## Session 3

# High performance simulation of plasma transport and validation

(Garrigues, Taccogna, Eremin, Powis, Knoll, Fubiani)



ExB Plasmas Workshop 2022

Madrid, online event

## List of contents

1. Common presentation

• Accelerating PIC simulations (20 min + 10 m	nin questions) Er	remin	GPU-based
	Minelli-Cichocki-Tacc	cogna	Hybrid MPI-OpenMP
	Garrigues et al.		Sparse PIC approach
	Knoll et al.		Dimensional reduction method

• PIC Penning discharge benchmark (20 min+ 10 min questions) Powis-Garrigues-Fubiani

2. Discussion: validation of PIC simulations (45 min)

#### Announcement

 Journal of Electric Propulsion Collection: Novel Numerical Methods for Electric Propulsion Modeling https://link.springer.com/journal/44205/collections?filter=Open

- Direct kinetic "Vlasov" or hybrid-Vlasov approaches

- Meshfree techniques - Models for resolving the dynamic surface / plasma interface

- Collisional algorithms beyond classic DSMC, plasma / surface chemistry models
- Hardware-specific approaches, including embedded and edge-computing numerical techniques
- Multiphysics models capturing effects such as charging, erosion, heat transfer, and radiative emission
- Multifidelity and reduced-order models, physics-based machine learning



**RUB** code's parallelization strategies:

- Single-CPU/single-GPU heterogenous parallelization
- GPU: pusher, particle sorting, calculation of ρ and its Fourier decomposition, inverse Fourier transform of φ;
  particle decomposition (CUDA C, each particle is processed by a separate GPU thread)
- CPU: 1D Poisson equation for each Fourier harmonic of  $\phi$ Corresponding Thomas algorithm is extremely efficient
- Mixed-precision approach

(single precision for particles, double precision for Poisson)

#### Architecture: CPU vs GPU



Latency-oriented architecture



Throughput-oriented architecture

#### **GPU** memory system



- Has fewer compatibility • requirements compared to CPU (bold technological innovations are possible, e.g., HBM)
- Exposes many more memory types compared to CPU, which allows data reuse to hide the DRAM latency



#### Arithmetical and memory performance: CPU vs GPU





**Typical server architecture featuring NVLink-connected GPUs** 

#### 2D $(\theta, z)$ simulations of spokes in dcMS

v<sub>ion</sub>,~ 1 kms<sup>-1</sup>



#### Expectation from experiments



#### **3D** simulations of rotating instabilities



#### **RUB 3D code's parallelization strategies:**

- Single-CPU/multi-GPU heterogenous parallelization, domain decomposition in the z direction
- GPU: pusher, particle sorting, calculation of *ρ* and its Fourier decomposition, inverse Fourier decomposition of *φ*;
  particle decomposition (CUDA C, each particle is processed by a separate GPU thread)
- CPU: 2D Poisson equation for each Fourier harmonic of  $\phi$ ; Fourier decomposition (openMP, each potential harmonic is solved with multigrid algorithm by a separate CPU thread)

#### • Mixed-precision approach

(single precision for particles, double precision for Poisson) Big potential for the mixed-precision parallelization of the multigrid solver on GPUs with tensor cores

## CNR-ISTP-Bari, Full kinetic "PICCOLO\_3D", Slide 1





## CNR-ISTP-Bari, Full kinetic "PICCOLO\_3D", Slide 2



#### **PICCOLO\_3D** description:

- 3D cylindrical metrics including part of the plume
- SPT100 case: N<sub>g</sub>=500x300x128 grid nodes with N<sub>p</sub>=2x10<sup>9</sup> total number of charged particles
- Domain decomposition with MPI framework:
  - decomposed in sub-domains of equal length along the azimuthal direction to minimize load imbalance
  - all the cells and particles of each sub-domain are assigned to a single MPI task
- Further domain decomposition by tiling to improve L2 cache use
- Particle decomposition inside each subdomain with OpenMP strategy
- Particle-based quantities: use of array of structures of arrays to speed up access to memory and to optimize OpenMP implementation
- Optimized and vectorized charge deposition and field gathering
- Particle sorting algorithm
- Ion orbit averaging subcycling



