## Error estimates for SISL methods and the Moving Mesh SISL method

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- Most problems in fluid mechanics and meteorology are advection-dominated.
- Explicit time integration is computationally efficient but the time step is constrained by wave speed and mesh resolution (CFL condition).
- Semi-implicit Semi-Lagrangian (SISL) methods are effective in dealing with large CFL numbers.
- The main source of error in SISL schemes is given by interpolation. This can be reduced with adaptive mesh methods (both r- and h-adaptive).

Combine moving mesh strategy with SISL to obtain a scheme with low error and no CFL restriction !

- Describe SISL method.
- Find analytic expression for diffusive and dispersive errors when applying SISL to Burger's equation in 1D.
- Describe Moving Mesh SISL method.
- Show results of MMSISL applied to 1D Burger's equation and Shallow Water equations.
- Future work.

## The Semi-Implicit Semi-Lagrangian (SISL) Method

Physical PDE: 
$$\frac{Du}{Dt} = f(x, u_x, u_{xx}), \ \frac{D}{Dt} = \frac{\partial}{\partial t} + u\partial_x$$



Kinematic Equation:  $X_A - X_D = \int_{t^n}^{t^{n+1}} u(X(t), t) dt$ 

$$= (\mathcal{N} + Y)\Delta x, \quad \mathcal{N} \in \mathbb{N}, \ 0 \leq Y < 1$$

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Using a semi-implicit 2TL discretization leads to the system:

$$(X_A - X_D)/\Delta t = \frac{1}{2}(U_A^{n+1} + U_D^n)$$
 (1)

$$\left(\frac{U_A^{n+1}}{H} + \frac{U_D^n}{H}\right) / (\Delta t) = \theta f_A^{n+1} + (1-\theta) f_D^n, \quad 0 \le \theta < 1$$
(2)

Solve for the unknown field  $U_A^{n+1}$  using the interpolated quantities  $U_D$ ,  $f_D$ . Source of fast waves in  $f_A$  are treated implicitly, while the remaining terms are treated explicitly.

### Implementation

- At time  $t^n = n\Delta t$ , set  $X_D = X_A$  and discretize  $f(x, u, u_x, u_{xx})$  at mesh points  $X_A$ .
- **2** Find an estimate of  $U_A^{n+1}$  by solving (2).
- Find  $X_D$  by solving (1).
- Interpolate  $f^n$ ,  $U^n$  onto  $X_D$  using an interpolation procedure.
- Solution Apply iteratively step (1-4) to find  $U_A^{n+1}$ .

L2 error between numerical and exact solution is given by:

- Spatial and Temporal discretization of the physical PDE
- Location of the departure points
- Interpolation of  $f^n$ ,  $U^n$  onto  $X_D$
- Interpolation of the discrete solution  $U_A^{n+1}$

## Application of SISL to Burger's Equation

$$\begin{aligned} \frac{Du}{Dt} &= \epsilon u_{xx} \quad 0 < \epsilon < 1, \\ u(-\infty, t) &= c + \alpha, \\ u(+\infty, t) &= c - \alpha. \end{aligned}$$

The exact solution is a travelling wave at constant speed *c*:

$$u(x,t) = c - \alpha \tanh\left(\frac{lpha(x-ct)}{2\epsilon}\right)$$

We expect  $\epsilon$  to be very small in real applications, so that  $\Delta x/\epsilon >> 1$ .

# The SISL method gives a solution with broader front than the exact travelling wave



x

Figure: Numerical solution with parameters  $\alpha = 0.1$ ,  $\epsilon = 1e - 4$ , c = 1

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SISL solution with *piecewise linear interpolation* is a rescaled tanh function:

$$\hat{u}(x,t) = c - lpha anh\left(rac{lpha(x-\hat{c}t)}{2\hat{\epsilon}}
ight)$$



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15 June 2020 9 / 31

Dissipative error:

 $\hat{\epsilon} = O(\Delta x) >> \epsilon$ 

Dispersive error:

$$\hat{c} = c + O(\alpha^2 \Delta x / \hat{\epsilon})$$

The errors are analysed using the modified equation analysis:

Find the modified nonlinear PDE satisfied exactly by the SISL solution

We obtain that the dominant source of error is given by the *interpolation step* in the SISL calculation.

Let 
$$U_j^n = \hat{u}(j\Delta x, n\Delta t) = V(j\Delta x - \hat{c}n\Delta t) = V(z)$$

Substitute it into the SISL scheme and expand the solution to find V(z) as heteroclinic solution of the ODE:

$$\begin{split} \Delta t \left( \left( V - \widehat{c} \right) V' - \varepsilon V'' \right) &= \frac{\Delta t^2}{2} \left( \widehat{c} + V \right) \left( V'^2 + \left( V - \widehat{c} \right) V'' - \varepsilon V''' \right) \\ &+ \frac{1}{2} \left[ \left( \left( 2\mathcal{N} + 1 \right) \Delta x - V \Delta t \right) V \Delta t - \left( \mathcal{N}^2 + \mathcal{N} \right) \Delta x^2 \right] V'' \\ &+ \mathcal{O} \left( \left( \Delta x + \Delta t \right)^3 \right) \,. \end{split}$$

$$V(-\infty) = c + \alpha, \quad V(\infty) = c - \alpha.$$

Solve for V(z) and c by expanding in powers of  $\alpha$ .

