### High-Order Methods for Turbulent Flow Simulations on Deforming Domains

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# Outline



Numerical Schemes – Discretization and Solvers

- The Discontinuous Galerkin Method
- Time-Stepping and Parallel Implicit Solvers
- Shock Capturing using Artificial Viscosity
- Methods for Deforming Domains
  - High-Order ALE Formulation
  - Time-Dependent PDE-Constrained Optimization
  - Unstructured Mesh Space-Time Methods

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# **Motivation**

- Need for higher fidelity predictions in computational mechanics
  - Turbulent flows, wave propagation, multiscale phenomena, non-linear interactions
- Many practical applications involve time-varying geometries
  - Fluid/structure interaction, flapping flight, wind turbines, rotor-stator flows
- Goal: Develop *robust*, *efficient*, and *accurate* high-order methods based on fully unstructured meshes









### Why Unstructured Meshes?

- Complex geometries need flexible element topologies
- Complex solution fields need spatially variable resolution
- Fully automated mesh generators for CAD geometries are based on unstructured simplex elements
- Real-world simulation software dominated by unstructured mesh discretization schemes





# Why high-order accurate methods?

- Scalar convection equation  $u_t + u_x = 0$
- High-order gives superior performance for equal resolution



# Example: High-order aero-acoustics

- Aero-acoustics simulation of a recorder model
- Line-DG scheme, p = 7
- High-order essential to capture turbulent flow sources and propagate waves







# **High-Order Discontinuous Galerkin Simulations**

Discontinuous Galerkin (DG) methods have desirable properties:

FVM

- 1) High-order/Low dispersion
- 2) Complex geometries
- 3) Stabilization for convection
- X J J J J X J J J J X J

FEM

DG

FDM

- However, several problems to resolve:
  - High CPU/memory requirements (compared to FVM or H-O FDM)
  - Robustness issues, low tolerance to under-resolved features
  - High-order geometry representation and mesh generation
- Need to make DG competitive for real-world problems

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### The Discontinuous Galerkin Method

- (Reed/Hill 1973, Lesaint/Raviart 1974, Cockburn/Shu 1989-, etc)
- Consider non-linear hyperbolic system in conservative form:

$$\boldsymbol{u}_t + \nabla \cdot \mathcal{F}_i(\boldsymbol{u}) = 0$$

- Triangulate domain  $\Omega$  into elements  $\kappa \in T_h$
- Seek approximate solution u<sub>h</sub> in space of element-wise polynomials:

$$\mathcal{V}_h^p = \{ \mathbf{v} \in L^2(\Omega) : \mathbf{v}|_{\kappa} \in P^p(\kappa) \ \forall \kappa \in T_h \}$$

• Multiply by test function  $v_h \in \mathcal{V}_h^p$  and integrate over element  $\kappa$ :

$$\int_{\kappa} \left[ (\boldsymbol{u}_h)_t + \nabla \cdot \mathcal{F}_i(\boldsymbol{u}_h) \right] \boldsymbol{v}_h \, d\boldsymbol{x} = 0$$

Integrate by parts:

$$\int_{\kappa} \left[ (\boldsymbol{u}_h)_t \right] \boldsymbol{v}_h \, d\boldsymbol{x} - \int_{\kappa} \mathcal{F}_i(\boldsymbol{u}_h) \nabla \boldsymbol{v}_h \, d\boldsymbol{x} + \int_{\partial \kappa} \hat{\mathcal{F}}_i(\boldsymbol{u}_h^+, \boldsymbol{u}_h^-, \hat{\boldsymbol{n}}) \boldsymbol{v}_h^+ \, d\boldsymbol{s} = 0$$

with numerical flux function  $\hat{\mathcal{F}}_i(u_L, u_R, \hat{n})$  for left/right states  $u_L, u_R$  in direction  $\hat{n}$  (Godunov, Roe, Osher, Van Leer, Lax-Friedrichs, etc)

- Global problem: Find u<sub>h</sub> ∈ V<sub>h</sub><sup>p</sup> such that this weighted residual is zero for all v<sub>h</sub> ∈ V<sub>h</sub><sup>p</sup>
- Error =  $\mathcal{O}(h^{p+1})$  for smooth solutions



### The DG Method – Observations

• Reduces to the finite volume method for p = 0:

$$(\boldsymbol{u}_h)_t A_{\kappa} + \int_{\partial \kappa} \hat{\mathcal{F}}_i(\boldsymbol{u}_h^+, \boldsymbol{u}_h^-, \hat{\boldsymbol{n}}) \, ds = 0$$

