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# CAMP First GPU Solver: A Solution to Accelerate Chemistry in Atmospheric Models

Christian Guzman Ruiz, Mario C. Acosta, Matthew Dawson\*, Oriol Jorba, Carlos Pérez García-Pando, Kim Serradell

**Barcelona SuperComputing Center**

**\*National Center for Atmospheric Research (NCAR)**

7th ENES workshop

# BSC Departments

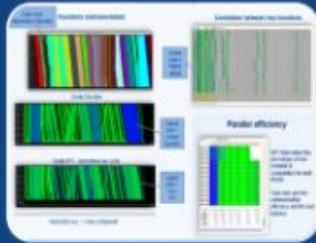


To develop and implement global and regional state-of-the-art models for short-term air quality forecast and long-term climate applications



**Performance Team**

- Provide HPC Services (profiling, code audit, ...) to find main bottlenecks of our operational models
- Research and apply new computational methods for current and new platforms



# Background

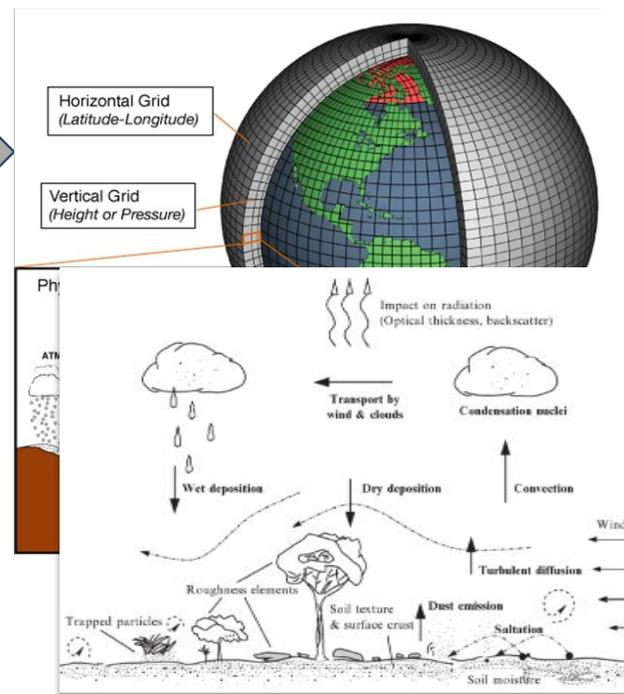
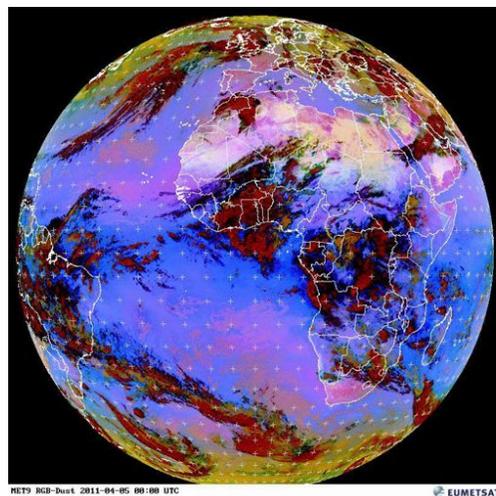


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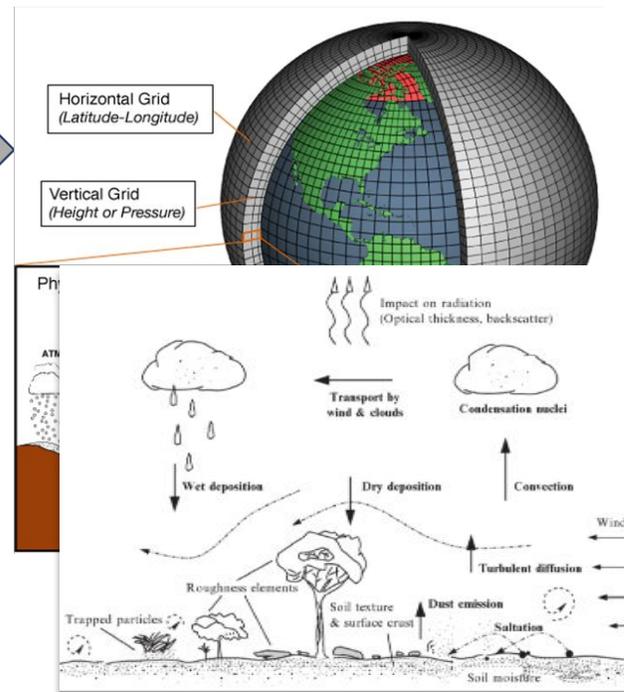
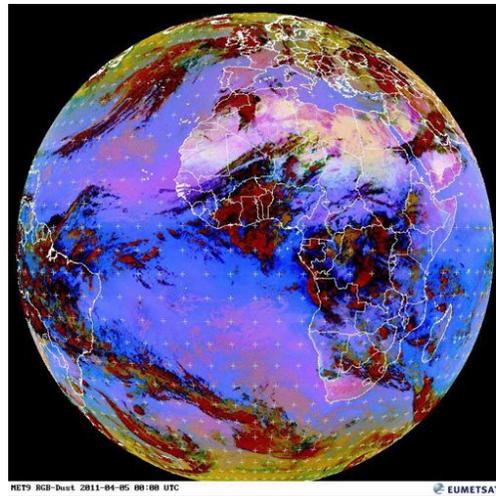
# Atmospheric models

