# Extension of the 1981 Arakawa and Lamb Scheme to Arbitrary Grids

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# Introduction

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# Key Principles of Numerical Modeling

- Not solving arbitrary PDEsphysical system
- 2 No analytic solutions
- Do algebraic solutions have the same properties as the differential solutions?



## Broad Research Overview: Dynamical Cores



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# Elements of Dynamical Core Design



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# C Grid and Z Grid Schemes

#### C and Z Grid Comparison

- C grid = staggered mass and wind
- Z grid = collocated mass, vorticity and divergence
- A major motivation of Z grid is to avoid computational modes; and have good wave dispersion properties independent of Rossby radius
- Comes at the cost of solving elliptic (global) equations



# Standing on the Shoulders of Giants



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# My Research

#### **Dissertation Overview**

- C Grid Scheme on Arbitrary Grids (Icosahedral and Cubed Sphere)
- Z Grid Scheme on Orthogonal Grids (Icosahedral)
- Linear Modes: Stationary and Propagating (Inertia-Gravity Waves and Rossby Waves)
- Test Cases- Williamson TC2 (Solid Body Rotation), TC5 (Flow over a Mountain), TC6 (Rossby-Haurwitz Wave); Galewsky, Thuburn Forced-Dissipative; Order of Accuracy



Icosahedral-hexagons



## Key Papers

#### Arakawa and Lamb 1981

#### A Potential Enstrophy and Energy Conserving Scheme for the Shallow Water Equations

AKIO ARAKAWA AND VIVIAN R. LAMB<sup>1</sup>

Salmon 2004

Poisson-Bracket Approach to the Construction of Energy- and Potential-Enstrophy-Conserving Algorithms for the Shallow-Water Equations

RICK SALMON

Thuburn, Cotter and Dubos 2012

#### A FRAMEWORK FOR MIMETIC DISCRETIZATION OF THE ROTATING SHALLOW-WATER EQUATIONS ON ARBITRARY POLYGONAL GRIDS\*

J. THUBURN<sup>†</sup> AND C. J. COTTER<sup>‡</sup>

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AL81 on arbitrary grids

# Extension of AL81 to Arbitrary Grids

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## Shallow Water Equations

#### Vector Invariant Shallow Water Equations

#### Vector Calculus Formulation

$$\frac{\partial h}{\partial t} + \vec{\nabla} \cdot (h\vec{u}) = 0$$
$$\frac{\partial \vec{u}}{\partial t} + q\hat{k} \times (h\vec{u}) + \vec{\nabla}\Phi = 0$$

#### Hamiltonian Formulation

$$\vec{x} = (h, \vec{u}) ; \frac{\partial \vec{x}}{\partial t} = \mathbb{J} \frac{\delta \mathcal{H}}{\delta \vec{x}}$$
$$\mathbb{J} = \begin{pmatrix} 0 & -\vec{\nabla} \cdot \\ -\vec{\nabla} & -q\hat{k} \times \end{pmatrix}$$
$$\mathcal{H} = \frac{1}{2}g(h, h) + \frac{1}{2}(h\vec{u}, \vec{u})$$
$$\frac{\delta \mathcal{H}}{\delta \vec{x}} = \begin{pmatrix} \Phi \\ h\vec{u} \end{pmatrix}$$

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## Shallow Water Equations: AL81 Scheme and Properties

Mimetic (Discrete Exterior Ca	lculus, Thuburn et. al 2012)
$ec  abla  imes ec \phi = 0$	$ar{D_2}ar{D_1}=0$
$(ec{ abla})^* = -ec{ abla}\cdot$	$D_2^{ op}=-ar{D_1}$

Conservation (Hamiltonian Methods, Salmon 2004)

# Arakawa and Lamb 1981 Scheme: Limitations and Extensions

#### (A Subset of) AL81 Shortcomings

Restricted to logically square, orthogonal grids

TRiSK: Ringler, Skamarok, Klemp, Thuburn, Cotter, Dubos

- Extension of AL81 to general, non-orthogonal polygonal grids
- Choose between total energy and potential enstrophy conservation



# What am I trying to accomplish?

- How can Arakawa and Lamb 1981 be extended to arbitrary, non-orthogonal polygonal grids?
- 2 Can the above be done in a way that preserves all of its desirable properties, and does not add new limitations?



# Mimetic Methods (Discrete Exterior Calculus)

#### Mimetic Operators

$$ec{
abla} imes ec{
abla} imes ec{
abla} \phi = 0 \Longleftrightarrow ec{D_2} ec{D_1} = 0$$
  
 $(ec{
abla})^* = -ec{
abla} \cdot \Longleftrightarrow D_2 = -ec{D_1}^T$ 



(Discrete) Exterior Derivative



Primal-Dual Grid Mass lives on primal grid

Image: A = A

# Conservation Laws (Hamiltonian Mechanics)

#### Hamiltonian (Energy)

$$\mathbb{J}^{\mathcal{T}}=-\mathbb{J}$$

#### $\ensuremath{\mathcal{H}}$ is positive definite

#### Casimirs (Potential Enstrophy)

$$\mathbb{J}\frac{\delta \mathcal{Z}}{\delta \vec{x}} = 0$$

#### Discrete Conservation

Enforce these conditions in discrete case  $\rightarrow$  conservation!

