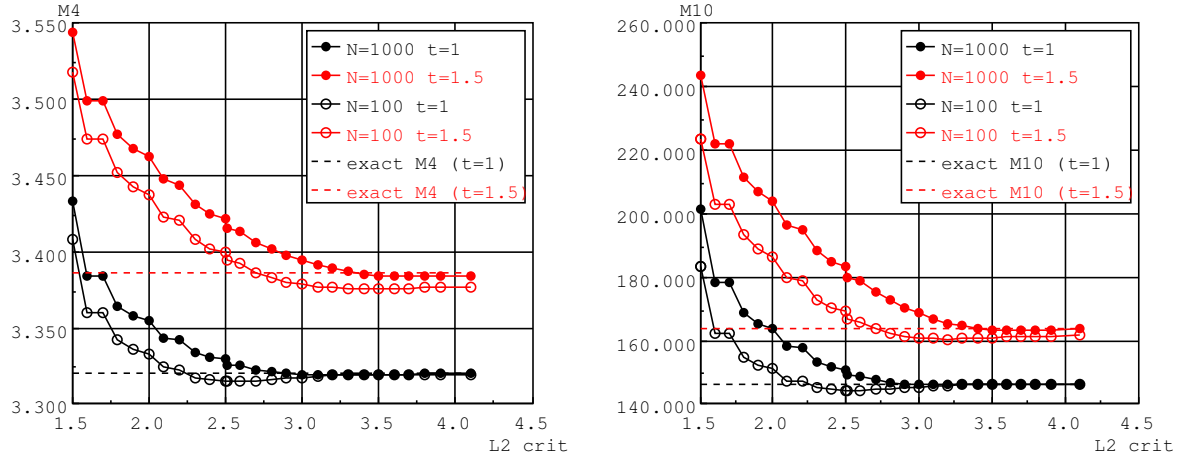


FIGURE 3.  $M_4$  and  $M_{10}$  versus  $L_{2crit}$

### Redistribution by Maxwell distr. function

If a particle has a long collision history (this depends on some effective length of the corresponding McKean graph that generates the particle), then the particle is sampled from a Maxwellian. We study the effect of the error introduced by this approximation. For a McKean graph constructed by sub-graphs **A** and **B**, this parameter is recursively defined as  $L_2 = 1 + (L_2(A) + L_2(B))/2$  [1]. The condition for replacement of a particle obtained by a graph by a particle sampled from Maxwellian is  $L_2 \geq L_{2crit}$ . The smaller  $L_{2crit}$  the more replacements are performed.

For four cases of particle number and final time  $t$ , the evolution of the moments of distribution function  $M_4$  and  $M_{10}$  for different value  $L_{2crit}$  is considered. The solution was obtained using single step  $\Delta t = t$ . Here we used  $\mu = 1$ . The moments values for case of large  $L_{2crit}$  (all collisions are performed) are presented in the following table:

time	$N$	ITRMC $M_4$	MFS $M_4$	Exact $M_4$	ITRMC $M_{10}$	MFS $M_{10}$	Exact $M_{10}$
1	1000	3.3200	3.3199	3.3201	146.34	146.31	146.36
1	100	3.3198	3.3194		146.34	146.13	
1.5	1000	3.3847	3.3857	3.3861	163.64	163.80	163.93
1.5	100	3.3771	3.3848		161.66	163.47	

Results of the computations with varying  $L_{crit}$  are presented in figure 3. It could be seen from the behavior of  $M_4$  and  $M_{10}$  on  $L_{crit}$  that

- the effect of replacement of collisions with redistribution is small for arbitrary large  $L_{crit}$ , while for small  $L_{crit}$  the deviation becomes more pronounced;
- smaller number of particles  $N = 100$  allows to perform calculations with smaller parameter  $L_{crit}$  (large fraction of redistributed molecules instead of collisions);
- large time step  $\Delta t = 1.5$  requires more accurate choice of parameter  $L_{crit}$  in comparison with smaller  $\Delta t = 1$ .

Note, that there is a value of parameter  $L_{crit}$  for which all moments are approximately equal to exact values even for  $N = 100$ . It means that the distribution function becomes closer to the exact one.

