# A new energetic particle module in M3D-C1 with GPU acceleration

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- We want to have the same capability of the kinetic module of M3D-K code in M3D-C1, to study the interaction between energetic ions and MHD activities (Alfvén waves, kink/tearing modes etc).
- With more advanced finite-element representation and implicit time advance method, M3D-C1 can study the nonlinear problem with larger timestep and save computation time.
  - Explicit particle pushing can be accelerated using modern HPC with GPU, like in PIC codes.

- 2. GPU acceleration of particle pushing
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2. GPU acceleration of particle pushing

3. Simulation results and benchmark with other codes

Two ways to load particles

- In M3D-K, particles are loaded homogeneously in both real and momentum space. Each particle will then carry a  $f_0$  that will appear in the weight equation.
  - It is OK for slowing-down distribution, but very expensive for Maxwellian distribution.
- In NIMROD, particles are loaded following *f*<sub>0</sub> through a Monte-Carlo sampling method.
- Some codes (like GTS) use homogeneous loading in configuration space, and Monte Carlo sampling in momentum space.
- We have tried all the methods and obtained similar result. The Monte-Carlo sampling method is the most efficient.



Loaded particle distribution using Monte-Carlo sampling

#### **Particle pushing**

$$\begin{aligned} \frac{d\mathbf{X}}{dt} &= \frac{1}{B^*} \left( \mathbf{v}_{\parallel} \mathbf{B}^* - \mathbf{b} \times \mathbf{E}^* \right) \\ m \frac{d\mathbf{v}_{\parallel}}{dt} &= \frac{q}{B^*} \mathbf{B}^* \cdot \mathbf{E}^* \\ \mathbf{B}^* &= \mathbf{B} + \frac{m \mathbf{v}_{\parallel}}{e} \nabla \times \mathbf{b}, \qquad B^* = \mathbf{B}^* \cdot \mathbf{b} \\ \mathbf{E}^* &= \mathbf{E} - \frac{m \mathbf{v}_{\parallel}}{e} \frac{\partial \mathbf{b}}{\partial t} - \frac{\mu}{q} \nabla B \end{aligned}$$

- Particle markers are advanced using 4th order Runge-Kutta.
- In guiding center mode, the fields are evaluated at the guiding center. In gyrokinetic mode, the fields are calculated using 4-point averaging along the gyro orbit.
- In the linear run, markers follow drift kinetic equations with equilibrium *B* fields only.
  - We have tested the energy and  $P_{\phi}$  conservation in the long-term run. The error is less than 10<sup>-4</sup> for 1ms, and it is not accumulating.

$$\delta f \text{ method} \qquad \frac{d\delta f}{dt} = -\delta \dot{\mathbf{z}} \cdot \frac{\partial f_0}{\partial \mathbf{z}}$$
$$\frac{dw}{dt} = \frac{\delta \dot{f}}{f} = \frac{1 - w}{f_0} \left( -\delta \mathbf{v} \cdot \nabla f_0 - \dot{\epsilon} \partial_{\epsilon} f_0 \right)$$

- Here we use energy derivative ( $\dot{\epsilon}$ ) to calculate weight evolution, which is not consistent with the guiding center equation ( $\vec{v_{\parallel}}$ ) but easier to implement. Will change to  $\vec{v_{\parallel}}$  in future.
- The change of Jacobian  $(B_{\parallel}^*)$  can be taken into account by introducing a new weight  $d = w + (1 w)\delta B_{\parallel}^*/B_{\parallel 0}^*$ , like in Belova (1997).

E.V. Belova, R.E. Denton, and A.A. Chan, J. Comp. Phys. 136, 324 (1997).

