Overview	AC/CH	AC first order	CH first order	Second Order	BE Analysis	Summary
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### Asymptotic Behaviour of Time Stepping Methods for Phase Field Models

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SIAM Materials Science May, 2021



### Overview

# Joint work with Xinyu Cheng, Dong Li, and Keith Promislow JSC (2021)

- Allen Cahn and Cahn Hilliard Meta-Stable Dynamics
- Adaptive Time Stepping:
  - Schemes
  - Predictions (Profile Fidelity)
  - Numerical Validation
- Rigorous Result for Backward Euler for AC

High Accuracy Benchmark Problems for Allen-Cahn and Cahn-Hilliard Dynamics, CiCP (2019).



#### Allen Cahn Dynamics

$$u_t = \Delta u - (u^3 - u)/\epsilon^2$$

Allen and Cahn, Acta Metall 1979

- solutions tend to  $u = \pm 1$  in O(1/ $\epsilon^2$ ) time: spinodal evolution
- Interfaces move approximately with curvature motion as  $\epsilon \rightarrow 0$  in an O(1) time scale (meta-stable dynamics).
- This equation is gradient flow on the energy

$$\mathcal{E} = \int_0^{2\pi} \left( |
abla u|^2/2 + W(u)/\epsilon^2 
ight) dx$$

with  $W(u) = \frac{1}{4}(u^2 - 1)^2$ .

• This leads to a symmetric Jacobian matrix for the implicit time steps of the spatial discretization.



#### Cahn-Hilliard Dynamics

$$u_t = -\Delta \left(\epsilon \Delta u - (u^3 - u)/\epsilon\right)$$

Cahn and Hilliard, J Chem Phys 1958

• Gradient flow on the same energy a AC but in the  $H_{-1}$  norm that has inner product

$$(u, v)_{H_{-1}} := (u, \Delta^{-1}v)$$

- Conserves the mass of the two phases
- The meta-stable interface motion is nonlocal, Mullins-Sekerka flow, in O(1) time scale.

Overview 0 AC first order

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Second Order

BE Analysis 0 Summary

#### Cahn-Hilliard Dynamics

#### Computational Results



#### YouTube: https://youtu.be/MovUu2DwWvI



Second Order

BE Analysis O Summary O

# Cahn-Hilliard Dynamics

#### **Computational Results**





### Two Wisdoms for Time Stepping

Wisdom #1:

- It is a problem with two equally stiff terms and dynamics of widely varying time scales
- Use implicit stiff solvers with variable time steps (local error tolerance  $\sigma$ )
- Choke down the extra effort to solve the nonlinear problem at every time step

Wisdom #2:

- It is a gradient flow
- Use fixed time steps and Energy Stable time stepping schemes for efficiency
- Choke down the loss of accuracy when time steps cannot capture fast dynamics

Accuracy more important in FCH: Jae Hyun Park talk tomorrow



#### Honest Message

- Goal is to compare the efficiency between time stepping strategies to achieve a result with a given accuracy.
- No reason to use fixed time steps, adapt with a local error tolerance  $\sigma.$
- Clear story when we consider the comparison of time step size k dependence on  $\sigma$  and  $\epsilon \rightarrow 0$ .
- But that is not the whole story (solver efficiency).

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# Allen Cahn Dynamics

#### **Computational Results**





#### Allen Cahn Dynamics

#### Details of Computational Results



Next Step: Get a formal understanding of how time steps k depend on  $\epsilon$  and  $\sigma$ .



#### First Order Schemes for AC

$$u_t = \Delta u - (u^3 - u)/\epsilon^2$$

Consider Spatially Continuous Semi-Discretization (Map of Planes) FI Fully Implicit (Backward Euler):

$$U^{n+1} = U^{n} + k\Delta U^{n+1} - k \left[ (U^{n+1})^3 - U^{n+1} \right] ) / \epsilon^2$$

ES Energy Stable (Eyre, Convex/Concave Splitting):

$$U^{n+1} = U^{n} + k\Delta U^{n+1} - k \left[ (U^{n+1})^{3} - U^{n} \right] ) / \epsilon^{2}$$

- ES schemes have desirable properties.
- FI schemes are asymptotically more accurate than ES.