- Boundary conditions enforced naturally for any degree p
- Block-diagonal mass matrix (no overlap between basis functions)
- Block-wise compact stencil neighboring elements connected



• General approach for second derivatives:

• Write as system of first order equations [Arnold et al 02]:

$$oldsymbol{u}_t + 
abla \cdot \mathcal{F}_i(oldsymbol{u}) - 
abla \cdot \mathcal{F}_v(oldsymbol{u},oldsymbol{\sigma}) = 0$$
  
 $oldsymbol{\sigma} - 
abla oldsymbol{u} = 0$ 

• Discretize using DG, choose appropriate numerical fluxes  $\hat{\sigma}$ ,  $\hat{u}$ 

- Various schemes have been proposed:
  - BR2 [Bassi/Rebay 1998]: Different lifting operator for each edge, compact connectivities, similar to Interior Penalty (IP)
  - LDG [Cockburn/Shu 1998]: Upwind/Downwind, non-compact
  - CDG [Peraire/Persson 2008]: Modification of LDG for local dependence – sparse and compact

### The CDG Method – Summary





- Excludes non-compact and indefinite terms
- Provably optimal accuracy  $\mathcal{O}(h^{p+1})$
- Higher stability/accuracy than LDG/BR2
- Sparser than LDG/BR2/IP



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### **Temporal Discretization: DIRK**

- Diagonally Implicit RK (DIRK) are implicit Runge-Kutta schemes defined by lower triangular Butcher tableau → decoupled implicit stages
- Overcomes issues with high-order BDF and IRK
  - Limited accuracy of A-stable BDF schemes (2nd order)
  - High cost of general implicit RK schemes (coupled stages)

$$u^{(0)} = u_0(\mu) \qquad c_1$$

$$u^{(n)} = u^{(n-1)} + \sum_{i=1}^{s} b_i k_i^{(n)} \qquad \vdots$$

$$u_i^{(n)} = u^{(n-1)} + \sum_{j=1}^{i} a_{ij} k_j^{(n)} \qquad c_2$$

$$\vdots$$

$$u_i^{(n)} = u^{(n-1)} + \sum_{j=1}^{i} a_{ij} k_j^{(n)} \qquad Butc$$

$$\mathbb{M}k_i^{(n)} = \Delta t_n r \left( u_i^{(n)}, \ \mu, \ t_{n-1} + c_i \Delta t_n \right) \qquad Butc$$

$c_1$	$a_{11}$			
С2	$a_{21}$	<i>a</i> <sub>22</sub>		
÷	÷	÷	·	
$C_{S}$	$a_{s1}$	$a_{s2}$	• • •	$a_{ss}$
	$b_1$	$b_2$		$b_s$

Butcher Tableau for DIRK scheme

### **Preconditioning for Newton-Krylov Solvers**

- Implicit solvers typically required because of CFL restrictions from viscous effects, low Mach numbers, and adaptive/anisotropic grids
- Jacobian matrices are large even at p = 2 or p = 3, however:
  - They are required for non-trivial preconditioners
  - They are very expensive to recompute
- Block-ILU(0) preconditioners and Minimum Discarded Fill (MDF) element ordering [Persson/Peraire 2008]
- Distributed parallel solvers developed in [Persson '09]
- IMEX schemes for geometrically induced stiffness (e.g. boundary layers) [Persson 2011]



### **Cylinder – Delayed Detached Eddy Simulation**

- DES/DDES [Spalart 1997,2006]: Hybrid RANS/LES model for problems with significant flow separation
- Edge of boundary layer moving; stabilize by continuous AV
- Model problem: Flow over cylinder,  $\text{Re} = 1.5 \cdot 10^6$
- Left: Force coefficients C<sub>D</sub>, C<sub>L</sub>, Right: Q-criterion isosurfaces



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# **Artificial Viscosity for Underresolved Features**

- Cannot resolve all solution features (shocks, RANS, singularities), and low dissipation makes DG sensitive to under-resolution
- Stabilize by sensors and artificial viscosity [Persson & Peraire 2006]
- Regularity of solution determined from the decay rate of expansion coefficients in orthogonal basis
- Periodic Fourier case:  $f(x) = \sum_{k=-\infty}^{\infty} g_k e^{ikx}$





