

# Parallelization of particle based systems

A distributed, shared and hybrid perspective

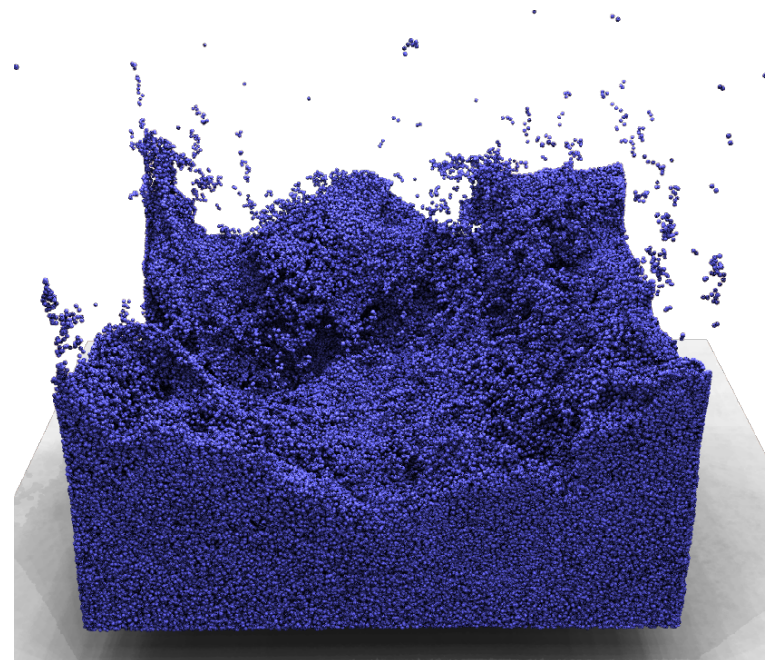
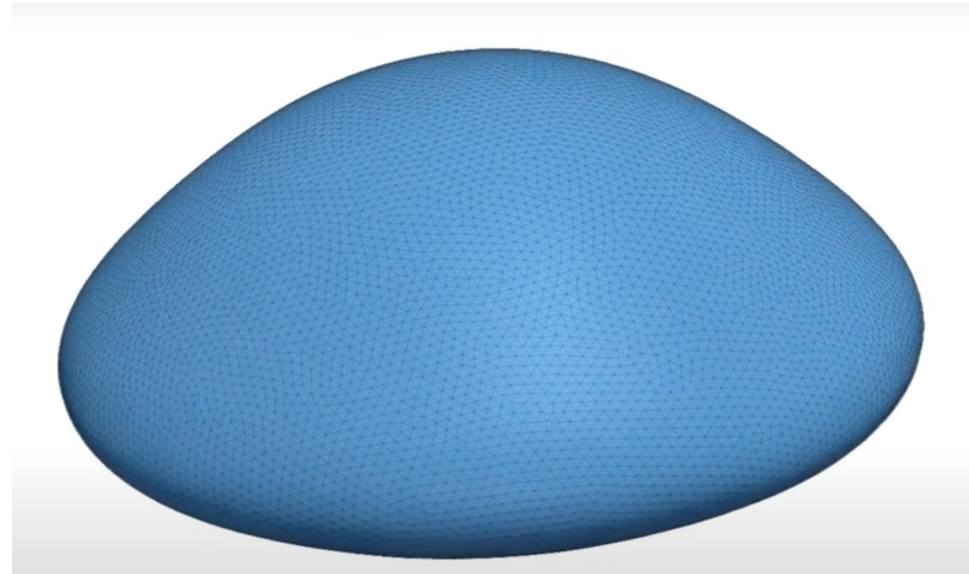
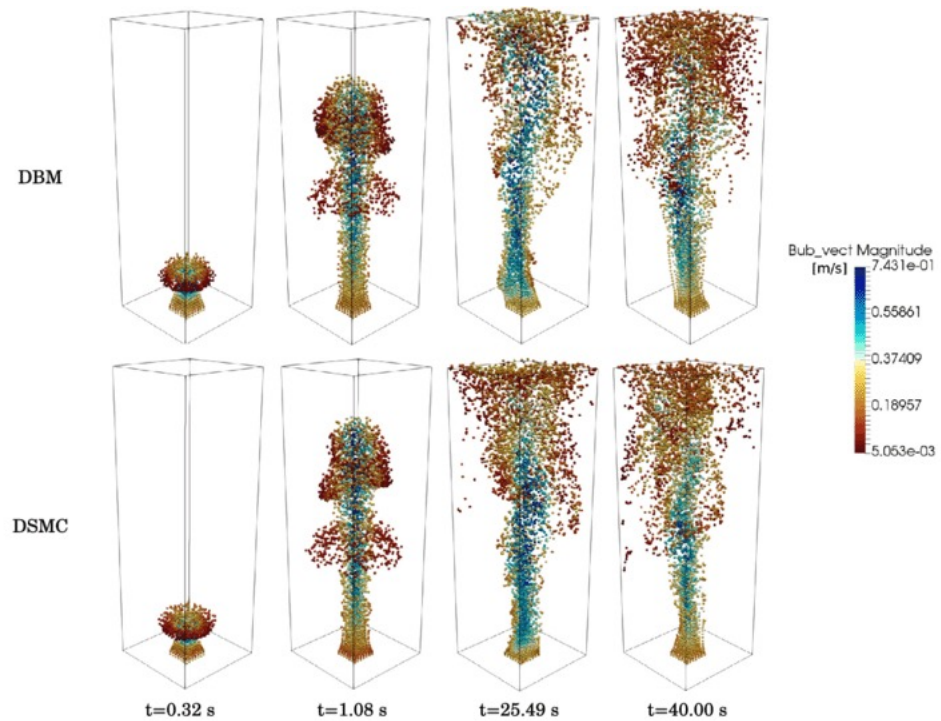
# Contents

