#### Software Abstractions for Structure Preservation

**Matt Knepley** 

Computer Science and Engineering University at Buffalo

Geometric Mechanics Formulations for Continuum Mechanics Banff, CA Mar 20, 2025

1846

Center for Hybrid Rocket Exascale Simulation Technology

# Never believe anything

until you run it.

#### Outline

Structure Preservation

Finite Elements

**Algebraic Solvers** 

Timesteppers

Lessons

What is a Structure-Preserving Method? Conservation

### Conserved quantities can arise,

#### from continuous symmetries.

(Neuenschwander 2017)

What is a Structure-Preserving Method? Montonicity

We can preserve

What is a Structure-Preserving Method? Montonicity

We can preserve

solution positivity (Horvath 2004) entropy monotonicity (Kraus and Hirvijoki 2017) solution monotonicity (Suresh and Huynh 1997) What is a Structure-Preserving Method? Manifolds

We can preserve

What is a Structure-Preserving Method? Manifolds

We can preserve

symplectic manifolds, (Ranocha and Ketcheson 2020) chiral manifolds, (Brower 1971) group manifolds. (Munthe-Kaas 1999)

#### What is a Structure-Preserving Method? Algebraic Relations

We can preserve

What is a Structure-Preserving Method? Algebraic Relations

We can preserve

symplecticity, (Skeel and Cieśliński 2020) algebraic compatibility, (Bonelle 2014) null spaces. (Schöberl 1999)

#### Accuracy

#### Accuracy

Stability

#### Accuracy

# Stability

Efficiency

### Accuracy

## Stability

Efficiency

Scalability

# Understandibility

# Understandibility

## Concision and Simplicity

# Understandibility

## Concision and Simplicity

Fewest Concepts (Occam's Razor)

# Understandibility

Concision and Simplicity

Fewest Concepts (Occam's Razor)

Ex. UNIX File abstraction

## Maintainability

# Maintainability

#### Small maintainer group

### Maintainability

### Small maintainer group

Often depends on workflows (Configure/Build/Test)

# Maintainability

Small maintainer group

Often depends on workflows (Configure/Build/Test)

Porting and optimization

# Maintainability

Small maintainer group

Often depends on workflows (Configure/Build/Test)

Porting and optimization

Ex. PETSc (Brown, Knepley, and Smith 2015)

# Extensibility

# Extensibility

#### Composability (Brown, Knepley, May, et al. 2012)

## Extensibility

Composability (Brown, Knepley, May, et al. 2012)

Can existing objects form a new thing?

# Extensibility

Composability (Brown, Knepley, May, et al. 2012)

Can existing objects form a new thing?

Increasing functionality, constant maintenance burden

# Extensibility

Composability (Brown, Knepley, May, et al. 2012)

Can existing objects form a new thing?

Increasing functionality, constant maintenance burden

Ex. Reynolds-robust PC (Farrell, Mitchell, et al. 2019)

# Humility

# Humility

#### Your interface might not be for everyone

# Humility

## Your interface might not be for everyone

Expose multiple layers

# Humility

#### Your interface might not be for everyone

Expose multiple layers

Ex. BLAS/LAPACK (Anderson et al. 1995)

#### Outline

Structure Preservation

Finite Elements Primal Basis Dual Basis Finite Elements

Algebraic Solvers

Timesteppers

Lessons

#### Outline

#### Finite Elements Primal Basis Dual Basis Finite Elements

**Basis Representation** 

# How should we represent an element?

# How should we represent an element?

# Tabulate basis functions

Assemble residual/Jacobian L<sub>2</sub> projection Boundary conditions
**Basis Representation** 

