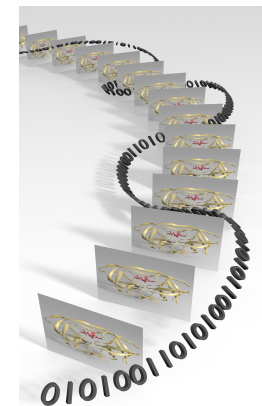
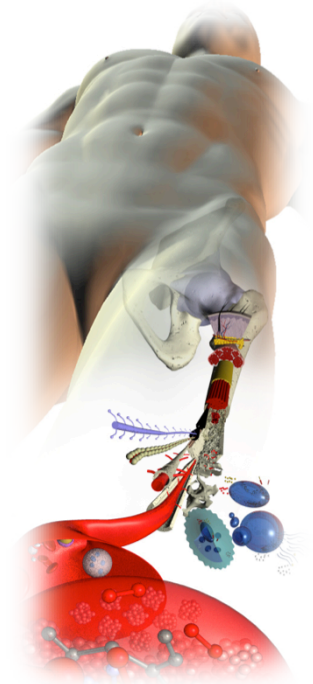


# Exploiting International e-Infrastructures for Large Scale Computational Science

**Peter Coveney**

*Centre for Computational Science  
University College London  
United Kingdom*



# Acknowledgements



- Agastya P. Bhati
- Shunzhou Wan
- David W. Wright
- Stefan J. Zasada



RUTGERS



- Ian Wall
- Darren Green
- Paul Bamborough



- Sarah Skerratt
- Kiyoyuki Omoto
- Veerabahu Shanmugasundaram
- Sharan K. Bagal



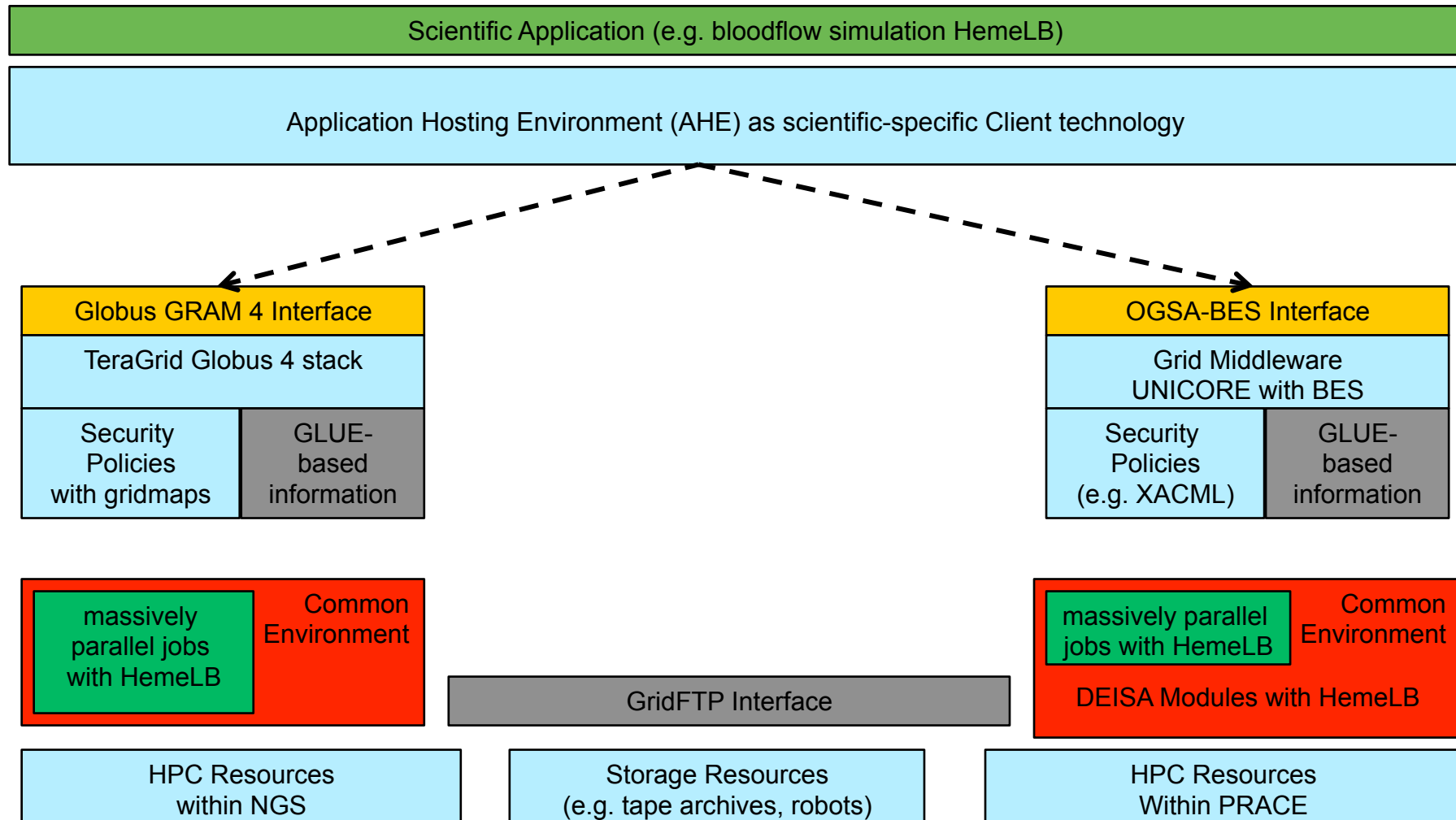
- AHE: A Lightweight Science Gateway
- Application 1: Calculating Drug Binding Affinities
  - Ensemble Methods
  - Binding Affinity Calculator
  - User Friendly Binding Affinity Calculator
  - High Performance & Cloud Computing
- Application 2: Multiscale simulation of nano materials
- Conclusions

- Problems for individual users installing/compiling/optimizing application
- Complexities of using computational infrastructures
  - Job workflows, from staging data to launching jobs
- Security is an obstacle for users
  - Applying for certificates
  - Generating MyProxy
- A solution is needed to simplify usage for scientific end users, e.g. to allow clinicians to run simulations at the click of a button.



- **Application Hosting Environment**
  - Simplifying Access to the Grid
  - Community Model.
- **Simplifies security**
  - End-User avoids grid security and MyProxy configuration and generation.
- **Simplifies application setup**
  - End-User does not have to compile, optimise, install and configure applications.
- **Simplifies basic workflow**
  - AHE stages the data, runs and polls the job and fetches the results automatically
- **Simplifies compute access through RESTful web-services**
  - Provides a RESTful interface
  - Clients and services access infrastructure and apps with 'Software as a Service'

# AHE Application Hosting Environment



Stefan Zasada, Steven Manos, Morris Riedel, Johannes Reetz, Michael Rambadt et al.,  
For the Virtual Physiological Human (VPH) projects that require interoperability of numerous Grids

# AHEApplication Hosting Environment



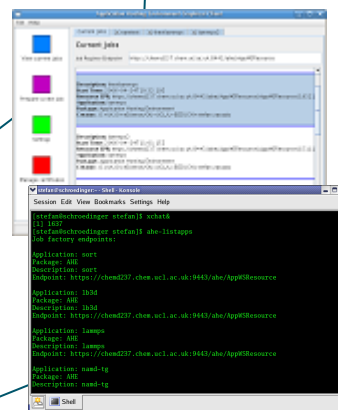
## Federating HPC resources

### Local resources



### GridSAM

### Globus



### UK

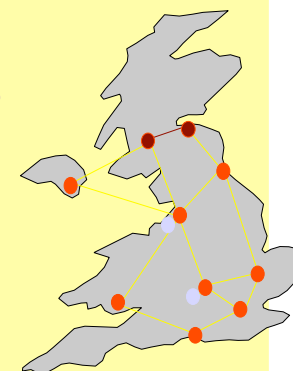
#### ARCHER

Leeds

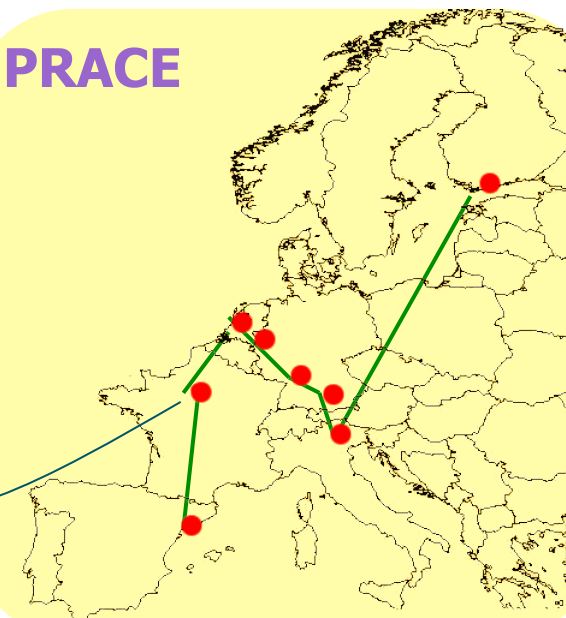
Manchester

Oxford

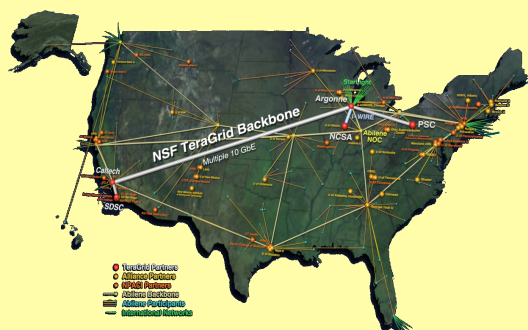
RAL



### PRACE



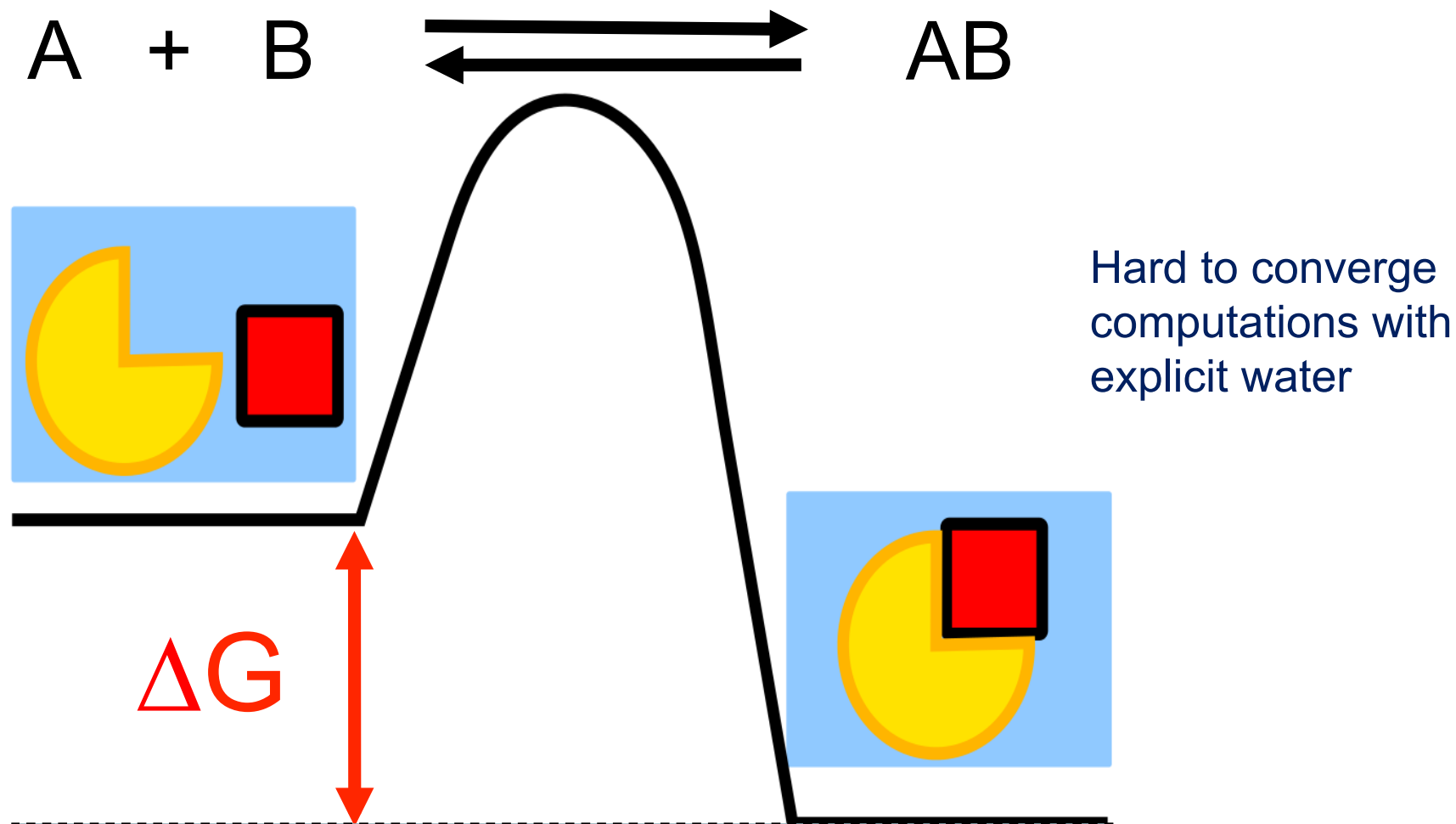
### XSEDE



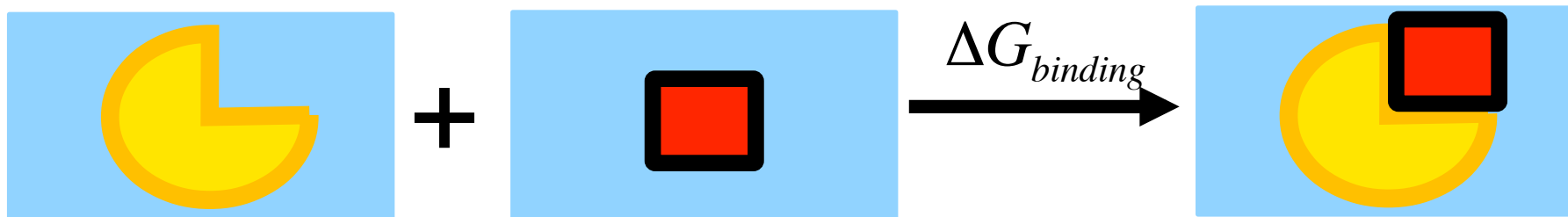
### Globus

### UNICORE

- Ligand binding driven by changes in the Gibbs free energy
- The more negative the  $\Delta G$  the stronger the binding



