

# Load Balancing Strategies for Parallel SPH

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# Outline

## 1 Smooth Particle Hydrodynamics

- The serial algorithm
- The parallel algorithm
- Load Balancing

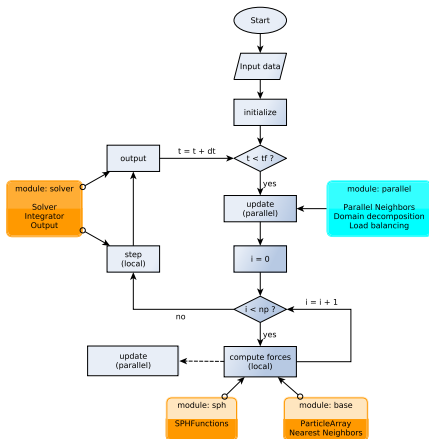
## 2 Load-balancing

- Load Balancing techniques
- Algorithms
- How do they do it?

## 3 Results

- Illustration
- Results
- Conclusion and Further work

## PySPH



pySPH

base

solver

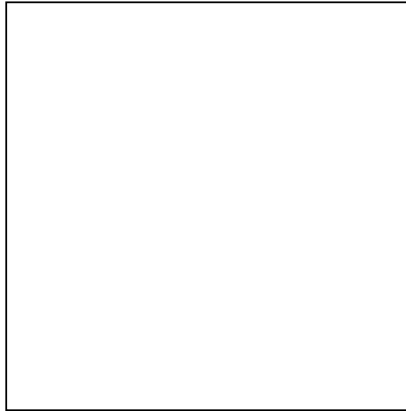
sph

parallel

# Serial algorithm in a nutshell

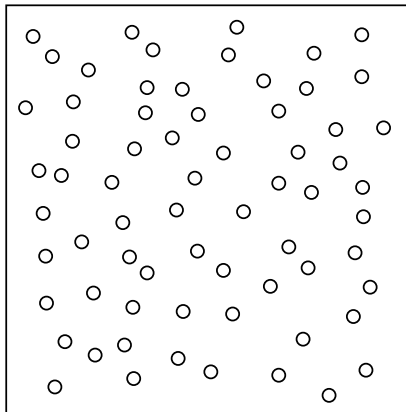
# Serial algorithm in a nutshell

Given a domain...



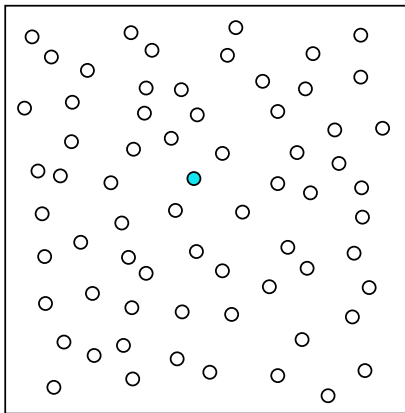
# Serial algorithm in a nutshell

Discretized with *Particles*



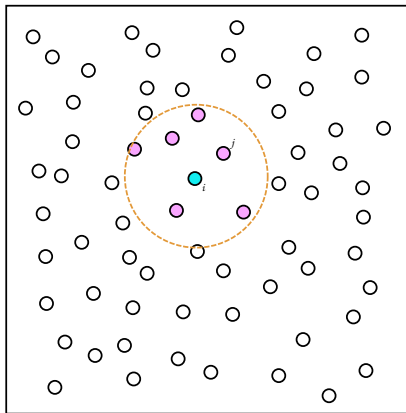
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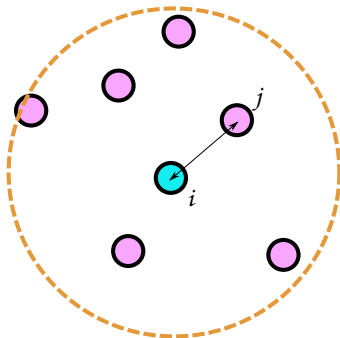
Find nearest neighbors...