## How should we represent an element?

#### Tabulate basis functions

FIAT Deal.II DUNE FreeFEM++ **Basis Representation** 

# What could we do with an explicit basis representation?

# What could we do with an explicit basis representation?

Runtime tabulation for particle methods

#### Outline

Finite Elements Primal Basis Dual Basis Finite Elements

#### How could we tabulate the dual basis?

#### How could we tabulate the dual basis?

#### By Riesz-Markov-Kakutani (Wikipedia 2015a),

### dual vectors are quadrature rules.

 $\psi_i \rightarrow \{\mathbf{x}_i, \mathbf{w}_i\}$ 

#### How could we tabulate the dual basis?

#### We also have a geometric

## decomposition of the dual space

### mesh point $\rightarrow \{\psi_i\}$

# Exposing the dual basis allows cheap, custom interpolation.

## Exposing the dual basis allows cheap, custom interpolation. The geometric decomposition makes interpolation on embedded manifolds easy.

## Geometric decomposition + Discrete Hodge Star =

(Isaac 2022)

## Geometric decomposition + Discrete Hodge Star =

a single isomorphism to trace-free subspaces

$$\overset{*}{\star}_{T} : \mathcal{P}_{r}\Lambda^{k}(T) \to \overset{*}{\mathcal{P}}_{r+k+1}^{-}\Lambda^{n-k}(T)$$
$$\overset{*}{\star}_{T} : \mathcal{P}_{r}^{-}\Lambda^{k}(T) \to \overset{*}{\mathcal{P}}_{r+k}\Lambda^{n-k}(T)$$

## Geometric decomposition + Discrete Hodge Star =

a single isomorphism to trace-free subspaces

$$\overset{\,\,{}_{*}}{\star}_{T}:\Lambda^{k}(\overline{T})\to \mathring{\Lambda}^{n-k}(\overline{T})$$

that acts pointwise.

## Geometric decomposition + Discrete Hodge Star =

a single extension operator

$$E_{f,g}: \mathring{\Lambda}^k(\overline{f}) \to \Lambda^k(\overline{g})$$

that acts pointwise.

## Geometric decomposition + Discrete Hodge Star =

a single extension operator that decomposes

$$\mathcal{P}_{r}\Lambda^{k}(\overline{g}) = \bigoplus_{f \in \Delta(g)} E_{f,g}\left(\mathring{\mathcal{P}}_{r}\Lambda^{k}(\overline{f})\right)$$
$$\mathcal{P}_{r}^{-}\Lambda^{k}(\overline{g}) = \bigoplus_{f \in \Delta(g)} E_{f,g}\left(\mathring{\mathcal{P}}_{r}^{-}\Lambda^{k}(\overline{f})\right)$$

## Geometric decomposition + Discrete Hodge Star =

a single extension operator that decomposes

$$\Lambda^{k}(\overline{g}) = \bigoplus_{f \in \Delta(g)} E_{f,g}\left(\mathring{\Lambda}^{k}(\overline{f})\right)$$

#### Outline

#### **Finite Elements**

Primal Basis Dual Basis Finite Elements **FE Representation** 

#### Instead of names,

#### we can refer to elements by structure

#### Instead of names,

#### we can refer to elements by structure

## Primal Space

trimmed polynomial

direct product

direct sum

#### Instead of names,

#### we can refer to elements by structure

#### **Dual Space**

Lagrange direct sum

#### Raviart-Thomas on a Simplex

-petscspace\_degree <k>

-petscspace\_type ptrimmed

#### **Raviart-Thomas on a Simplex**

- -petscspace degree <k>
- -petscspace\_type\_ptrimmed
- -petscdualspace\_form degree -1
- -petscdualspace order <k>
- -petscdualspace lagrange trimmed **true**

#### Raviart-Thomas on a Quadrilateral

- -petscspace\_type sum
- -petscspace\_variables 2
- -petscspace\_components 2
- -petscspace\_sum\_spaces 2
- -petscspace\_sum\_concatenate true