## Types of error

The linear interpolant depends on the CFL number

$$u_{\textit{CFL}} = c\Delta t / \Delta x = \mathcal{N} + Y, \mathcal{N} \in \mathbb{N}, \quad 0 \leq Y < 1$$

$$\hat{\epsilon} = \epsilon + \frac{cY(1-Y)\Delta x}{2\nu_{CFL}} + O(\alpha\Delta x^2)$$
$$\hat{c} = c - \frac{\alpha^2(1-2Y)\nu_{CFL}}{3cY(1-Y) + 6\epsilon\nu_{CFL}/\Delta x} + O(\alpha^2\Delta x^2)$$

The dissipative error is smallest when Y = 0(Right solution at the wrong time) The dispersive error is smallest when Y = 1/2(Wrong solution at the right time)

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#### The error increases as the time step decreases !



## Dispersive Error: Burger's equation



15 June 2020 14 / 31

## Hermite interpolation



- Flux limited Hermite interpolant reduces diffusive error but has significant dispersive error.
- Non-monotonic Hermite interpolant has dispersive error and oscillatory approximation error.

## Dispersion/Diffusion Error for Lagrange interpolation



## 1D Shallow-Water equation

$$\begin{aligned} \text{Momentum equation} &: \frac{Du}{Dt} + g\partial_x h = 0, \\ \text{Continuity equation} &: \frac{Dh}{Dt} + \partial_x(hu) = 0, \\ \text{Boundary conditions} &: \partial_x h(0, t) = \partial_x h(L, t) = 0, \\ u(0, t) &= u(L, t) = 0. \end{aligned}$$



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15 June 2020 17 / 31

We perform numerical tests with the SISL scheme applied to the Dam-Break problem

$$h(x,0) = \begin{cases} h_l & \text{if } 0 \le x \le x_0 \\ h_r & \text{if } x_0 < x \le L \end{cases} \quad u(x,0) = 0 \ m/s, \tag{16}$$

with  $h_r = 3$ ,  $h_l = 1$ ,  $x_0 = 5$  and domain [0, 10].



Figure: Numerical and exact solution of h, u at time t = 0.5 (blue) and t = 2 (black)

## The solution develops a left-going rarefaction wave and a right-propagating shock wave.



#### Observations:

- Error is mainly Dispersive
- Highly oscillatory error for small  $N_x$
- Peaks are observed for increasing  $N_x$  when  $\Delta t$  is reduced. As the interpolation is the main source of error in the SISL scheme, we see that these peaks are linked to the propagating shock wave, associated with integer-valued  $\nu_{CFL} = v_s \Delta t / \Delta x$ , where  $v_s$  is the analytical shock speed. The minimum error is obtained for half-integer  $\nu_{CFL}$ .

## The Moving Mesh SISL method

• Calculate the new mesh point locations  $X_i^n$  via equidistribution:

$$\int_{X_j^n}^{X_{j+1}^n} \rho(u(x,t^n)) dx = \theta(t^n)$$

- Set arrival points:  $X_{j,A}^{n+1} = X_j^n$
- Apply SISL iterative scheme on the non-uniform mesh

#### Advantages:

- Interpolation onto the new mesh is handled within the SISL method
- Spatial accuracy increased and no CFL restriction.
- Curvature monitor function  $\rho = \sqrt{1 + \beta u_{xx}^2}$  gives optimal error estimates for linear interpolation. In practice also arc-length monitor function is used:  $\rho = \sqrt{1 + \beta u_x^2}$

- At time level  $t^n = n\Delta t$ , we have a computed solution  $U_j^n$  at the current points  $X_j^n$ .
- Evaluate  $\rho(U_j^n, X_j^n)$  to compute the new arrival points  $X_{j,A}^{n+1}$ .
- Use the kinematic equation (1) to compute the departure point  $X_{j,D}^n$  from  $X_{j,A}^{n+1}$ .
- Apply the SISL iterative scheme to find the new computed solution  $U_{i,A}^{n+1}$ .

No interpolation onto the new mesh is needed !

## The MMSISL scheme on Burger's equation



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15 June 2020 22 / 31

## Dissipative/Dispersion error MMSISL



Figure: Arc-length monitor function for Burger's equation (MAX CFL = 37.5)

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#### L2 error

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Figure: Error for arc-length monitor function  $\rho = \sqrt{1 + \beta u_x^2}$ 

## Dissipative/Dispersion error MMSISL



Figure: Curvature monitor function for Burger's equation (MAX CFL = 37.5)

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15 June 2020 25 / 31

### Two evolving fronts solution of Burger's equation





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## The MMSISL scheme on Dam break problem



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15 June 2020 27 / 31

## Moving Mesh SWEs with Euler scheme



Solution affected by numerical dissipation and dispersion.

Number of mesh points  $N_x$  must be limited (< 100) to avoid instability.

Forward Euler problem unstable for  $\nu_{CFL} < 1$  and  $\beta > 1$ .

- The SISL method allow for big time steps with no CFL constraint. Interpolation error poses a problem for spatial accuracy.
- The Moving Mesh SISL method reduces significantly the spatial error by adapting the mesh to the solution according to the equidistribution principle.
- Interpolation to the arrival points is handled automatically by the SISL method.
- Accurate and stable results have been showed for the Burger's equation and the Dam-Break problem.

- Extend the MMSISL method to more complex problems in higher dimensions.
- 2D mesh adaptation by solving an optimal-transport Monge-Ampere equation with the Mixed Finite Element method.
- Use a posteriori-errori DG estimate as monitor function  $\rho$ .
- Implement mass conservative interpolation scheme by local Galerkin projection.

## THANK YOU FOR YOUR ATTENTION !

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