



Time-dependent Reverse Monte Carlo Modelling

A summary of O Gereben et al (2007) *J. Phys.: Condens. Matter* 19 335223

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Basics of RMC

- Statistical method for modelling of atomic-scale structure
- Originally for liquids ([2]), but also applicable to crystalline ([3]), amorphous ([4]) and magnetic ([5]) systems
- Fits atomic structure to experimental data
- Inherently non-parametric



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- ④ Use MH to accept/reject the proposal given χ^2
- ⑤ Repeat step 2-4 until convergence



Overview of RMCT

- Evolution of RMC to model atomic-scale dynamics
- Many ensembles divided by time Δt
- Ensembles have knowledge
- Follows the same steps as RMC

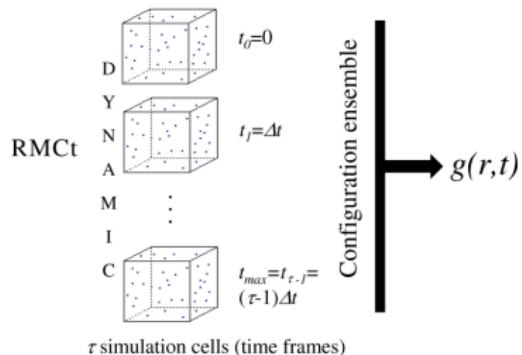


Figure: Sketch of the RMCT method



A statistical issue

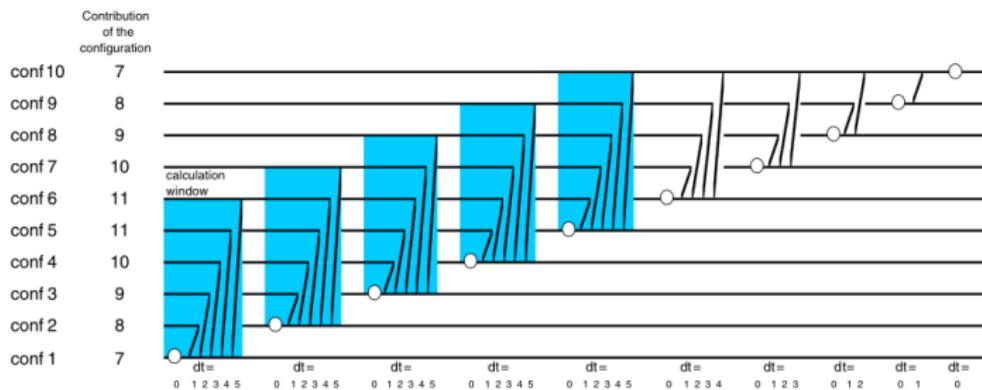


Figure: Sketch of window-of-calculation concept ¹

¹ O Gereben et al, 2007, *J. Phys.: Condens. Matter* 19 335223



RMCt in the article

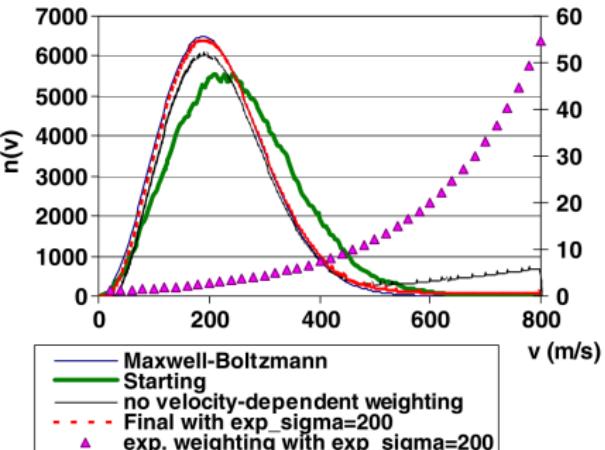
- The article² describes method - no new physics
- Test data is quasi-experimental, obtained from Molecular Dynamics simulations of liquid Ar
- Dynamics are fitted to three data sets ($g(r, t)$, $S(Q, w)$ and $S(Q)$)
- Constraints are used to facilitate convergence

²O Gereben et al, 2007, *J. Phys.: Condens. Matter* 19 335223



Constraints in RMCT

- Necessary for convergence and to produce "real" physics"
- Issues come from lack of information in experimental data
- Adds parameter from *a priori* knowledge
- Can also be physical constraints

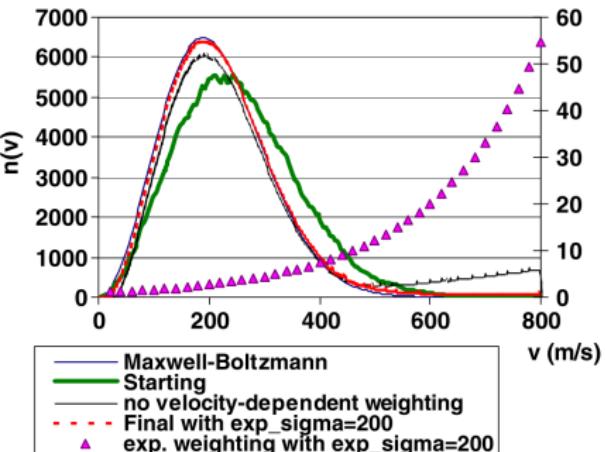


Constraints in practice

Constraints are added by biasing the χ^2 . An example:

$$\chi_{VD}^2 = \frac{1}{\sigma_{VD}^2} \sum_j (V_j^C - V_j^{MB})^2 w_j(v)$$

$$w_j(v) = \begin{cases} \exp\left(\frac{v_j}{\sigma^{exp}}\right) & \text{if } \sigma^{exp} > 0 \\ 1 & \text{if } \sigma^{exp} \leq 0 \end{cases}$$



Issues

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Issues

- Idea of non-parametric modelling is great! But...
- Lack of uniqueness can be a problem [4]
- Parameters have to be used anyway (constraints)
- Computationally demanding (huge parameter space, statistical concessions)



Wrap-up

- Non-parametric method for modelling atomic-scale dynamics
- Author succeeded in fitting a model to quasi-experimental data
- Has some issues
 - Lack of uniqueness can be a problem ([4])
 - Constraints require parameters
 - Computationally demanding (statistical concessions, many parameters)
- Despite issues, widely used to great results (especially RMC ([5]))



Thank you for your time!



References

-  O Gereben et al, 2007, *J. Phys.: Condens. Matter* 19 335223
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