- $-sumcomp_0_tensorcomp_1_petscspace_degree <k-1>$
- -sumcomp\_0\_tensorcomp\_0\_petscspace\_degree <k>
- -sumcomp\_0\_petscspace\_tensor\_uniform **false**
- -sumcomp\_0\_petscspace\_tensor\_spaces 2
- -sumcomp\_0\_petscspace\_type tensor
- -sumcomp\_0\_petscspace\_variables 2
- -petscspace\_sum\_concatenate true
- -petscspace\_sum\_spaces 2
- -petscspace\_variables 2 -petscspace\_components 2
- -petscspace\_type sum
- Raviart-Thomas on a Quadrilateral

#### Raviart-Thomas on a Quadrilateral

- -sumcomp\_1\_petscspace\_variables 2
- -sumcomp\_1\_petscspace\_type tensor
- -sumcomp\_1\_petscspace\_tensor\_spaces 2
- -sumcomp\_1\_petscspace\_tensor\_uniform **false**
- -sumcomp\_1\_tensorcomp\_0\_petscspace\_degree <k-1>
- -sumcomp\_1\_tensorcomp\_1\_petscspace\_degree <k>

#### Raviart-Thomas on a Quadrilateral

- -sumcomp\_1\_petscspace\_variables 2
- -sumcomp\_1\_petscspace\_type tensor
- -sumcomp\_1\_petscspace\_tensor\_spaces 2
- -sumcomp\_1\_petscspace\_tensor\_uniform **false**
- -sumcomp\_1\_tensorcomp\_0\_petscspace\_degree <k-1>
- -sumcomp\_1\_tensorcomp\_1\_petscspace\_degree <k>
- -petscdualspace\_form\_degree -1
- -petscdualspace\_order <k>
- -petscdualspace\_lagrange\_trimmed **true**

Brezzi-Douglas-Marini on a Simplex

-petscspace\_degree <k>

**Brezzi-Douglas-Marini on a Simplex** 

- -petscspace\_degree <k>
- -petscdualspace form degree -1

-petscdualspace lagrange trimmed **false** 

- -petscdualspace\_order <k>

First Kind Nedelec on a Simplex

-petscspace\_degree <k>

-petscspace\_type ptrimmed

#### First Kind Nedelec on a Simplex

- -petscspace degree <k>
- -petscspace\_type\_ptrimmed

-petscdualspace order <k>

-petscdualspace form degree 1

-petscdualspace lagrange trimmed **true** 

Second Kind Nedelec on a Simplex

-petscspace\_degree <k>

#### Second Kind Nedelec on a Simplex

- -petscspace\_degree <k>
- -petscdualspace form degree 1
- -petscdualspace\_order <k>

-petscdualspace lagrange trimmed **false** 

**Exterior Calculus** 

#### Could we build

## an explicit basis for $Alt^k V$ ?

src/dm/dt/interface/dtaltv.c

**Exterior Calculus** 

# We can check that the differential commutes with discretization:

 $\mathbf{d}\Pi(\omega) = \Pi(\mathbf{d}\omega)$ 

src/dm/dt/tests/ex14.c

**Exterior Calculus** 

# We can check that the differential commutes with discretization:

 $\mathbf{d}\Pi(\omega) = \Pi(\mathbf{d}\omega)$ 

src/dm/dt/tests/ex14.c

Produce a constructive proof in Lean?

#### Outline

Structure Preservation

Finite Elements

Algebraic Solvers

Timesteppers

Lessons

Parameter-Robust Smoothers

#### Smoothers for

#### $L + \alpha K$

#### can suffer as $\alpha \to \infty$ if

 $\mathcal{N}(K) \neq \emptyset.$
## Smoothers for

$$-\nabla \cdot 2\nu \epsilon(\mathbf{u}) + (\mathbf{u} \cdot \nabla)\mathbf{u} - \alpha \nabla (\nabla \cdot \mathbf{u})$$

can suffer as  $\alpha \to \infty$  if

$$\mathcal{N}(\nabla(\nabla \cdot \mathbf{u})) \neq \emptyset.$$

## The Schur complement is almost

$$S^{-1} \approx -(\nu + \alpha)M_p^{-1}$$

but the velocity smoother is hard.

