## Towards a Unified Framework for Coarse-graining Particle-based Simulations

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Jun 5, 2012



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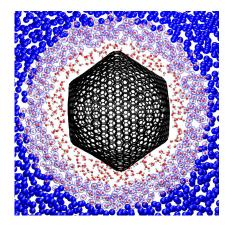
Introduction

Kirkwood-Buff Models

Targeted Coarse-Graining 00000 Conclusion

Coarse-graining is an essential part of multi-scale simulations!

- Reduces number of degrees of freedom
- Enhances accessible range of time- and length-scales
- Links atomistic and coarse-grained representations





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### Introduction

### Systematic Coarse-Graining

Is there a force-field for the coarse-grained model which reproduces a certain property?

- Structure (e.g. bond distribution or two-body correlations):
  - Boltzmann inversion
  - Iterative Boltzmann inversion
  - Inverse "Monte Carlo"
  - Relative Entropy Method
- Forces  $\rightarrow$  Force matching (multi-body PMF)
- Free energy (MARTINI force-field)
- Further properties:
  - Pressure  $\rightarrow$  Pressure correction
  - $\bullet~$  Diffusion  $\rightarrow~$  Thermostat (friction constant fitting)

#### Incomplete list, many more methods and variations available! UNCLASSIFED(LA-UR 12-21100)



Introduction	Kirkwood-Buff Models	Targeted Coarse-Graining	
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Introduction			

- $\bullet\,$  Consistent implementation of most of these methods  $\rightarrow\,$  Allows for direct comparison
- Platform for the implementation of new methods
- Integrates existing sampling programs (e.g. MD codes)

### Parts of VOTCA<sup>1</sup>- www.votca.org

Mapping engine

VOTCA Framework

- Parallel analysis framework
- Automated iterative coarse-graining
- Charge transport modules
- Ohloh: 10 Person Years / 39.8k Lines / \$ 528.4K
- 15 Developers
- Packages in Fedora, OpenSuse, Gentoo

<sup>1</sup>JCTC 5, 3211 (2009) & Macromol. Theo. Simul. 20, 472 (2011) UNCLASSIFED(LA-UR 12-21100)



Kirkwood-Buff Models

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# Kirkwood-Buff Models

Find a coarse-grained model that reproduces the Kirkwood-Buff Integrals:

$$G_{ij}=4\pi\int_0^\infty [g_{ij}^{\mu VT}(r)-1]r^2~{
m d}r$$

#### Motivation

Describe salting-in/salting-out of Biomolecules on a coarse-grained level:

$$f_{cc} = \left(\frac{\partial \ln \gamma_c}{\partial \ln \rho_c}\right)_{p,T} = -\frac{\rho_c \left(G_{cc} - G_{cw}\right)}{1 + \rho_c \left(G_{cc} - G_{cw}\right)},$$

 $\label{eq:kb} \begin{array}{l} {\sf k}_{\rm B} T \mbox{ In } \gamma_c \mbox{: co-solvent solvation free energy} \\ \gamma_c \mbox{: co-solvent molar scale activity coefficient} \\ \rho_c \mbox{: co-solvent number density} \end{array}$ 

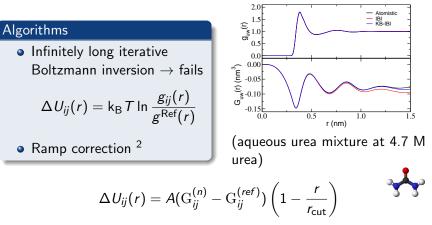
Assumption: large systems  $(g^{\mu VT} \approx g^{NVT})$ 



Kirkwood-Buff Models

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### Kirkwood-Buff Models Aqueous Urea Mixture

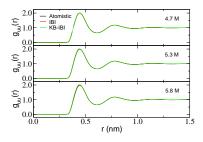


Problem: A is difficult to determine.

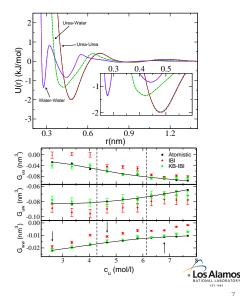
<sup>2</sup>Ganguly et al., JCTC 8, 1802 (2012) UNCLASSIFED(LA-UR 12-21100)



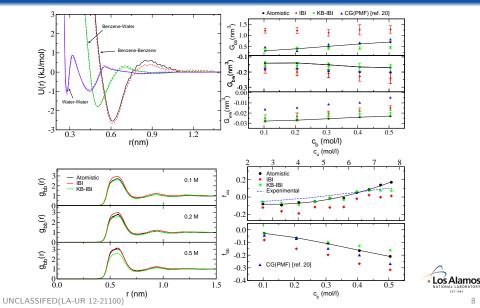
Kirkwood-Buff Models Aqueous Urea Mixture



- Minimal differences in the potential
- Potentials are transferable in a small concentration interval
- Does it work for other systems?



### Kirkwood-Buff Models Benzene in Water



Kirkwood-Buff Models

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### Kirkwood-Buff Models Conclusion

What did we learn?