- Parallel and perpendicular pressure are calculated from particles using  $\delta\text{-function}$  deposition

$$\int \nu P_{\parallel} g d\mathbf{x} = \sum_{i} m v_{i,\parallel}^{2} \nu(\mathbf{x}_{i})$$
$$\int \nu P_{\perp} g d\mathbf{x} = \sum_{i} \mu_{i} B(\mathbf{x}_{i}) \nu(\mathbf{x}_{i})$$

- We can add a small diffusion to the obtained  $P_{\parallel}$  and  $P_{\perp}$  to reduce noise, but it will break the energy conservation of the coupling scheme.
- The calculated  $P_{\parallel}$  and  $P_{\perp}$  can be used for both pressure and current coupling to MHD equations.
  - Pressure coupling

$$abla \cdot \mathbf{P} = 
abla P_{\perp} + 
abla \cdot \left( P_{\parallel} - P_{\perp} 
ight) \mathbf{b} \mathbf{b}$$

Current coupling

$$\mathbf{J}_{hot} \times \mathbf{B} = \frac{P_{\parallel}}{B^2} \mathbf{b} \times \nabla \times \mathbf{b} - \frac{P_{\perp}}{B^2} \nabla_{\perp} \ln B - \nabla \times \left(\frac{P_{\perp}}{B} \mathbf{b}\right) \times \mathbf{B}$$

• This does not include current due to "moving dipole" effect.

J.W. Burby and C. Tronci, Plasma Phys. Control. Fusion 59, 045013 (2017).

# 2. GPU acceleration of particle pushing

3. Simulation results and benchmark with other codes

- Many of the newly built supercomputers utilize GPU to reach high computation power.
  - In Traverse, a new cluster built by PPPL and Princeton University, 97% of computing power comes from GPU.
- GPU can be regarded as a co-processor with many cores and a shared memory.
  - Computation on a single GPU core is slower than on a single CPU core, especially for logical operations.
  - GPU should be used to do strongly parallel jobs with each job very simple, and particle pushing is indeed a suitable job.
- With the help of new API like OpenMP4 or OpenACC, it is now easier to migrate the existing code to run on GPUs.
  - Most of the migration work is related to communications between GPU and CPU (offloading), since they have separate memory.
  - Existing MPI structure of the code can complicate the work.

### Combining distributed memory and shared memory

- Currently M3D-C1 use MPI processes for parallelization, with domain decomposition and distributed memory mode.
  - Each process only knows the information about a small subdomain of the whole 3D mesh.
- The most efficient way to push particles in GPU is to use particle-based data structure, and each particle is pushed independently.
  - This is more memory-consuming since every GPU needs the field information of the whole mesh. Fortunately for modern GPU with >16GB RAM, this is not a problem.
  - Previously we use a mesh-based data structure to store particle data. This leads a lot of communication due to particles particles moving from one mesh to the other.
- To incorporate the distributed-memory M3D-C1 and share-memory particle pushing, we exploit two methods for data sharing
  - Shared memory function (within one node) introduced in MPI-3.
  - MPI\_Allgatherv between different nodes





• Using GPU profiler, it is found that the data transfer time is < 0.1s for GPU offloading, which is ignorable compared to GPU computation time with subcycles.

# Subcycles of particle pushing within MHD timestep

- Currently M3D-C1 can use timestep of tens of  $\tau_A$  to simulate long-term phenomena, with the help of the advanced semi-implicit algorithm for velocity advance.
  - This is an improvement over the M3D code, which typically use much smaller timestep.
  - For particle pushing we use explicit RK4, thus the timestep is limited by particle speed.
- Here we use subcycles for particle pushing, which means that we push particle multiple times between two MHD timesteps.
  - GPU-CPU communications are only needed at the beginning and end of subcycles.
  - Fields are fixed during subcycles. This can be improved by utilizing information of time derivative of field.

- The benchmark was done using the initial version of code, which only runs on one GPU. We compare it with OpenMP version running on Traverse CPU with 128 threads.
- According to the results, in current version (supporting multiple GPUs), we should get >16× speedup from GPU acceleration.
- Most of the time for particle pushing is spent in calculating the value of basis functions at each particle location, which requires a calculation of 5th order polynomials.



# Linear subcycles in nonlinear MHD simulations

- In a nonlinear run of current version of code, most of the computation time is spent in matrix term calculation of MHD equations, especially evaluating the semi-implicit terms.
- To simulate the Alfvén wave excitation, we have to use MHD timesteps smaller than mode period, like  $1\tau_A$  or less.
- To save time in matrix calculation, we keep using the same matrix for MHD evolution for several timesteps ( $\sim$  30), like in a linear run, and then recalculate the matrix and do the matrix factorization.
  - The particle current terms or pressure terms are added to equations as external momentum source, thus the wave-particle interaction is well treated.
  - However, the wave-wave interaction is absent.
  - The method can lead to numerical instabilities near the mode saturation. It is better to introduce self-adaptive timesteps.