If f(x) has *m* continuous derivatives  $\rightarrow |g_k| \sim k^{-(m+1)}$ 

• For simplices: Expand solution in orthonormal Koornwinder basis:

$$u = \sum_{i=1}^{N(p)} u_i \psi_i, \quad \hat{u} = \sum_{i=1}^{N(p-1)} u_i \psi_i, \quad s_e = \log_{10} \left( \frac{(u - \hat{u}, u - \hat{u})_e}{(u, u)_e} \right)$$

# Nonlinear stabilization using artificial viscosity

- *s<sub>e</sub>* is a highly sensitive yet selective sensor
- $\bullet~\mbox{General} \rightarrow \mbox{applicable}$  to any type of under-resolved features
- Allows for full Newton convergence of sensor
- $\bullet\,$  Subgrid resolution  $\to$  smooth propagation of moving shocks





### **3-D Transonic Flow over Tapered Wing**

- 3-D wing, fully unstructured tetrahedral mesh
- Freestream Ma = 0.8, AoA =  $3^{\circ}$
- Polynomial degrees p = 3



#### Pressure

Artificial viscosity

# **Pitching wing in transonic flow**

- ALE formulation for the Euler equations combined with sensor-based artificial diffusion
- Freestream Ma = 0.6, AoA harmonic with amplitude=  $30^{\circ}$
- Implicit solver, re-used Jacobians





*x*-gradient of density

Arfificial viscosity

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### **ALE Formulation for Deforming Domains**

- Use mapping-based ALE formulation for moving domains [Visbal,Gaitonde 2002], [Persson,Bonet,Peraire 2009]
- Map from reference domain V to physical deformable domain v(t)
- Introduce the mapping deformation gradient  $G = \nabla_X \mathcal{G}$  and the mapping velocity  $v_X = \frac{\partial \mathcal{G}}{\partial t}\Big|_X$ , and set  $g = \det(G)$
- The system of conservation laws in the physical domain v(t)

$$\left.\frac{\partial \boldsymbol{U}_x}{\partial t}\right|_x + \boldsymbol{\nabla}_x \cdot \boldsymbol{F}_x(\boldsymbol{U}_x, \boldsymbol{\nabla}_x \boldsymbol{U}_x) = 0$$

can then be written in the reference configuration V as

$$\frac{\partial \boldsymbol{U}_X}{\partial t}\Big|_X + \boldsymbol{\nabla}_X \cdot \boldsymbol{F}_X(\boldsymbol{U}_X, \boldsymbol{\nabla}_X \boldsymbol{U}_X) = 0$$

where

$$U_X = gU_X, \qquad F_X = gG^{-1}F_X - U_XG^{-1}v_X$$
$$\nabla_x U_x = \nabla_X (g^{-1}U_X)G^{-T} = (g^{-1}\nabla_X U_X - U_X\nabla_X (g^{-1}))G^{-T}$$

# **ALE Formulation for Deforming Domains**

 Mapping-based formulation gives arbitrarily high-order accuracy in space and time





# **Nonlinear Elasticity for Deforming Domains**

- Non-linear solid mechanics approach: [Persson & Peraire 2009]
  - An initial reference mesh corresponds to an undeformed solid
  - External forces come from the true moving boundary constraints
  - Solving for a force equilibrium gives the deformed (curved) boundary conforming mesh
- High-order ALE methods require a smooth mapping  $\mathcal{G}(X, t)$  such that the elements are aligned with the moving boundaries



# **Moving Domain Applications**







# **Partitioned FSI using IMEX schemes**

- [Froehle & Persson 2013, 2014]
- IMEX schemes can be used to derive accurate partitioning methods for fully coupled FSI problems
- Treat a *predicted* traction  $\tilde{t}$  explicitly and everything else implicitly:

$$\boldsymbol{r} = \begin{bmatrix} \boldsymbol{r}^{f}(\boldsymbol{u}^{f}; \boldsymbol{x}(\boldsymbol{u}^{s})) \\ \boldsymbol{r}^{s}(\boldsymbol{u}^{s}; \boldsymbol{t}(\boldsymbol{u}^{f})) \end{bmatrix} = \begin{bmatrix} \boldsymbol{r}^{f}(\boldsymbol{u}^{f}; \boldsymbol{x}(\boldsymbol{u}^{s})) \\ \boldsymbol{r}^{s}(\boldsymbol{u}^{s}; \tilde{\boldsymbol{t}}) \end{bmatrix} + \begin{bmatrix} \boldsymbol{r}^{fs}(\boldsymbol{t}(\boldsymbol{u}^{f}) - \tilde{\boldsymbol{t}}) \end{bmatrix}$$

implicit

explicit





### Flow around Membrane, 3-D

- Angle of attack 22.6°, Reynolds number 2000.
- Flexible structure reduces leading edge separation.
- Fluid: 108k degree 3 tetrahedra (11M DOF)
- Solid: 1k degree 3 tetrahedra