- What are Lagrangian systems?
- Types/Classification of particle based systems
- Algorithm
- Single core optimization
  - Data structures
  - Cache hits
  - Vectorization
- Heading towards multi-core
  - Decomposition
  - Local is better
  - Do I see the whole picture?
  - Serialization considerations
  - Synchronization
- Programming tips
  - Approach
  - Unit tests
  - Why is my program failing?
  - Parallel Debuggers are useful BUT

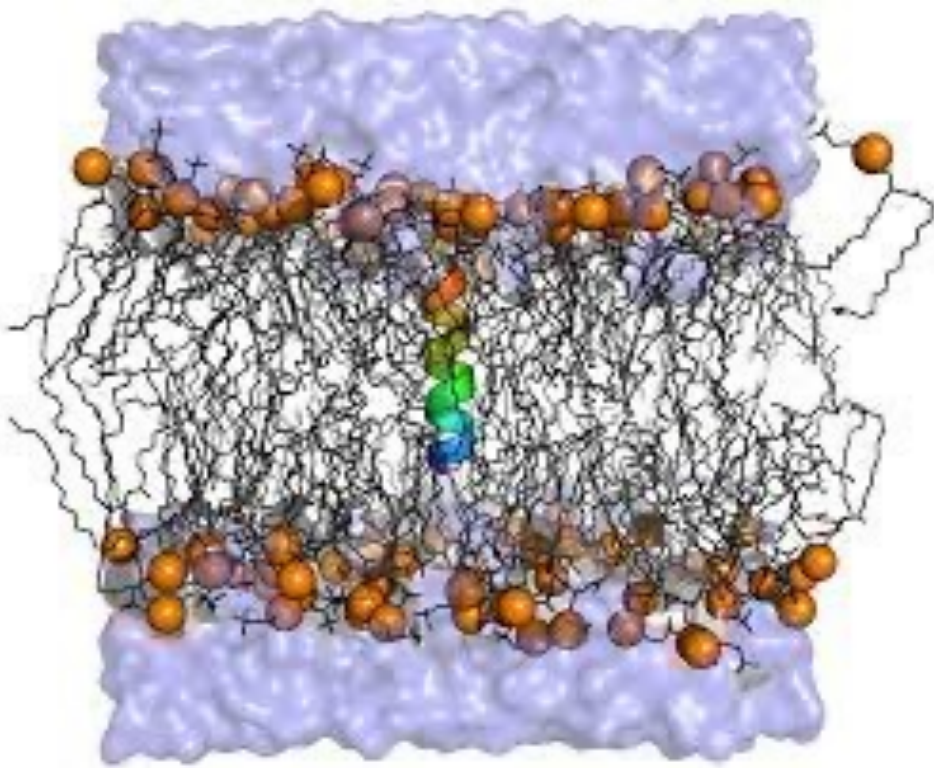
# What are Lagrangian systems?

- Systems with moving entities in a static frame
- Interaction laws/rules
- External force fields
- May have an inlet or outlet or a system complete in itself
- These entities can be
  - Particles
  - Meshed elements
  - Coarse grained elements