Atmospheric models are a **mathematical representation** of atmospheric water, gas, and aerosol cycles.



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Resolution of chemical processes can take up to 80% of the time execution!

# State of the art - KPP GPU

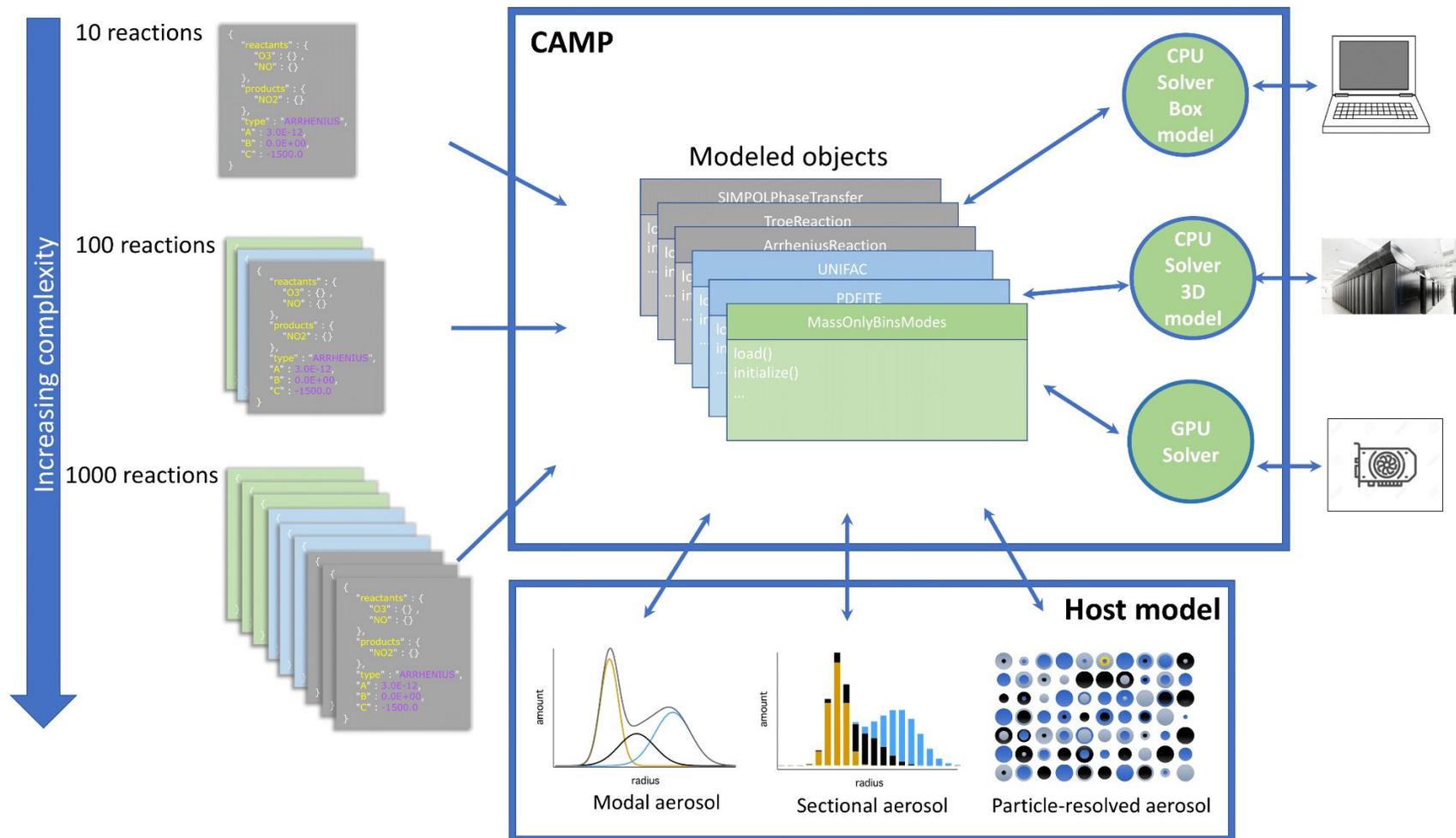
- Kinetic PreProcessor (KPP) is a analysis tool to solve chemical mechanisms using Rosenbrock methods
- KPP is widely used in the atmospheric community
- The GPU version for the EMAC climate model achieves up to 20x speedup against CPU single-core and 1.86x against 2 CPUs