# Serial algorithm in a nutshell

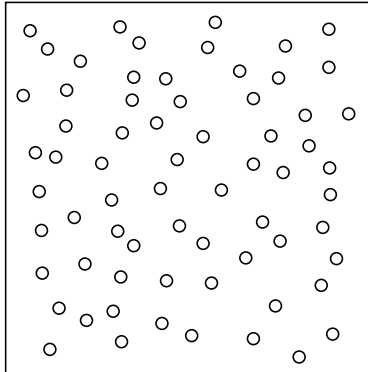
Compute interactions..



$$\frac{dU_i}{dt} = - \sum_{j \in \mathcal{N}(i)} m_j \mathcal{F}_{ij} \nabla_i W_{ij}$$

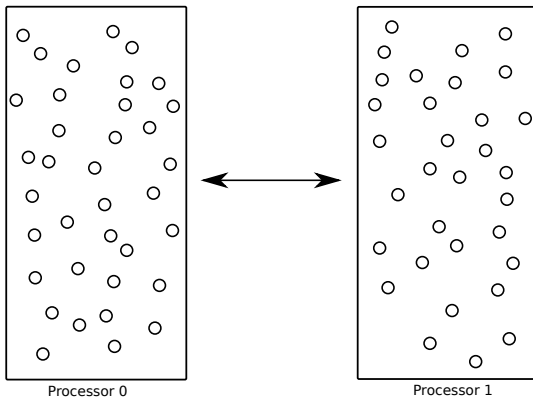
# Doing it in Parallel

Given the domain discretized with *Particles*..



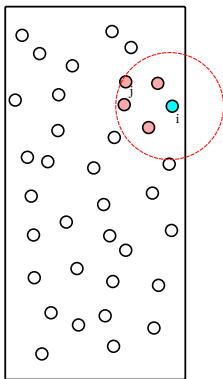
# Doing it in Parallel

Partition it across processors : *Load-balancing*

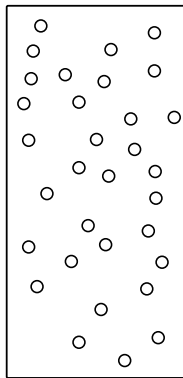


# Doing it in Parallel

For every particle, find neighbors.



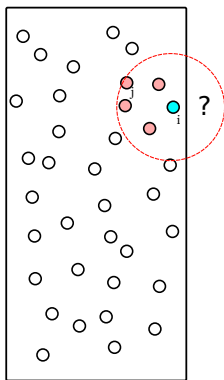
Processor 0



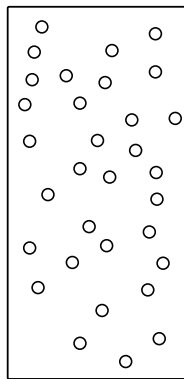
Processor 1

# Doing it in Parallel

For every particle, find neighbors. *Oops!*



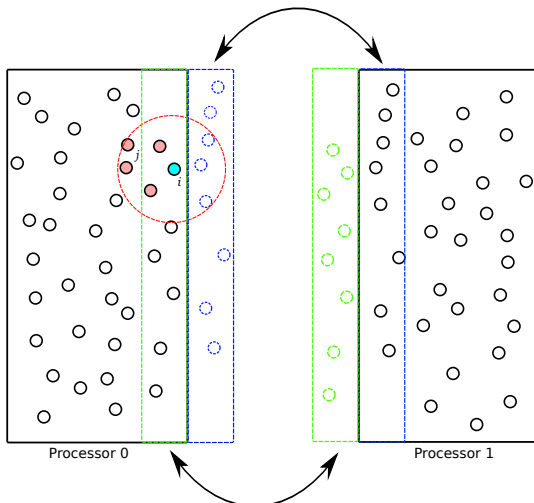
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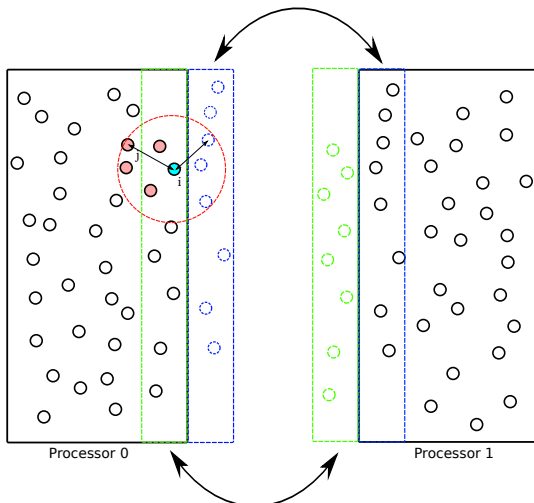
# Doing it in Parallel

Exchange ghost data.