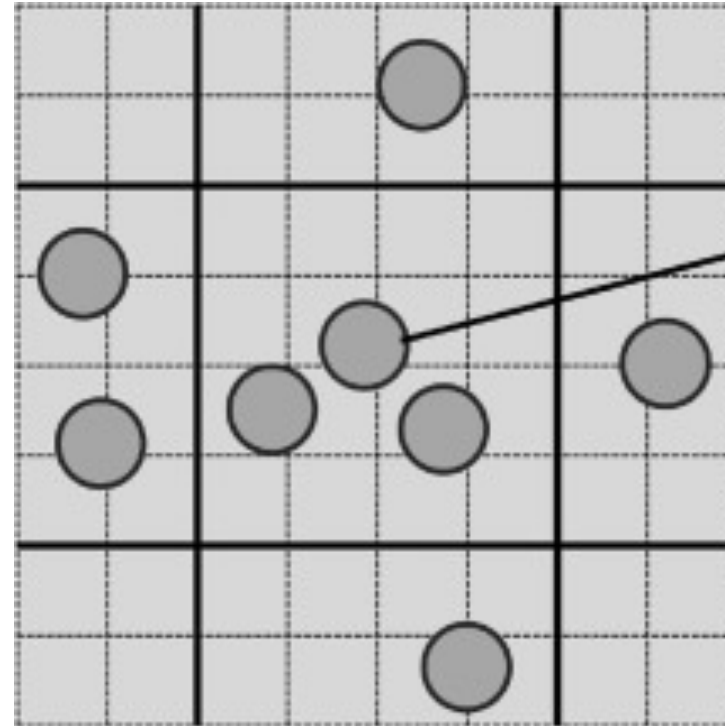
# Typical examples



# Classification relevant for parallelization



Purely Lagrangian



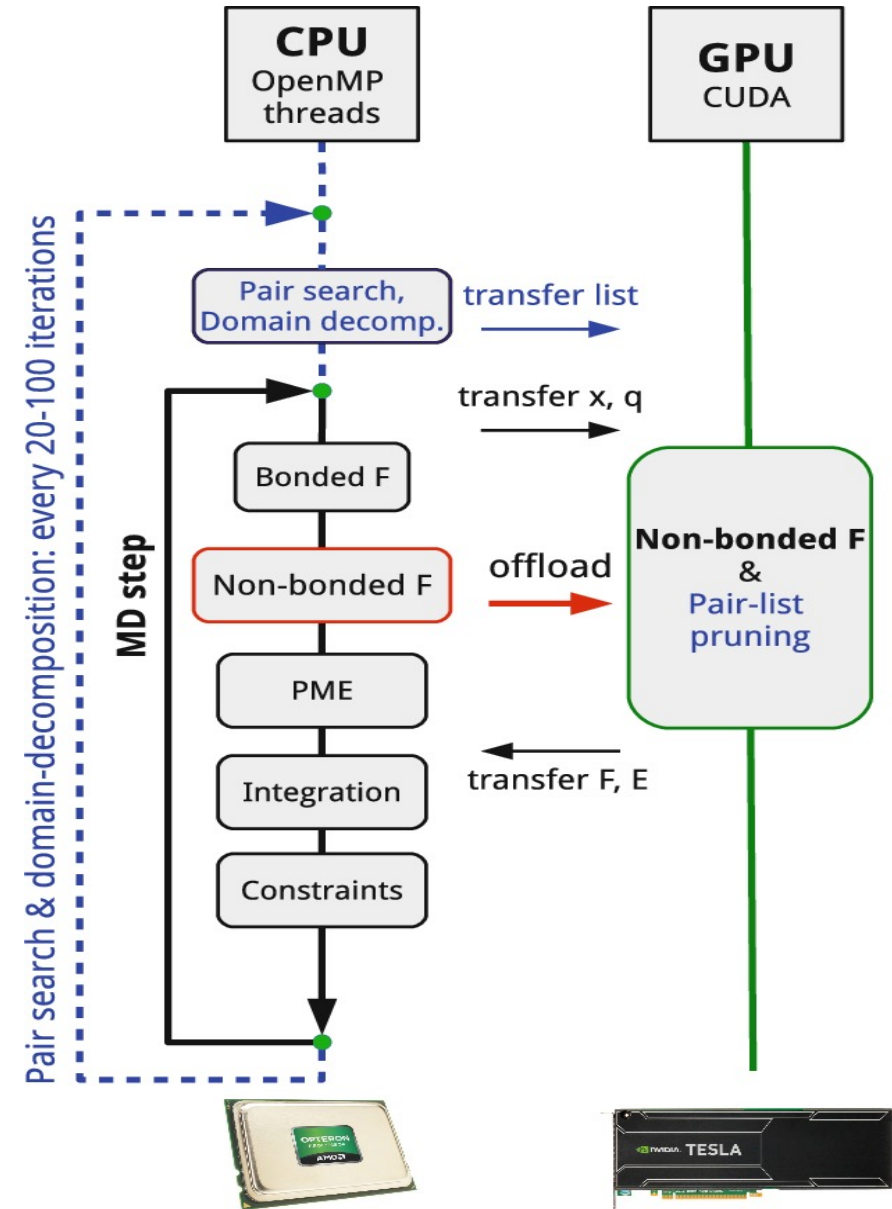
Particle

--- Fluid grid  
— Particle grid

Lagrangian and Eulerian

# Algorithm

- Initiation (accompanied with domain decomposition, will be explained later )
- Applying boundaries/injection if needed
- Creation of a cell list, neighborlist
- Force calculation
- Collision detection (if done separately)
- Translation, rotation OR integration
- Back to the top