Configuration	Median CPU exec time (s)	Median accelerated exec time (s)	Performance over CPU
Intel Xeon X5650 + M2070	4.502	0.999	4.50×
Intel Xeon E5-2680 v3 + K80	1.476	0.283	5.21×
IBM POWER8 + P100	3.040	0.149	20.40×

Configuration	MPI Processes	CPU exec time (s)	Accelerated exec time (s)	Performance over CPU
2 × 6-core Intel Xeon X5650 + 2 × NVIDIA M2070	2 MPI processes	5199	2358	2.27 ×
	12 MPI processes	1388	1368	1.01 ×
2 × 12-core Intel E5-2680 v3 + 2 × NVIDIA K80	4 MPI processes	7362	3384	2.17 ×
	24 MPI processes	1756	1473	1.19 ×
2 × 10-core IBM POWER8 + 4 × NVIDIA P100	4 MPI processes	2294	918	2.50 ×
	20 MPI Processes	814	437	1.86 ×

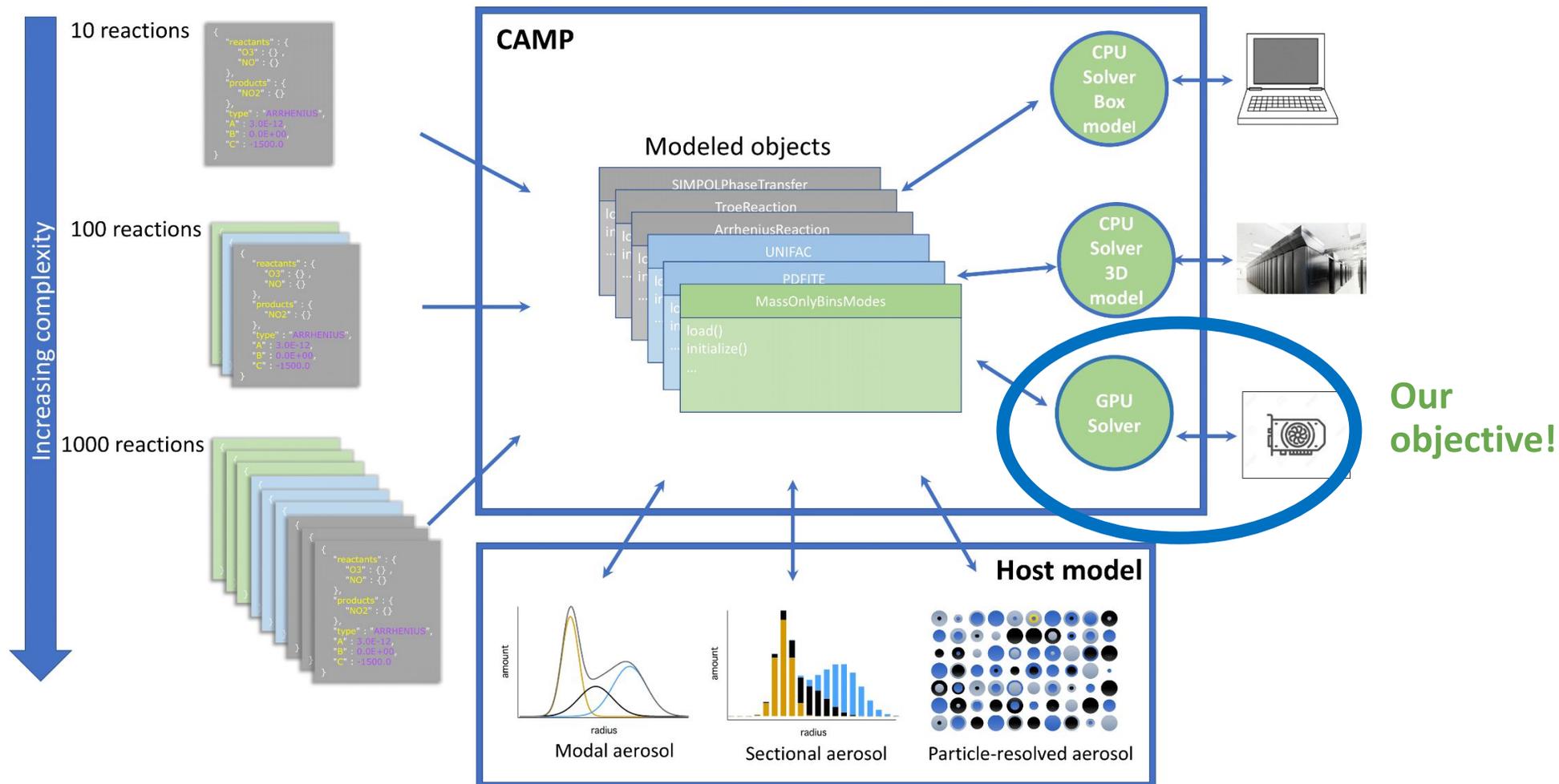
*Michail Alvanos and Theodoros Christoudia, GPU-accelerated atmospheric chemical kinetics in the ECHAM/MESSy (EMAC) Earth system model, 2017*