## Patch smoothers satisfying $\sum_{i=1}^{n} W_{i} = \sum_{i=1}^{n} W_{i}$

# $\mathcal{N}(K) = \sum_{i} V_{i} \bigcap \mathcal{N}(K)$

are robust.

(Schöberl 1999)





FIG. 3.1. Star patch for  $\mathbb{BDM}_2$ -elements.

#### Incompressible Navier-Stokes



(Farrell, Mitchell, et al. 2019)

Mesh Topology

## Hasse Diagram (Wikipedia 2015b)



#### Mesh Topology

## DMPlex (Lange et al. 2016)



### Solver for the $\mathcal{H}(div)$ Riesz map

- -ksp\_type cg
- -pc\_type mg
- -mg\_levels\_ksp\_type richardson
- -mg\_levels\_ksp\_richardson\_scale 0.333333
- -mg\_levels\_pc\_type patch
- -mg\_levels\_patch\_pc\_patch\_local\_type additive
- -mg\_levels\_patch\_pc\_patch\_construct\_type star
- -mg\_levels\_patch\_pc\_patch\_construct\_dim 0

### (Farrell, Knepley, et al. 2021)

## Many papers followed (Adler, Benson, et al. 2021)

(Adler, He, et al. 2022)

(Laakmann, Farrell, et al. 2022)

(Abu-Labdeh et al. 2023)

(Laakmann, Hu, et al. 2023)

on different problems.

#### **Composable Solvers**

Incompressible Viscoresistive MHD



### (Laakmann, Farrell, et al. 2022)

#### **Composable Solvers**

#### Incompressible Viscoresistive MHD



#### (Laakmann, Farrell, et al. 2022)

#### **Composable Solvers**

#### Incompressible Viscoresistive MHD



#### (Laakmann, Farrell, et al. 2022)

#### Outline

Structure Preservation

Finite Elements

Algebraic Solvers

Timesteppers

Lessons

High-Level Interface

## Separate implicit and explicit parts

$$\boldsymbol{F}(\boldsymbol{u}, \dot{\boldsymbol{u}}, \boldsymbol{x}, t) = \boldsymbol{G}(\boldsymbol{u}, \boldsymbol{x}, t)$$

High-Level Interface

## Separate implicit and explicit parts

$$J_{\alpha} = \alpha F_{\dot{u}} + F_{u}$$

## **Explicit Methods:**

## Define only G, *F* is assumed to be $\dot{u}$

## Implicit Methods:

## Define only *F*, *G* is empty

## **IMEX Methods:**

## Define both F and G, but splitting is fixed

#### (Implicit) Runge-Kutta

Diagonally implicit Runge-Kutta ARKIMEX Strong Stability Preserving (Ketcheson 2008) Relaxation Runge-Kutta (Ketcheson 2019)

 $\theta$  method

**Backward Differentiation Formula** 

General Linear (Butcher et al. 2007)

 $\alpha$  method (Jansen et al. 2000)

Extrapolated IMEX (Constantinescu and Sandu 2010)

Rosenbrock-W (Shampine 1982)

## Implicit Runge-Kutta (IRK) is symplectic (Benettin and Giorgilli 1994)

## Implicit Runge-Kutta (IRK) is symplectic (Benettin and Giorgilli 1994) could also use DIRK

## Implicit Runge-Kutta (IRK) is symplectic (Benettin and Giorgilli 1994) could also use DIRK

Relaxation Runge-Kutta (RRK) is conservative / monotonic

## Implicit Runge-Kutta (IRK) is symplectic (Benettin and Giorgilli 1994) could also use DIRK

## Relaxation Runge-Kutta (RRK) is conservative / monotonic Needs a projection $\mathcal{P}$

## Explicit methods,

## Explicit methods,

## basic symplectic (Hairer et al. 2002)

## Explicit methods,

## basic symplectic (Hairer et al. 2002) Boris (volume-preserving) (Qin et al. 2013)

## Explicit methods,

## basic symplectic (Hairer et al. 2002) Boris (volume-preserving) (Qin et al. 2013)

need field splitting!