## COUETTE FLOW

In this part of the paper applicability of ITRMC method to spatially non-uniform gas flows studied in the case of plane Couette flow between two parallel plates.

This problem was considered in the following statement. Two plates are kept in temperature  $T_w = 300$  K. Distance between plates is 1 m. Left plate is stationary ( $V_1 = 0$ ) and the other one moves in its own plane with velocity  $V_2 = 1766$  m/s. The  $x$ -axis is directed perpendicular to walls, and the  $y$ -axis is in the direction of the motion. The space between plates is filled with monoatomic gas of average density  $n_0 = 1.3442 \cdot 10^{20} m^{-3}$ . Mass of gas molecule is  $m = 6.64 \cdot 10^{-26}$  kg which corresponds to Argon. For simulation of collisions between molecules, the approximation of Maxwellian molecules was used, the effective diameter for  $T_{ref} = 300$  K is  $d_{ref} = 4.0679 \cdot 10^{-10}$  m (the collisional frequency can be estimated as  $\mu = 4d_{ref}^2 n \sqrt{2kT_{ref}/m} = 3.8513 \cdot 10^4 s^{-1}$ ). When stationary flow was reached, the usual estimation of the macro-parameters in sampling cells was performed.

The dimensionless parameters for the problem are the Knudsen number  $Kn$  and the ratio  $S$  of wall velocity to temperature velocity of molecules. For the given parameters, the Knudsen number calculated at temperature 300 K and density  $n_0$  were  $Kn_{T=300K, n_0} = 0.01$  and velocity ratio  $S = V_2 / \sqrt{2kT_w/m} = 5$ .

The collisional cells size was varied through computational domain from  $\Delta x = 0.002$  m near walls (where the temperature is low and hence density is higher then in center) to  $\Delta x = 0.005$  m in the central area.

The reference solution was obtained using Majorant Frequency Scheme (MFS) of DSMC method, which in the limit of infinite number of simulated molecules can be treated as numerical solution of Boltzmann equation [2]. ITRMC result is compared with MFS for Couette flow and then the effect of redistribution by Maxwellians studied for different critical values of the parameter  $L_2$ .

Simulation of Couette flow was performed by ITRMC method and MFS. In both simulations time step size was  $\Delta t = 10^{-6}$  s corresponding to  $\tau = 6.785 \times 10^{-2}$ , and the number of simulated molecules was  $N = 5000$ . Notice that with such parameters MFS scheme produces very accurate solutions [2].

The velocity and temperature profiles are presented in the figure 4. The temperature value at the center is equal 841 K (right plot on figure 4). This strong heating of the gas is caused by high velocity of the right wall (figure 4, left). As shown in both plots MFS and ITRMC produce similar profiles. The heat flux  $S_x$  is function of higher order moment of the distribution function. The functions of high-order moments are more sensitive to parameters of the simulations, however the  $S_x$ -profile obtained by ITRMC is almost similar to the reference one, obtained by MFS (see figure 5, left). In Couette flow in transitional and free-molecular regimes there is a component of heat-flux, parallel to the plates. This component is not described in the framework of Navier-Stokes equations. As follows from the profile of parallel component  $S_y$  in figure 5 (right) the value of  $S_x$  is about three times larger then  $S_y$  component, which means that the flow with used parameters is in strong non-equilibrium.

Hence, in the example of Couette flow it is shown that the ITRMC method can produce results close to the solution of the Boltzmann equation for spatially non-homogeneous case. However, the sensitivity of the solution to the calculational parameters should be studied. ITRMC method in comparison with traditional DSMC method like MFS has not only parameters such as  $N$ ,  $\Delta t$  and  $\Delta x$ , but also the parameter of the truncation of  $L_{crit}$ . The dependence of deviation of solution on  $L_{crit}$  should be studied additionally.

