## PLUMED <br> An introduction

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## Molecular dynamics

time 0.0041 ps


Molecular dynamics (MD) is a form of computer simulation wherein atoms and molecules are allowed to interact for a period of time under known laws of physics, giving a view of the motion of the atoms

## Timescales for, e.g., RNA dynamics



GROMACS
ANTON
(normal computer) (special computer)
adapted from Rinnenthal, Buck, Ferner,Wacker, Fuertig, and Schwalbe Chem Res 44, I292 (201 I)

## Rare events




## Rare events




## Agenda

## Tackling rare events Introduction to PLUMED

Sample applications \& recent developments

## Tackling rare events

## Brute force:

very long simulations distributed computing
...

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Based on annealing: simulated annealing parallel tempering simulated tempering


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Based on a priori physical insight: umbrella sampling steered MD

metadynamics adiabatic free-energy, temperature accelerated MD

## Tackling rare events

## Brute force:

 very long simulations distributed computing...

Based on annealing: simulated annealing parallel tempering simulated tempering


## Based on a priori physical insight:

 umbrella sampling steered MD
metadynamics adiabatic free-energy, temperature accelerated MD

## Pulling

## Steered MD



Pulling to accelerate rare events
CV can be any possible function of the microscopic coordinates
Grubmuller, Heymann, and Tavan, Science (I996) Jarzynsky, PRL (1997)

## Filling

## Metadynamics

Reaction coordinate (AKA Collective Variable)

Fill wells in free-energy landscape, then reconstruct it!
Laio and Parrinello, PNAS (2002)
Barducci, Bussi, and Parrinello, PRL (2008)

## Filling

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## Actual implementation

depending on physical problem/type of machine/...


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depending on the physical problem: distances, angles, ...
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depending on the physical problem: distances, angles, ...
depending on physical problem/type of machine/...

> several possible algorithms
> e.g. steered MD, metadynamics, ...

## PLUMED (born 2008)

## MD code



Bonomi, Branduardi, Bussi, Camilloni, Provasi, Raiteri, Donadio, Marinelli, Pietrucci, Broglia, and Parrinello, CPC (2008)

## PLUMED (born 2008)

## MD codes



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## MD codes



## Why PLUMED?

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## PLUgin for MEtaDynamics

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## MD codes

 for several MD codes!

# PLUgin for MEtaDynamics 

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## History

PLUMED I.x
I. 0
I. 2 CECAM tutorial 2010
1.3

2008

I.I

2009
2010

2011

2012

2013

2014

## History

## PLUMED I.x

2008
1.0
I. 2 CECAM tutorial 2010
development started

2012
user meeting
2011 beta

2009


2013
2.0
2.1 user meeting

## A quickly growing community



Number of "external" users grows rapidly
all: ISI citations to Bonomi et al CPC (2009) others: without authors of first paper + Laio and Gervasio

## What can you do with PLUMED?

Analyze trajectories ${ }^{\$}$
\# using plumed as a standalone tool plumed driver --igro traj.gro --plumed plumed.dat

Analyze simulations on the fly*

> \# e.g. using gromacs: mdrun -plumed plumed.dat

Bias simulations on the fly*

> \# e.g. using gromacs: mdrun -plumed plumed.dat
\$from command line or from VMD - Giorgino, CPC (2014), http://github.com/tonigi/vmd_plumed
*used in combination with a supported MD engine, e.g. GROMACS, NAMD, LAMMPS, Q-ESPRESSO, AMBER + others

## PLUMED+MD

MD code


## PLUMED+MD

PLUMED read from a separate file

MD code


## PLUMED+MD

PLUMED read from a separate file

MD code
initialization

also derivatives w.r.t. atom positions

## PLUMED+MD

PLUMED read from a separate file

## MD code

## initialization


also derivatives w.r.t. atom positions

> sometime using history-dependent schemes

## plumed.dat file

```
# Compute distances, angles, torsions, ...
c1: COM ATOMS=1-10
c2: COM ATOMS=30-40
d1: DISTANCE ATOMS=c1,c2 COMPONENTS
f1: COMBINE ARG=d1.x,d1.y,d1.z POWERS=2,2,2
a1: ANGLE ATOMS=14,15,16
t1: TORSION ATOMS=20, c1, c2,23
# Perform a metadynamics simulation
b1: METAD ARG=f1,a1 PACE=20 HEIGHT=0.5 SIGMA=0.05,0.1
# Limit the exploration to a relevant region
b2: UPPER_WALL ARG=d1.z AT=1.0 KAPPA=0.1
# Print the result
PRINT ARG=a1,t1,b1.bias,b2.bias FILE=colvar STRIDE=100
```


## Example: SN2 reaction

SN2 reaction with density functional theory (QESPRESSO). Compute $\mathrm{Cl}-\mathrm{C}$ distance and bias it with a moving restraint.
d12: DISTANCE ATOMS=1,2
d23: DISTANCE ATOMS=2,3
\# moving restraint
MOVINGRESTRAINT ...