# CAMP: Chemistry Across Multiple Phases



Dawson, Guzman, Curtis, Acosta, et. al., Chemistry Across Multiple Phases (CAMP) version 1.0, GMD 2022

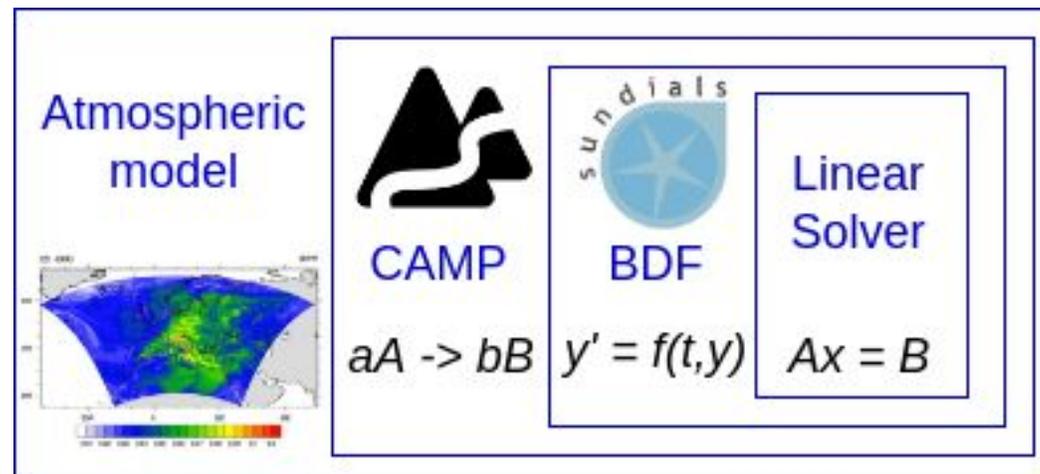
# CAMP: Chemistry Across Multiple Phases



Dawson, Guzman, Curtis, Acosta, et. al., Chemistry Across Multiple Phases (CAMP) version 1.0, GMD 2022

# CAMP CPU Solver

- CAMP uses the Backward Differentiation Formula (BDF) from CVODE, which is a solver for ordinary differential equation (ODE) systems.
- BDF requires a linear solver package. The default option is the KLU algorithm for the CPU execution, while it also has a CUDA version of the Biconjugate Gradient (BCG) algorithm.