As was shown for the homogeneous case (figure 2), redistribution by Maxwell distribution in case of comparatively large  $\Delta t$  with suitable parameter  $L_{crit}$  in principle can lead to an accurate numerical solution, just as in the case without redistribution. To check this we perform calculations with the same parameters ( $\tau$  and  $L_{crit}$  values) as was established for the homogeneous case. Comparison of most sensitive profiles for cases  $L_{crit} = 2$  and  $L_{crit} = 2.7$ ,  $\Delta t = 10^{-5}$  s and

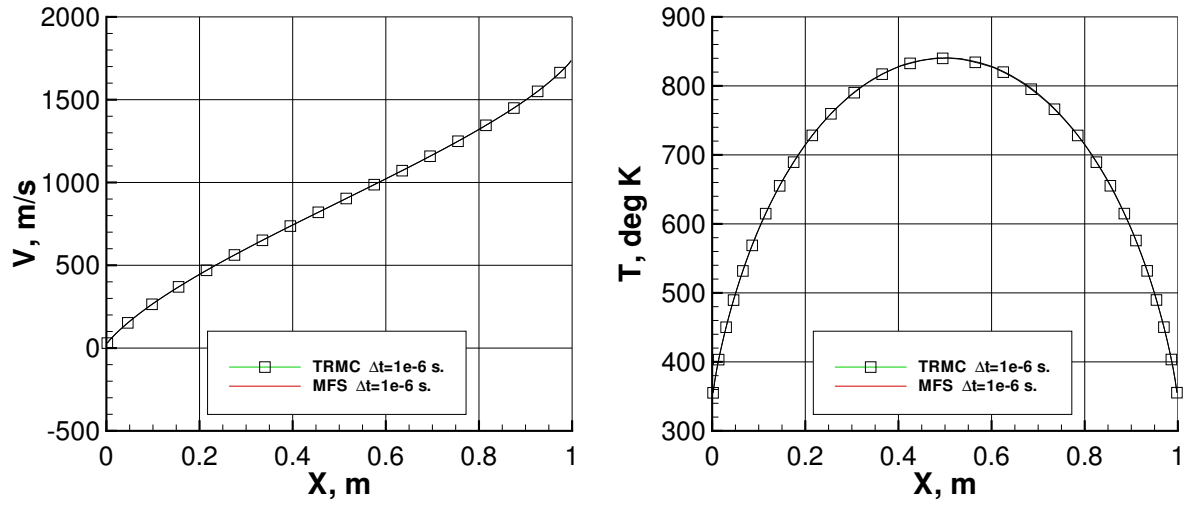


FIGURE 4. Velocity and temperature profiles for MFS and ITRMC methods.

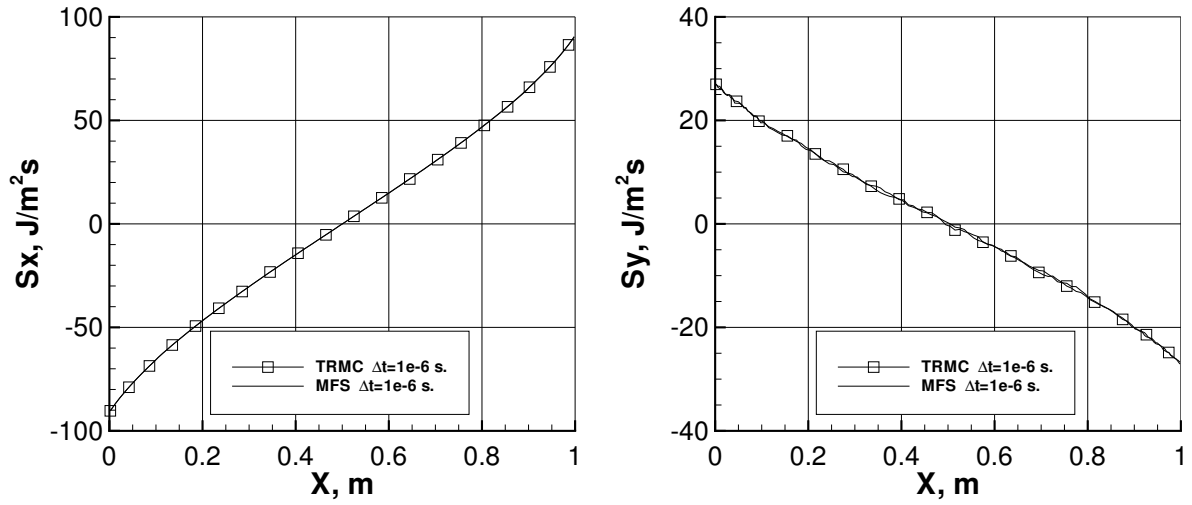


FIGURE 5. Heat flux and parallel heat flux profiles for MFS and ITRMC methods.

case  $\Delta t = 10^{-5}$  s without redistribution are presented in the figure 6. It can be seen from figure, that there is only a small difference between cases  $\Delta t = 10^{-6}$  and  $\Delta t = 10^{-5}$  for both temperature and heat flux profiles.