# Recap: Conservative, Mimetic Methods

# Conservation Laws

 ${\mathcal H}$  is positive definite

#### Mimetic Properties

$$\vec{
abla} imes \vec{
abla} \phi = \mathbf{0} \Longleftrightarrow \vec{D_2} \vec{D_1} = \mathbf{0}$$

$$(\vec{\nabla})^* = -\vec{\nabla} \cdot \Longleftrightarrow D_2 = -\bar{D_1}^T$$

#### Conservative, Mimetic Methods

 Use mimetic operators to build a discrete (quasi-)Hamiltonian system

# Generalized C Grid Discretization: Hamiltonian-DEC

• Discrete variables are  $m_i = \int h dA$  and  $u_e = \int \vec{u} \cdot \vec{dI}$ 

• C grid staggering  $(m_i \text{ at cell centers}, u_e \text{ at edges})$ 



#### **Q** operator is the remaining hurdle

# What is **Q**?



Diagram of Q operator action

# $q\hat{k} imes extsf{Q}$

Given mass fluxes normal to primal edges and potential vorticities at vertices (black diamonds), produces PV fluxes normal to dual edges

# General Form of **Q**

Following Salmon 2004, set

$$\mathbf{Q}F_{e} = \sum_{\mathbf{e}' \in \mathbf{ECP}(e)} \sum_{\mathbf{v} \in \mathbf{VC}(i)} q_{\mathbf{v}} \alpha_{e,\mathbf{e}',\mathbf{v}} F_{\mathbf{e}'}$$

What are  $\alpha_{e,e',v}$ 's? Each  $\alpha_{e,e',v}$  is associated with one green/red edge pair; and one blue vertex



Diagram of Q operator stencil

## **Discrete** Conservation

#### Energy

$$\mathbb{J}^{\mathsf{T}} = -\mathbb{J} \longrightarrow \mathbf{Q} = -\mathbf{Q}^{\mathsf{T}} \longrightarrow \alpha_{e,e',v} = -\alpha_{e',e,v}$$

#### Potential Enstrophy

$$\mathbb{J}\frac{\delta \mathcal{Z}}{\delta \vec{x}} = 0 \longrightarrow \text{ linear system of equations} \longrightarrow \mathbf{A}\vec{\alpha} = \vec{b}$$

Also want **Q** to give steady geostrophic modes when  $q_v$  is constant

# Solving $\mathbf{A}\vec{\alpha} = \vec{b}$

#### Issue: System is too large

- Geodesic grid: 90 coefficients per cell, all coefficients are interdependent  $\rightarrow$  not feasible for realistic grids
- Cubed sphere grid is similar (24 coefficients per cell)

#### Solution: Subsystem Splitting

$$\mathbf{A}\vec{lpha} = \vec{b} \longrightarrow \sum_{i} \mathbf{A}_{i}\vec{lpha}_{i} = \vec{b}_{i}$$

Split into independent subsystems for each cell!

System has been solved for various planar and spherical grids Gives AL81 on a uniform square grid

# Recap: What have I accomplished?

#### What has been done?

- Arakawa and Lamb 1981 extended to arbitrary grids via new **Q**
- Coefficients can be precomputed (efficiently)

#### Hamiltonian

 $\ensuremath{\mathcal{H}}$  is positive definite

$$\mathbb{J} = -\mathbb{J}^{\mathsf{T}}$$
$$\mathbb{J} \frac{\delta \mathcal{Z}}{\delta \vec{x}} = 0$$

#### Mimetic

$$\vec{\nabla} \times \vec{\nabla} \phi = 0 \iff \bar{D}_2 \bar{D}_1 = 0$$
$$(\vec{\nabla})^* = -\vec{\nabla} \iff D_2 = -\bar{D}_1^T$$



# Test Case Results

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# Model Configuration

#### Settings

- Cubed Sphere: 6x384x384, 880K cells (25km resolution)
- Geodesic: G8, 640K cells (30km resolution)
- 3rd Order Adams Bashford (15s CS, 22.5s Geodesic)
- 3 Variants of **Q**



# Galewsky et. al

# Galewsky (Unstable Jet)

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No dissipation

Run for 10 days, absolute vorticity at 6 days is shown Perturbation added to (balanced) initial height field