# Doing it in Parallel

Exchange ghost data. And compute interactions..



# Requirements : Parallel SPH

## Features

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## Features

- *Local* particles assigned to processors
- 
- 

## Requirements

- Equal distribution of workload
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-

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- *Local* particles assigned to processors
- *Ghost (Remote)* particles shared as halo region
- 

## Requirements

- Equal distribution of workload
- Minimum communication overhead
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# Requirements : Parallel SPH

## Features

- *Local* particles assigned to processors
- *Ghost (Remote)* particles shared as halo region
- Due to the Lagrangian nature of SPH, particle distribution changes!

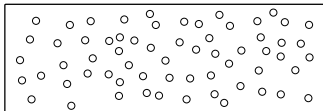
## Requirements

- Equal distribution of workload
- Minimum communication overhead
- **Dynamic Load Balancing**

# The right way

## Load Balancing

Mapping of *objects* to processors and distributing data accordingly.

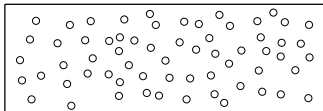


Given a domain

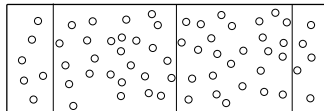
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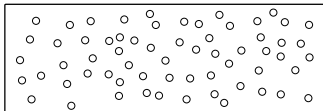
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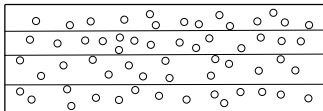
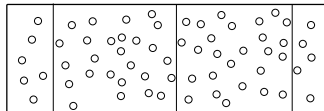
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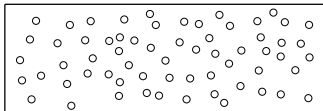
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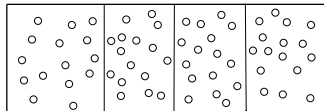
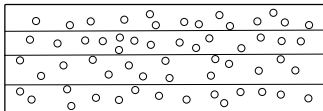
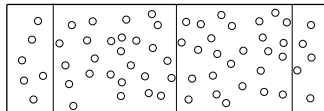
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# Algorithm classification

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## Geometric partitioners

- Physical coordinates as input
- Most general for numerical work
- Natural for particle methods

## Examples

- Recursive Coordinate Bisection (RCB)
- Recursive Inertial Bisection (RIB)
- Space Filling Curves (SFC)

# Algorithm classification

## Geometric partitioners

- Physical coordinates as input
- Most general for numerical work
- Natural for particle methods

## Graph partitioners

- Data represented as a graph
- Inherently suitable for mesh-based methods
- Cell based graph-partitioning may be used for SPH

## Examples

- Recursive Coordinate Bisection (RCB)
- Recursive Inertial Bisection (RIB)
- Space Filling Curves (SFC)

## Examples

- METIS/ParMETIS
- PTScotch
- Hypergraph partitioning

# Zoltan Data Management Library

## What is it?

- Developed by Sandia National Laboratories
- Trilinos Project (9.0 September 2008)
- Zoltan v3.6 released in September 2011

## What can it do?

- **Dynamic Load Balancing**
- Graph Coloring
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- Geometric (RCB, RIB, HSFC)
- Graph and Hypergraph
- ParMETIS, PTScotch

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## Motivation

- PySPH parallel module
- PyZoltan
- Load balancing for particle methods

# Recursive Coordinate Bisection (RCB)

## Algorithm and Advantages

- Recursively subdivide domain
- Cuts are orthogonal to co-ordinate axes
- Fast and inexpensive
- Global decomposition is trivial