# Implementation

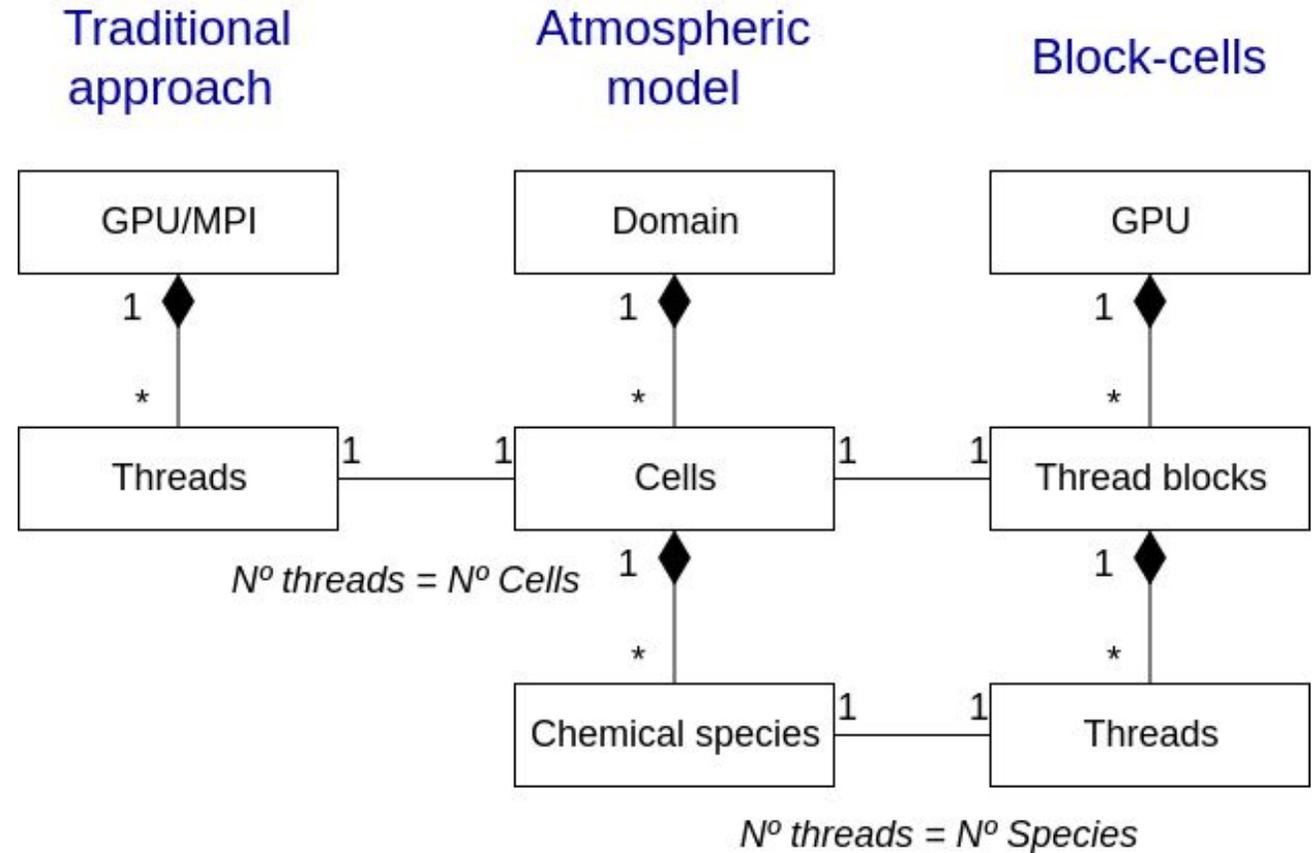


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# Block-cells (GPU parallelization strategy)

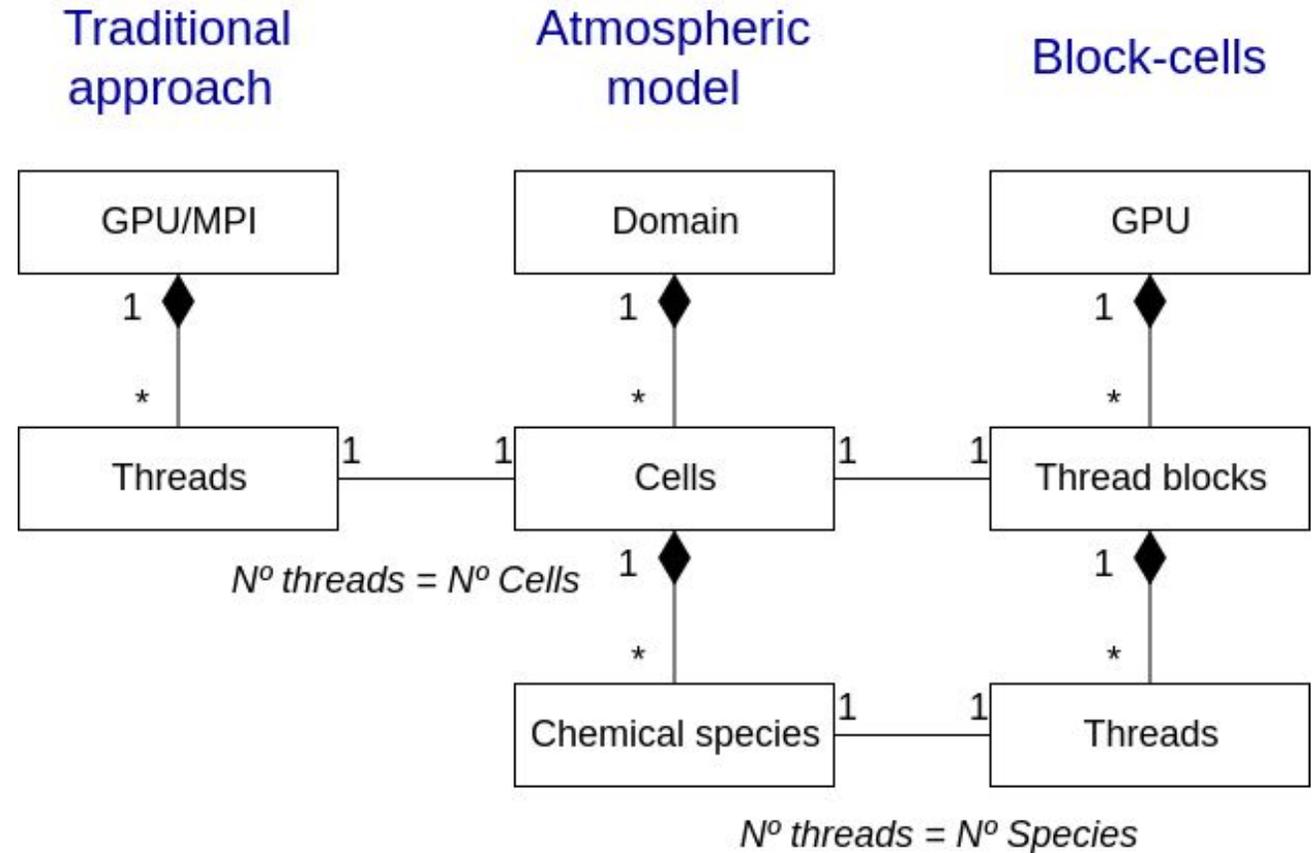
- Block-cells assigns each atmospheric cell to a GPU thread block
- Uses as many threads as chemical species