## CNR-ISTP-Bari, Full kinetic "PICCOLO\_3D", Slide 3



#### **PICCOLO\_3D:** scaling performances

- Push represents 70% of PIC cycle
- Good scaling up to 500 cores

#### @Marconi-Cineca

# cores	speedup	Relative performance	
192	1.0000	1	
384	1.9726	0.986	
768	3.3854	0.846	
1536	5.9660	0.746	



## Garrigues, Sparse PIC Approach, Slide 1 - Constrains Explicit Standard PIC

#### • Explicit PIC approach

- Constrains of grid spacing and time step related to the resolution of electron properties (Debye length and inverse of plasma frequency)
- Limitation to explicit PIC approach: high computational time due to exponential dependence on dimension

#### Sparse approach: reduction of dimension dependence for

#### grid-based methods

- Sparse grid techniques
  - Define a hierarchy of anisotropic grids with a coarser resolution
  - Reconstruction of the solution on the initial Cartesian grid using combination techniques
  - Preserving second order approximation (for d > 1)
  - Applied to Eulerian approaches
  - Applied to PIC approaches: L. F. Ricketson and A. J. Cerfon, PPCF 59, 024002 (2017), L. Garrigues et al., JAP 129, 153303, ibid 153304 (2021)
    - Particle sampling error scales as same maner than the standard approach,
    - Using same NPC concept still relevant for Sparse PIC method as in standard approach

#### Garrigues, Sparse PIC Approach, Slide 2 - Grid Construction



#### Garrigues, Sparse PIC Approach, Slide 3 - Reduction in the Number of Cells



Gain in number of cells, Gain in number of particles Reduction of computational time

large speed up expected for 3D simulations

## Garrigues, Sparse PIC Approach, Slide 4 - Illustration 2D - EDI – Hall thruster

- 2D EDI in the (x,θ) plane of a Hall thruster Landmark project Case 2b, T. Charoy et al., PSST, **28**, 105010 (2019)
- Ion density profile



- The principal idea behind the reduced-order PIC simulation is to lower to 1D the dimensionality of the Poisson's equation by taking integrals of the multi-dimensional equation to obtain a coupled system of 1D ODEs for the potential functions φ<sup>x</sup>, φ<sup>y</sup>, and φ<sup>z</sup>.
- The aim is to reduce the computational cost of multi-dimensional PIC simulations through significant reduction in the necessary total number of macroparticles.
- This is done **by splitting the computational domain** into several "**Regions**" that meet the following criteria:
  - $\succ$  the extent of the regions ( $L_R$ ) are much larger than the Debye length ( $L_R \gg \lambda_D$ ), and,
  - Within each region, the gradient of the potential along each coordinate is more significant than its gradient along the other two perpendicular directions (1D approximation, e.g.,  $\frac{\partial \phi}{\partial x} \gg \frac{\partial \phi}{\partial y}, \frac{\partial \phi}{\partial z}$ ), thus, allowing to assume  $\phi(x, y, z) = \phi^x(x) + \phi^y(y) + \phi^z(z)$ .

To simplify the discussion, we look at the **formulation for a <u>single region</u> in a <u>2D domain</u>. We thus have:** 



- Here, we demonstrate quantitatively the computational advantage that the approach has over traditional multi-dimensional PIC simulations, which essentially paves the way towards 3D approximation of the domain.
- For simplicity, we focus on an implementation where an entire 2D domain is approximated by a single region.



Total number of cells:  $N_i \times N_j$ Typical minimum  $N_{ppc} = 100$ Total  $N_{p,initial} = 100 \times N_i \times N_j$ 

#### For a typical $500 \times 250$ 2D domain, we have

 $N_{p,initial} = 1.25 \times 10^7$  for full-2D case  $N_{p,initial} = 5 \times 10^4$  for the pseudo-2D case The **reduced-order PIC simulation** results in **250 times reduction in computational cost** 





Total maximum number of cells:  $max(N_i, N_j)$ Typical minimum  $N_{ppc} = 100$ Total maximum  $N_{p,initial} = max(100 \times N_i, 100 \times N_j)$ 

Verification of the reduced-order PIC was performed in axial-azimuthal configuration (pseudo-2D simulation) using the single-and double-region implementations, taking as reference the full-2D z – θ benchmark results reported in T Charoy et al. 2019 Plasma Sources Sci. Technol. 28 105010.