#### Mesh

Flow field

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# **Discretization of PDE-Constrained Optimization**

#### • Continuous PDE-constrained optimization problem

$$\begin{array}{ll} \underset{U,\ \mu}{\text{minimize}} & \mathcal{J}(U,\mu) \\ \text{subject to} & \boldsymbol{C}(U,\mu) \leq 0 \\ & \frac{\partial \boldsymbol{U}}{\partial t} + \nabla \cdot \boldsymbol{F}(\boldsymbol{U},\nabla \boldsymbol{U}) = 0 \ \text{ in } \ \boldsymbol{v}(\mu,t) \end{array}$$

• Fully discrete PDE-constrained optimization problem

$$\begin{array}{l} \underset{\boldsymbol{u}^{(0)}, \dots, \boldsymbol{u}^{(N_{t})} \in \mathbb{R}^{N_{u}}, \\ k_{1}^{(1)}, \dots, k_{s}^{(N_{t})} \in \mathbb{R}^{N_{u}}, \\ \mu \in \mathbb{R}^{n_{\mu}} \end{array} & J(\boldsymbol{u}^{(0)}, \dots, \boldsymbol{u}^{(N_{t})}, \boldsymbol{k}_{1}^{(1)}, \dots, \boldsymbol{k}_{s}^{(N_{t})}, \boldsymbol{\mu}) \\ \text{subject to} & \mathbf{C}(\boldsymbol{u}^{(0)}, \dots, \boldsymbol{u}^{(N_{t})}, \boldsymbol{k}_{1}^{(1)}, \dots, \boldsymbol{k}_{s}^{(N_{t})}, \boldsymbol{\mu}) \leq 0 \\ \boldsymbol{u}^{(0)} - \boldsymbol{u}_{0}(\boldsymbol{\mu}) = 0 \\ \boldsymbol{u}^{(n)} - \boldsymbol{u}^{(n-1)} + \sum_{i=1}^{s} b_{i}\boldsymbol{k}_{i}^{(n)} = 0 \\ \mathbb{M}\boldsymbol{k}_{i}^{(n)} - \Delta t_{n}\boldsymbol{r}\left(\boldsymbol{u}_{i}^{(n)}, \boldsymbol{\mu}, t_{i}^{(n-1)}\right) = 0 \end{array}$$

### **Generalized Reduced-Gradient Approach**

#### Optimizer drives, Primal returns Qol values, Dual returns Qol gradients



### **Adjoint Method to Compute Qol Gradients**

- Consider the *fully discrete* output functional  $F(u^{(n)}, k_i^{(n)}, \mu)$ 
  - Represents either the objective function or a constraint
- The *total derivative* with respect to the parameters μ, required in the context of gradient-based optimization, takes the form

$$\frac{\mathrm{d}F}{\mathrm{d}\mu} = \frac{\partial F}{\partial \mu} + \sum_{n=0}^{N_t} \frac{\partial F}{\partial \boldsymbol{u}^{(n)}} \frac{\partial \boldsymbol{u}^{(n)}}{\partial \mu} + \sum_{n=1}^{N_t} \sum_{i=1}^s \frac{\partial F}{\partial \boldsymbol{k}_i^{(n)}} \frac{\partial \boldsymbol{k}_i^{(n)}}{\partial \mu}$$

- The sensitivities,  $\frac{\partial \boldsymbol{u}^{(n)}}{\partial \mu}$  and  $\frac{\partial \boldsymbol{k}_i^{(n)}}{\partial \mu}$ , are expensive to compute, requiring the solution of  $n_{\mu}$  linear evolution equations
- Adjoint method: alternative method for computing  $\frac{dF}{d\mu}$  that require one linear evolution evoluation equation for each quantity of interest, *F*