*Guzman et. al. Studying a new GPU treatment for chemical modules inside CAMP, 19th ECMWF Workshop*

# Block-cells (GPU parallelization strategy)

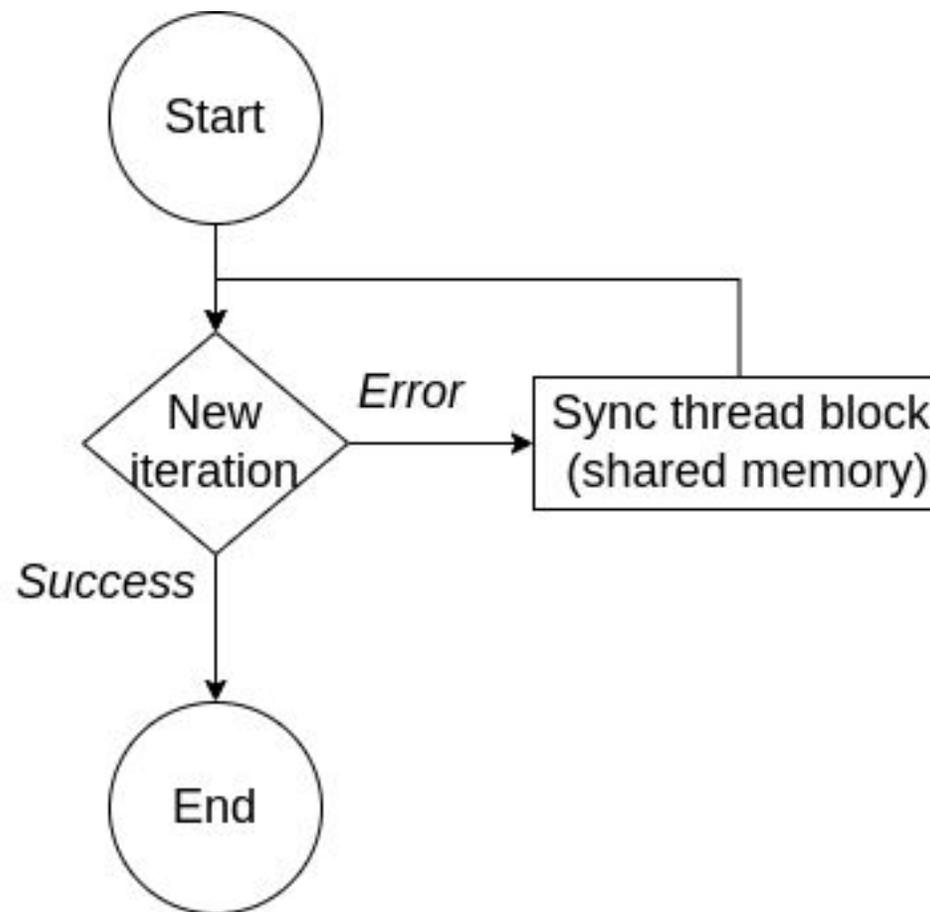
- Higher occupancy than traditional approaches (more threads computing data)
- 34x speedup against CPU single-thread for the CAMP BCG linear solver



*Guzman et. al. Studying a new GPU treatment for chemical modules inside CAMP, 19th ECMWF Workshop*

# Communicating data between threads

- All **communications** are performed at **thread block level**
- An example: A thread triggers an error due to a negative concentration
- The error is shared between the other threads in the block by using shared memory



*GPU BDF convergence loop*

# Test environment



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# Hardware

- **CTE-POWER cluster:**
  - **2 x IBM Power9 8335-GTH @ 2.4GHz (3.0GHz on turbo, 20 cores and 4 threads/core, total 40 cores per node)**
  - **4 x GPU NVIDIA V100 (Volta) with 16GB HBM2.**
  - Compilers: GCC version 6.4.0 and NVCC version 10.2