#### Local Truncation Error

Asymptotic solution in metastable dynamics:

$$u(x,t) \approx anh\left(rac{\operatorname{dist}(x,\Gamma)}{\epsilon\sqrt{2}}
ight)$$
, so  $rac{\partial^n u}{\partial t^n} = O(\epsilon^{-n})$ 

FI local error

$$\frac{1}{2}k^2u_{tt}=O(k^2/\epsilon^2)$$

ES

$$U^{n+1} = U^n + k\Delta U^{n+1} - k \left[ (U^{n+1})^3 - U^n \right] ) / \epsilon^2 = FI - k (U^{n+1} - U^n) / \epsilon^2$$

ES dominant local error term

$$k^2 u_t / \epsilon^2 = O(k^2 / \epsilon^3)$$

ES is asymptotically less accurate than FI.



### Adaptive Time Stepping

Let  $\sigma$  be the allowable local error per time step.

FI (local error  $O(k^2/\epsilon^2)$ )

•  $k = O(\sqrt{\sigma}\epsilon)$ 

• 
$$M = O(1/k) = O(1/(\sqrt{\sigma}\epsilon))$$

ES (local error  ${\it O}(k^2/\epsilon^3))$  also SDBF1 and SAV1

•  $k = O(\sqrt{\sigma}\epsilon^{3/2})$ 

• 
$$M = O(1/k) = O(1/(\sqrt{\sigma}\epsilon^{3/2}))$$

This formal argument relies on the fact that the schemes with these time steps retain the layer profile structure: profile fidelity

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AC first order

CH first order

Second Order

BE Analysis 0 Summary O

## AC Numerical Results

Fully Implicit  $M = O(1/(\sqrt{\sigma}\epsilon))$ 

 $\epsilon =$  0.2,  $\sigma$  varied

σ	М	CG	E
1e-4	717	5,348 [7.46]	0.003
1e-5	2,225 (3.10)	9,448 [4.24]	0.001
1e-6	7,010 (3.15)	23,017 [3.28]	0.001

Validates  $M = O(\sqrt{1/\sigma})$  for constant  $\epsilon$ . ( $\sqrt{10} \approx 3.16$ ).

#### $\epsilon$ varied, $\sigma = 1e - 4$

$\epsilon$	M	CG	E
0.2	717	5,348 [7.46]	0.003
0.1	1,291 (1.80)	12,354 [9.57]	0.001
0.05	2,412 (1.87)	27,782 [11.52]	0.001
0.025	4,630 (1.92)	64,884 [14.01]	*

Validates  $M = O(1/\epsilon)$  for constant  $\sigma$ .

Overview 0 AC first order ○○○ ○● CH first order

Second Order

BE Analysis 0 Summary O

### AC Numerical Results

Energy Stable  $M = O(1/(\sqrt{\sigma}\epsilon^{3/2}))$ 

 $\epsilon =$  0.2,  $\sigma$  varied

σ	М	CG	E
1e-4	2,350	14,856 [6.32]	0.047
1e-5	7,351 (3.12)	28,263 [3.85]	0.014
1e-6	23,172 (3.15)	68,148 [2.94]	0.004

Validates  $M = O(\sqrt{\sigma})$  for constant  $\epsilon$ ,  $(\sqrt{10} \approx 3.16)$ .  $\epsilon$  varied,  $\sigma = 1e - 4$ 

$\epsilon$	М	CG	transition
0.2	2,350	14,856 [6.32]	0.047
0.1	6,463 (2.75)	44,717 [6.92]	0.069
0.05	18,218 (2.83)	143,416 [7.87]	0.099
0.025	52,595 (2.89)	497,846 [9.47]	0.141

Validates  $M = O(1/\epsilon^{3/2})$  for constant  $\sigma$ ,  $(2^{3/2} \approx 2.83)$ , and reduced accuracy as  $\epsilon \to 0$ .