### Fully Discrete Adjoint Equations: Dissection

- Linear evolution equations solved backward in time
- Primal state  $u_i^{(n)}$  required at each stage of dual problem
- Heavily dependent on chosen output

$$\boldsymbol{\lambda}^{(N_{t})} = \frac{\partial \boldsymbol{F}}{\partial \boldsymbol{u}^{(N_{t})}}^{T}$$
$$\boldsymbol{\lambda}^{(n-1)} = \boldsymbol{\lambda}^{(n)} + \frac{\partial \boldsymbol{F}}{\partial \boldsymbol{u}^{(n-1)}}^{T} + \sum_{i=1}^{s} \Delta t_{n} \frac{\partial \boldsymbol{r}}{\partial \boldsymbol{u}} \left(\boldsymbol{u}_{i}^{(n)}, \ \boldsymbol{\mu}, \ t_{n-1} + c_{i} \Delta t_{n}\right)^{T} \boldsymbol{\kappa}_{i}^{(n)}$$
$$\mathbb{M}^{T} \boldsymbol{\kappa}_{i}^{(n)} = \frac{\partial \boldsymbol{F}}{\partial \boldsymbol{u}^{(N_{t})}}^{T} + b_{i} \boldsymbol{\lambda}^{(n)} + \sum_{j=i}^{s} a_{ji} \Delta t_{n} \frac{\partial \boldsymbol{r}}{\partial \boldsymbol{u}} \left(\boldsymbol{u}_{j}^{(n)}, \ \boldsymbol{\mu}, \ t_{n-1} + c_{j} \Delta t_{n}\right)^{T} \boldsymbol{\kappa}_{j}^{(n)}$$

Gradient reconstruction via dual variables

$$\frac{\mathrm{d}F}{\mathrm{d}\mu} = \frac{\partial F}{\partial \mu} + \boldsymbol{\lambda}^{(0)T} \frac{\partial \boldsymbol{u}_0}{\partial \mu} + \sum_{n=1}^{N_t} \Delta t_n \sum_{i=1}^s \boldsymbol{\kappa}_i^{(n)T} \frac{\partial \boldsymbol{r}}{\partial \mu} (\boldsymbol{u}_i^{(n)}, \ \boldsymbol{\mu}, \ t_i^{(n)})$$

# **Energetically Optimal Flapping, Thrust Constraint**

minimize  $-\int_{2T}^{3T} \int_{\Gamma} \mathbf{f} \cdot \dot{\mathbf{x}} \, dS \, dt$ <br/>subject to  $\int_{2T}^{3T} \int_{\Gamma} \mathbf{f} \cdot \mathbf{e}_1 \, dS \, dt = q$ <br/> $\mathbf{U}(\mathbf{x}, 0) = \bar{\mathbf{U}}(\mathbf{x})$ <br/> $\frac{\partial \mathbf{U}}{\partial t} + \nabla \cdot \mathbf{F}(\mathbf{U}, \nabla \mathbf{U}) = 0$ 

- Isentropic, compressible, Navier-Stokes
- Re = 1000, M = 0.2
- y(t), θ(t), c(t) parametrized via periodic cubic splines
- Black-box optimizer: SNOPT





Airfoil schematic, kinematic description

Fixed Shape, Optimal Rigid Body Motion (RBM), Varied x-Impulse



### **Optimal Control, Time-Morphed Geometry**



### **Adjoint Method for Periodic PDE-Constraints**

 Following identical procedure as for non-periodic case, the adjoint equations corresponding to the periodic conservation law are

$$\boldsymbol{\lambda}^{(N_t)} = \boldsymbol{\lambda}^{(0)} + \frac{\partial F}{\partial \boldsymbol{u}^{(N_t)}}^T$$
$$\boldsymbol{\lambda}^{(n-1)} = \boldsymbol{\lambda}^{(n)} + \frac{\partial F}{\partial \boldsymbol{u}^{(n-1)}}^T + \sum_{i=1}^s \Delta t_n \frac{\partial \boldsymbol{r}}{\partial \boldsymbol{u}} \left( \boldsymbol{u}_i^{(n)}, \ \boldsymbol{\mu}, \ t_{n-1} + c_i \Delta t_n \right)^T \boldsymbol{\kappa}_i^{(n)}$$
$$\mathbb{M}^T \boldsymbol{\kappa}_i^{(n)} = \frac{\partial F}{\partial \boldsymbol{u}^{(N_t)}}^T + b_i \boldsymbol{\lambda}^{(n)} + \sum_{j=i}^s a_{ji} \Delta t_n \frac{\partial \boldsymbol{r}}{\partial \boldsymbol{u}} \left( \boldsymbol{u}_j^{(n)}, \ \boldsymbol{\mu}, \ t_{n-1} + c_j \Delta t_n \right)^T \boldsymbol{\kappa}_j^{(n)}$$