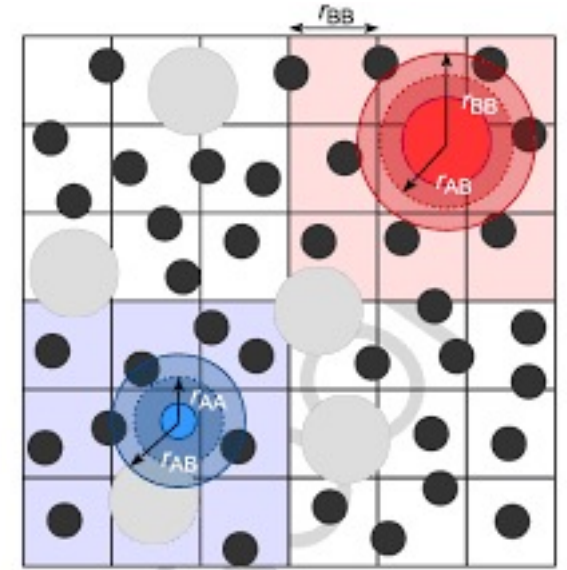
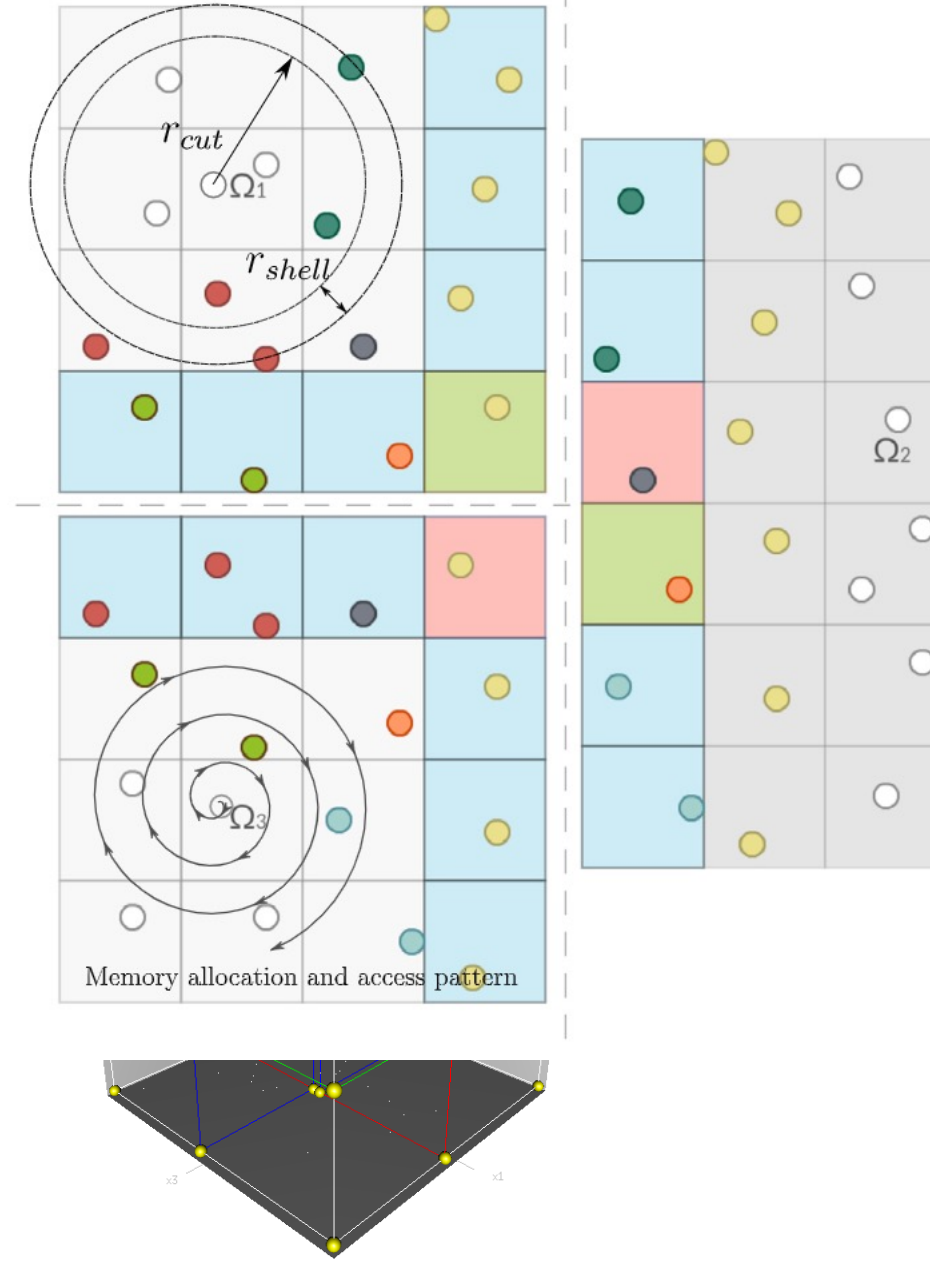
# Single core optimization

- A big chunk of efficiency depends on efficiency of the single core version.
- Particle based techniques are NOT memory bound but are compute bound.
- If your PB simulation is proving to be memory bound then you are missing a lot (cache)!
- How?
  - Use of efficient Data structures
  - Cache optimization
  - Vectorization (or even off load some parts to GPUs)



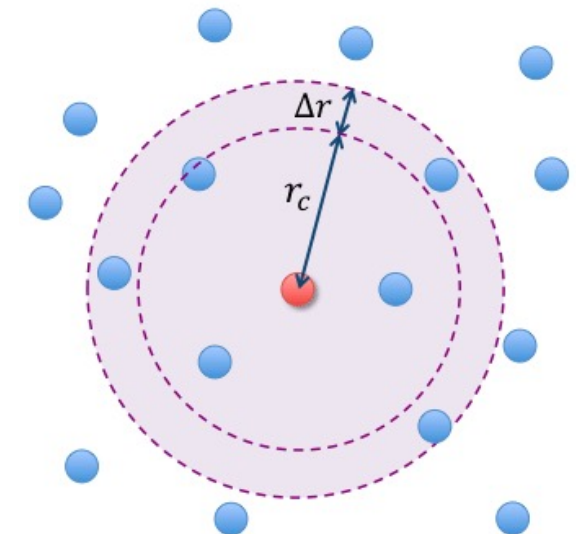
# Data structure

- Cell list
  - Kd-tree
  - Stencil volume
- Neighbour list
  - Verlet list
- “Bonded” en