## Absolute binding free energy with end-point methodologies



$$\Delta G_{binding} = G_{complex} - G_{protein} - G_{ligand}$$

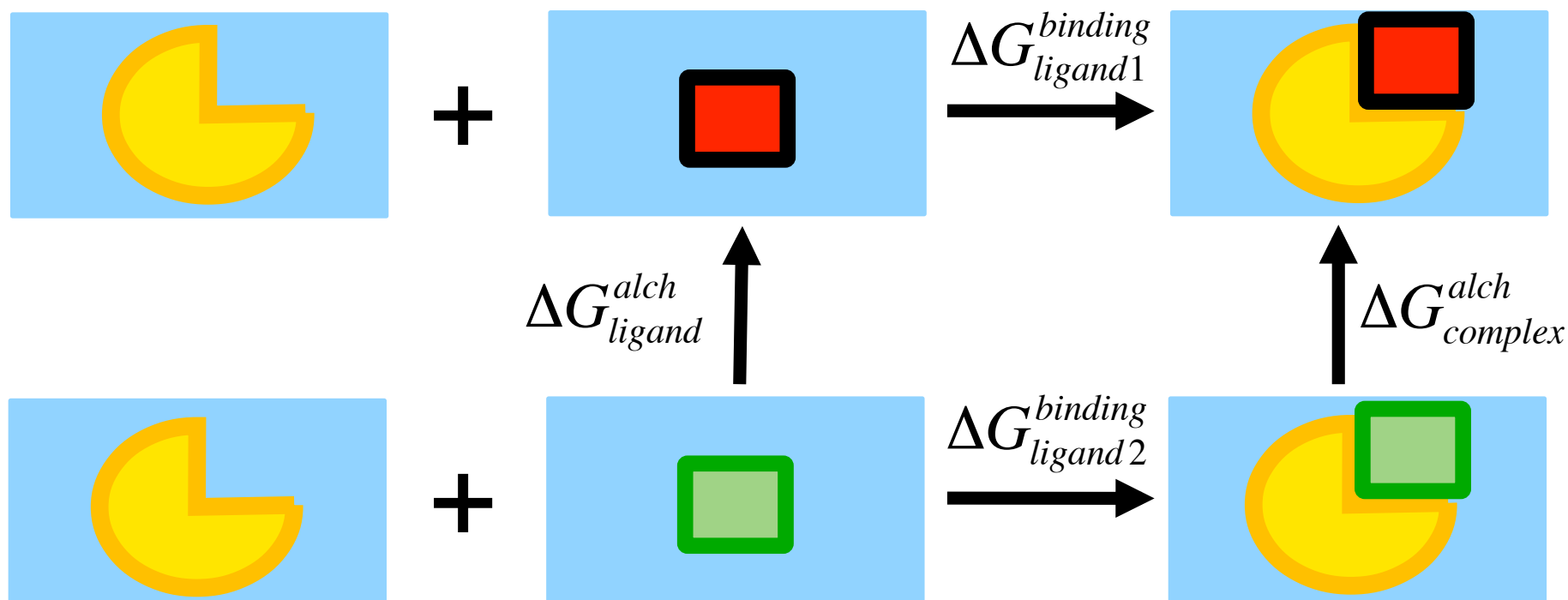
The end-point free energy calculation methodologies **MMPB(GB)SA** are used to estimate the free energies of protein, ligands and their complexes using conformations generated via molecular dynamics simulation.

$$\begin{aligned} G^i &= G_{MMPB(GB)SA}^i - TS_{conf}^i \\ &= E_{MM}^i + G_{solv}^i - TS_{conf}^i \\ &= E_{MM}^i + G_{PB/GB}^i + G_{SA}^i - TS_{conf}^i \end{aligned}$$



# Computing Binding Free Energy Difference

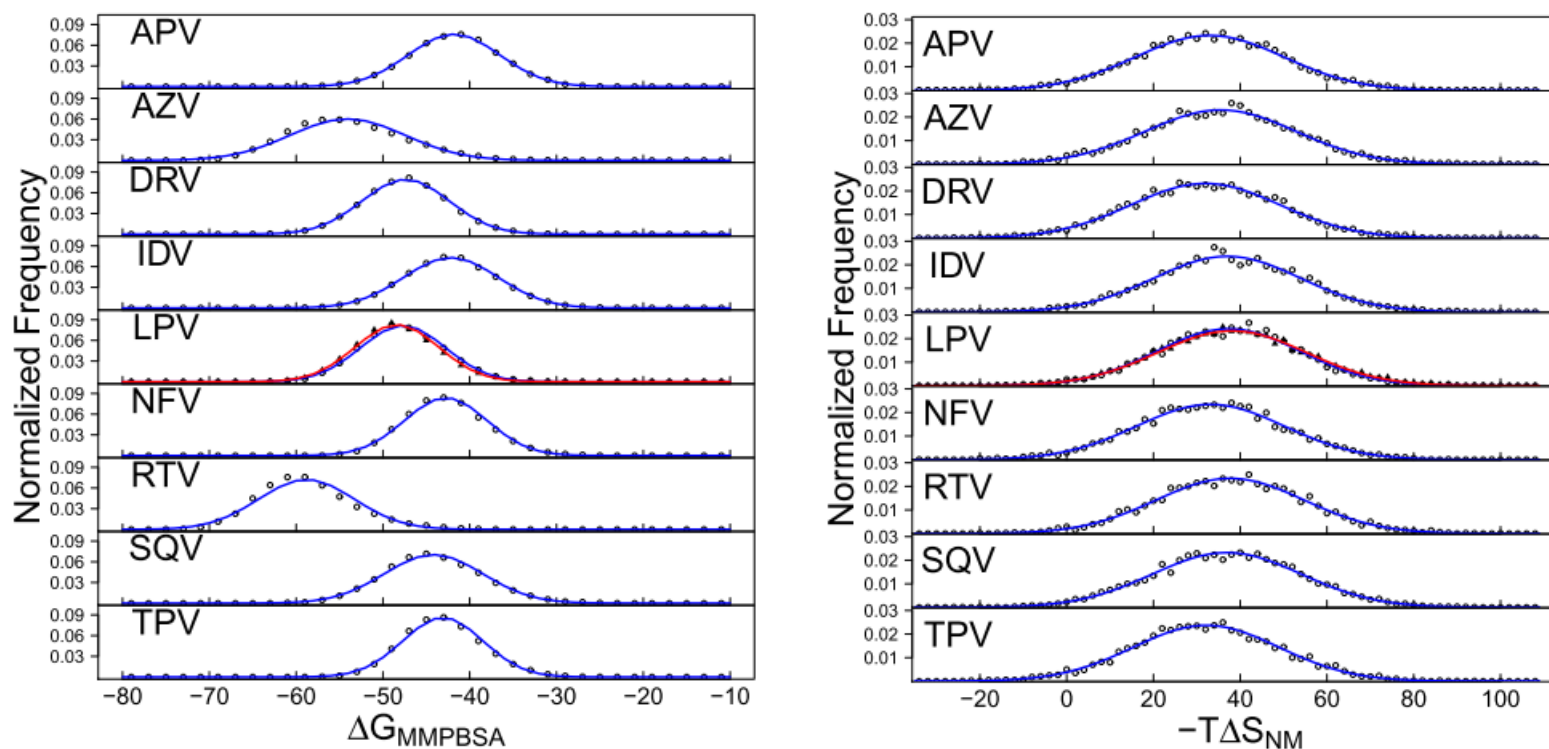
Relative binding free energy with alchemical mutation: make use of thermodynamic cycle to calculate binding free energy difference



$$\Delta\Delta G^{binding} = \Delta G_{ligand2}^{binding} - \Delta G_{ligand1}^{binding} = \Delta G_{ligand}^{alch} - \Delta G_{complex}^{alch}$$

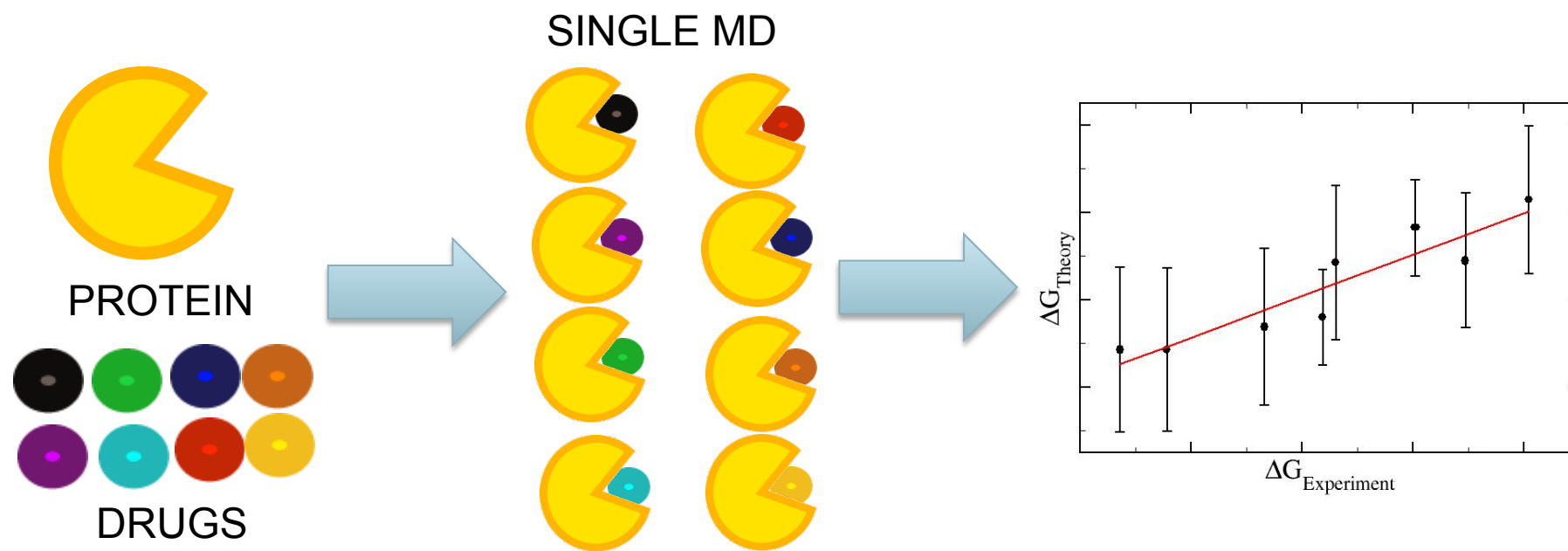
- The MM/PBSA results follow well defined Gaussian distributions.
- Configurational entropies, obtained from normal mode estimates, closely resemble normal distributions.

Drug – HIV-1 protease



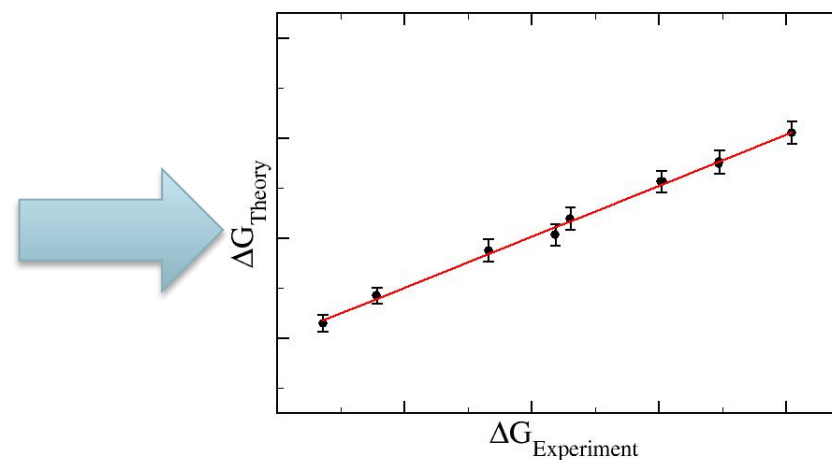
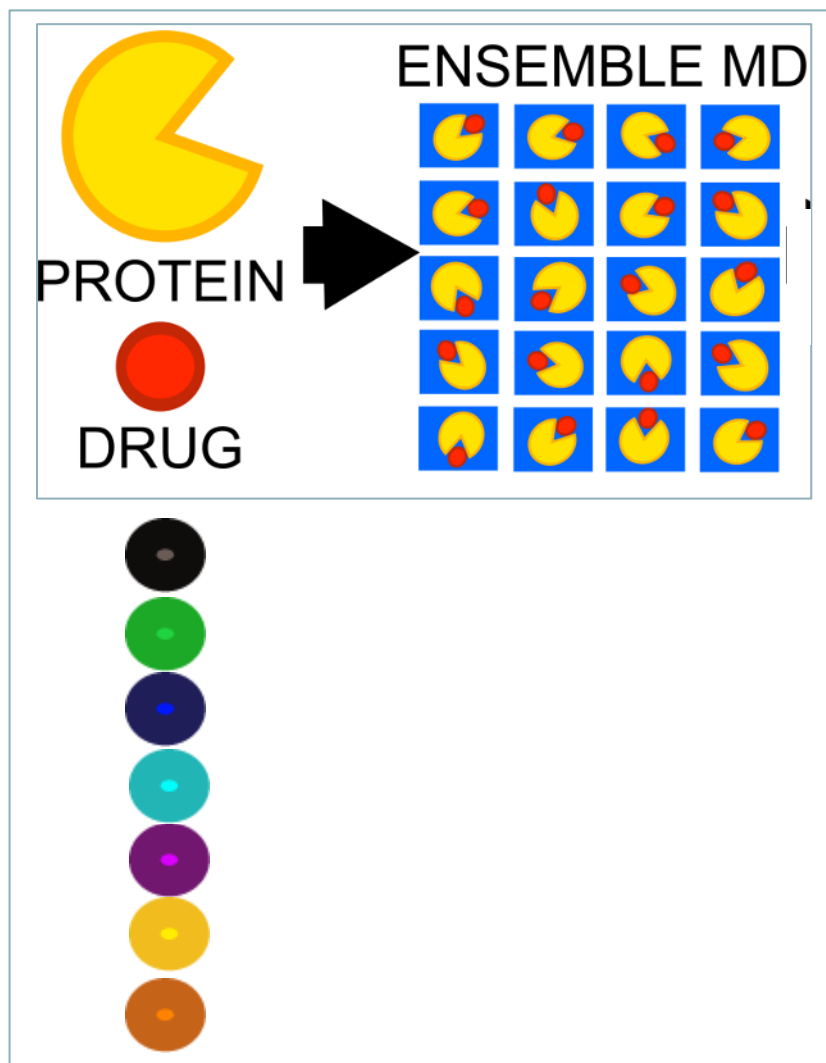
Wright, Hall, Kenway, Jha & Coveney, JCTC, (2014), DOI: 10.1021/ct4007037.