# Software configuration

Architecture	Parallel resources	Parallelization language
CPU	1, 40	MPI
GPU	N° of different chemical concentrations (species x cells)	CUDA

- The evaluation is performed over the code included in the most external loop in BDF. The code related to previous initializations is excluded.
- Chemical mechanism: Gas phase chemistry from Carbon bond 2005 (CB05) | Chemical species: 156 | Cells (ODE systems): 100-10,000 | GPU Shared memory size per block: 256 | CVODE absolute tolerance: 0.01% | BCG tolerance: 1.0e-30

# Results

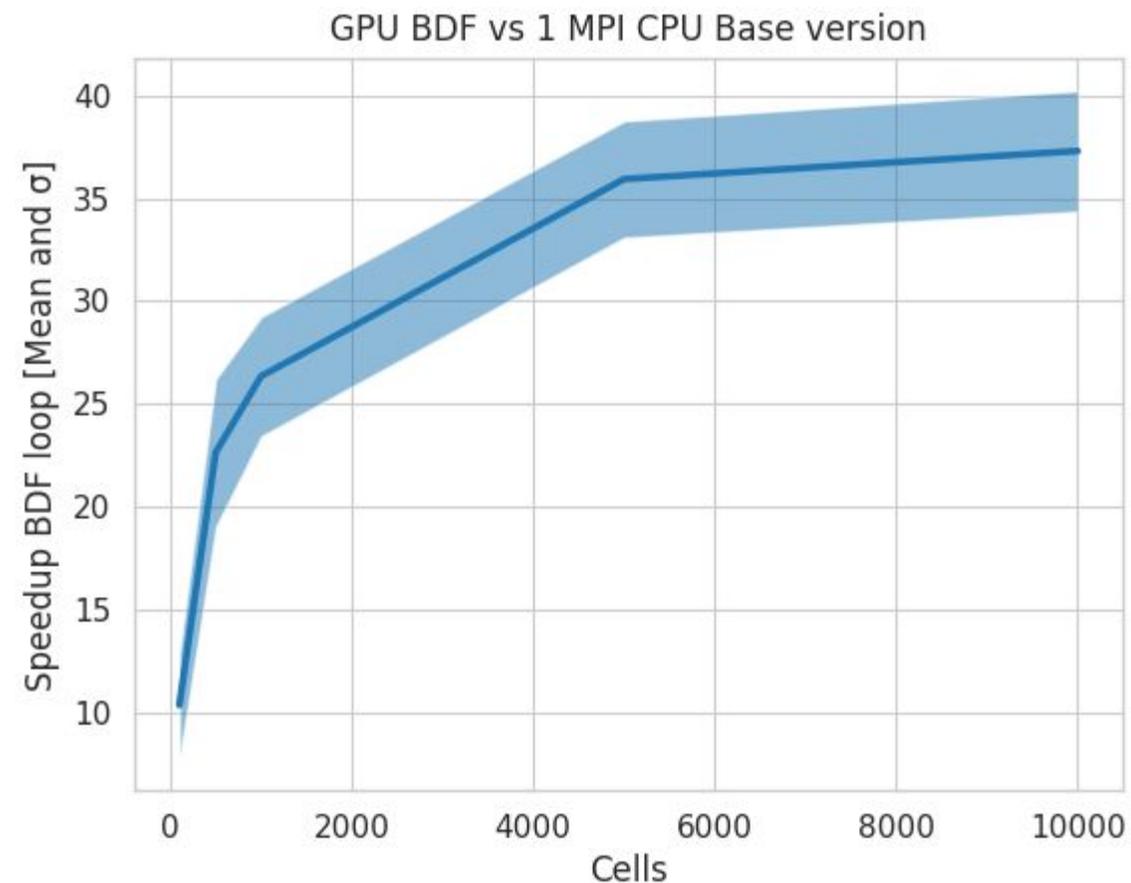


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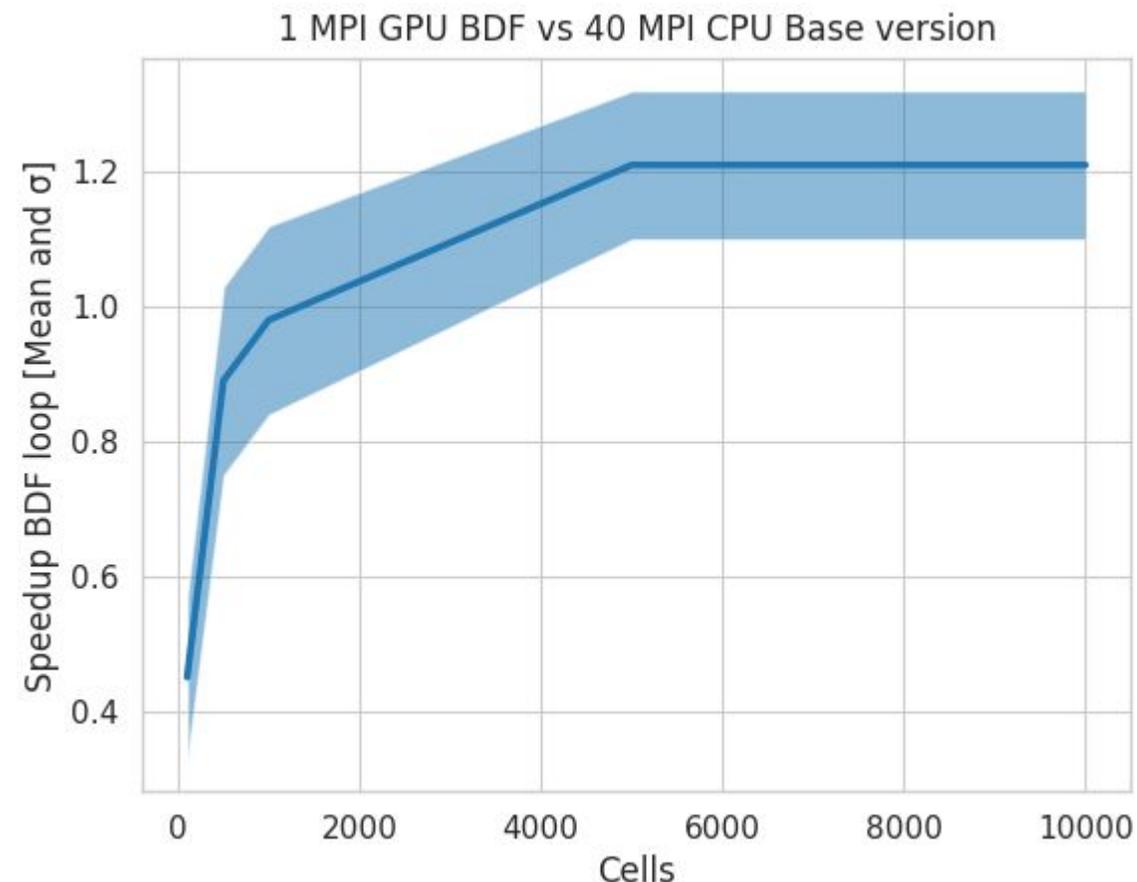
# Speed-up

- Up to 35x speedup in average vs single-thread
- Standard deviation around 2



# Speed-up against 40 processes

- 1.2x speed-up against a fully CPU node (40 MPI processes)
- Since there's no communication between threads, we estimate 4.8x speed-up using the full GPU resources in a node (4 GPUs) - *Ongoing work*



# Kernel profiling

- Some optimizations already performed (like adjusting the number of registers per thread)
- The register usage is likely preventing the kernel from fully utilizing the GPU
- This usage is mostly produced by the algorithm definition, which computes big data like the Jacobian matrix

Variable	Achieved	Theoretical	Device Limit	Grid Size: [ 10000,1,1 ] (10000 blocks)Block Size: [ 73,1,1 ] (73 threads)