- Iterative Boltzmann inversion alone is not enough
- Transferable potentials over different concentrations
- Useful method to develop models to study salting-in and salting-out

Open questions:

- Are there less arbitrary ways of correcting?
- Is it possible to incorporate the correction in an inversion scheme?



Kirkwood-Buff Models

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# Targeted Coarse-Graining Introduction

Find a coarse-grained model, which reproduces other non-structural related property.

### Reformulation

Use  $n \ (\sim 5000)$  input parameters (potential tables) to generate m output parameters (properties measured in the MD simulation) and rank their quality.

- $\bullet~$  The problem is overdetermined  $\rightarrow~$  use  ${\sim}10$  essential parameters
- Equivalent to a standard optimization problem
- Minimization would be possible if all  $\partial$ input/ $\partial$ output exist

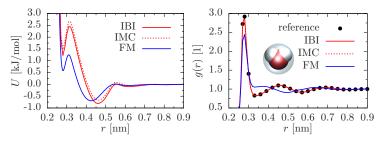


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# Targeted Coarse-Graining Example: Water



Potential should have 2 minima.



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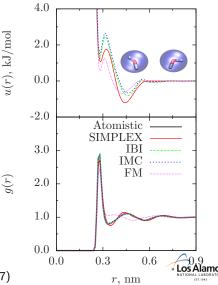
Targeted Coarse-Graining

Conclusion

### Targeted Coarse-Graining Example: Water

- Center of mass mapping
- CKD (= WCA + cos<sup>2</sup> attraction) + Gaussian (6 parameters)<sup>3</sup>
- Optimize parameters with Nelder-Mead method (Simplex)<sup>4</sup>

<sup>&</sup>lt;sup>3</sup>Idea: M. Jochum, Phd Thesis <sup>4</sup>Shinoda et al., Mol. Sim. 33, 27 (2007) UNCLASSIFED(LA-UR 12-21100)



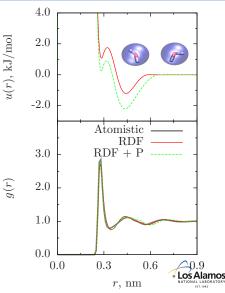
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# Targeted Coarse-Graining Example: Water

What about the pressure?

- Can easily be incorporated
- Objective (penalty) function needs modification



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### Targeted Coarse-Graining Example: Water

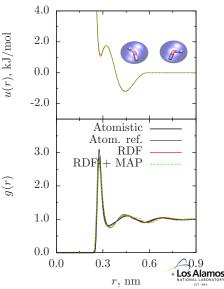
What about the mapping?

$$\vec{R} = \sum_{i} \lambda_{i} \vec{r}_{i}$$

with

$$\sum_i \lambda_i = 1$$

- Can easily be incorporated
- adds 1 extra parameter for symmetric mappings
- Objective (penalty) function needs no modification
- Reference rdf changes



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Conclusion
Example: Water

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Conclusion

What did we learn?

- 6 parameters are enough, but simple LJ (2) is not
- Potential is short ranged
- Other target properties can be incorporated
- Simplex is fast, but can be trapped, inefficient for  $\geq 10$  parameters
- Use of learning optimizers (e.g. CMA Evolution Strategy or genetic algorithms) possible
- Functional potential can speed up the simulations
- Mapping can be optimized as well

The optimization view provides a framework to aim for a broader class of coarse-grained models.

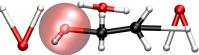


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### Conclusion VOTCA Team

### **Core developers** Victor Rühle Christoph Junghans



Versatile Object-oriented Toolkit for Coarse-graining Applications

Modular C++ kernel Scripting for iterative workflow Simple integration of other simulation packages Iterative Boltzmann inversion Inverse Monte Carlo Force matching

### Implementations

Tristan Bereau Sebastian Fritsch Mara Jochum Konstantin Koschke Alexander Lukyanov Sikandar Mashayak Interface to ESPResSo Interface to AdResS Simplex algorithm Parallel analysis engine force-matching Relative entropy method

### Project supervisor

Denis Andrienko Kurt Kremer

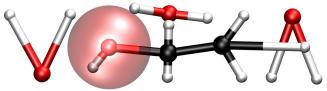
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Linus Torvalds:

Talk is cheap, show me the code.



Versatile Object-oriented Toolkit for Coarse-graining Applications

Modular C++ kernel Scripting for iterative workflow Simple integration of other simulation packages Iterative Boltzmann inversion Inverse Monte Carlo Force matching

- It's free
- All examples are in the tutorial
- It's flexible and expandable

Visit us at www.votca.org



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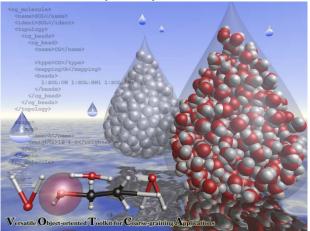
### \$\$\$

- Max Planck Society
- SFB 625 "From Single Molecules to Nanoscopically Structured Materials"
- Department of Energy



## The End

#### Thank you for your attention !





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