## Disadvantages

- Not adaptive to rotations
- Leads to stretched halo-regions

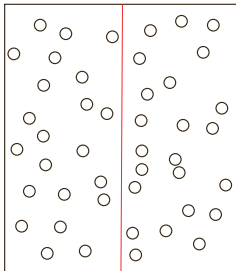
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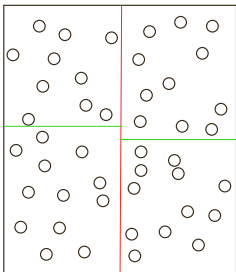
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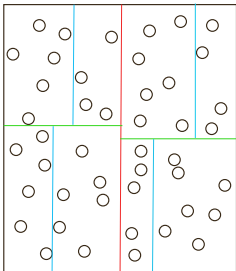
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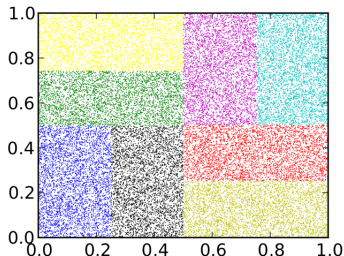
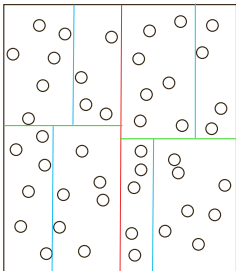
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# Recursive Inertial Bisection (RIB)

## Algorithm and Advantages

- Variant of RCB
- Finds inertial axes
- Cuts are orthogonal to principal inertial axes
- Adaptive to rotations
- Lesser communication overhead

## Disadvantages

- Eigenvector computations

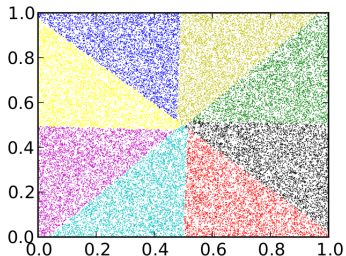
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# Hilbert Space Filling Curves (HSFC)

## Algorithm and Advantages

- Use a SFC  $f : R^3 \rightarrow R$
- Order objects linearly
- Geometric locality

## Disadvantages

- Particle distribution has *projections*
- Disconnected regions for complex geometries

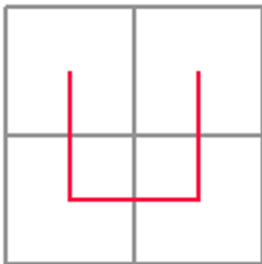
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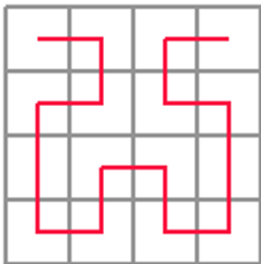
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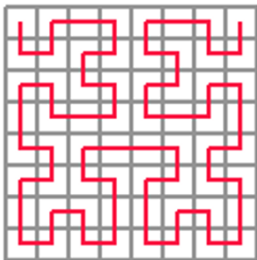
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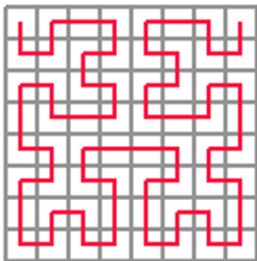
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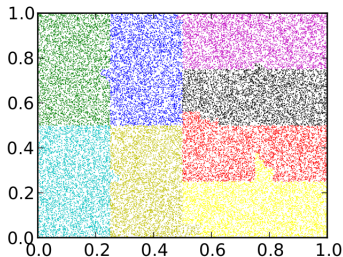
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# Graph partitioning

## Algorithm and Advantages

- Interpret particle/cell data as graph nodes and neighborhood as edges
- Cell based graph partitioning has fixed/known neighbors
- Generates closed and compact partitions

## Disadvantages

- Inherently mesh-based
- Can not be used on particle data directly
- Slower than geometric methods