## Computational Application to Drug Affinity Ranking – Single MD simulation



Errors uncontrolled  
Results unreproducible

## Computational Application to Drug Affinity Ranking – Ensemble Simulations



Errors fully under control  
Results reproducible.

## **ESMACS: Enhanced Sampling of Molecular dynamics with the approximation of Continuum Solvent**

- “Absolute” free energies
- Compare diverse ligands
- Statistical error analysis
- MM/PBSA
- Conformational entropy

## **TIES: Thermodynamic Integration with Enhanced Sampling**

- Relative binding affinities
- “Exact”
- Limited range of application
- Ensemble needed for each  $\lambda$

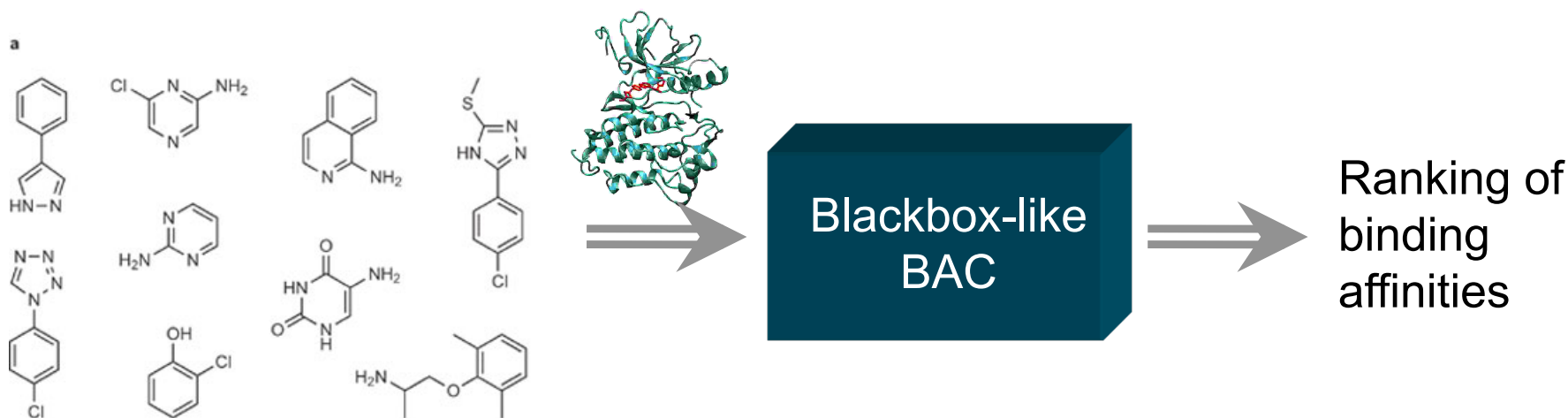


- Run <25 'replica' simulations
- Vary only initial velocities
- 4 ns of production trajectory per replica
- More efficient sampling compared to single long simulation
- Allows us to examine reproducibility of results
- The workflow can be completed within <8 hours of wallclock time, provided the required number of cores is available.
- To compute more than one binding affinity concurrently, one needs to multiply the node requirement by the number of molecules of interest.

Sadiq, S.K, Wright, D.W., Kenway, O.A. and Coveney, P.V. "Accurate Ensemble Molecular Dynamics Binding Free Energy Ranking of Multidrug-Resistant HIV-1 Proteases." *Journal of Chemical Information and Modeling* 2010 50 (5), 890-905.

Wan, S., Knapp, B., Wright, D.W., Deane, C.M., Coveney, P.V., "Rapid, Precise and Reproducible Prediction of Peptide-MHC Binding Affinities from Molecular Dynamics that Correlate Well with Experiment", *J. Chem. Theory Comput.*, 11 (7), 3346-3356 (2015), DOI: 10.1021/acs.jctc.5b00179

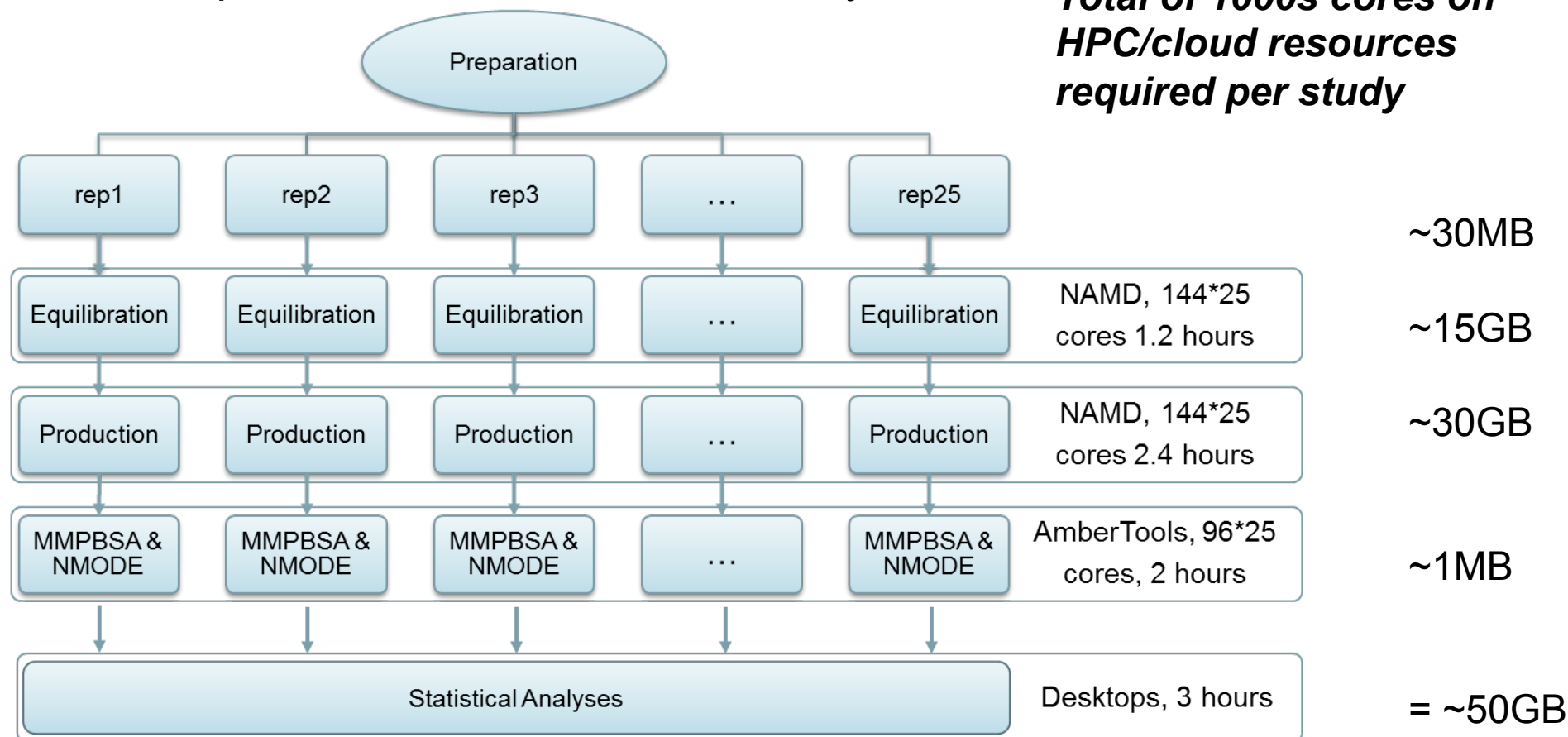
**BAC can reliably predict binding affinities of compounds with their target proteins, and be used potentially as a drug ranking tool in clinical application or a virtual screening tool in pharmaceutical lead discovery.**



S. K. Sadiq, D. Wright, S. J. Watson, S. J. Zasada, I. Stoica, Ileana, and P. V. Coveney, "Automated Molecular Simulation-Based Binding Affinity Calculator for Ligand-Bound HIV-1 Proteases", *Journal of Chemical Information and Modeling*, **48**, (9), 1909-1919, (2008), [DOI: 10.1021/ci8000937](https://doi.org/10.1021/ci8000937).

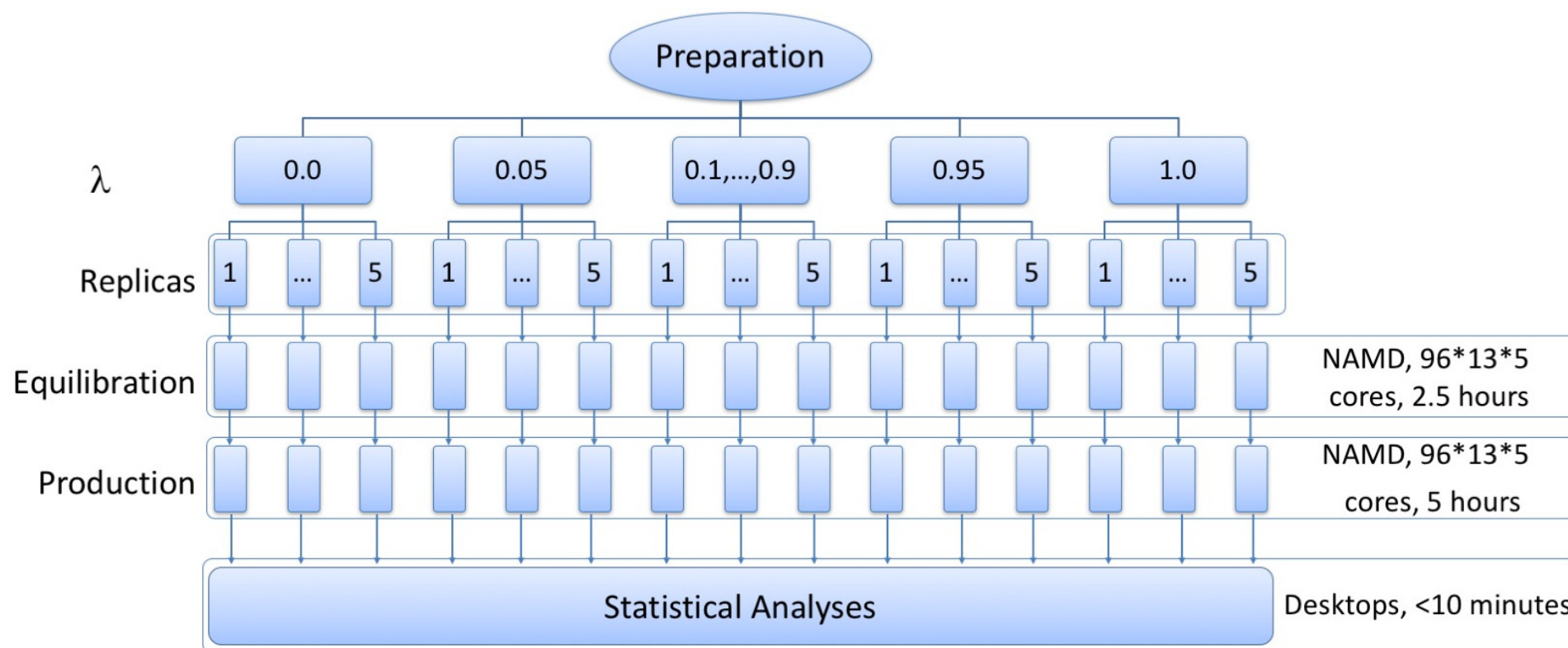
BAC: rapid and accurate binding affinity calculation on timescales relating to clinical decision making on drug selection and to pharmaceutical lead discovery.

**Total of 1000s cores on HPC/cloud resources required per study**



A. Bhati, S. Wan, D. Wright, P. V. Coveney, "Rapid, accurate, precise and reliable relative free energy prediction using ensemble based thermodynamic integration", Journal of Chemical Theory and Computation, DOI: [10.1021/acs.jctc.6b00979](https://doi.org/10.1021/acs.jctc.6b00979).

**Binding Affinity Calculator (BAC)** is a software toolkit which automates the implementation of TIES (and ESMACS) methods for binding affinity calculations



S.K. Sadiq, D. Wright, S.J. Watson, S.J. Zasada, I. Stoica, P.V. Coveney, *J. Chem. Inf. Model.*, **2008**, 48, 1909-1919.