High-Level Interface

# Separate implicit and explicit parts, and fields,

 $F_i(u, \dot{u}, x, t) = G_i(u, x, t)$ 

High-Level Interface

# Separate implicit and explicit parts, and fields,

$$J_{i,\alpha} = \alpha F_{i,\dot{u}} + F_{i,u}$$

$$u_t = \mathcal{S}(u) \nabla F(u)$$

$$u_{n+1} - u_n = \Delta t \,\overline{\mathcal{S}}(u_n, u_{n+1}) \overline{\nabla F}(u_n, u_{n+1})$$

$$(u_{n+1} - u_n) \cdot \overline{\nabla F}(u_n, u_{n+1}) = F(u_{n+1}) - F(u_n)$$
$$\overline{\nabla F}(u_n, u_n) = \nabla F(u_n)$$

$$\overline{\nabla F}(u_n, u_{n+1}) = \nabla F(u_{n+1/2}) + (u_{n+1} - u_n) \cdot \frac{F(u_{n+1}) - F(u_n) - (u_{n+1} - u_n) \cdot \nabla F(u_{n+1/2})}{||u_{n+1} - u_n||^2}$$

### (Gonzalez 1996)

$$\overline{\nabla F}(u_n, u_{n+1}) = \int_0^1 d\xi \,\nabla F\left((1-\xi)u_n + \xi u_{n+1}\right)$$

(Harten et al. 1983) (Finn et al. 2025)

$$S(u_{n+1}) - S(u_n) = (E(u_{n+1}) - F(u_{n+1})) - (E(u_n) - F(u_n))$$
  
=  $-(F(u_{n+1}) - F(u_n))$   
=  $-((u_{n+1} - u_n) \cdot \overline{\nabla F}(u_n, u_{n+1}))$   
=  $-\Delta t \overline{\nabla F}(u_n, u_{n+1}) \overline{S}^T \overline{\nabla F}(u_n, u_{n+1})$ 

For metric systems, S is symmetric negative definite. (Kraus and Hirvijoki 2017) (Öttinger 2018)
#### **Discrete Gradients**

 $u_t = \mathcal{S}(u) \nabla F(u)$ 

Interface Extensions

# Field split (BSI) Domain split (PRK)

Term split (IMEX)

#### Outline

Structure Preservation

Finite Elements

**Algebraic Solvers** 

Timesteppers

Lessons





#### at runtime



#### at runtime

that compose together.

#### at runtime

#### that compose together.

(Brown, Knepley, and Smith 2015)

## Build in Layers

## Build in Layers

#### to allow targeted APIs

#### Build in Layers

# to allow targeted APIs that preserve understandability.

#### **Build in Layers**

## to allow targeted APIs

## that preserve understandability.

(Smith and Gropp 1996)

#### References I



Neuenschwander, Dwight E. (2017). Emmy Noether's wonderful theorem. JHU Press.

Horvath, Zoltan (2004). "On the positivity of matrix-vector products". In: Linear algebra and its applications 393, pp. 253–258.



Suresh, A. and H.T. Huynh (1997). "Accurate Monotonicity-Preserving Schemes with Runge–Kutta Time Stepping". In: Journal of Computational Physics 136.1, pp. 83–99. ISSN: 0021-9991. DOI: 10.1006/jcph.1997.5745.

Ranocha, Hendrik and David I Ketcheson (2020). "Relaxation Runge–Kutta methods for Hamiltonian problems". In: Journal of Scientific Computing 84.1, p. 17.