Cell list needed to determine the neighbors of solvent (A) at

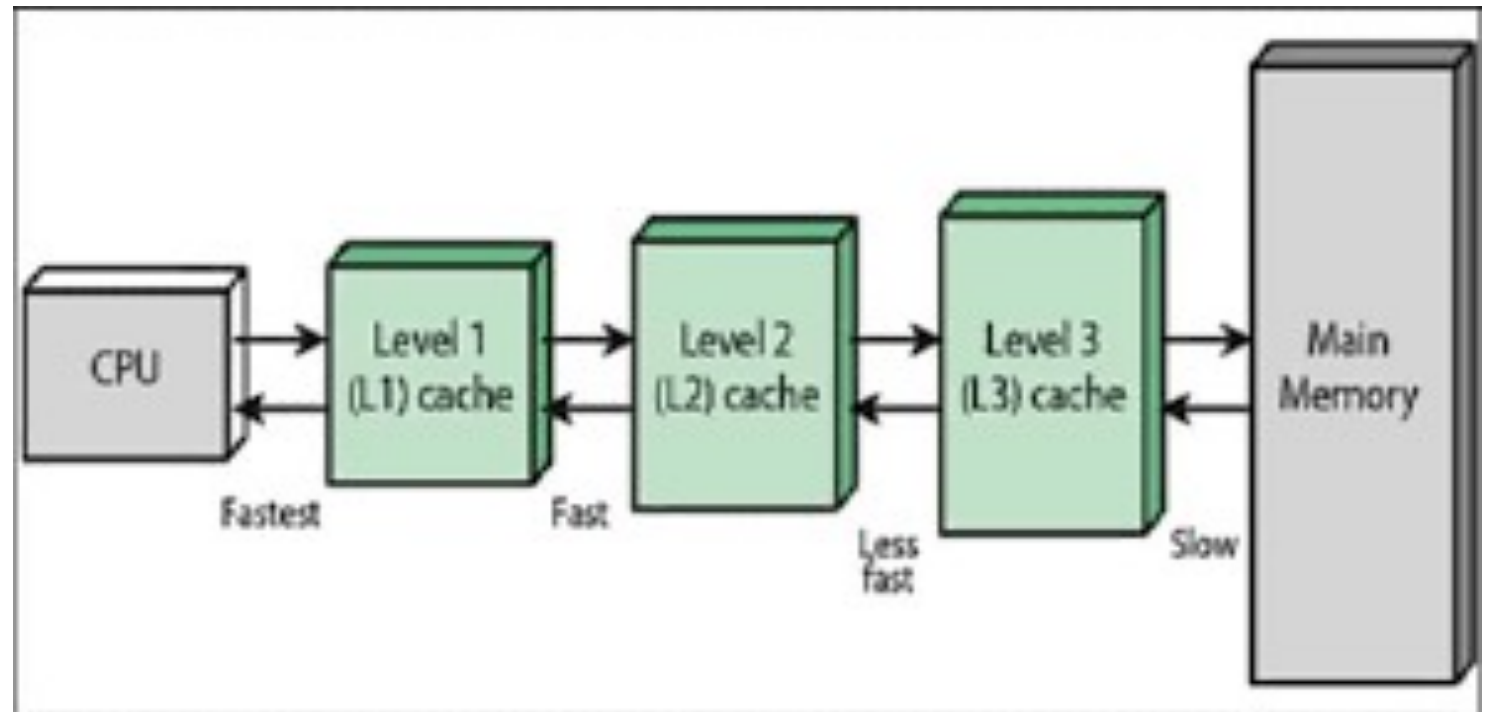
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# Cache Optimization

- Cache hierarchy
- Check access pattern of most compute intensive part of the program.
- In this case, they are nb-list query, force calculation, integration.



# Vectorization

- Operations such as distance calculation, dot products etc. can be vectorized using SIMD.
- Results in maximum usage of the CPU registers and prevents unwanted repetitive calculations.
- Code can look a bit ugly.
- Off loading certain operations to accelerators/GPU is also an option.

Scalar Operation

$$\begin{array}{l} A_1 \times B_1 = C_1 \\ A_2 \times B_2 = C_2 \\ A_3 \times B_3 = C_3 \\ A_4 \times B_4 = C_4 \end{array}$$