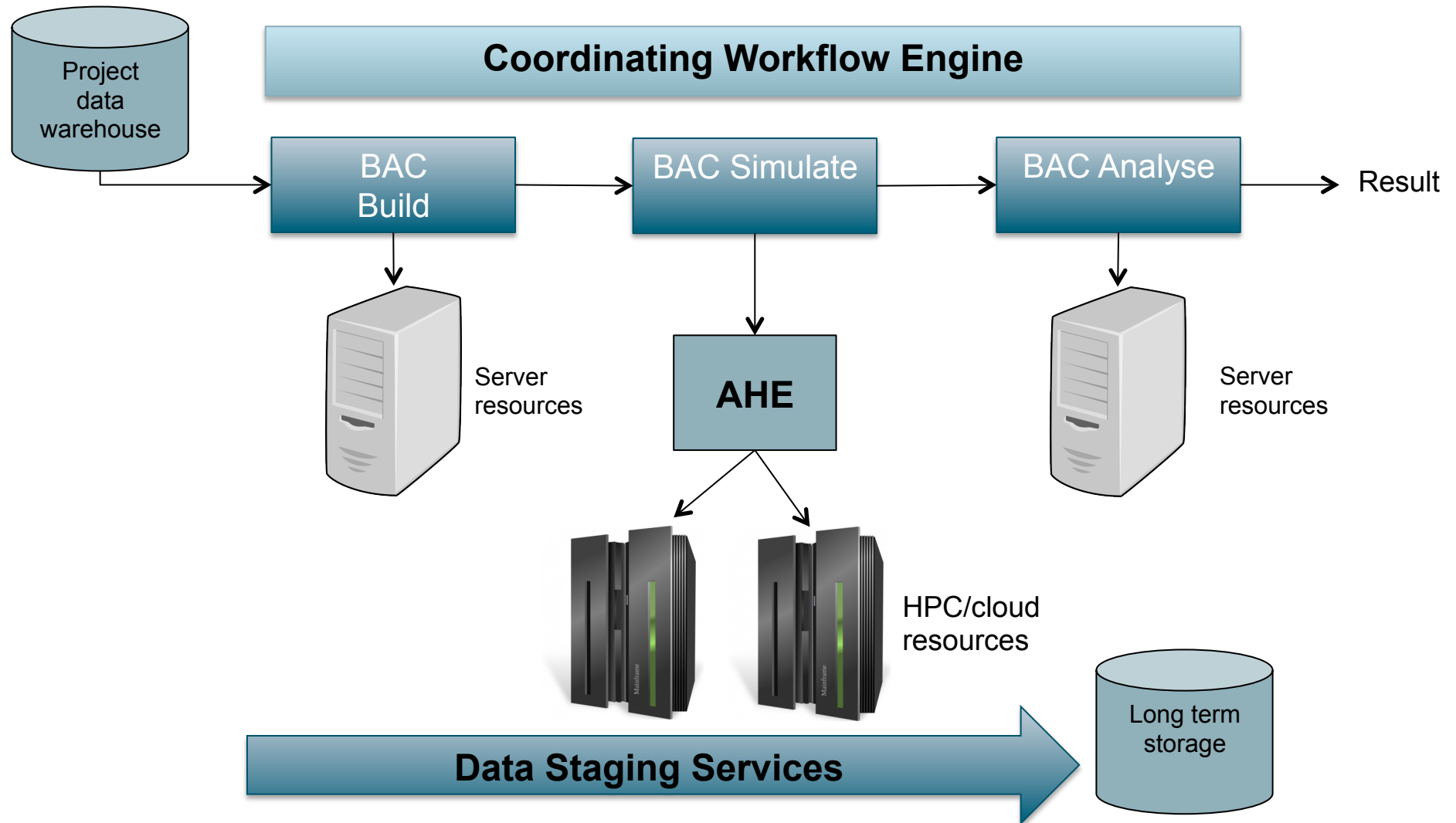
A.P. Bhati, S. Wan, D.W. Wright & P.V. Coveney, *J. Chem. Theory Comput.*, **2017**, 13, 210–222. <sup>18</sup>

- User Friendly BAC makes reliable, repeatable binding affinity calculations available to anyone
- Web interface allows full BAC workflows via simple, user friendly client
- Manages execution of calculations on a range of resources, from HPC to commercial cloud platforms
- ufBac manages complete study execution and data archival on behalf of the user



# BAC Requires Unified E-Infrastructures

The BAC workflow requires resources of different scales to execute



# Petascale Computing Facilities Used by Us



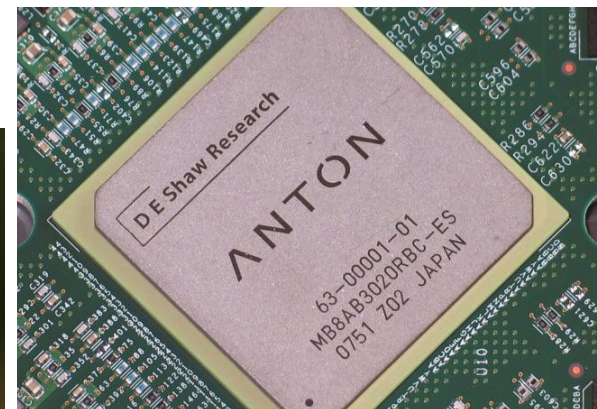
Piz Daint



SuperMUC



Cartesius



Anton



PRACE



HECToR



ARCHER



EMERALD



Blue Joule



Blue Wonder

## Industrial Strength of BAC



Leibniz Supercomputing Centre  
of the Bavarian Academy of Sciences and Humanities

### SuperMUC

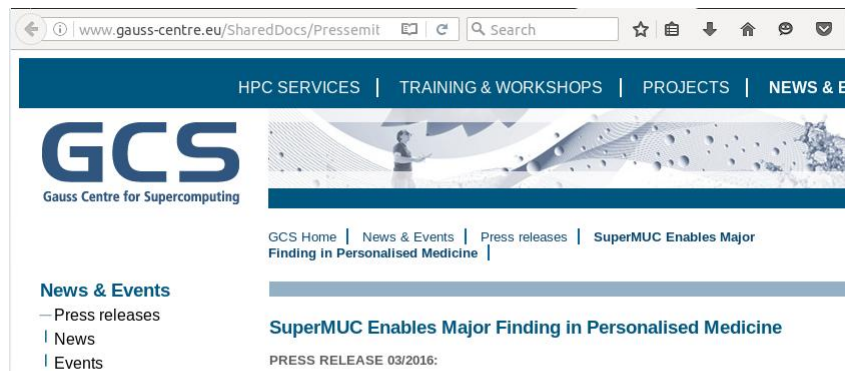
“Scientists can work out the way that a candidate drug will act on a target in the body – a protein – and in a matter of a few hours.”

11-13 June 2016

36 hours on active machine.



### LRZ Press Release:



### Post on the London Science Museum Blog:



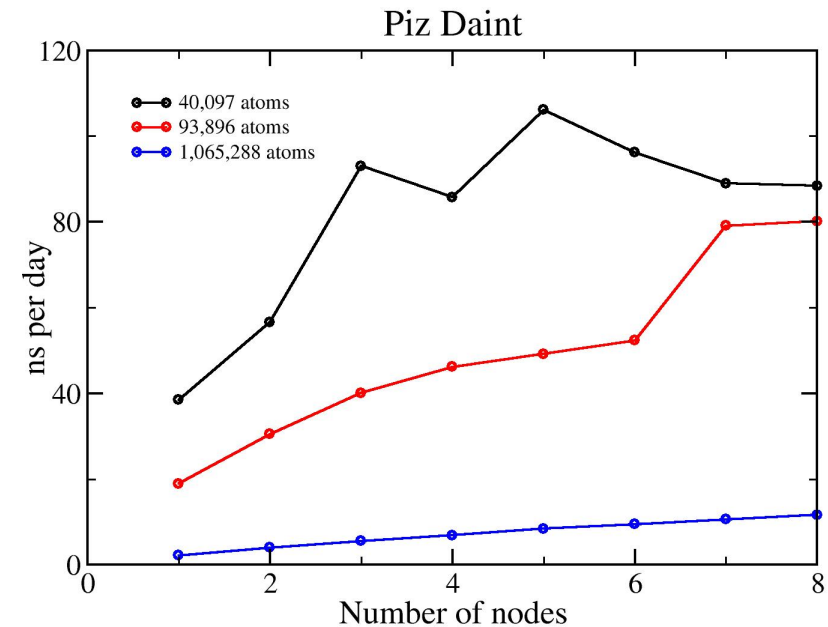
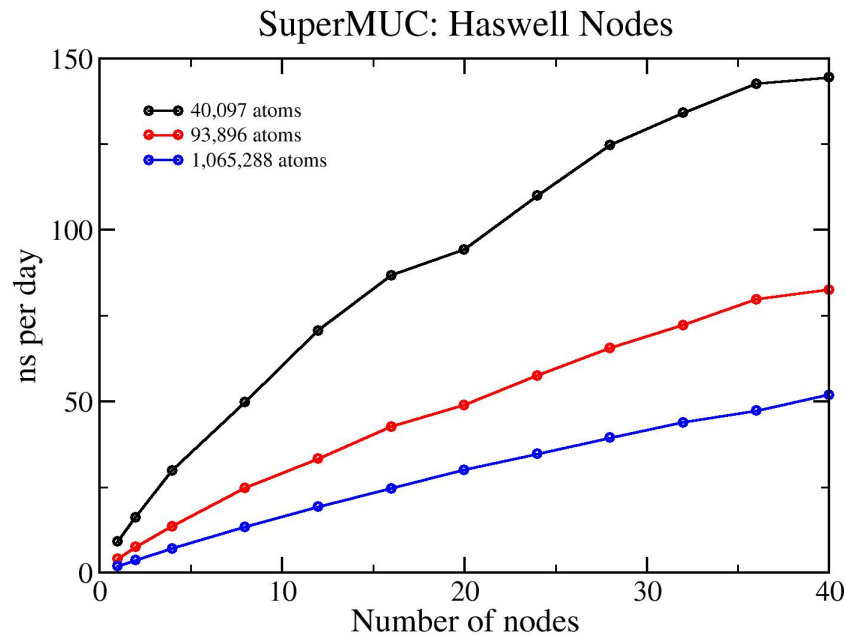


- 60 combinations of drug and protein investigated
  - 30 absolute free energy calculations of diverse ligands (ESMACS)
  - 30 relative free energy calculations of related ligands (TIES)
- Refine ESMACS protocols
  - Multiple simulations
  - Differences between chemical groups
- New insights into TIES methodology
  - Determinants of statistical error
- Hardened automation scripts
  - BAC
  - FabSim

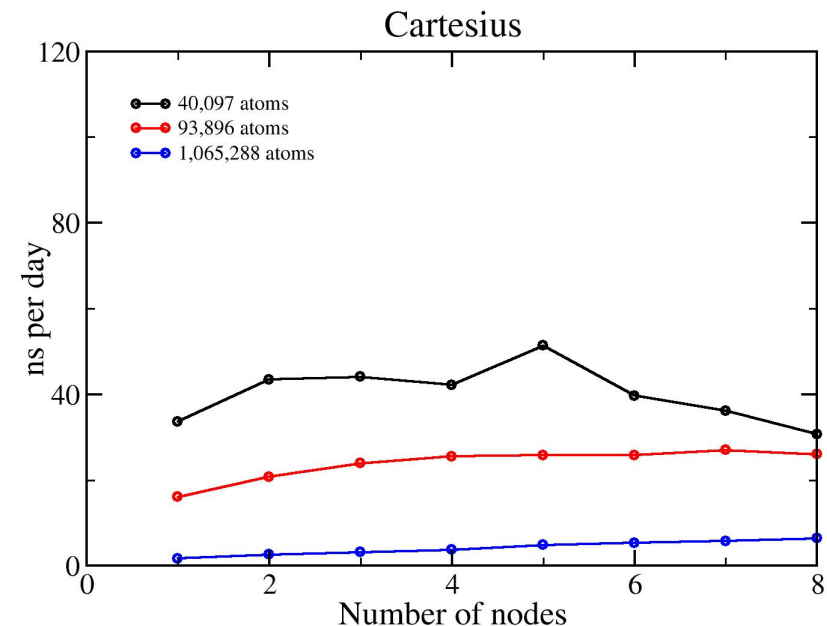


**Rapid, accurate, precise and reliable relative free energy prediction using ensemble based thermodynamic integration, [Agastya P. Bhati](#), [Shunzhou Wan](#), [David W. Wright](#), and [Peter Vivian Coveney](#), *J. Chem. Theory Comput.*, 2016, DOI: 10.1021/acs.jctc.6b00979**

# CPUs vs GPUs



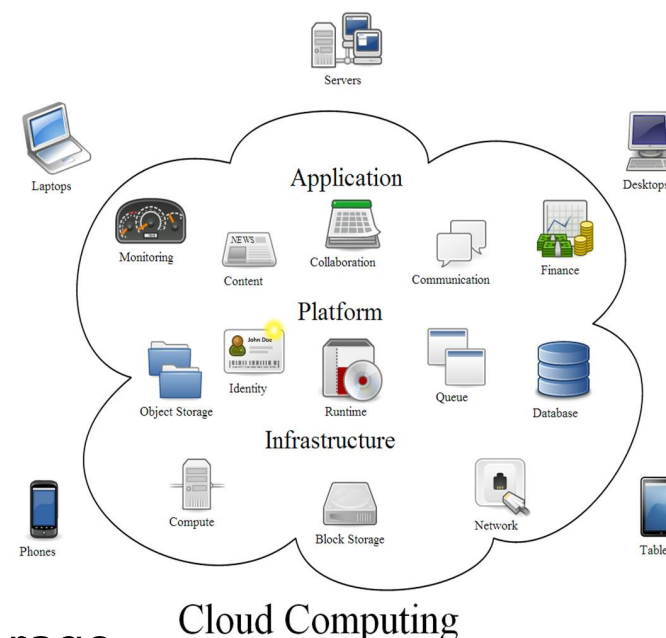
- Speed-up keeps growing on CPU machine, up to 40 nodes for a 40K atom system (36 atoms per core).
- Quicker speed is obtained on single GPU accelerated node, scaling up to 3 nodes on Piz Daint for the 40K system.