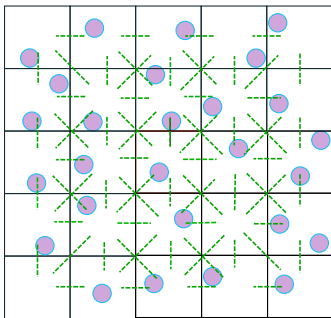
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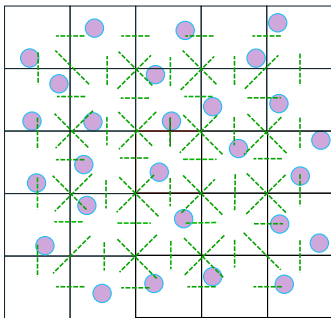
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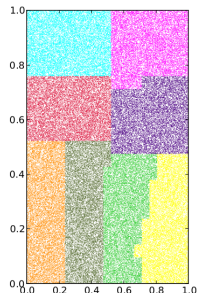
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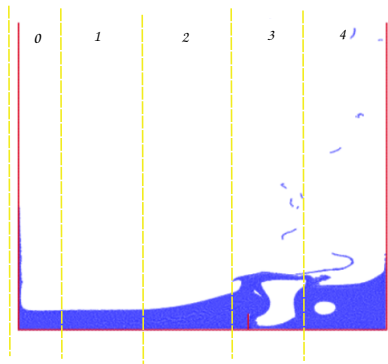
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# How do they do it?

- SPhysics
- GADGET2
- Ferrari et al.

# SPhysics



- Incompressible free surface flows
- Fixed domain
- Super-linear parallel speed-up

# GADGET2

- Astrophysics and Cosmology
- Massive N-Body and SPH simulations
- Free/Periodic boundaries
- 2D & 3D Space Filling Curves for Load-balancing



# Ferrari et al.

- Free surface flows
- Cells as partitioning objects
- Serial METIS graph-partitioner for Load-balancing

# Scope of this work

## Algorithms

- Geometric (RCB, RIB, HSFC)
- METIS

## Applications

- Free surface flows

# Scope of this work

## Algorithms

- Geometric (RCB, RIB, HSFC)
- METIS

## Applications

- Free surface flows

- Partitioning quality
- Execution times
- Scale-up

# Limitations of this work

- 2D
- Load balancing at every time step
- Particle based partitioning
- Graph partitioners not benchmarked

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# Problem description

## Problem

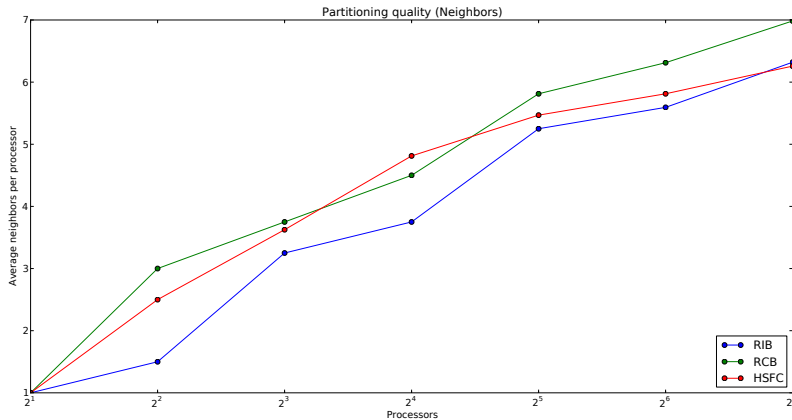
- Dam break, Sloshing flows
- Fluid + boundary conditions
- $N_p \approx O(0.1M)$

## Algorithms

- RCB
- RIB
- HSFC

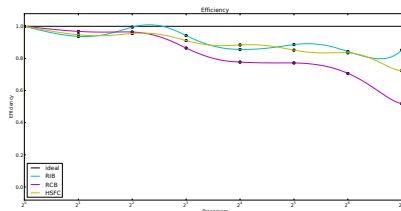
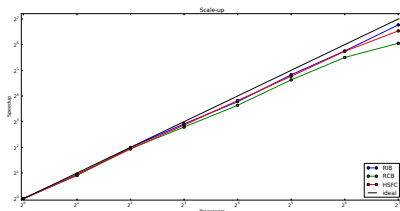
# Neighbors per processor