# Galewsky et. al (Unstable Jet)- C Grid Geodesic



Inactive portion of jet differs

Minor differences in active portion of jet

A > 4 B

# Galewsky et. al (Unstable Jet)- C Grid Cubed Sphere



A > 4 B

# Galewsky et. al (Unstable Jet)- Z Grid Geodesic



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## Order of Accuracy

# Order of Accuracy (Taylor Series Sense)

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RMS Error

# Order of Accuracy- Laplacian on Primal (C Grid)

#### 10 100 10-1 10-1 10-2 10.5 10-3 10-3 10-10 geo-tweaked geo-tweaked aeo-spring0.8 geo-spring0.8 aeo-spring1.1 aeo-sprina1.1 10.5 10 aeo-cvt aeo-cvt 101 10 10<sup>2</sup> 10<sup>3</sup> 10<sup>4</sup> 10<sup>6</sup> 101 10<sup>5</sup> 107 10 10<sup>2</sup> 103 $10^{4}$ 105 $10^{6}$ 107 Computed for $\psi = \cos(\theta) \sin(\lambda)$

Maximum Error

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Cubed sphere is inconsistent, geodesic is  $\approx$ 1st order

# Order of Accuracy- Q

**RMS Error** 

## Maximum Error

10 10 10 10-2 10-2 10-3 10-3 10-4 10 geo-tweaked geo-tweaked aeo-spring0.8 aeo-sprina0.8 10-5 geo-spring1.1 geo-spring1.1 10 aeo-cvt aeo-cvt 101 10 104 101 10<sup>2</sup> 103 105  $10^{6}$ 107 103 102  $10^{3}$  $10^{4}$ 105  $10^{6}$ 107

Computed for  $\psi = q = \cos(\theta) \sin(\lambda)$ error =  $q_e \bar{D_1} \psi_e - \mathbf{Q}(q_v, D_1 \psi_v)$ error = exact PV flux from streamfunction vs computed PV flux All grids are inconsistent

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# Order of Accuracy- Zonal Jet (Williamson Test Case 2, C Grid)





# Thuburn (Forced-Dissipative Turbulence)

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# Thuburn (Forced-Dissipative Turbulence)- Description



2400 days total run time: 400 days spin-up, 2000 days simulation Run at C6/G6 resolution ( $\approx$  120km resolution)

# Thuburn (Forced-Dissipative Turbulence)- Height (C Grid Geodesic)



#### Zonal means are basically identical Differences (mid-latitudes) in zonal standard deviations

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# Thuburn (Forced-Dissipative Turbulence)- Height (C Grid Cubed Sphere)



#### Total energy variant has issues in zonal mean Zonal standard deviations are different

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# Thuburn (Forced-Dissipative Turbulence)- Height (Z Grid Geodesic)



#### Identical zonal means Differences in zonal standard deviations at mid-latitudes

# Thuburn (Forced-Dissipative Turbulence)- Divergence (Zonal Means, C and Z Grid)







C Grid Geodesic C Grid Cubed Sphere Z Geodesic zonal means are almost identical Again, cubed-sphere total energy variant is different Z Grid and C grid markedly different

Z Grid Geodesic

# Thuburn (Forced-Dissipative Turbulence)- Divergence (C Grid)



C Grid Geodesic



#### C Grid Cubed Sphere

Strong grid imprinting for ALL grids

C Grid Geodesic

# Thuburn (Forced-Dissipative Turbulence)- Divergence (Z Grid)



Z Grid Geodesic

Z grid does not show the same grid imprinting Possibly due to better behaviour of inconsistent Z grid operator (Jacobian)?

Summary and Conclusions

# Conclusions

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# Summary

#### Summary

- Galewsky results indicate all geodesic variants, and all but total energy cubed-sphere variants are producing good results
- Q is inconsistent for all grids; Laplacians are inconsistent for cubed-sphere
- Long time tests (Thuburn forced-dissipative) show strong grid imprinting NOT present in shorter (Galewsky) tests
- The Z grid scheme does not appear to have any of these issues, but it is also inconsistent (Jacobian operator)

# Fixing the C Grid Scheme

#### Primal-Dual Finite Elements

- Recent work by John Thuburn and Colin Cotter
- ≥ Low order, compound polygonal finite elements (same degrees of freedom) → all operators are consistent
- Current version does not conserve energy or potential enstrophy
- Can fix this with Hamiltonian approach



Figure from Thuburn and Cotter 2015. Bottom row is primal function spaces, top row is dual function spaces.

## Elements of Dynamical Core Design- Redux



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# Conclusions

#### Conclusions

- This C grid scheme on geodesic and cubed-sphere grids does not appear suitable as a basis for dynamical core development
- This Z grid scheme does appear suitable, but inconsistency is troubling, although it can likely be fixed

#### Future Work

- Consistent Q (Primal-Dual Finite Element)
- Onsistent Jacobian operator for Z grid (Finite Element)
- Output State of the second second
- Sully conservative (implicit) time stepping

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# **Questions?**