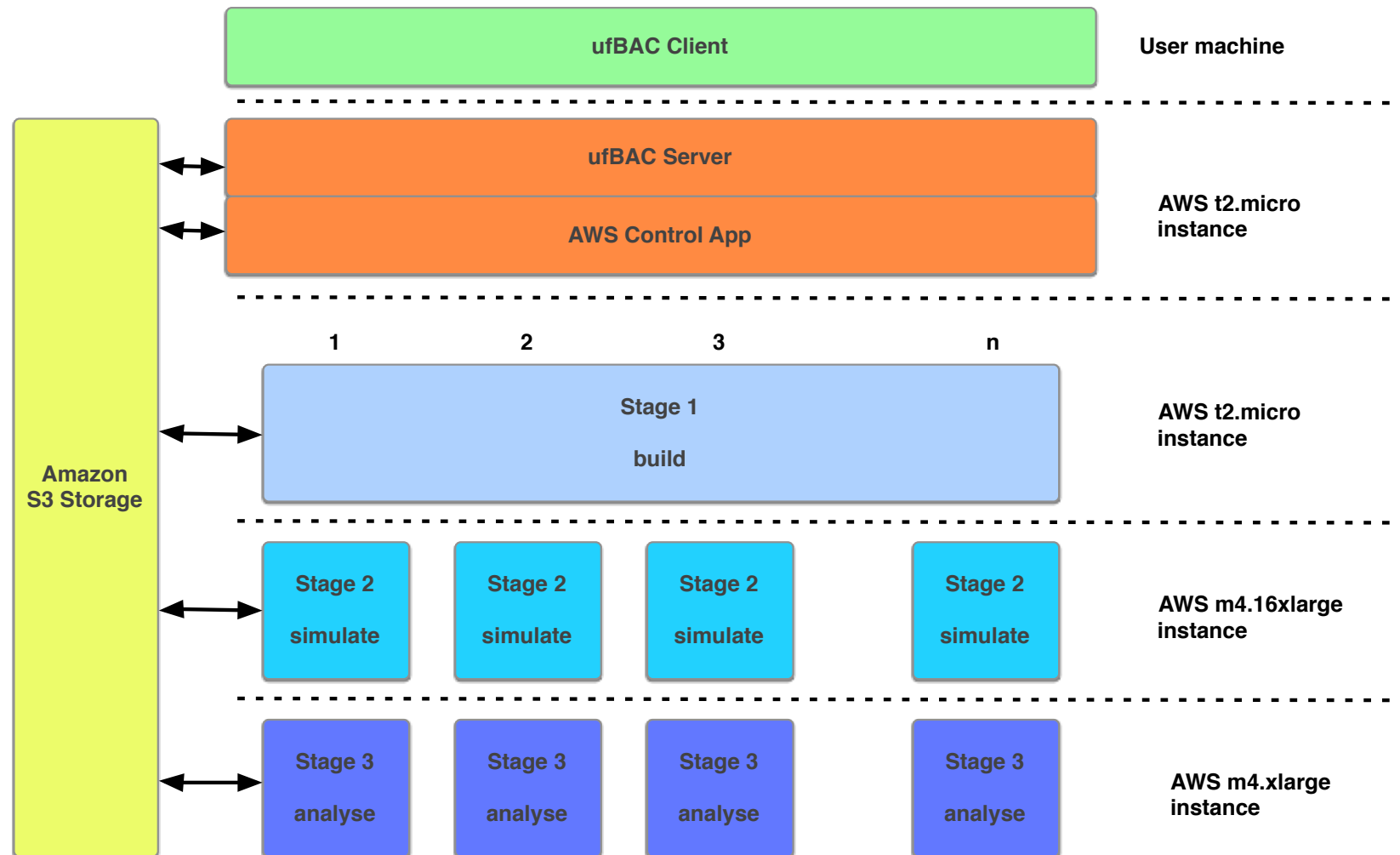
# Commercial Clouds

- Cloud computing is an alternative schema for running applications on remote resources.
- Access to compute is provided in return for monetary payment.
- *Infrastructure as a Service (IaaS)* clouds provide access to CPU, memory and storage.
- *Software as a Service (SaaS)* clouds provide access to applications.

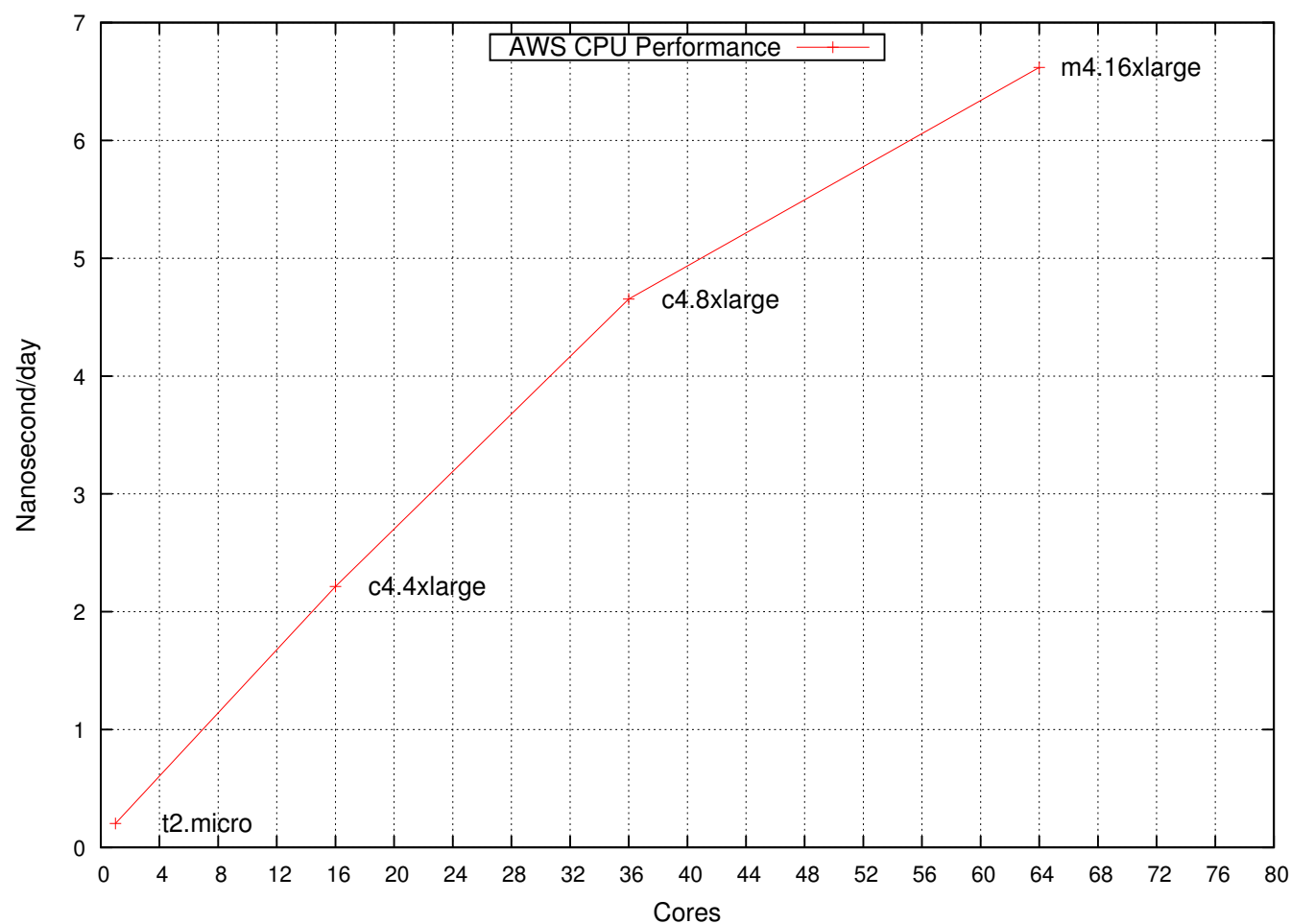


*We've worked to deploy BAC on AWS and DNAnexus cloud platforms, and expect to publish it through the Amazon Market Place. We are currently evaluating deployment on Microsoft Azure.*

# Cloud Deployment: Amazon Web Services



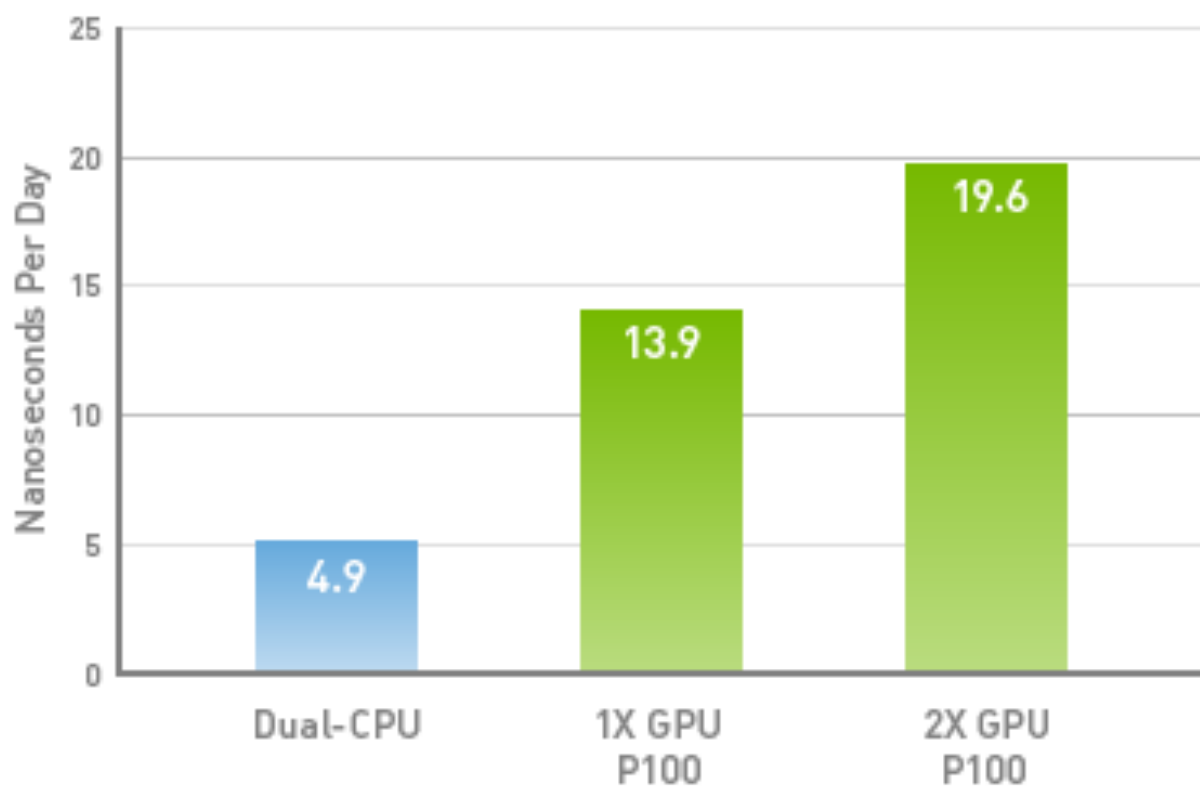
# Cloud Scaling Performance



Instance	Size
t2.micro	1 CPU/1 GB RAM
c4.4xlarge	16 CPU/30 GB RAM
c4.8xlarge	36 CPU/60 GB RAM
m4.16xlarge	64 CPU/256 GB RAM

# GPU Scaling Performance

**ApoA1**

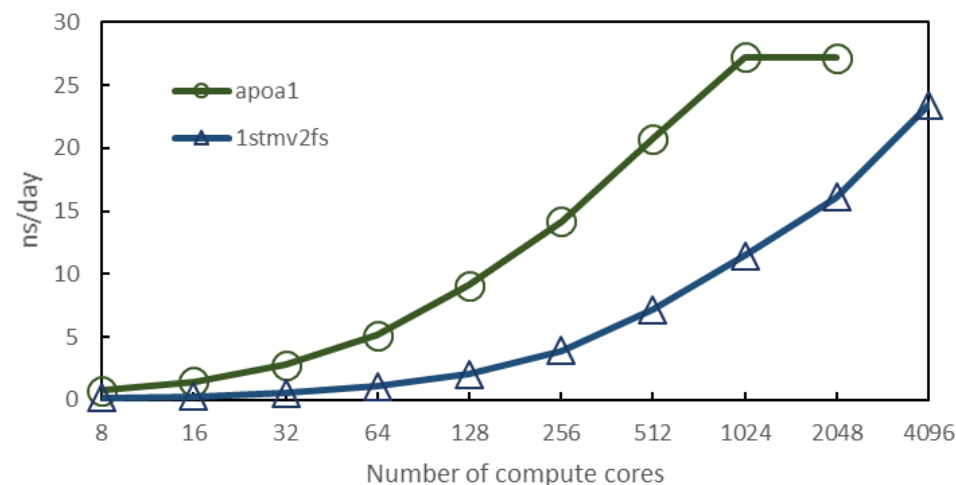


Dual CPU server, Intel E5-2699 v4@2.2GHz, 3.6GHz Turbo (Broadwell-EP), Tesla P100, ECC off, Autoboost ON