SIMD Operation

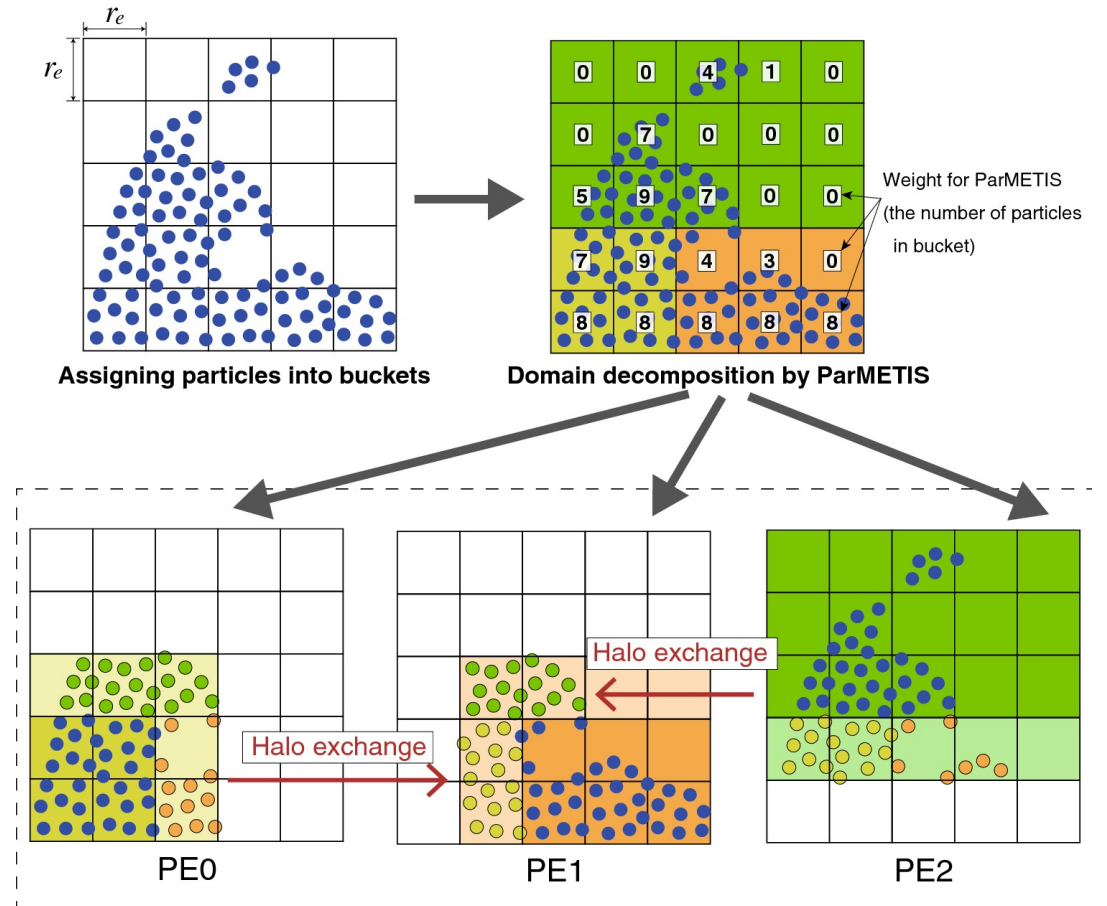
$$\begin{array}{|c|} \hline A_1 \\ \hline A_2 \\ \hline A_3 \\ \hline A_4 \\ \hline \end{array} \times \begin{array}{|c|} \hline B_1 \\ \hline B_2 \\ \hline B_3 \\ \hline B_4 \\ \hline \end{array} = \begin{array}{|c|} \hline C_1 \\ \hline C_2 \\ \hline C_3 \\ \hline C_4 \\ \hline \end{array}$$

# Heading towards multi-core

- Can be shared memory (OpenMP) or distributed memory (MPI) or both!
- Code conversion wise OpenMP is typically easier to try out.
  - Code still looks (almost) the same.
  - All information is still accessible (shared memory).
  - Easier to debug.
  - Lesser cache is available per thread.
  - Parallelism is typically ID based.
- MPI needs to start with a thought process 😊
  - Code may not look the same after.
  - All information is not available any more.
  - Errors look scary and is harder to debug as well.
  - A whole physical core is executing a process.
  - Parallelism is typically based on sub-domains.