Overview	AC/CH	AC first order	CH first order	Second Order
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Cahn Hilliard Equation

#### Local Truncation Error

FI local error as before

$$\frac{1}{2}k^2u_{tt}=O(k^2/\epsilon^2)$$

ES dominant local error term

$$k^2 \Delta u_t / \epsilon = O(k^2 / \epsilon^4)$$

Gap in performance between FI and ES larger for CH than AC.



### Adaptive Time Stepping for CH

Let  $\sigma$  be the allowable local error per time step.

FI (local error  $O(k^2/\epsilon^2)$ )

- $k = O(\sqrt{\sigma}\epsilon)$
- $M = O(1/k) = O(1/(\sqrt{\sigma}\epsilon))$

ES (local error  $O(k^2/\epsilon^4)$ )

- $k = O(\sqrt{\sigma}\epsilon^2)$
- $M = O(1/k) = O(1/(\sqrt{\sigma}\epsilon^2))$

Observed computationally.

Overview	AC/CH	AC first order	CH first order	Second Order	BE Analysis	Summary
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Second Order L-stable Schemes

BDF2: 
$$\frac{3U}{2} - k\mathcal{F}(U) = 2U^n - U^{n-1}/2$$

Local truncation error  $-k^3 u_{ttt}/3 = O(k^3/\epsilon^3)$  for both AC and CH.

DIRK2: 
$$U^* - \alpha k \mathcal{F}(U^*) = U^n$$
  
 $U - \alpha k \mathcal{F}(U) = U^n + (1 - \alpha) k \mathcal{F}(U^*)$ 

Local truncation error (also SBDF2, SAV2, Secant)

AC: 
$$3\alpha^2(1-\alpha)uu_t^2/(2\epsilon^2) = O(k^3/\epsilon^4)$$
  
CH:  $-\Delta \left(3\alpha^2(1-\alpha)uu_t^2/(2\epsilon)\right) = O(k^3/\epsilon^5)$ 

Observed computationally.



### Source of Increased Error

- In the metastable regimes of AC and CH, diffusion and nonlinear reaction are both large but approximately cancel to give the slow dynamics.
- FI(BE) and BDF2 dominant truncation errors that are pure time derivatives of the solution, which inherit this high order cancellation.
- ES and DIRK2 (SBDF2, SAV2) have truncation errors that involve the reaction term individually, hence the amplification in size.

#### Surprises:

- No time step accepted for accuracy by the adaptive time stepping strategy for any scheme for any of the computations exhibited an energy increase.
- With adaptive time stepping, SBDF and SAV schemes behave identically.

### BE Accuracy for AC

**BE** Analysis

A naïve prediction for the final accuracy of BE is  $M\sigma = O(\sqrt{\sigma}/\epsilon)$ , but we see computationally accuracy independent of  $\epsilon$  for fixed  $\sigma$ . A formal asymptotic analysis shows that the dominant truncation error term is strongly damped at each time step.

Rigorous analysis of BE for AC (radial case) has been done: in meta-stable dynamics, BE has profile fidelity and energy stability with  $k = o(\epsilon)$  (appropriate for accuracy).

Another Surprise:  $f(u) = u^3 - u \rightarrow f(u) = u^5 - u^3$ BE performance is unchanged but Eyre time steps change dramatically

$$k = O(\sqrt{\sigma}\epsilon^{3/2}) \rightarrow k = O(\sqrt{\sigma}\epsilon^2)$$

due to a loss of profile fidelity.



- 1. Behaviour of time steps for different schemes for AC and CH with  $\sigma$  and  $\epsilon$  is predicted and validated with numerical experiments.
- It is seen that methods with a dominant local truncation error that is a pure time derivative behave asymptotically better (fewer time steps) than those that do not. BE and BDF2 have this desirable property.
- 3. We observe better accuracy for BE applied to AC than expected. A formal asymptotic argument can explain the behaviour.
- 4. Rigorous proof for large energy stable time steps with BE.