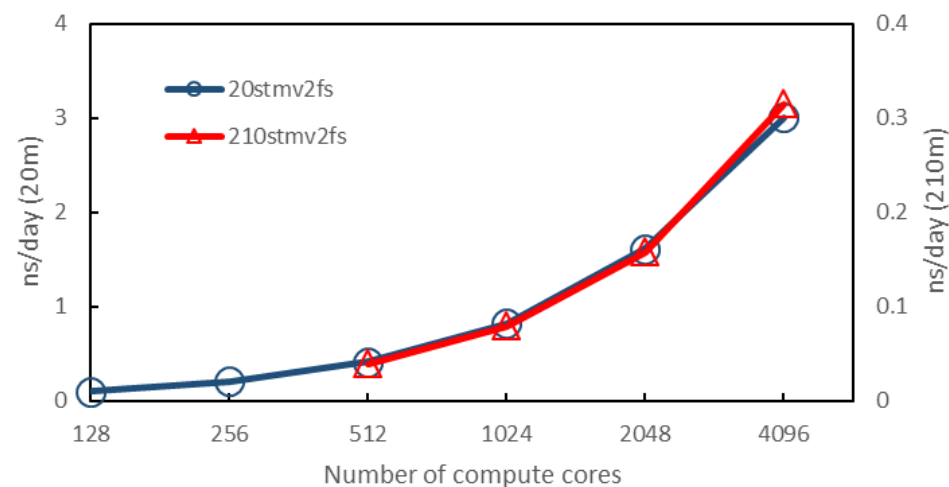
- Microsoft Azure Big Compute has **InfiniBand-interconnectec** HPC nodes (H-series) for Linux and Windows
- 2-3 microsec MPI latency
- nVidia K80 GPU nodes with InfiniBand available (K-series)
- Azure Batch Shipyard allows Dockerized deployment of MPI applications – including NAMD
- No queueing

**Scaling to thousands of cores with NAMD benchmark (preliminary results shown)**

93k and 1m atoms

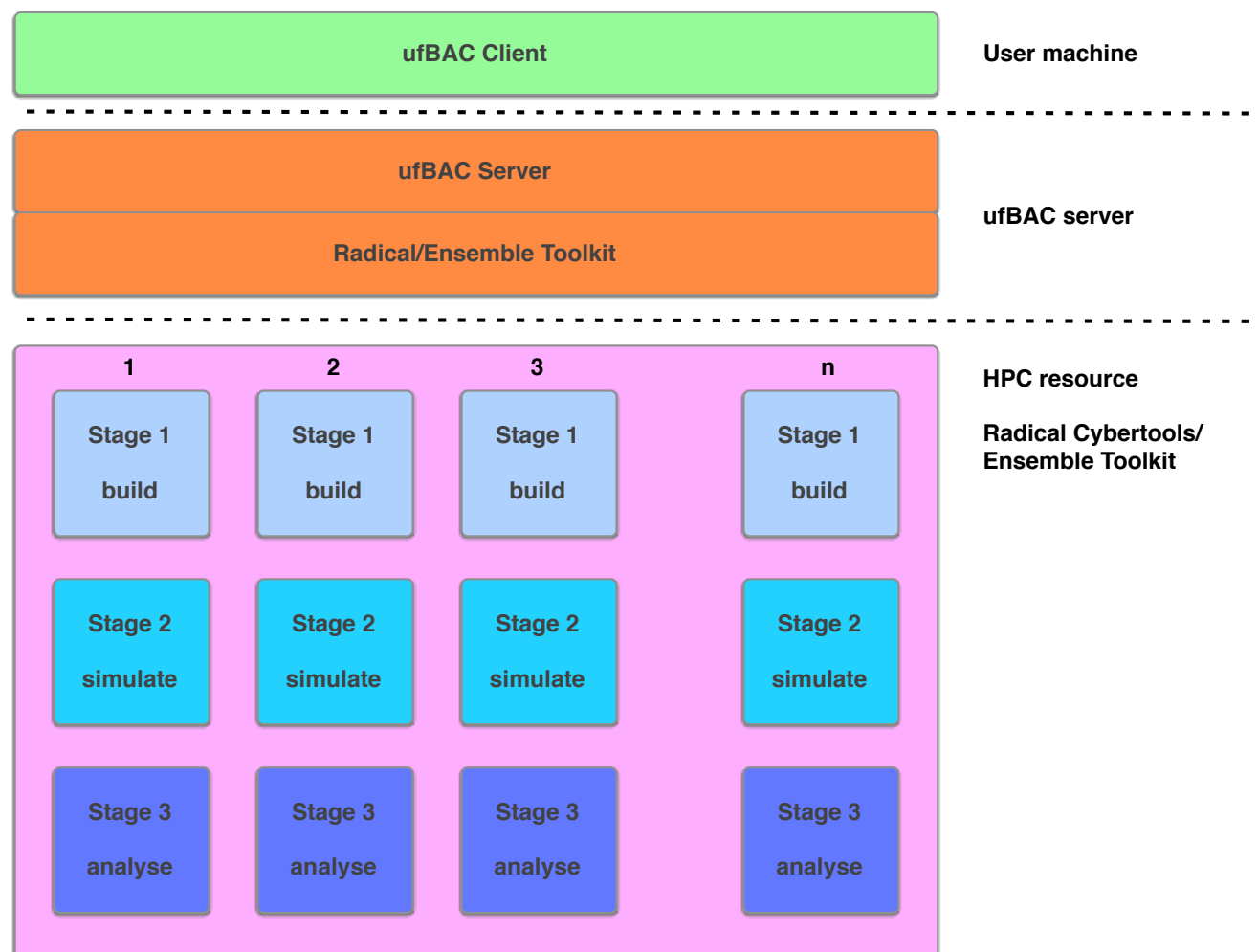


20m and 210m atoms



- Cloud is 'elastic' – should always have enough resource to run your workflow.
- Public HPC runs on first come first served queue
- Clouds have security architectures beyond those provided by conventional HPC providers.
- Cloud gives access to resources at scale to 'try things out' but, at large scale, production cloud is expensive
- Learning curve is steep – need to install most things

# HPC Deployment: Radical/Ensemble Toolkit



# RADICAL-Cybertools



Four Layers:

L4: Application

L3: Workload Management (**WLMS**)

L2: Task Run-time (**TRS**)

L1: Resource Access Layer

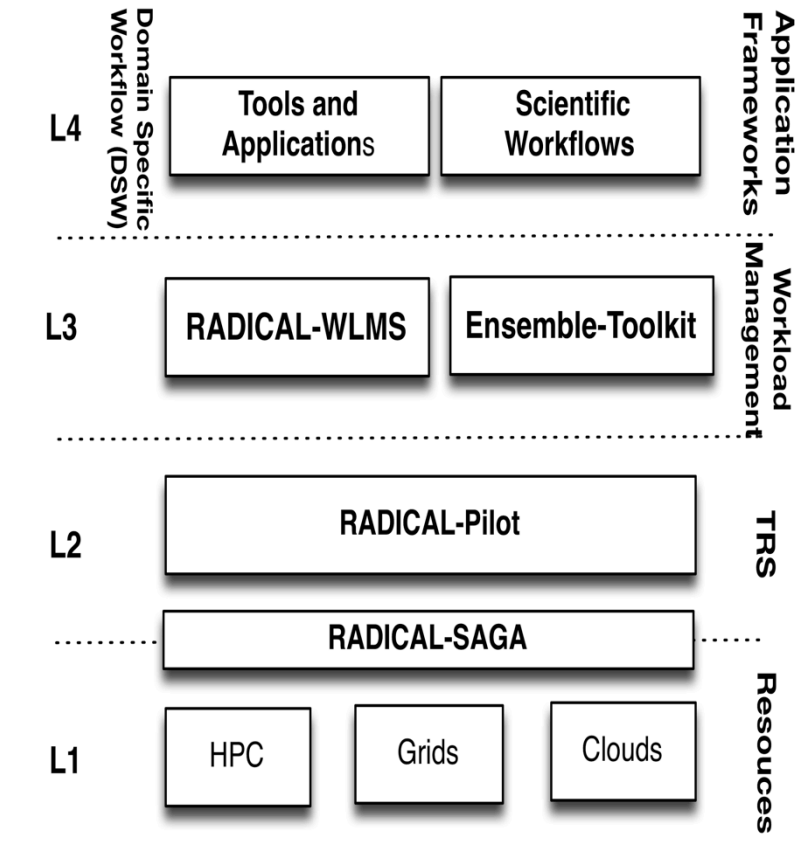
Abstractions & Building Blocks:

L1: **RADICAL-SAGA** Distributed job submission & standard interface

L2: **RADICAL-Pilot (RP)** Abstraction for Resource Management

L3: **RADICAL-WLMS, Ensemble Toolkit**

Cross-layer: **RADICAL-Analytics**





# “Building Blocks” Approach to Workflow Systems

Workflows aren't what they used to be!

Pervasive, sophisticated but no longer confined to “big science”

Diverse requirements, “design points”; unlikely “one size fits all”

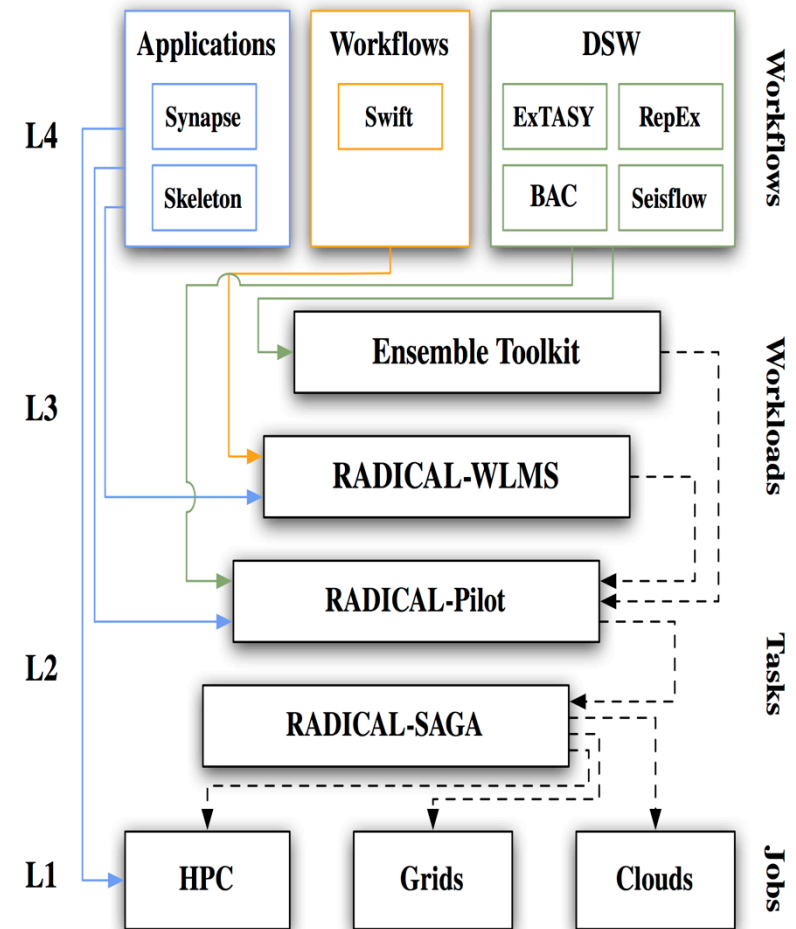
Extend traditional focus from **end-users** to **workflow system/tool developers!**

Building Blocks (BB) permit workflow tools and applications

Two illustrative examples of building blocks:

WLMS (**AIMES Model**)

Pilot Job Systems (**P\* Model**)



RUTGERS

# RADICAL-Cybertools: Ensemble Toolkit (EnTK)

Ensemble-Member = task = **Execution Unit**

Multi-node, sub-node, MPI/non-MPI...

Simulation, Analysis, ..