Time averaged axial profiles of plasma properties

Plot (c) illustrates the capability of the pseudo-2D simulation to properly incorporate the necessary waveinduced mobility for the sustainment of plasma potential.

In addition to time-averaged plasma properties, the pseudo-2D simulation is also capable of capturing accurately the azimuthal waves and their induced transport, remarkably similar to the full-2D simulation.



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# Penning Discharge Benchmark

Andrew (Tasman) Powis, Laurent Garrigues, Gwenael Fubiani

## Motivation – Code Benchmarking

- This proposed effort evolved from discussions following the highly successful Landmark 2a benchmark, Charoy *et al.* 2019
- The basis for the setup is the paper from *Powis et al.* 2018 which simulates the emergence of a large-scale coherent rotating structure within a Penning discharge.
- However there exist many simulation efforts which capture similar structures occurring within low-temperature partially magnetized ExB plasmas [1-9]

We propose two benchmark setups:

- 1. Collisionless case (the topic of this presentation):
  - a) Capture the emergence of large scale coherent structures as well as micro-turbulence in partially magnetized ExB plasmas

2. Collisional case:

- a) This will extend benchmarking of code capabilities beyond that of Landmark 2a and the collisionless case considered here
- b) We are still exploring the appropriate parameters to include in this case
- **c)** The ad-hoc nature of MCC collision modules make it challenging to converge on a clear and concise problem description



Electron density plots demonstrating formation of a rotating spoke within 2D Penning discharge simulations [Powis *et al.* 2018]

## Motivation – A Pathway to Validation

- Numerous past and current experiments exhibit spoke like phenomena, and several are designed to explicitly explore the structure:
  - Penning like or plasma columns (including Mistral) [10-15]
  - Hall thrusters [16-28]
  - Planar magnetrons [29-26]
  - Cylindrical magnetrons [37,38]



- **1**. Benchmark 2D collisionless simulations (as proposed here)
- 2. Benchmark 2D collisional simulations, with increasing addition of relevant reactions
- **3.** Work with experimentalists to determine appropriate conditions which are feasible for simulations and experiments
- 4. Compare with experiments, add to models as required (i.e. complex boundary conditions, 3D geometry etc.) to reach agreement



Photo-emission from a Xenon plasma rotating within a cylindrical Hall thruster [Raitses *et al.* 2012]



Spatio-temporal plots of photoemission from Argon in a HiPIMS planar magnetron. Streaks indicate the presence of a spoke during a pulse [Anders *et al.* 2017]

## Motivation – Unsolved Physics

- Clearly the rotating spoke and associated anomalous transport have enjoyed a rich history of research
- This benchmark provides a pathway to engage more plasma physicists (both computational and experimental) to investigate this interesting and unsolved problem.
- Some interesting and unsolved questions include:
  - How does the spoke form? Is it a single coherent instability? Is it an inverse-cascade?
  - What are the characteristics of the micro-turbulence which forms within the spoke?
  - How does the spoke affect cross-field transport? Does it drive it directly or does turbulence within the structure promote transport? I.e., which wavenumbers are responsible for anomalous transport?
  - Can we control (or do we want to control) the spoke?

## Problem Description 1

Properties of the simulation:

- 2D square domain supporting a uniform Cartesian grid with grounded walls
- Evolved for 500  $\mu s$ , sufficient for multiple rotations of the emergent spoke
- Uniform constant magnetic field applied in the zdirection (out of the page)
- The time step and cell size are sufficiently small to resolve the smaller electron plasma period and Debye length respectively

A complete description of the problem will be made available to all participants shortly.



Penning discharge benchmark simulation schematic

## Problem Description 2

Emerging p	hysics
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- The domain begins completely empty
- A constant current of ions and electrons are injected into the center
- The flux of electrons is higher than that of ions, therefore a negative potential builds up in the center forcing electron transport to the walls
- The systems is non-neutral for up to  $10 20 \ \mu s$
- The spoke emerges after around 50 100 μs and is presumably the most efficient structure to transport electrons from the center to the walls
- Quasi-steady state is achieved after  $100 \ \mu s$

#### MOVIE

## Problem Description 3

Emerging physics

- The domain begins completely empty
- A constant current of ions and electrons are injected into the center
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- Quasi-steady state is achieved after 100 μs