Dam-break,  $N_p \approx 10M$ , per-iteration



# Scale-up & Efficiency

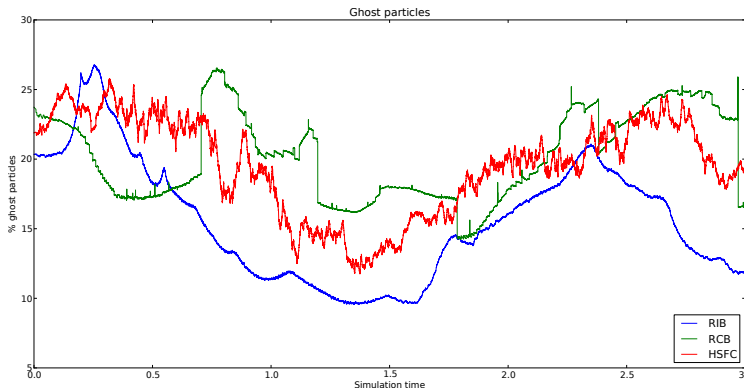
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# Ghost particles

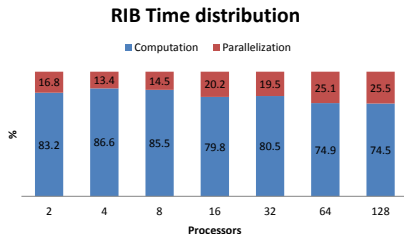
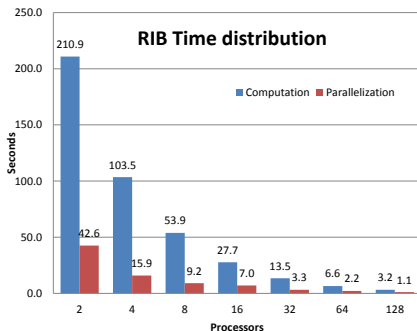
Dam-break,  $N_p \approx 1\text{M}$ , 8 partitions, Simulation time = 3sec



Method	Average % ghosts/iteration
RCB	20.24
HSFC	19.57
RIB	15.59

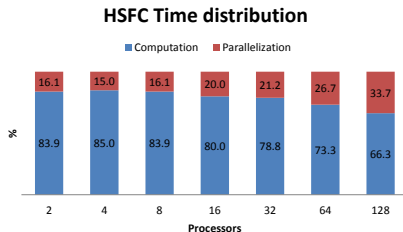
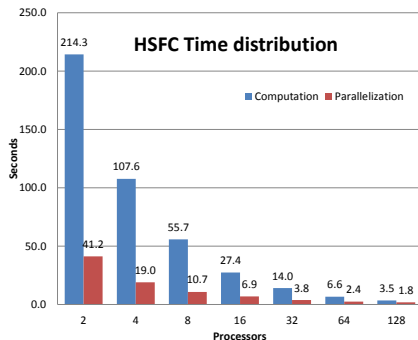
# Time distribution : RIB

Dam break,  $N_p \approx 10M$ , per-iteration



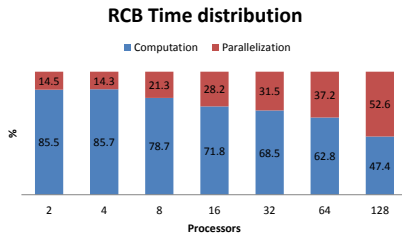
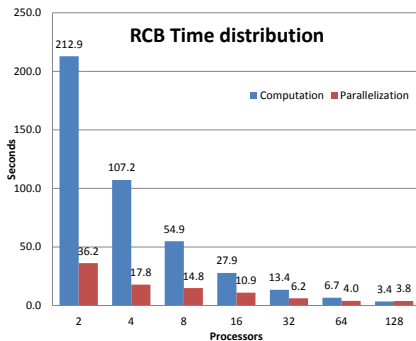
# Time distribution : HSFC

Dam break,  $N_p \approx 10M$ , per-iteration



# Time distribution : RCB

Dam break,  $N_p \approx 10M$ , per-iteration



## Further work

- 3D
- Evaluation of Graph based partitioners with cell-partitioning
- Periodic load-balancing
- PyZoltan as the PySPH's parallel module

# Code

- PySPH: <http://pysph.googlecode.com>
- zsph: <http://bitbucket.org/kunalp/zsph>

Thank you!