2. GPU acceleration of particle pushing

#### 3. Simulation results and benchmark with other codes

#### Fishbone simulation result agrees with M3D-K and NIMROD

 $R/a = 2.8, \quad \beta_{total} = 0.08, \quad q_0 = 0.6, \quad q_a = 2.5$  $\hat{\rho}_h = v_0/(\Omega_h a) = 0.0125, v_0/v_A = 4$ 



- These results are obtained using pressure coupling scheme used in M3D-K and NIMROD. With current coupling, the growth rate increase significantly with  $\beta_h$ 

G.Y. Fu, W. Park, H.R. Strauss, J. Breslau, J. Chen, S. Jardin, and L.E. Sugiyama, Phys. Plasmas 13, 052517 (2006). C.C. Kim and the NIMROD Team, Phys. Plasmas 15, 072507 (2008).

## TAE linear simulation without and with FLR effects

• This is an ITPA collaborative effort to compare different codes and physical model. Several hybrid MHD, gyrokinetic and gyrofluid codes are benchmarked.

$$\begin{aligned} R/a &= 10, \quad \beta \approx 0.2\%, \quad q = 1.71 + 0.16(r/a)^2 \\ n_f &= c_3 \exp\left(-\frac{c_2}{c_1} \tanh \frac{\sqrt{s} - 0.5}{c_2}\right) \end{aligned}$$



• In nonlinear simulations, an energetic particle driven acoustic-like mode is observed with growth rate of the same order.

# Simulation of RSAE driven in DIII-D tokamak

 Recently several MHD and gyrokinetic codes are employed to study the linear growth of reversed shear Alfvén eigenmode (RSAE) using DIII-D experimental parameters.

 $\begin{array}{ll} R/a = 2.5, & q_{min} = 2.94, & B_0 = 2T, \\ n_f = 1.95 \times 10^{12} {\rm cm}^{-3}, & T_f = 24 {\rm keV} \end{array}$ 

- Including FLR effects leads to smaller mode growth rate, especially for high-k modes.
- We got almost the same results using pressure coupling or current coupling, meaning that the parallel dynamics are not important.
- Compressional effects  $(\delta B_{\parallel})$  are not important.

$$n_0 = 3.29 \times 10^{13} \mathrm{cm}^{-3}, \quad T_e = 1.689 \mathrm{keV}$$



#### **Energy conservation test**

- We study the energy conservation in the nonlinear simulation of RSAE in DIII-D.
- Both the kinetic and magnetic energy are calculated using the perturbed field only, to reduce the noise coming from the equilibrium fields.
- Pressure is chosen to be very small.
- In energetic particle energy calculation, the contribution from full-f current is subtracted to reduce noise (Belova (1997))



- The total energy change is within 10% of MHD energy increase during linear growing stage, but in the saturation stage this error is significantly larger.
- We think this is caused by the phase mixing related to continuum damping of RSAE, since high-*k* modes can be excited. E.V. Belova, R.E. Denton, and A.A. Chan, J. Comp. Phys. 136, 324 (1997).

2. GPU acceleration of particle pushing

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- A new kinetic module coupled to M3D-C1 has been developed, which utilizes GPU for particle pushing, and can do both pressure coupling and current coupling.
- Linear benchmarks with other MHD and gyrokinetic codes are conducted, and good agreements are achieved.
  - The test of energy conservation is also successful in the linear stage.
- Future work
  - Continue working on nonlinear simulation of RSAE and benchmark with MEGA
  - Implement a full-orbit scheme for particle simulation, and use it to simulate high frequency Alfven waves like GAE and CAE.

$$\nabla \cdot (\alpha \mathbf{B} \mathbf{B}) = \mathbf{B} \cdot \nabla (\alpha \mathbf{B})$$
  