- Dual problem is also periodic
- Solve linear, periodic problem using Krylov shooting method

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# **Domains with Large Deformations**

- For large deformations, it is in general not possible to deform the meshes smoothly *remeshing required*
- For efficient numerical schemes, use *local* mesh operations



# The DistMesh Mesh Generator

- High quality meshes obtained using the *DistMesh* algorithm [Persson, Ph.D. thesis, '05]
  - 1. Start with any topologically correct initial mesh
  - 2. Move nodes to find force equilibrium in edges
    - Project boundary nodes using *implicit geometry*  $\phi(\mathbf{x})$
    - Update element connectivities with Delaunay
- Excellent properties:
  - Very simple (1 page of MATLAB)
  - $\bullet \ \ \text{Implicit geometries} \rightarrow \text{No CAD required}$
  - Very high element qualities
  - Moving meshes/deforming domains
- Widely used:
  - Numerous books and courses
  - Rewritten in C, C++, C#, Fortran 77/90, Python, Mathematica, Octave





### The DistMesh Mesh Generator

• Spring-based non-linear compressive force analogy for mesh motion

$$p^{(n+1)} = p^{(n)} + \delta \sum_{i} F_{i}$$
$$|F_{i}(l)| = \begin{cases} k(l-l_{0}) & \text{if } l \ge l_{0} \\ 0 & \text{if } l < l_{0} \end{cases}$$

 Perform topological transformations ("edge flips") to improve element connectivities







### The DistMesh Mesh Generator on Surfaces



# **Element flips and DistMesh in 3D**

#### • Local element flips for 3D tetrahedra:



#### • Restricts the topology changes to a small number of elements



# **Moving Meshes**

- In addition to generating high-quality initial meshes, the DistMesh algorithm is excellent for iterative generation of moving meshes
- The resulting mesh sequence involves two types of operations:
  - Smooth node movements
  - 2 Localized element topology updates
- This allows for integration with efficient numerical schemes





### **Space-time Mesh Generation**

• Local mesh operations significantly simplify the process of space-time slab mesh generation



 Each local prism triangulation depends on the choice of the diagonals on the lateral faces



A depth-first algorithm for the global assignment of diagonals

# Edge collapsing and Edge splitting

#### Two more local mesh operations for adding and removing nodes:



### **Space-Time Discontinuous Galerkin Formulation**

- Fully unstructured space-time DG method:
  - Fully consistent discretization in both space and time
  - Allows for arbitrary mesh deformations and topology changes
- Define the broken DG spaces  $\mathcal{V}_T^h$  and  $\Sigma_T^h$  associated with a triangulation  $\mathcal{T}_{[0,T]}^h = \{K\}$  of the space-time domain  $\Omega[0,T]$  as:

$$\mathcal{V}_{T}^{h} = \{ \mathbf{v} \in [L^{2}(\Omega[0,T])]^{5} \mid \mathbf{v}|_{K} \in [\mathcal{P}_{p}(K)]^{5} \; \forall K \in \mathcal{T}_{[0,T]}^{h} \},$$

$$\Sigma_T^h = \{ \boldsymbol{\sigma} \in [L^2(\Omega[0,T])]^{5 \times 3} \mid \boldsymbol{\sigma}|_K \in [\mathcal{P}_p(K)]^{5 \times 3} \ \forall K \in \mathcal{T}_{[0,T]}^h \},$$

 Discretize the first-order system using a standard DG formulation on the space-time domain Ω[t<sub>1</sub>, t<sub>2</sub>].