## AIMES Execution Model

Support for heterogeneous tasks

Adaptive Workload: Tasks and/or relations  
between tasks changes, or unknown *a priori*

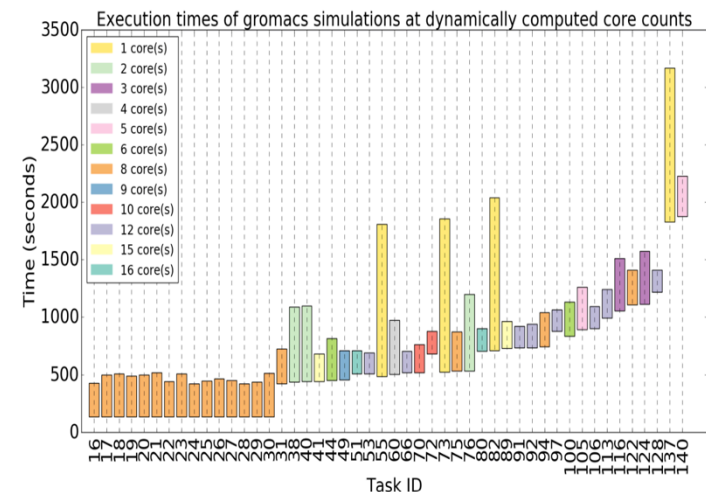
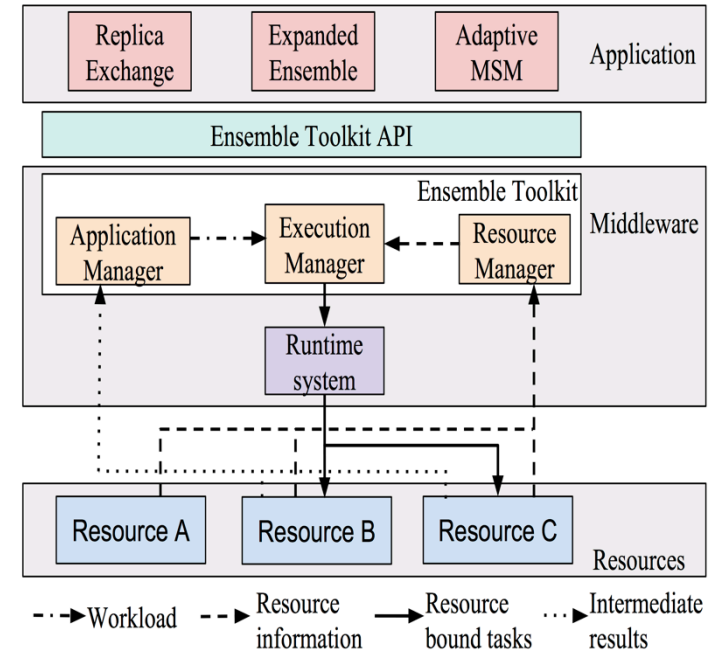
Multiple dimensions of scalability:

Concurrency:  $O(10K)$  tasks

Task size:  $O(1)$ - $O(1,000)$  cores

Launch:  $O(100+)$  tasks per second

Task duration:  $O(1)$ - $O(10,000)$  seconds

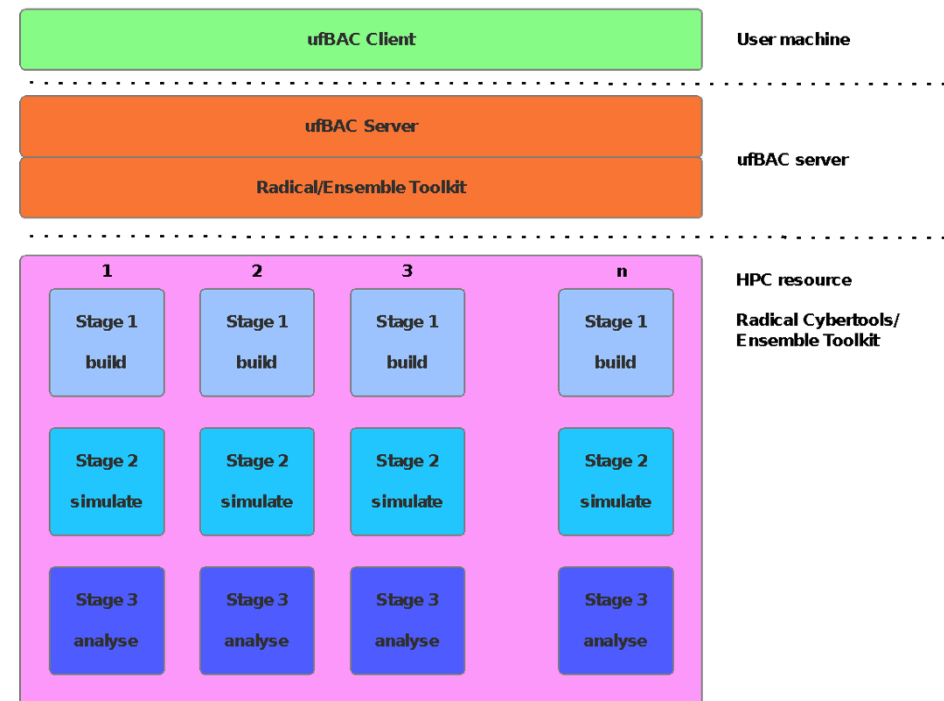


# HT-BAC: BAC + RADICAL-Cybertools

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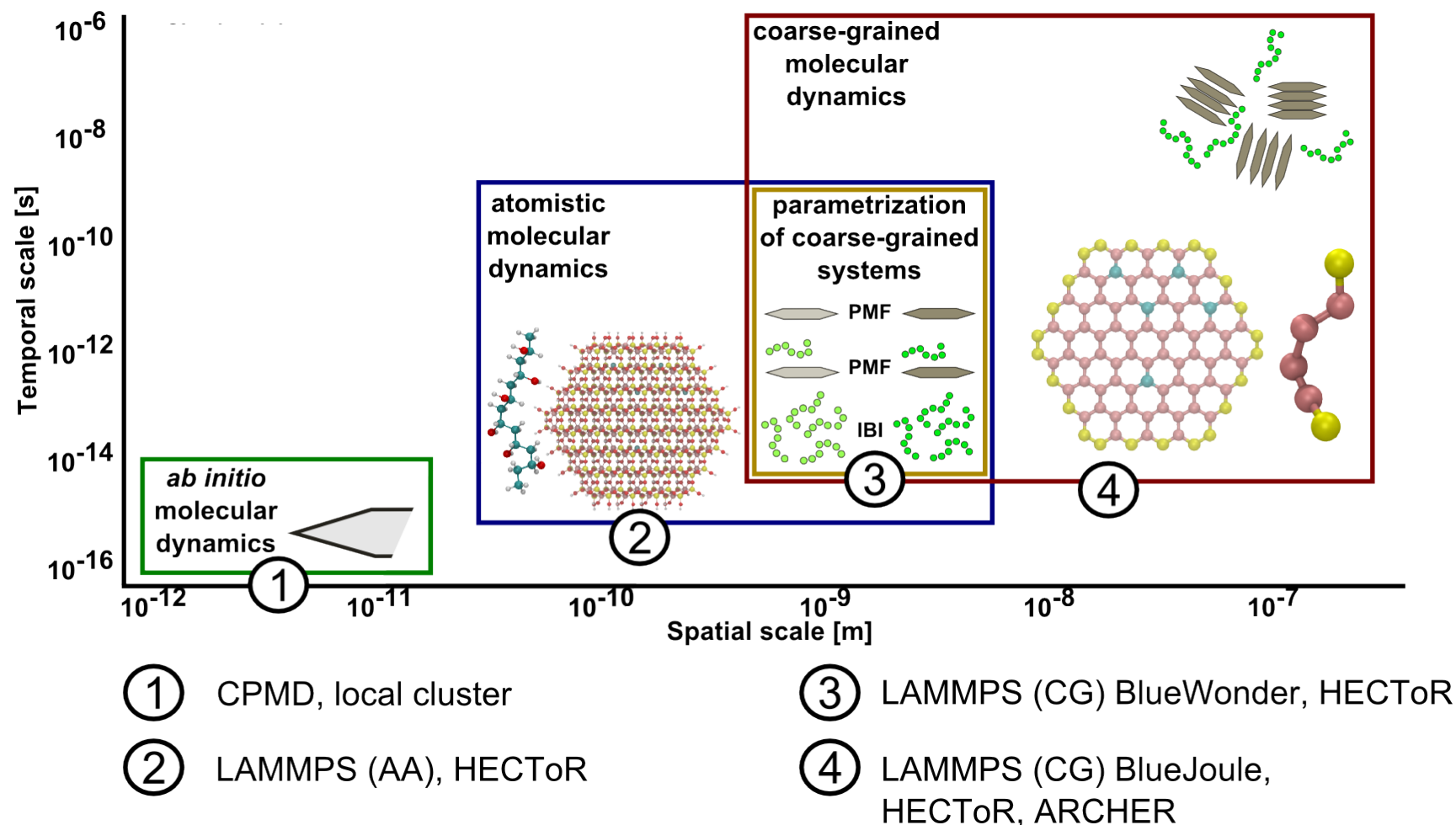
Design Challenge: How to (i) provide performance (ii) adequate functional extensibility, (iii) keep new software footprint.

Implementation: Use (i) functionally well-defined building blocks, (ii) provide well-defined interfaces and (iii) separate (performance and interoperability) from functionality.



# App 2: Multiscale simulation of nanomaterials

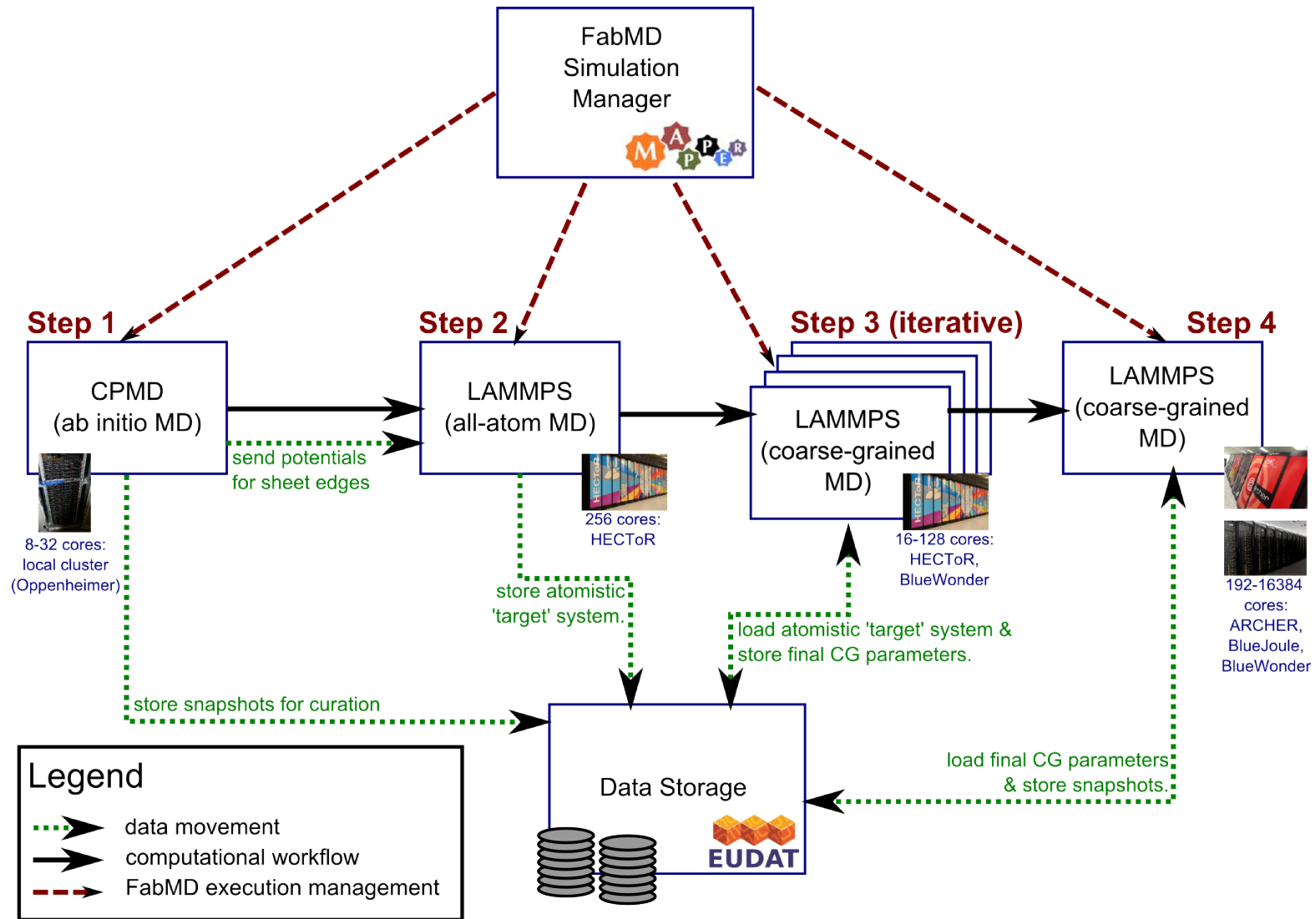
## From micro to meso ....



Size of data generated: ~10TB . All data is stored on the RDF and on EUDAT ([www.eudat.eu](http://www.eudat.eu)).