For Couette flow, shear stress components  $P_{xx}$  and  $P_{xy}$  are constant over area. Calculation of  $P_{xx}$  and  $P_{xy}$  was made on the wall by summation of incident and reflected molecules momentum  $m\mathbf{v}$ . The values of  $P_{xx}$  and  $P_{xy}$  are presented in the following table:

Method	$\Delta t \cdot 10^6, s$	redistr.	$P_{xx}, \text{kg/ms}^2$	$P_{xy}$	redistributed, %
MFS	1	—	1.2493	-0.10758	—
ITRMC	1	no	1.2493	-0.10758	0
ITRMC	10	no	1.2519	-0.11141	0
ITRMC	10	$L_{2crit} = 2.7$	1.2516	-0.11083	0.35
ITRMC	10	$L_{2crit} = 2$	1.2496	-0.11053	6.22

The fraction of replaced collisions is presented in the last column. The values of  $P_{xx}$  and  $P_{xy}$  for the case  $\Delta t = 10^{-5}$  s

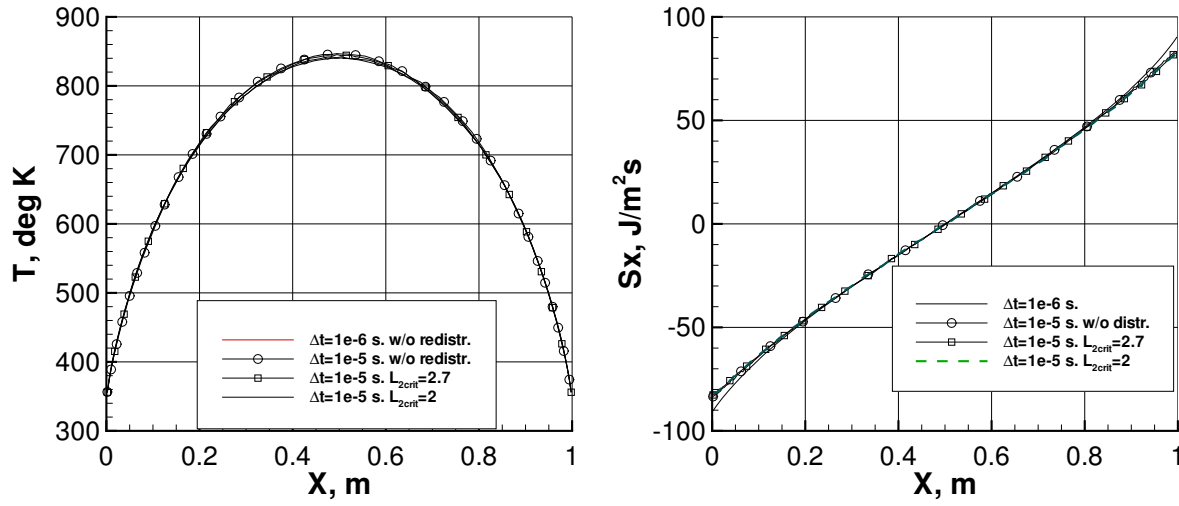


FIGURE 6. Calculations with redistribution.

and  $L_{2crit} = 2.7$  are closer to the solution of the Boltzmann equation (MFS result) than without replacement by redistribution. It points to existence of the optimal value for  $L_{2crit}$  parameter for Couette flow.

## CONCLUSION

The proposed ITRMC method for modeling of the rarefied gas flows in case of small time step produces results very close to the solution of the Boltzmann equation for homogeneous case as well as for spatially one-dimensional flow. The new approach has the potential of providing more efficient codes. The efficiency of the proposed method has still to be verified.

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