ARG=d12
STEP0=0 AT0=0.31 KAPPA0 $=200000.0$
STEP1=5000 AT1=0.18
LABEL=steer
... MOVINGRESTRAINT
PRINT
FILE=COLVAR ARG=d12,d23,steer.d12_cntr,steer.d12_work STRIDE=1
... PRINT
Tribello, Bonomi, Branduardi, Camilloni, and Bussi, CPC (2014)

## Example: path CV

## Alanine dipeptide

 Path CVs ${ }^{\#}+$ WT-MetaD ${ }^{\$}$ with adaptive Gaussians ${ }^{\%}$ (path can be made with a single command this is just to show input flexibility)\# just declare the RMSD^2 for five structures t1: RMSD REFERENCE=c_1.pdb TYPE=OPTIMAL SQUARED
\#\#\# ...etc for t2, t3, t4, t5 ... \#\#\#
\# calculate the sum of the exp of the five RMSDs
 MATHEVAL ...
LABEL=dwn
$A R G=t 1, t 2, t 3, t 4, t 5 V A R=d 1, d 2, d 3, d 4, d 5$
FUNC $=(\exp (-770 * d 1)+\exp (-770 * d 2)+\exp (-770 * d 3)+\exp (-770 * d 4)+\exp (-770 * d 5))$
PERIODIC=N0
... MATHEVAL
\#\#\# etc \#\#\#
\# do metadynamics
METAD HEIGHT=1.2 SIGMA=0.02 PACE=60 ARG=s,z ADAPTIVE=GEOM BIASFACTOR=5 TEMP=300
Tribello, Bonomi, Branduardi, Camilloni, and Bussi, CPC (2014)
\#Branduardi, Gervasio, and Parrinello, JCP (2007)
\$Barducci, Bussi, and Parrinello, PRL (2008)
\%Branduardi, Bussi, and Parrinello, JCTC (2012)

## Example: CV distribution

Lennard-Jones cluster at high T reweighted at low T. Free energy as a function of moments of coordination number distribution*

```
COORDINATIONNUMBER ...
    SPECIES=1-7
    MOMENTS=2-3
    SWITCH={RATIONAL R_0=1.5 NN=8 MM=16}
    LABEL=c1
```

... COORDINATIONNUMBER
\#

\# calculate histograms from the moments
\#
HISTOGRAM ...
ARG=c1.moment_2,c1.moment_3 STRIDE=10
REWEIGHT_TEMP=0.1 TEMP=0.2
GRID_MIN=0.2,-0.5 GRID_MAX=1.2,1.7 GRID_BIN=200,440
BANDWIDTH=0.01,0.01 KERNEL=triangular
GRID_WSTRIDE=10000000 GRID_WFILE=histo
... HISTOGRAM

Tribello, Ceriotti, and Parrinello, PNAS (20I0)

## On the web

Website: http://www.plumed-code.org/
Github: http://github.com/plumed/plumed2
User \& developer mailing lists

User \& developer manuals + tutorials

Plumed 2.0 is wiriten in $\mathrm{C}+$ and uses many ot the advancood, object-oriented features ot his language. This structure makes the implementation of o olleative coordinates and tree energy melthods


 bout implementing CV, tunctions and bliseses. Another usetulu page is he Tool Box page, which contains in itomation on the many reusable objects hat have been implemented in plumed
A bref introduction to the plumed core
A bref introduction to the plumed core
And finaly, tor the devevepers ot MD cocose, we provide intormation as to how to incorperate plumed into your codes here:
How to add plumed to an MD code


## TAR-Tat binding

Crucial step for HIV replication


Initiation
Elongation


Oligopeptides mimicking TAT developed in G.Varani's lab* (UoW)

## Mechanism of binding?

*Davidson et al, PNAS (2009)

## Pretend binding mode is unknown

- GROMACS 4 MD code* (+PLUMED*)
- parmbsc0 force field\%
- Explicit water (TIP3P\$, ~12k molecules)
- Explicit counter-ions ( NaCl I50mM)

> Pulling on TAR-peptide distance: problem is too complex, difficult to reach the proper binding site...

