





# Filtered Density Function(FDF) Solver

## **Development Plan**

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## Project Review: FDF Solver Development



Overall Objective: Develop data-driven closure models for turbulent scalar transport using the Filtered Density Function (FDF) approach.

- •Current Focus: Build a scalar FDF solver as a foundational step toward full model development.
- •Goal: Establish a flexible, validated FDF framework as the basis for future data-driven closure model training & evaluation.
- •Approach: Leverage the existing LES solver to provide:
  - Resolved flow fields (velocity, pressure)
  - Sub-grid-scale (SGS) fields (e.g., Reynolds stresses)

#### •Key Tasks Ahead:

- Develop robust Eulerian–Lagrangian coupling for scalar particle transport.
- Implement the scalar transport Eulerian solver compatible with curvilinear grids.

## Master Plan & Status: (1/5) Grid & Geometry Infrastructure



#### 1.1 Setup Core DMDA Structures 🔽

- Create DMDA user->da (DOF=1).
- Create/Derive DMDA user->fda (DOF=3).
- Set parallel decomposition layout.
- Setup DM structures (DMSetUp).

#### 1.2 Grid Definition

- Read grid params from options (control.dat).
- Read grid params from file (grid.dat).
- Logic to choose input source.
- Determine & store global dimensions (IM, JM, KM).

#### 1.3 Assign Curvilinear Coordinates

- Get local coordinate vector Coor.
- Generate coordinates (uniform/stretched).
- Read coordinates from file.
- Broadcast/Distribute coordinates.
- **Populate local coordinate vector Coor.**
- Synchronize global coordinate vector gCoor.

#### 1.4 Calculate Grid Metrics

- Define data structures (Vecs) for metrics.
- ■ Implement numerical differentiation of Coor.
- Implement calculation of Jacobian, basis vectors, etc.
- Store metrics in Vecs.
- Update ghost values for metric Vecs.

#### 1.5 Walking Search Algorithm (Curvilinear) /

- **Compute All rank Bounding Boxes (curvilinear)**
- **Compute Distance of Particle to Face Analyze**
- Compute Signed Distances from all faces of a cell to particle.
- ✓ Search through Cells in a Rank Bounding Box.
- Determine cell indices (i,j,k) & weights (a1,a2,a3).
- ✓ Store results in DMSwarm CellID and weight fields (mechanism exists).

#### 1.6: Verify/Adapt Particle Migration 1

- **Existing logic identifies potential migrants using physical coords vs.** axis-aligned bounding box of owned nodes.
- Existing logic identifies target rank by checking axis-aligned bounding boxes (bboxlist) of immediate Cartesian neighbors (user->neighbors).
- 1 Analyze robustness: Evaluate if the current axis-aligned bounding box approach (based on owned nodes) is sufficient for identifying all necessary migrants and finding the correct target rank near highly curved interprocessor boundaries.
- Develop/Implement robust condition (if needed): Based on analysis, potentially implement checks against neighbor ghost cells or use more sophisticated geometric tests instead of simple axis-aligned boxes.
- Verify: Test particle transfer across representative curved boundaries using the chosen (existing or revised) logic.





Complete/Functional | A Partial/Needs Adaptation/Verification | Requires Implementation



## Master Plan & Status: (2/5) Eulerian Field Management



#### 2.1 Setup Context and Parameters

- **✓** Define UserCtx struct.
- Read standard simulation parameters.
- Add reading for FDF parameters (Sc\_t, C\_mix).

#### 2.3 Handle LES Data Input 📣

- ✓ Implement PETSc binary reader (ReadFieldData).
- **Read Ucat using ReadFieldData.**
- ■ Read Nu\_t into user->nu\_sgs\_les.
- Calculate D\_sgs\_grid = nu\_sgs\_les / Sc\_t.
- 1 Update ghost cell values (Needs cases for new fields:  $D_sgs_grid$ ,  $<\phi>$ ).