Brower, Richard C (1971). "A chiral invariant dual model". In: Physics Letters B 34.2, pp. 143-146.

Munthe-Kaas, Hans (1999). "High order Runge-Kutta methods on manifolds". In: Applied Numerical Mathematics 29.1, pp. 115-127.

#### Skeel, Robert D. and Jan L. Cieśliński (2020).

On the famous unpublished preprint "Methods of integration which preserve the contact transformation property of the Hamilton equations" by René De Vogelaere. arXiv: 2003.12268 [math.NA]. URL: https://arxiv.org/abs/2003.12268.

Bonelle, Jérôme (2014). "Compatible Discrete Operator schemes on polyhedral meshes for elliptic and Stokes equations". PhD thesis. Université Paris-Est.



Brown, Jed, Matthew G. Knepley, and Barry Smith (Jan. 2015). "Run-time extensibility and librarization of simulation software". In: IEEE Computing in Science and Engineering 17.1, pp. 38–45. DOI: 10.1109/MCSE.2014.95.

#### References II



Brown, Jed, Matthew Knepley, David A. May, Lois C. McInnes, and Barry F. Smith (2012). "Composable linear solvers for multiphysics". In: <u>Proceeedings of the 11th International Symposium on Parallel and Distributed Computing (ISPDC 2012)</u>. IEEE Computer Society, pp. 55–62. DOI: 10.1109/ISPDC.2012.16.



Farrell, Patrick E, Lawrence Mitchell, and Florian Wechsung (2019). "An augmented Lagrangian preconditioner for the 3D stationary incompressible Navier-Stokes equations at high Reynolds number". In: SIAM Journal on Scientific Computing 41.5, A3073–A3096. eprint: 1810.03315.



Anderson, E., Z. Bai, C. Bischof, J. Demmel, J. Dongarra, J. Du Cros, A. Greenbaum, S. Hammarling, A. McKenney, S. Ostrouchov, and D. Sorensen (1995). LAPACK User's Guide. Second. Philadelphia, Pennsylvania: SIAM.



Wikipedia (2015a). Riesz-Markov-Kakutani Representation Theorem.

http://en.wikipedia.org/wiki/Riesz-Markov-Kakutani\_representation\_theorem.URL: http://en.wikipedia.org/wiki/Riesz-Markov-Kakutani\_representation\_theorem.

Isaac, Toby (2022). Unifying the geometric decompositions of full and trimmed polynomial spaces in finite element exterior calculus. arXiv: 2112.02174 [math.NA]. URL: https://arxiv.org/abs/2112.02174.



Wikipedia (2015b). <u>Hasse Diagram</u>. http://en.wikipedia.org/wiki/Hasse\_diagram. URL: http://en.wikipedia.org/wiki/Hasse\_diagram.

Lange, Michael, Lawrence Mitchell, Matthew G. Knepley, and Gerard J. Gorman (2016). "Efficient mesh management in Firedrake using PETSc-DMPlex". In: SIAM Journal on Scientific Computing 38.5, S143–S155. DOI: 10.1137/15M1026092. eprint: http://arxiv.org/abs/1506.07749.

Farrell, Patrick E, Matthew G Knepley, Lawrence Mitchell, and Florian Wechsung (2021). "PCPATCH: software for the topological construction of multigrid relaxation methods". In: <u>ACM Transaction on Mathematical Software</u> 47.3, pp. 1–22. ISSN: 0098-3500. DOI: 10.1145/3445791. eprint: http://arxiv.org/abs/1912.08516.

Adler, James H, Thomas R Benson, Eric C Cyr, Patrick E Farrell, Scott P MacLachlan, and Ray S Tuminaro (2021). "Monolithic Multigrid Methods for Magnetohydrodynamics". In: SIAM Journal on Scientific Computing 0, S70–S91.