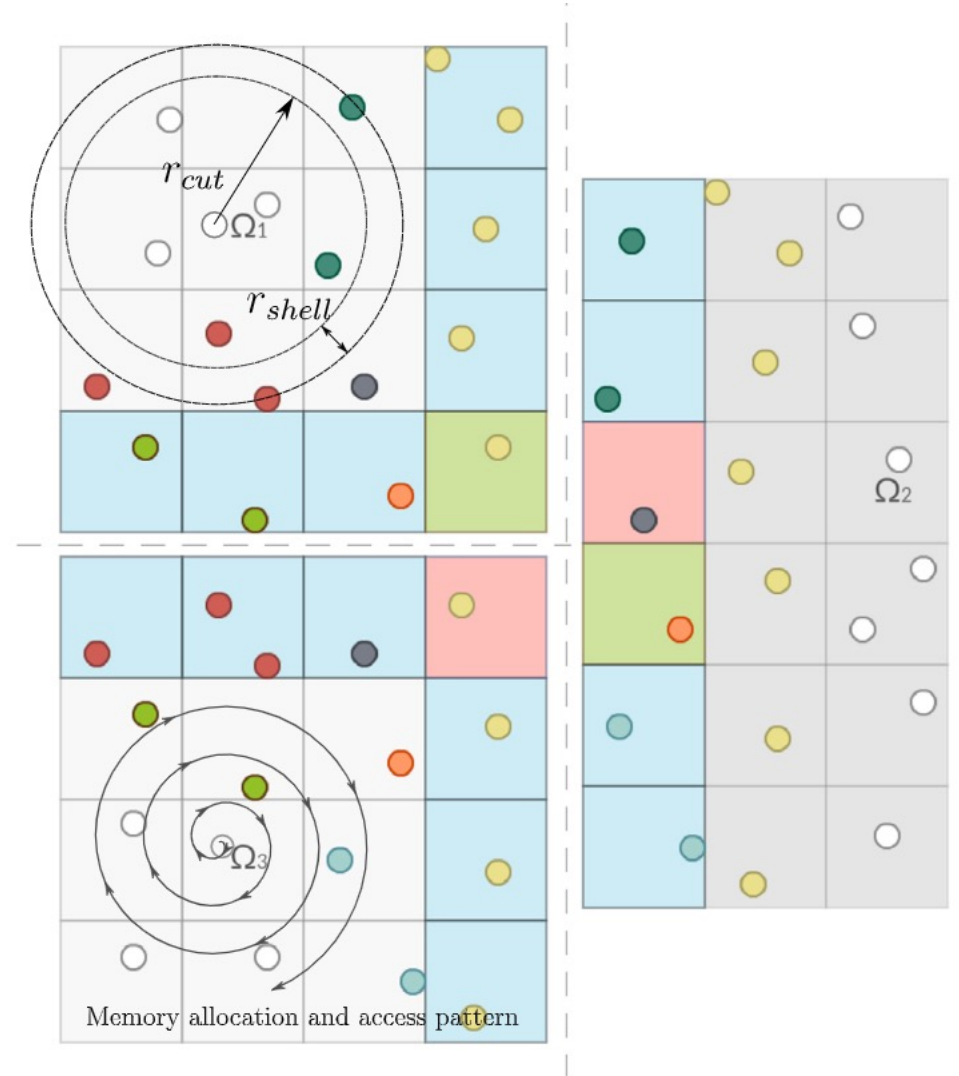
# Domain Decomposition

- Can be static or dynamic.
- Depends on type of simulation.
  - A static grid based (Eulerian) system will perform better on a static grid.
  - Dynamic decomposition required for LOAD BALANCING.
  - A simulation with both static grid and dynamic entities need best of both worlds but this needs to be tested.
- Do not forget the inlet and the outlet of the system.
  - Managing inlet of new entities can be complex once the domain is decomposed.
- Choose the right MPI topology for an appropriate decomp.



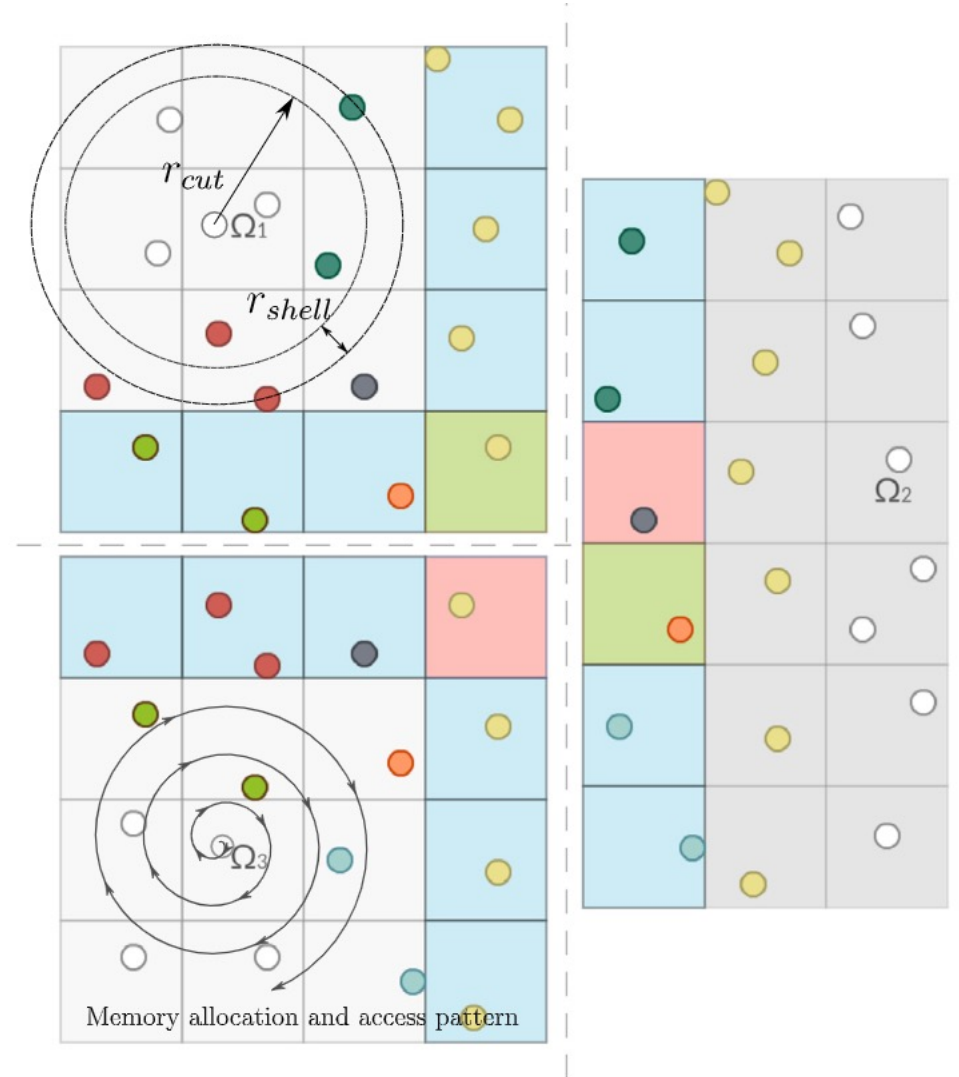
# Local is better

- Coming back to the algorithm:
  - Can my algorithm run locally on each sub-domain?
  - Which parts need communication?
  - What kind of communication is required and where?
    - Just with the nbrs.
    - All to one or one to all
  - What does it mean for the overall performance?
- DBM and DSMC example
  - One algorithm relies on time
  - The other relies on a random partner.