#### 2.2 Setup Eulerian Field Vectors 🛝

- **Create Vecs for Ucat, P, Nvert, etc.**
- Create Vec user->nu\_sgs\_les (on da).
- Create Vec user->D\_sgs\_grid (on da).
- Create Vec user->euler\_phi\_mean (for <φ>, on da).
- Create Vecs for FDF stats (phi\_fdf\_mean, phi\_fdf\_variance, on da).
- Create Vec for FDF source term (if needed).

## Master Plan & Status: (3/5) Lagrangian Particle Solver



#### 3.1 Setup DMSwarm

- **Create DMSwarm object.**
- Register standard fields (position, velocity, pid, CellID, weight).

#### 3.2 Add FDF Particle Fields

- Register "phi\_scalar" field.
- Register "D\_sgs\_interp" field.
- Register temporary fields if needed (e.g., "phi\_fluct\_sq").

#### 3.3 Initialize Particle Properties /

- Initialize positions.
- Initialize velocity (to zero/interpolated).
- Initialize "phi\_scalar" based on initial condition.

#### 3.4 Implement Stochastic Differential Equation (SDE)

- Access required fields (pos, vel, D\_sgs\_interp).
- Setup/Verify parallel PetscRandom.
- Implement sqrt(2\*D\_sgs) term (handle non-positive D\_sgs)\*\*.
- Implement Wiener increment dW generation\*\*.
- Implement Euler-Maruyama update step\*\*.
- Refactor UpdateAllParticlePositions.

#### 3.5 Implement Scalar Mixing Model (IEM)\*\*

- Create new function UpdateParticleScalars\_IEM.
- $\rightarrow$  Access particle fields & interpolated  $\langle \phi \rangle$ .
- Calculate cell size Δ.
- Calculate mixing timescale τ\_mix.
- Implement Euler forward update for phi\_scalar.
- Integrate call into AdvanceSimulation.

#### 3.6 Implement Particle Boundary Handling /

- Check/Remove particles leaving physical domain.
- Implement periodic boundary conditions (if needed).
- Implement/Verify reflective boundary conditions for curvilinear walls.

## Master Plan & Status: (4/5) Eulerian-Lagrangian Coupling



#### 4.1 Grid-to-Particle Interpolation /

- Interpolate Ucat (nodal fda) to particle "velocity" field (Mechanism exists).
- Verify Ucat interpolation accuracy on curvilinear grid (PRIORITY 1c).
- Implement D\_sgs\_grid (cell da) to particle "D\_sgs\_interp" interpolation.
- Implement grid <φ> (from phi\_cell\_mean\_grid on da) back to particles (for IEM).

#### 4.2 Particle-to-Grid Statistics (Moments) 🔔

- **☑** Calculate particle count per cell (user->ParticleCount).
- Implement scatter/accumulate framework.
- Implement normalization by count framework.
- **In the interior of the inter**
- Implement calculation & scatter/normalize for variance <φ'²>\_fdf (user->phi\_fdf\_variance).
- implement scatter/normalize for final FDF mean  $\langle \phi \rangle_{fdf}$  (user- $\langle \phi \rangle_{fdf}$ ).

# Master Plan & Status: (5/5) Post Processing, Validation, Performance



#### 5 Post Processing and I/O 1

- Write Eulerian/Lagrangian fields to PETSc binary.
- Write FDF statistics fields (<φ>\_fdf, <φ'²>\_fdf).
- Write particle scalar field (phi\_scalar).
- Adapt VTK output for new fields (FDF stats, particle scalar, maybe metrics).
- Implement particle PDF calculation/export.
- → Implement ML-ready data output (HDF5/CSV).

#### 7 Parallel Performance & Scalability 1

- Particle migration framework exists.
- Verify particle migration on curvilinear grids (see Task 1.6).
- PETSc parallel structures used.
- Verify parallel RNG correctness.
- Implement strong/weak scaling tests.
- Implement profiling of key components.