*Hess, Kutzner, Van Der Spoel and Lindahl JCTC (2008)
\#www.plumed-code.org
\%Perez et al, BJ (2007)
\$Jorgensen et al, JCP (1983)

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Binding is driven by electrostatics: why not pulling the "electrostatic energy"?

Der Spoel and Lindahl JCTC (2008)
\#www.plumed-code.org \%Perez et al, BJ (2007) \$Jorgensen et al, JCP (1983)

## Pulling the estimated interaction energy

pulling out pulling in
(from NMR structure) (from unbound structure)

$$
\begin{aligned}
& s=G^{D H}=\frac{1}{k_{B} T \epsilon_{w}} \sum_{j \in B} \sum_{i \in A} q_{i} q_{j} \frac{e^{-\kappa\left|\mathbf{r}_{i j}\right|}}{\left|\mathbf{r}_{i j}\right|} \\
& V(t, s)=\frac{1}{2} k\left(s_{0}+\left(s_{1}-s_{0}\right) \frac{t}{T}-G^{D H}\right)^{2}
\end{aligned}
$$

Made on
FERMI@CINECA

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(from NMR structure)
pulling in
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$$

## Made on <br> FERMI@CINECA

## Comparison with NMR structure


(2)

correct pocket inverse orientation
*Davidson et al, PNAS (2009) Do, Carloni, Varani and Bussi, JCTC (2013)

## When performance is an issue

Biased sampling is expected to provide a huge speedup provided good CVs are used.

However good CVs are sometime expensive:

- Steinhardt order parameters ${ }^{1}$
-Path/Property maps ${ }^{2}$
- Secondary structure CVs ${ }^{3}$
-SPRINT ${ }^{4}$
-Sketch maps ${ }^{5}$
$\mathrm{t}_{\text {tot }}=\mathrm{t}_{\mathrm{MD}}+\mathrm{t}_{\mathrm{PL}}$

'Steinhardt, Nelson, and Ronchetti, PRB (1983);Trudu, Donadio, and Parrinello, PRL (2006);
${ }^{2}$ Branduardi, Gervasio, and Parrinello, JCP (2007); Spiwok and Králová, JCP(201 I);
${ }^{3}$ Pietrucci and Laio, JCTC (2009); ${ }^{4}$ Pietrucci and Andreoni, PRL (201 I);
${ }^{5}$ Tribello, Ceriotti, and Parrinello, PNAS (20I2); ${ }^{6}$ Do, Carloni, Varani, and Bussi, JCTC (20I3)


## Multiple time stepping

Compute PLUMED forces every $n$ steps

$\mathrm{t}_{\text {tot }}=\mathrm{t}_{\text {MD }}+\mathrm{t}_{\text {pL }} / n$
$e^{A+B} \approx e^{\frac{A}{2}} e^{B} e^{\frac{A}{2}}$
Forces from PLUMED scaled up by a factor $n^{\#}$
Reversible trajectories
\#Tuckerman, Berne, and Martyna, JCP (1992); Sexton and Weingarten, Nucl. Phys. B (I992)

## RNA/protein complex





## MetaD on RNA/protein interaction

$$
G^{D H}=\frac{1}{k_{B} T \epsilon_{w}} \sum_{i \in \operatorname{prot}} \sum_{j \in \mathrm{RNA}} q_{i} q_{j} \frac{e^{-\kappa\left|\mathbf{r}_{i j}\right|}}{\left|\mathbf{r}_{i j}\right|}
$$

DHENERGY as introduced in Do, Carloni,Varani, and Bussi JCTC (2013) Ferrarotti, Bottaro, Perez-Villa, and Bussi, submitted

## Overall speedup



PLUMED overhead can be decreased by a factor $n$ Even $n=2$ can be interesting!

## Tackling rare events

## Brute force:

very long simulations distributed computing


## Based on annealing: simulated annealing parallel tempering simulated tempering

 adiabatic free-energy, temperature accelerated MD

## Replica exchange



Ladder of replicas:
-"reference" replica
-"ergodic" replica
-as many as needed in the middle (depends on "how different")
In parallel tempering,"ergodic" means "high T"

## MetaD used to "increase T"


$\Phi$
$\Delta T=600 \mathrm{~K}$

$\Phi$
$\Delta T=1800 \mathrm{~K}$

$\Delta T=4200 \mathrm{~K}$
time is spent on the desired region $\exp (-\mathrm{F} /(\mathrm{T}+\Delta \mathrm{T}))$
$\Delta T$ tunes the explored region