# App 2: Multiscale simulation of nanomaterials

## From micro to meso ....

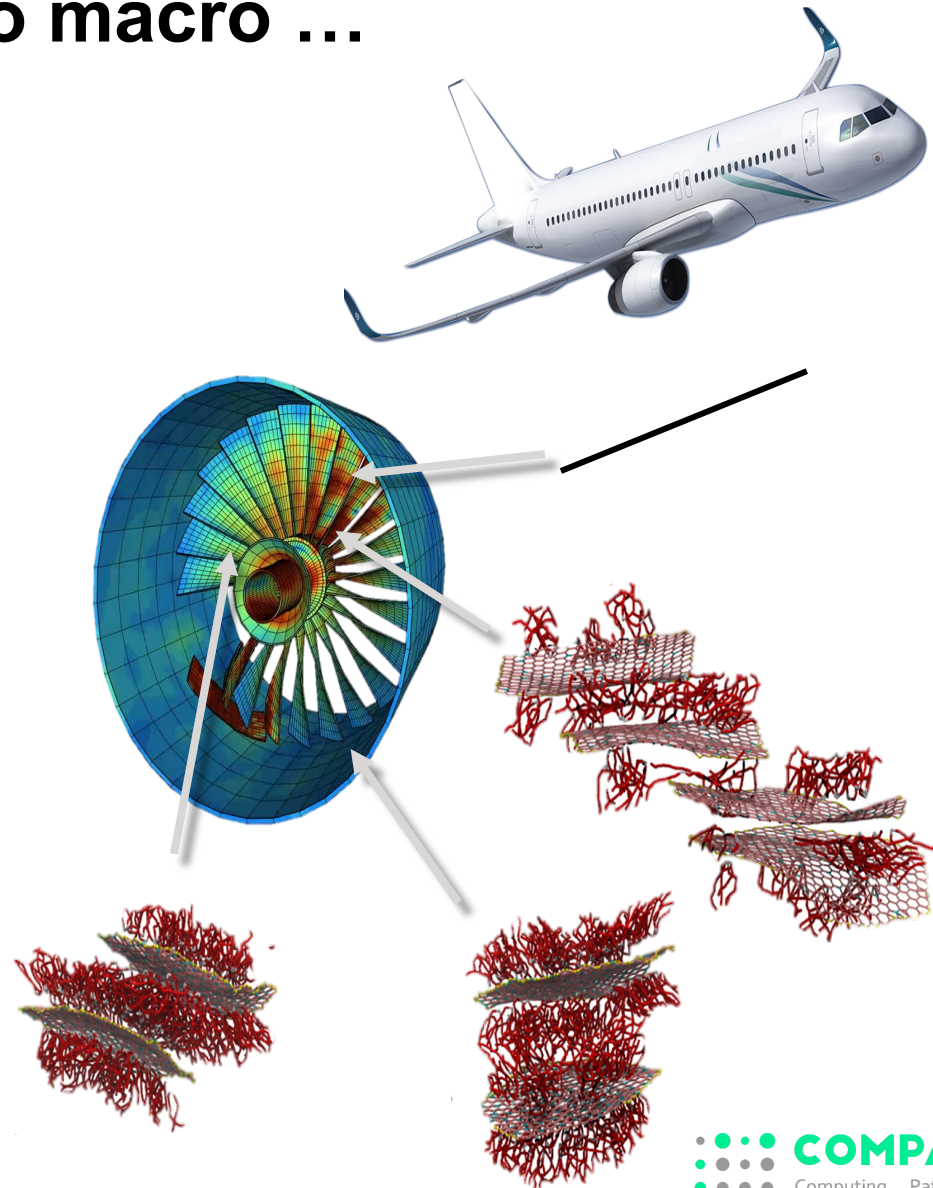


# App 2: Multiscale simulation of nanomaterials

## From meso to macro ...

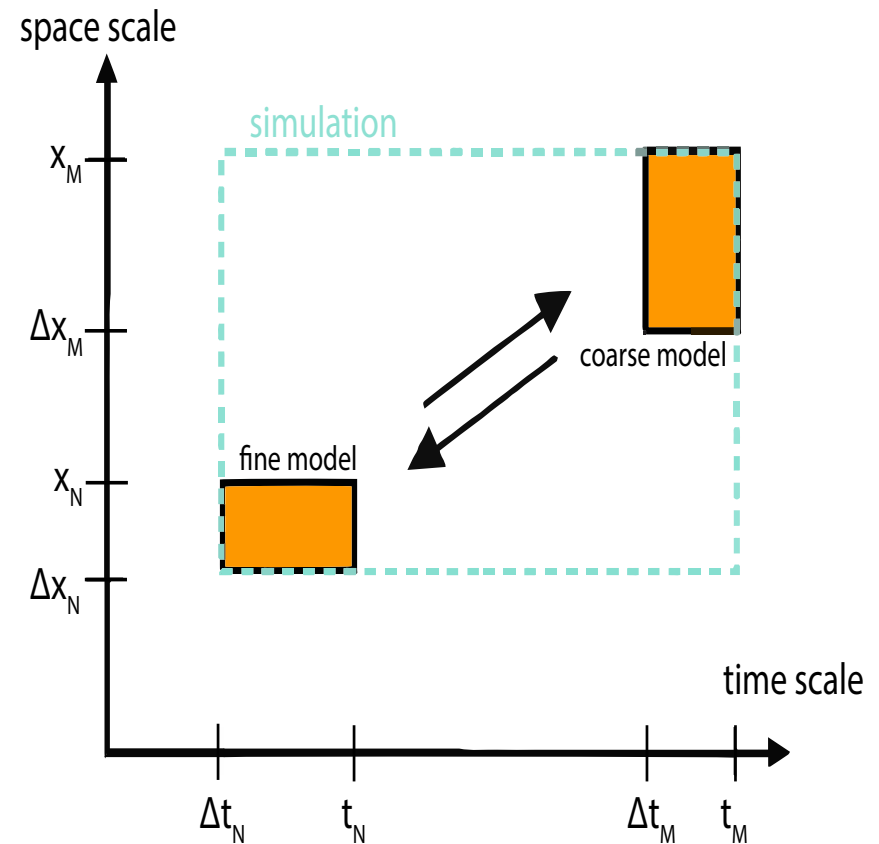
- Material properties at the macroscopic scale **depend tightly** on the structure of the material and its evolution at **finer scales**
- Using **reduced models** to account for this dependency such as constitutive equations has **limited accuracy** and **stability** (e.g. when nonlinear, inelastic, anisotropic, or history-dependent behaviors)

↪ **Multi-scale simulations** replace reduced models with structural models of the material at finer scale



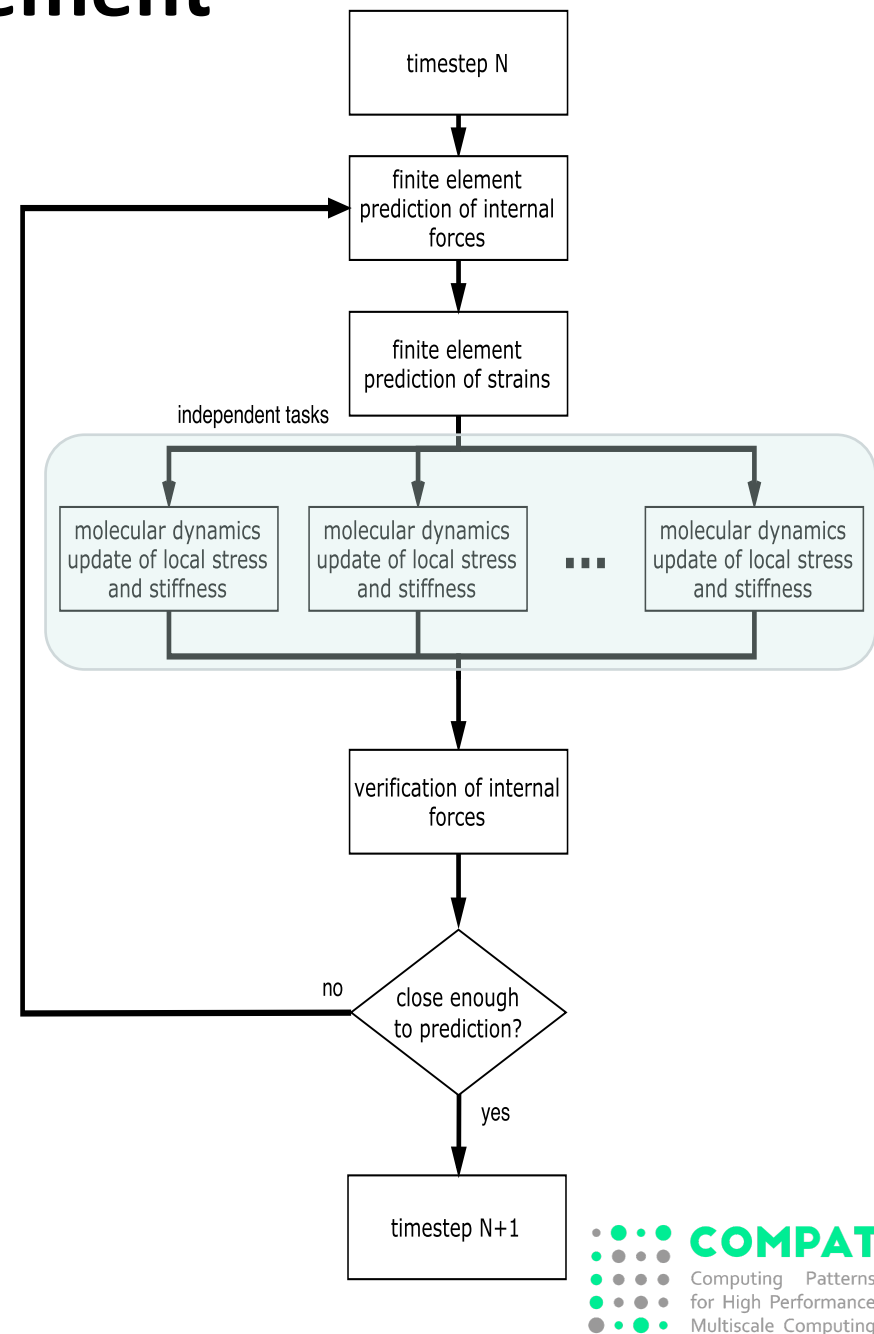
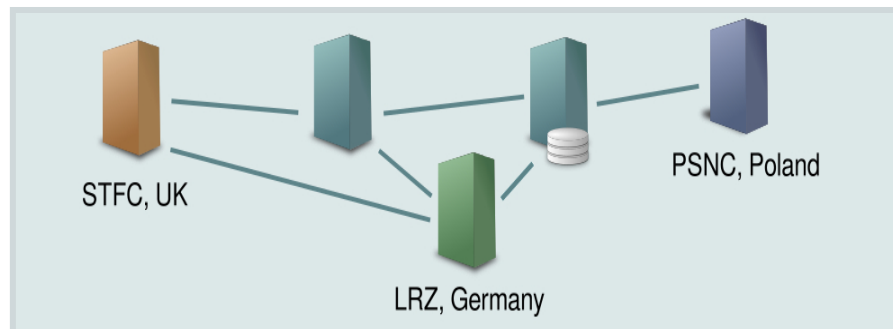
# Heterogeneous Multiscale Methods (HMM)

- Two or more structural models loosely coupled as part of a single simulation
  - partial information exchange in **chosen space-time locations**
  - information exchange **both ways** (bottom-up and top-down)
  - **discontinuity** of time and space discretization
    - faster **relaxation** times at lower scales  $\rightarrow t_n \ll \Delta t_m$
    - **periodicity** in space  $\rightarrow x_n \ll \Delta x_m$
- Implementation of a FE-MD HMM
  - Macroscale model based on continuum mechanics using the **finite element** library **Deal.II**
  - Nanoscale model based on **molecular dynamics** using **LAMMPS**
  - Exchange of **strains** (top-down) and **stresses** and **stiffness** (bottom-up)



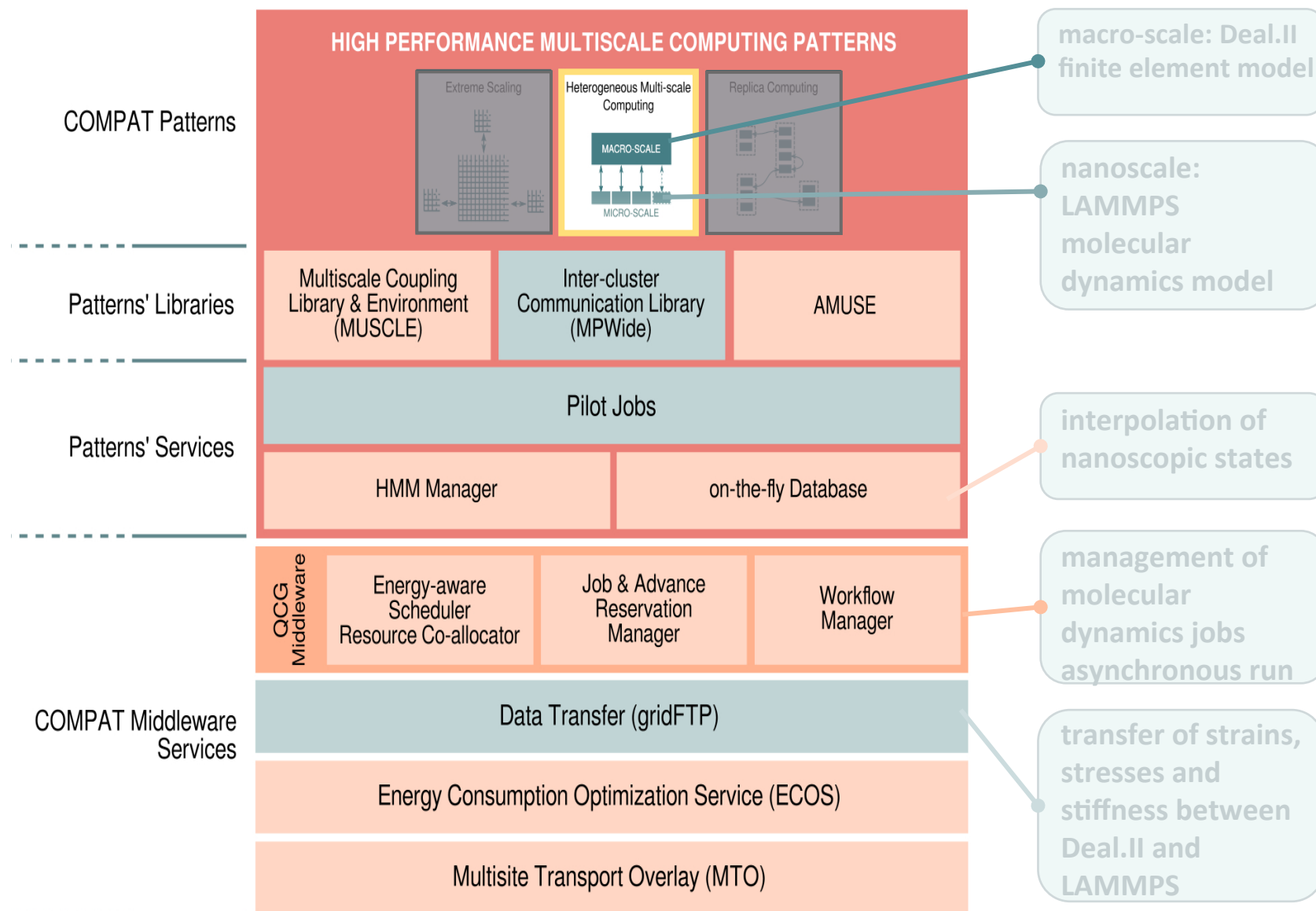
# Workflow of the Finite Element - Molecular Dynamics HMM Coupling Scheme

- Solving continuum mechanics **quasi-static equilibrium** using an **incremental iterative algorithm**
- Finite element computations are short and parallelised
- At a given time, nanoscale state updates can be run **i n d e p e n d e n t l y**





# The FE-MD HMM in the ComPat project



-

# Acknowledgements



- Agastya P. Bhati
- Shunzhou Wan
- David W. Wright
- Stefan J. Zasada



- Ian Wall
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- Paul Bamborough



- Sarah Skerratt
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