<b>Occupancy Per SM</b>				
Active Blocks		10	32	
Active Warps	29,67	30	64	
Active Threads		960	2048	
Occupancy	46,4%	46,9%	100%	
<b>Warps</b>				
Threads/Block		73	1024	
Warps/Block		3	32	
Block Limit		21	32	
<b>Registers</b>				
Registers/Thread		64	255	
Registers/Block		6144	65536	
Block Limit		10	32	
<b>Shared Memory</b>				
Shared Memory/Block		1024	98304	
Block Limit		76	32	

# Conclusions



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# Conclusions

- Our Block-cells strategy increase the GPU parallel threads against traditional implementations ( $N^{\circ}$  Threads =  $N^{\circ}$  Cells)
- The CUDA BDF loop performs up to 35x times faster than CPU single-thread
  - 1.2x speed-up against CPU using the fully resources node.
  - Since the load is independent between threads, we estimate up to 4.8x speedup using 4 GPUs per node.
- The kernel profiling suggests a limitation on the performance by memory
- Our approach can be used in more chemical applications thanks to the versatility of the CAMP module.

## Future work

- Add multi-device functionality to compute up to 4 GPUs per node.
- Balance load between CPU and GPU architectures.
- Integrate our implementation inside an atmospheric model.



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# Thank you

[christian.guzman@bsc.es](mailto:christian.guzman@bsc.es)