#### 6 Validation & Test Cases

- Curvilinear grid verification (VTK, metrics).
- Curvilinear particle location validation.
- Curvilinear interpolation/advection validation.
- (Standalone Eulerian solver validation Deferred)
- SDE particle dispersion test.
- FDF test case(s) (e.g., scalar decay/channel flow using LES data).
- lmplement grid convergence tests.
- Implement FDF diagnostics (PDF plots).

## **Priority 1: Ensuring Curvilinear Grid Compatibility**



#### **Key Focus Areas & Tasks (Phase 1)**

- 1. Verify/Adapt Particle Location Algorithm (Task 1.5):
- Ensure robust mapping: physical  $(x,y,z) \rightarrow logical (i,j,k, a1,a2,a3)$ . Debug/Refine LocateParticleInGrid using coordinate/metric data.

Status: Framework exists [ ], Curvilinear logic needs verification/implementation [ 1 ]

- 2. Verify/Adapt Particle Migration Logic (Task 1.6):
- Ensure correct particle identification & transfer across curved processor boundaries.
- Evaluate robustness of current axis-aligned bounding box approach.

Status: Framework exists [ ], Curvilinear robustness needs analysis/verification [ 1 ].

- 3. Verify Interpolation Accuracy (Task 4.1.1 / 6.1.3):
- Assess accuracy of InterpolateEulerFieldToSwarm (for U\_LES) on distorted grid cells.

## **Priority 2: FDF Core Physics Implementation**



- Ingest SGS Data & Calculate Diffusivity (Task 2.3):
- Read LES Nu\_t (cell-centered) into user->nu\_sgs\_les. Calculate D\_sgs = Nu\_t / Sc\_t on the grid (user->da).
- 2. Add Particle Scalar & Interpolate D\_sgs (Tasks 3.2, 3.3, 4.1):
- Add phi\_scalar & D\_sgs\_interp fields to DMSwarm.
- Implement cell-to-particle interpolation for D\_sgs.
- 3. Implement Stochastic Position Update (SDE) (Task 3.4):
- Modify UpdateAllParticlePositions: dX = U\_LES dt + sqrt(2\*D\_sgs)dW. Requires parallel Random Number Generation.
- 4. Implement Mixing Model (IEM) (Task 3.5)\*\*:
- **Calculate conditional** mean <φ|X\_p> (scatter/interpolate).

  Calculate mixing timescale τ\_mix.
- Update phi\_scalar.

- 5. Calculate FDF Statistics (Task 4.2):
- Compute Mean <φ>\_fdf (scatter/normalize phi\_scalar).
  Compute Variance <φ'²>\_fdf (scatter/normalize fluctuations) (If time permits).

<sup>\*\*</sup> If time permits

## **Proposed 2-Month Plan & Mid-August Goals**



#### Phase 1: Curvilinear Foundation Verification (~3 Weeks)

**Focus:** Tasks 1.5, 1.6, 4.1.1 (Location, Migration, Interp. Accuracy). **Deliverable:** Verified particle tracker components on curvilinear grid.

### Phase 2: Core A Posteriori FDF Implementation (~5 Weeks)

Focus: Tasks 2.3 (Nu\_t, D\_sgs), 3.2/3.3 (phi\_scalar), 4.1.2 (D\_sgs interp.), 3.4 (SDE). Stretch: 3.5 (IEM), 4.2 (Stats).

**Deliverable (Depends on Goal Level):** Basic FDF prototype.

Focus: Prioritize robust curvilinear handling (Phase 1) above all else.

## Mid-August (~2 Months) Goal Scenarios:

- Ambitious Goal: Phase 1 verified + FDF prototype with SDE, IEM, Mean & Variance calculation functional for a simple test case.
- Moderate Goal (Primary Target): Phase 1 verified + FDF core with SDE implemented & tested. phi\_scalar added. D\_sgs read & interpolated. (Maybe) FDF Mean calculated.
- Conservative Goal (If Challenges Arise): Phase 1 fully verified & robust (Curvilinear tracker foundation complete). Initial steps of Phase 2 started (e.g., Nu\_t reading).

**Dependencies:** Phase 2 heavily relies on successful completion and verification of Phase 1. Plan flexibility is key.