## (initial rate $\omega=\Delta T / T=2.4 \mathrm{kcal} / \mathrm{mol} / \mathrm{ps}$ )



## (Hamiltonian) replica exchange


-Replicas with different value of $(T+\Delta T)=\gamma T$

## GACC tetranucleotide


r(GACC) tetranucleotide


A-form major



# 24 (T-REMD) $\times 8$ (H-REMD) replicas $\approx 60 \mu \mathrm{~s}$ total 

> In comparison with poly-peptides, roughly $3 x$ complexity per residue

Bergonzo, Henriksen, Roe, Swails, Roitberg, and Cheatham, JCTC (2014)

## GACC tetranucleotide

Amber99-chiOL\#
TIP-3P water\%
GROMACS $4.6^{\$}$
PLUMED 2.0@

## Each nucleotide:

7 backbone dihedrals
puckering
minimum distance from other bases (total $28 \times 1 D+4 \times 2 \mathrm{D}$ concurrent MetaD)

16 replicas

$\gamma=1-4$<br>$\alpha \approx 40 \%-70 \%$

\#Zgarbova et al, JCTC (2010)
\% Jorgensen et al, JCP (1983)
\$Hess et al, JCTC (2008)
@Tribello et al, CPC (2014)

## Dihedral distribution

## Relative stability of rotamers



Gil-Ley and Bussi, submitted

## Relative stability of rotamers



Gil-Ley and Bussi, submitted

## Take home message

PLUMED: an open source plugin for molecular dynamics
A posteriorilon-the-fly analysis of MD
Many CVs and biasing methods (metadynamics et al)
Compatible with several MD engines
http://www.plumed-code.org

## Acknowledgements

Andrea Perez-Villa Sandro Bottaro Alejandro Gil-Ley

Marco Jacopo Ferrarotti Do Trang

PLUMED developers:
Gareth Tribello Max Bonomi
Davide Branduardi Carlo Camilloni


ERC for funding CINECA for computing time

| $\rho_{6} \frac{9}{5}$ | erc INRICERCA |  |
| :---: | :---: | :---: |
|  |  |  |



## PLUMED+VMD (GUI)


http://www.ks.uiuc.edu/Research/vmd Giorgino, CPC (2014) - see http://github.com/tonigi/vmd_plumed

## Supported MD codes

GROMACS - fast, tuned for biomolecules, open source NAMD - fast, tuned for biomolecules, scalable LAMMPS - very general and scalable, open source QuantumESPRESSO - DFT, open source AMBER/sander, many force methods (QMMM, semi-empirical,...)

+ some code has PLUMED support out-of-the-box

PLUMED is a library with a documented API thus, you can easily add your own code!
http://www.gromacs.org http://www.ks.uiuc.edu/Research/namd
http://lammps.sandia.gov http://www.quantum-espresso.org http://ambermd.org

## Molecular Dynamics

$$
\begin{aligned}
E_{\text {total }}= & \sum_{\text {bonds }} k_{\mathrm{b}}\left(\ell-\ell_{0}\right)^{2}+\sum_{\text {angles }} k_{\mathrm{a}}\left(\theta-\theta_{0}\right)^{2} \\
& +\sum_{\text {torsions }} \frac{1}{2} V_{\mathrm{n}}[1+\cos (n \omega-\gamma)]^{2} \\
& +\sum_{j=1}^{N-1} \sum_{i=j+1}^{N}\left\{\varepsilon_{i, j}\left[\left(\frac{r_{0 i j}}{r_{i j}}\right)^{12}-2\left(\frac{r_{0 i j}}{r_{i j}}\right)^{6}\right]+\frac{q_{i} q_{j}}{4 \pi \varepsilon_{0} r_{i j}}\right\}
\end{aligned}
$$

Classical empirical force field:
-Chemically motivated interactions

- Atomistic detail
- Water and ions explicitly modeled
- No polarization, no chemical reactions

Large computers required
5-100 ns/day


## Open source philosophy

Do you want to contribute:

- reaction coordinates?
- free energy methods?
- source code cleaning?
- write documentation?
- port to other MD code?

Open source is good for me. I will fully embrace it: Open source is good for me. I will fully embrace t. Open source is good for me. I will fully embrace t; Open source is good for me. I will fully embrace t. Open source is good for me. I will fully embrace t. Open source is good for me. I will fully embre

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Your code will be available for free, forever (also to you!)

Your method/coordinate will be usable by many people immediately

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*this is good for citations, too!

## GPUs (gromacs)



Load balancing shifts load to GPU when PLUMED is too expensive

