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CS7GV2: Mathematics of Light and Sound, M.Sc. in Computer Science.

Lecture #4: Simulation

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Notes

1/13

## Analytical versus numerical methods

For a quadratic polynomial  $f(x) = ax^2 + bx + c$ , the roots (zero-crossings) are found with the well-known formula,

$$x_1, x_2 = \frac{-b \pm \sqrt{b^2 - 4 \ ac}}{2 \ a}.$$

- ▶ In science and engineering it's more-often-than-not the case that problems do not have neat *closed-form* or *analytical* solutions except in very specific circumstances.
- What can we do about it? Approximation, iteration. For example, the "method of bisection" for root finding: guess where a root might be; keep halving the length of an interval around it such that f(x) has different signs at the start and the end.
- ► Such solutions often described as *numerical methods* because they use numbers (and computers) versus *analytical methods* which use symbols (and thinking.)

Notes

3 / 13

#### Wave Motion

► We've seen that wave motion is described by the second order PDE known as the wave equation,

$$\frac{\partial^2 u(x,t)}{\partial t^2} = c^2 \frac{\partial^2 u(x,t)}{\partial x^2}.$$

▶ We've seen a *closed-form* solution for wave propagation,

$$u(x, t) = R\cos(kx - \omega t) + (1 - R)\cos(kx + \omega t).$$

- ► This is perfect when there are no constraints. For example, light in a homogeneous medium, a wave on an infinitely long string (no end points,) or a sound in a huge volume of air.
- ▶ But the closed-form solution doesn't tell us, for example, how a string plucked in a particular way is going to move: https://tinyurl.com/y4ncymx7.

Notes			

#### Wave Simulation

- ▶ When there are specific constraints (also known as conditions,) there is usually no alternative but to *simulate* wave motion in an *iterative* way.
- ► Iterative means doing more-or-less the same sequence of calculations again and again.
- ► Usually the current iteration's calculations use results calculated in the previous iteration(s.)
- ► An iterative simulation can never be perfect. Error is inevitable, for example, because descretization is required.
- ▶ Error is typically cumulative so the results become less correct at each iteration.
- ► There are lots of nice interactive simulations of wave motions available, for example: https://tinyurl.com/2xrsrz and https://tinyurl.com/mtwczmj.

Votes			

5 / 13

#### **EM** Wave simulation

- ► Solve Maxwell's equations to find local wave characteristics at many discrete volumes of space at successive steps in time.
- ▶ The results for one discrete volume are used in the calculation of the characteristics of its neighbors.
- ▶ One of the most used techniques (e.g. in MEEP) is called *finite difference time domain* (FDTD.)
- ▶ Approaches like this in general are called *finite element methods* for the approximate solution of *boundary value problems* with *partial differential equations*.
- Advantages: can deal with complex geometries and different materials.
- Disadvantages: can be very computationally intensive which limits the spatial accuracy or the temporal duration, cf. weather forecasting.

Notes			

## Initial and Boundary Conditions

 $\triangleright$  To simulate a specific solution for u(x,t) described by the wave equation,

$$\frac{\partial^2 u(x,t)}{\partial t^2} = c^2 \frac{\partial^2 u(x,t)}{\partial x^2} \quad x \in [0,L], \ t \in [0,T],$$

for a string of length L over a time period T, we need:

ightharpoonup two initial conditions at time t=0,

$$u(x,0)=I(x), \quad x\in [0,L]$$

$$\frac{\partial}{\partial t}u(x,0)=0, \quad x\in[0,L]$$

where I(x) specifies the initial shape of the string,

▶ and two boundary conditions at distances x = 0 and x = L,

$$u(0, t) = 0, \quad t \in [0, T]$$

$$u(L,t)=0, \quad t\in [0,T]$$

7 / 13

#### Discretization of domain

► Computer operations take a finite amount of time to complete so there can't be infinitely many time steps in the simulation.

The time period [0, T] has to be descretized, e.g. into intervals of equal duration  $\Delta t$ ,

$$t_i = i \Delta t$$
,  $i = 0, ... N_t$  (where  $N_t = T/\Delta t$ .)

► Computer memory is finite so there can't be infinitely many distances in the simulation.

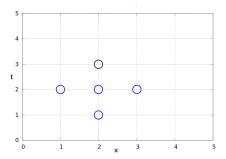
The length [0, L] have to be descretized, e.g. into intervals of equal distance  $\Delta x$ ,

$$x_j = j \Delta x$$
,  $j = 0, ... N_x$  (where  $N_x = L/\Delta x$ .)

Notes

#### Solution mesh

► The discrete points in space and time can be visualized as a two-dimensional *mesh* (or net.)



- ▶ The solution for wave height  $u(x_j, t_i)$  at each mesh point is found using already-calculated solutions at neighbouring mesh points . . .
- ightharpoonup ... except for certain exterior mesh points whose values have been specified through the initial conditions, i.e. I(x).

Notes

9 / 13

10 / 13

### Discretization of equations

Wave equation. Use the symmetric second difference approximation of the second derivative,

$$\frac{u(x_{j}, t_{i+1}) - 2 u(x_{j}, t_{i}) + u(x_{j}, t_{i-1})}{\Delta t^{2}} \approx c^{2} \frac{u(x_{j+1}, t_{i}) - 2 u(x_{j}, t_{i}) + u(x_{j-1}, t_{i})}{\Delta x^{2}}.$$

Alternative notation can be used to make the parameters more obvious,

$$\frac{u_j^{i+1} - 2u_j^i + u_j^{i-1}}{\Delta t^2} \approx c^2 \frac{u_{j+1}^i - 2u_j^i + u_{j-1}^i}{\Delta x^2},\tag{1}$$

▶ *Initial condition.* Use the centered first difference approximation of the first derivative.

$$\frac{\partial}{\partial t}u(x_j,t_i)\approx\frac{u_j^{i+1}-u_j^{i-1}}{2\Delta t}\tag{2}$$

Note division by  $2\Delta t$  because the difference is between values of u(x,t) separated by two time intervals.

### **Initial Conditions**

• Using approximation (2), initial condition  $\frac{\partial}{\partial t}u(x_j,0)=0$  means,

$$u_j^{i-1} = u_j^{i+1}, \quad j = 0, \dots, N_x. \quad i = 0.$$

► The intial condition of shape is simply,

$$u_j^0 = I(x_j), \quad j = 0, \ldots, N_x.$$

## Formulae

- $ightharpoonup C = c \frac{\Delta t}{\Delta x}.$
- $\qquad \qquad \mathbf{u}_{j}^{1} = u_{j}^{0} \frac{1}{2}C^{2}\left(u_{j+1}^{i} 2u_{j}^{i} + u_{j-1}^{i}\right)$

Notes			

11 / 13

Notes			

# Iterative Simulation Algorithm

- 1. Initialize  $u_j^0 = I(x_j)$  for  $j = 0, \dots N_x$ .
- 2. Compute  $u_j^1$  and set  $u_j^1=0$  for the boundary points i=0 and  $i=N_{\times}$ , for  $i=1,\dots N-1$
- 3. For each time level  $i=1,\ldots N_t-1$  3.1 find  $u_j^{i+1}$  for  $j=1,\ldots N_x-1$ . 3.2 set  $u_j^{i+1}=0$  for the boundary points  $j=0,j=N_x$ .

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13 / 13