Total electrons and ions vs time within the entire simulation domain

#### Diagnostics – Time Averaged Cross-Section Profiles



#### Results – Time Averaged Cross-Section Profiles



## Results – Time Averaged Cross-Section Profiles

- One issue with this simulation is that there are very large changes in density from within to outside the spoke
- With fixed macroparticle weight, this leads to some regions with very poor statistics (i.e. outside the spoke near the boundary)
- As such, how we perform the time averaging of temperature can make a difference in the results



Cross-section and temporal average of electron temperature

#### Results – Time Averaged Cross-Section Profiles

• We derive an effective collision frequency for the radially transported electrons from the steady state electron continuity and momentum equations

$$v_{eff}(r) = j_r(r) \frac{B^2}{m_e} \left[ \frac{1}{e} \frac{\partial P(r)}{\partial r} + n(r) E_r(r) \right]^{-1}$$

- Since this equation involves the temperature (through pressure) we suffer from similar statistic issues when time averaging
- This is exacerbated by having a small denominator near in regions near the simulation boundary
- Clearly this result is non-symmetrical and highly noisy
- It's an interesting physical result, but is it worth keeping?



Cross-section and temporal average of effective radial electron collision frequency

#### Diagnostics – Spoke Frequency



## Diagnostics – Spoke Frequency

- Plot density at  $x = L_x/2$ , y = 0 against time
- Compute the spoke period by averaging over the first 10 peaks
- Gives a frequency of 45.60 *kHz*



Ion density vs time at probe location

#### Next Steps

Questions to answer:

- How do we perform time-averaging of temperature and effective collision frequency?
- Are there any other diagnostics which should be included?

**Collisional Simulations** 

- Propose to begin with electron-neutral elastic and ionization collisions
- Incorporate excitation as well as ion-neutral collisions
- Do we need coulomb collisions?

Continue discussions with experimentalists on an appropriate experimental setup which is achievable with modern codes

## **Expressions of Interest**

- LPP Anne Bourdon, Federico Petronio, Alejandro Alvarez-Laguna
- **CERFACS** Benedicte Cuenot, Olivier Vermorel, Gabriel Vigot
- Princeton/PPPL Andrew (Tasman) Powis, Igor Kaganovich, Willca Villafana
- Saskastchewan Dmytro Sydorenko, Andrei Smolyakov
- Laplace Laurent Garrigues, Gwenael Fubiani
- **CNR-Bari** Francesco Taccogna, Filippo Cichocki
- Bochum Denis Eremin
- Stanford Ken Hara
- **Onera** Paul Quentin Elias
- Madrid Eduardo Ahedo, Mario Merino, Enrique Bello Benitez, Alberto Marin Cebrian
- JIHT RAS Timofey Chernyshev
- Wigner Research Center for Physics Peter Hartmann, Zoltan Donko
- **Dublin City University** Miles Turner
- VKI-Bruxelles Thierry Magin, Pietro Parodi
- Imperial College Aaron Knoll, Maryam Reza

## How to get involved

- Contact us!
  - Andrew (Tasman) Powis apowis@pppl.gov
  - Laurent Garrigues laurent.garrigues@laplace.univ-tlse.fr
- Request to join our Slack channel: landmark-benchmark.slack.com
- We also highly encourage feedback on both the problem itself and the process of the benchmarking effort

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#### Hall Thrusters

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## Discussion: validation of PIC simulations in ExB discharges

#### • Verifications

- Theoretical predictions (analytical solutions, dispersion relations, etc.)
- Benchmark between different models developed by different groups
- Validations comparisons with experimental results
- When is a model validated?
  - Macroscopic quantities plasma properties profiles (temperature, densities, potential, etc.)
  - Time dependent microscopic quantities associated to instabilities (fluctuating electric field, spoke rotation frequency, etc.)

#### • Need to identify one device

- Penning, magnetron, Hall thruster, others? (In each of these devices some different/same mechanisms can take place)
- Minimize complexity, possible change of pressure, gas, voltage and magnetic field
- In favor of accessibility
- Low plasma density, one type of ions are preferable for numerical contraints
- Reference device
  - GEC cell for RF discharges in the 1990's
  - Reproducibility of experimental results by different groups