#### References III

- Adler, James H, Yunhui He, Xiaozhe Hu, Scott MacLachlan, and Peter Ohm (2022). "Monolithic multigrid for a reduced-quadrature discretization of poroelasticity". In: <u>SIAM Journal on Scientific Computing</u> 45.3, S54–S81.
- Laakmann, Fabian, Patrick E Farrell, and Lawrence Mitchell (2022). "An augmented Lagrangian preconditioner for the magnetohydrodynamics equations at high Reynolds and coupling numbers". In: <u>SIAM Journal on Scientific Computing</u> 44.4, B1018–B1044.
- Abu-Labdeh, Razan, Scott MacLachlan, and Patrick E Farrell (2023). "Monolithic multigrid for implicit Runge–Kutta discretizations of incompressible fluid flow". In: Journal of Computational Physics 478, p. 111961.
- Laakmann, Fabian, Kaibo Hu, and Patrick E Farrell (2023). "Structure-preserving and helicity-conserving finite element approximations and preconditioning for the Hall MHD equations". In: Journal of Computational Physics 492, p. 112410.
- Ketcheson, David I (2008). "Highly Efficient Strong Stability Preserving Runge-Kutta Methods with Low-Storage Implementations". In: SIAM Journal on Scientific Computing 30, pp. 2113–2136.
- (2019). "Relaxation Runge–Kutta methods: Conservation and stability for inner-product norms". In: <u>SIAM Journal on Numerical Analysis</u> 57.6, pp. 2850–2870.
  - Butcher, J.C., Z. Jackiewicz, and W.M. Wright (2007). "Error propagation of general linear methods for ordinary differential equations". In: Journal of Complexity 23.4-6, pp. 560–580. ISSN: 0885-064X. DOI: 10.1016/j.jco.2007.01.009.
- Jansen, Kenneth E, Christian H Whiting, and Gregory M Hulbert (2000). "A generalized-α method for integrating the filtered Navier–Stokes equations with a stabilized finite element method". In: Computer methods in applied mechanics and engineering 190.3-4, pp. 305–319.
- Constantinescu, E.M. and A. Sandu (2010). "Extrapolated implicit-explicit time stepping". In: <u>SIAM Journal on Scientific Computing</u> 31.6, pp. 4452–4477. DOI: 10.1137/080732833.
  - Shampine, Lawrence F (1982). "Implementation of Rosenbrock methods". In: ACM Transactions on Mathematical Software (TOMS) 8.2, pp. 93–113.

#### References IV



Benettin, Giancarlo and Antonio Giorgilli (1994). "On the Hamiltonian interpolation of near-to-the identity symplectic mappings with application to symplectic integration algorithms". In: Journal of Statistical Physics 74, pp. 1117–1143.



Hairer, E., Ch. Lubich, and G. Wanner (2002). Geometric Numerical Integration. Berlin Heidelberg: Springer-Verlag.



Gonzalez, Oscar (1996). "Time integration and discrete Hamiltonian systems". In: Journal of Nonlinear Science 6, pp. 449-467.

Harten, Amiram, Peter D Lax, and Bram van Leer (1983). "On upstream differencing and Godunov-type schemes for hyperbolic conservation laws". In: SIAM review 25.1, pp. 35–61.



Finn, Daniel S., Joseph V. Pusztay, Matthew G. Knepley, and Mark F. Adams (2025). "Entropy Monotonicity using Discrete Gradients in the Vlasov-Poisson-Landau System". In: Journal of Computational Physics. Submitted.



Öttinger, Hans Christian (Apr. 2018). "GENERIC Integrators: Structure Preserving Time Integration for Thermodynamic Systems". In: Journal of Non-Equilibrium Thermodynamics 43 (2), pp. 89–100. ISSN: 14374358. DOI: 10.1515/jnet-2017-0034.

Smith, Barry F. and William D. Gropp (1996). "The Design of Data-structure-neutral Libraries for the Iterative Solution of Sparse Linear Systems". In: Scientific Programming 5, pp. 329–336.