=  $\mathbf{B} \mathbf{B} \cdot \nabla \alpha + \alpha \mathbf{B} \cdot \nabla \mathbf{B}$   
=  $\mathbf{B} \mathbf{B} \cdot \nabla \alpha + \frac{1}{2} \alpha \nabla B^2 - \alpha \mathbf{B} \times \nabla \times \mathbf{B}$ 

$$\begin{split} \mathbf{B} &= \nabla \psi \times \nabla \phi - \nabla_{\perp} f' + F \nabla \phi \\ \nu \nabla \varphi \cdot \nabla \times R^{2} \nabla \cdot (\alpha \mathbf{BB}) &= R^{2} \nabla_{\perp} \nu \times \nabla \varphi \cdot \nabla \cdot (\alpha \mathbf{BB}) \\ &= [\alpha, \psi](\nu, \psi) + \alpha' R^{-2} F(\nu, \psi) - (\alpha, f')(\nu, \psi) \\ &+ R^{2}[\alpha, \psi][\nu, f'] + \alpha' F[\nu, f'] - (\alpha, f') R^{2}[\nu, f'] \\ &+ \frac{1}{2} \alpha R^{2} [B^{2}, \nu] \\ &+ \alpha \Delta^{*} \psi[\nu, \psi] - \alpha \Delta^{*} \psi(\nu, f') + \alpha F[\nu, F^{*}] + \alpha F R^{-2}(\nu, \psi') \end{split}$$

$$\nu \mathsf{R}^2 \nabla \varphi \cdot \nabla \cdot (\alpha \mathsf{B} \mathsf{B}) = \nu \mathsf{F}[\alpha, \psi] + \nu \mathsf{F} \mathsf{F} \alpha' \mathsf{R}^{-2} - \nu \mathsf{F}(\mathsf{f}', \alpha)$$

 $+\,\nu\alpha {\rm B} {\rm B}'$ 

$$-\alpha\nu[\psi,\mathsf{F}^*] - \alpha\nu\frac{1}{R^2}(\psi,\psi') - \alpha\nu(f',\mathsf{F}^*) - \alpha\nu[\psi',f']$$

$$\begin{split} \nu \nabla_{\perp} \cdot \left[ R^{-2} \nabla \cdot (\alpha \mathbf{B} \mathbf{B}) \right] &= - \nabla_{\perp} \nu \cdot \left[ R^{-2} \nabla \cdot (\alpha \mathbf{B} \mathbf{B}) \right] \\ &= -R^{-2} [\alpha, \psi] [\nu, \psi] - \alpha' R^{-4} F[\nu, \psi] + (\alpha, f') R^{-2} [\nu, \psi] \\ &+ (\nu, f') R^{-2} [\alpha, \psi] + (\nu, f') R^{-4} \alpha' F - (\nu, f') R^{-2} (\alpha, f') \end{split}$$

$$-\frac{1}{2}\alpha R^{-2}(\nu,B^2))$$

+ 
$$R^{-4}\alpha\Delta^*\psi(\nu,\psi)$$
 +  $R^{-2}\alpha\Delta^*\psi[\nu,f']$   
+  $FR^{-4}\alpha(\nu,F^*)$  +  $FR^{-4}\alpha[\psi',\nu]$ 

# Parallel pressure term in M3D-C1

$$\nabla p = \frac{\mathbf{BB}}{B^2} \cdot \nabla p + (1 - \frac{\mathbf{BB}}{B^2}) \nabla p$$
$$\nabla \cdot (\frac{p}{B^2} \mathbf{BB}) = \mathbf{B} \cdot \nabla (\frac{p}{B^2} \mathbf{B})$$
$$= \mathbf{BB} \cdot \nabla \frac{p}{B^2} + \frac{p}{B^2} \mathbf{B} \cdot \nabla \mathbf{B}$$
$$= \mathbf{BB} \cdot \nabla \frac{p}{B^2} + \frac{1}{2} \frac{p}{B^2} \nabla B^2 - \frac{p}{B^2} \mathbf{B} \times \nabla \times \mathbf{B}$$
$$= \left(\frac{\mathbf{BB}}{B^2} \cdot \nabla p + \mathbf{BB} p \cdot \nabla \frac{1}{B^2} - \frac{1}{2} p \mathbf{BB} \cdot \nabla \frac{1}{B^2}\right)$$
$$+ \left(-\frac{1}{2} p (B^2 - \mathbf{BB}) \cdot \nabla \frac{1}{B^2} + \frac{p}{B^2} \mathbf{J} \times \mathbf{B}\right)$$

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