$$-\int_{K} \widetilde{F}^{\text{inv}}(\boldsymbol{u}^{h}) : \nabla_{XT} \boldsymbol{v}^{h} \, dx + \oint_{\partial K} (\widehat{\widetilde{F}^{\text{inv}} \cdot \boldsymbol{n}}) \cdot \boldsymbol{v}^{h} \, ds$$
  
$$= -\int_{K} F^{\text{vis}}(\boldsymbol{u}^{h}, \boldsymbol{q}^{h}) : \nabla_{X} \boldsymbol{v}^{h} \, dx + \oint_{\partial K} (\widehat{F^{\text{vis}} \cdot \boldsymbol{n}}_{s}) \cdot \boldsymbol{v}^{h} \, ds, \qquad \forall \boldsymbol{v}^{h} \in \mathcal{V}_{T}^{h}$$
  
$$\int_{K} \boldsymbol{q}^{h} : \boldsymbol{\sigma}^{h} \, dx = -\int_{K} \boldsymbol{u}^{h} \cdot (\nabla_{X} \cdot \boldsymbol{\sigma}^{h}) \, dx + \oint_{\partial K} (\widehat{\boldsymbol{u}^{h}} \otimes \boldsymbol{n}_{s}) : \boldsymbol{\sigma}^{h} \, ds, \qquad \forall \boldsymbol{\sigma}^{h} \in \Sigma_{T}^{h}.$$

## **Example: Euler Vortex, Convergence**

- Propagate an Euler Vortex on a fixed domain but moving mesh
- Optimal order of convergence O(h<sup>p+1</sup>) for fixed and moving mesh.





# **Example: Spinning Cross**

- Flow around a spinning cross with ω = 1, Reynolds number 3000, Mach 0.2, polynomial degree p=2.
- Graded mesh around cross moves rigidly with geometry movement
- Mesh improvement techniques applied to the remaining elements







### **Example: Tandem Foils**

• Two foils are placed very close and rotated based on  $\theta = A \sin(-2\pi ft)$  with  $A = \pi/6$  and f = 0.05. Reynolds number 3000, Mach 0.2, polynomial degree p=2.



# **Example: Tandem Foils**





### Fully unstructured 4D space-time mesh generation

• 4D is difficult to visualize, and we extend concepts such as 'Prisms' and 'Lateral Faces' using combinatorial notions



2D 'Prism'

3D Prism

4D 'Prism'

	2D Prism	3D Prism	4D Prism
Geometry of Bottom/Top Face	Line Segment	Triangle	Tetrahedra
Geometry of Lateral Faces	Line Segment	Rectangle	Triangular prism
Number of Lateral Faces	2	3	4
Number of Diagonals	$\binom{2}{2}$	$\binom{3}{2}$	$\binom{4}{2}$

### Fully unstructured 4D space-time mesh generation

• The following result can be shown for obtaining valid simplex triangulations of a simple 4D prism:

#### Theorem

If the 4D prism mesh is constructed purely by simple 4D-prisms, the indexing approach can always triangulate the prism mesh into a valid simplex mesh. More precisely, in each simple 4D-prism, if we have the ordered vertices  $\{p_{(1)}^{V,t}, p_{(2)}^{V,t}, p_{(3)}^{V,t}, p_{(4)}^{V,t}\}$  with  $I_{(1)} < I_{(2)} < I_{(3)} < I_{(4)}$ , the simple 4D-prism is triangulated by the following four 4D-simplices with vertex sets

$$T_{1} = \{p_{(1)}^{V,t}, p_{(1)}^{V,t+\Delta t}, p_{(2)}^{V,t+\Delta t}, p_{(3)}^{V,t+\Delta t}, p_{(4)}^{V,t+\Delta t}\},\$$

$$T_{2} = \{p_{(1)}^{V,t}, p_{(2)}^{V,t}, p_{(2)}^{V,t+\Delta t}, p_{(3)}^{V,t+\Delta t}, p_{(4)}^{V,t+\Delta t}\},\$$

$$T_{3} = \{p_{(1)}^{V,t}, p_{(2)}^{V,t}, p_{(3)}^{V,t}, p_{(4)}^{V,t+\Delta t}, p_{(4)}^{V,t+\Delta t}\},\$$

$$T_{4} = \{p_{(1)}^{V,t}, p_{(2)}^{V,t}, p_{(3)}^{V,t}, p_{(4)}^{V,t+\Delta t}\},\$$

### **Extruded 3D Euler vortex convergence test**



Sample solution

**Convergence Plot** 

- DG and related high-order methods are getting sufficiently mature to handle realistic problems
- For moving domains with large deformations, novel mesh generation techniques and numerical schemes are required
- Constructive methods for generation of unstructured space-time 3D/4D simplex meshes
- Applications in DNS/LES/DDES flow problems, flapping flight, wind turbine simulations, etc