# Do I see the whole picture?

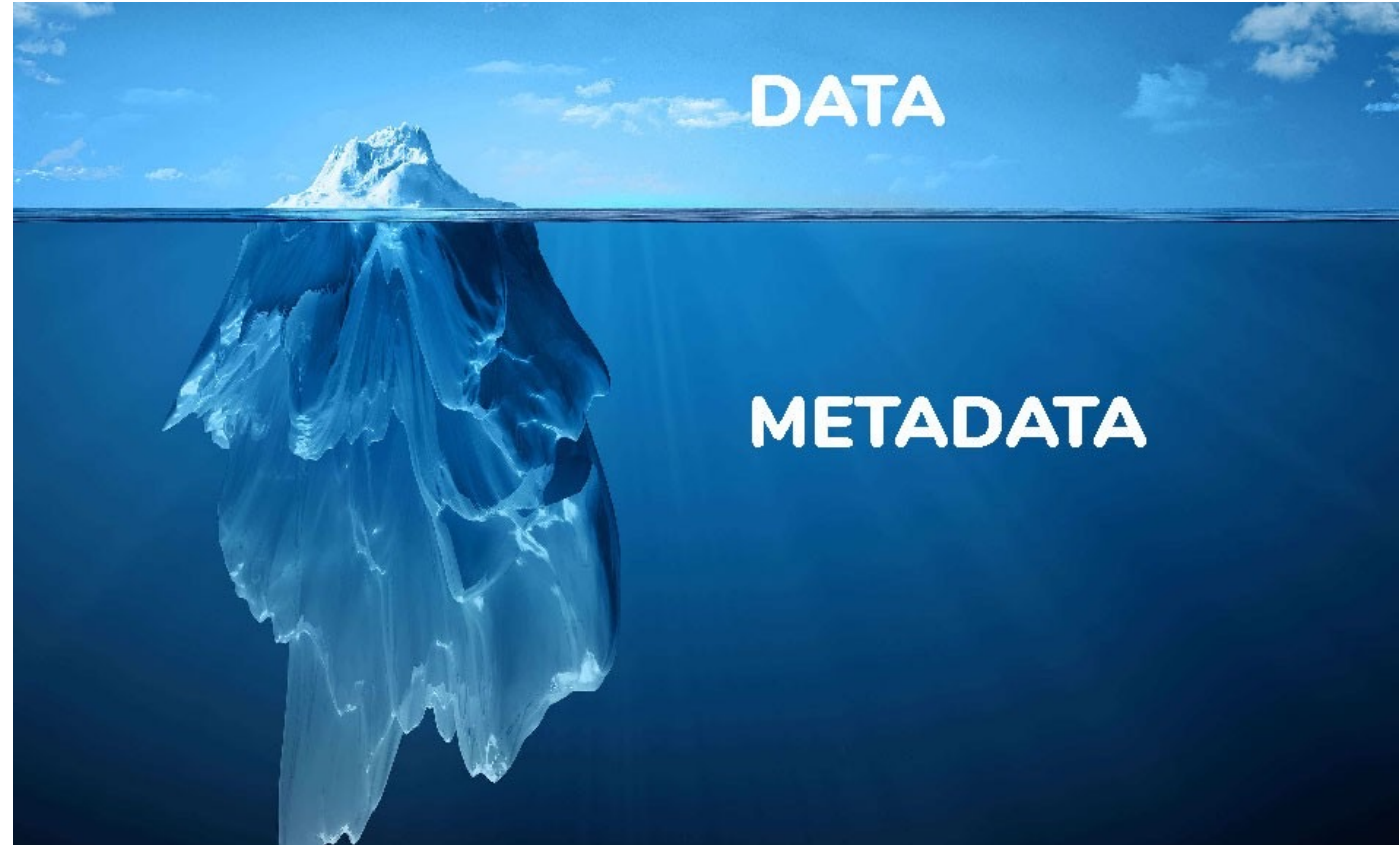
- The short and correct answer is NO. 😊
- Is my algorithm the same at edges as in the bulk?
  - Does this require extra communication?
- How many layers of Halo regions will I need?
  - The more you need, the larger data size you need to communicate.





# Serialization considerations


- Whenever I need to communicate, I need to serialize the data and deserialize it on the other side.
- Of course, this costs extra computation, therefore it is better to use easily mutable data structures and some metadata.
- Make it easier for yourself and the computer to de-serialize the data.
- The whole game is about access here, therefore think about cache and as far as possible do your operations in blocks.




# Synchronization

- No algorithm is perfectly parallel.
- Some steps in the algorithm will depend on other steps to finish in the nearby processes.
- Lesser in-sync the better.
- Initiation (accompanied with domain decomposition, will be explained later )
- Applying boundaries/injection if needed
- Creation of a cell list, neighborlist
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# Programming tips - Approach

- It is a no brainer to start with a small representative system.
- It is also good to make sure that the representative system rigourously tests your algorithm.
- MPI typically requires some re-structuring of your original code, therefore take it slow initially. (Use `#ifndef` and `#ifdef`)
- Start with I/O first!! 😊  Visualization is very important!
- Every process will have its own mind!! 😊
- Create helper functions that dump out data with which you can debug.

# Unit tests and documentation

- In a nutshell  REQUIRED!
- What are unit tests?
- Create unit tests for literally every function.
- Create a documentation pipeline during the starting stages of any project. (Doxygen is an example)
- Constantly check for memory leaks and warnings during the coding stage (Valgrind is your friend. 😊)

# Why is my program failing?

- Memory errors such as violations, race conditions.
- MPI Dead locks.
- Logical errors.
- Sudden performance reductions.
- I/O violations.

# Parallel debugging is an Art

- Debugging can be cumbersome, therefore unit tests are very important.
- Parallel debuggers (apart from gdb and valgrind) are a boon BUT they need not point always to the right place.
- This is where the helper functions that dump data REALLY help!
- Profile your code from time to time to understand the bottle necks, these can also help find bugs at unexpected places.



Happy coding and parallelizing!! 😊