

## Notes

- Some example values for common materials: (VERY approximate)
  - Aluminum:  $E=70$  GPa  $\nu=0.34$
  - Concrete:  $E=23$  GPa  $\nu=0.2$
  - Diamond:  $E=950$  GPa  $\nu=0.2$
  - Glass:  $E=50$  GPa  $\nu=0.25$
  - Nylon:  $E=3$  GPa  $\nu=0.4$
  - Rubber:  $E=1.7$  MPa  $\nu=0.49\dots$
  - Steel:  $E=200$  GPa  $\nu=0.3$

## 2D FVM strain

- Triangle with corners  $i, j, k$
- Coordinates  $x_i=X(p_i), x_j=X(p_j), x_k=X(p_k)$
- Assume affine in this triangle:  $X(p)=Ap+b$  (so  $\partial X/\partial p$ )
- Then  $x_i-x_j = (Ap_i+b)-(Ap_j+b) = A(p_i-p_j)$
- And  $x_i-x_k = A(p_i-p_k)$
- Let  $\Delta x=[x_i-x_j \mid x_i-x_k]$  and  $\Delta p=[p_i-p_j \mid p_i-p_k]$
- Thus  $A\Delta p = \Delta x$
- Then  $A = \Delta x \Delta p^{-1}$
- Can precompute and store  $\Delta p^{-1}$

## Finite Volume Method

- We discretize integral equation (complete with boundary integrals) over finite volumes
- Typically Voronoi regions (from Delaunay triangulation) or quads from grid
- Each finite volume has a vertex in the middle
  - Assume volume quantities are constant (equal to value at vertex)
  - Assume deformation affine in each triangle (constant strain  $\rightarrow$  constant stress)
  - [evaluate each term]
  - Exact choice of control volumes not critical - constant times normal integrates to zero

## 2D FVM stress calculation

- Look at single triangle  $i,j,k$  again
- Write part of path integral of  $\sigma n$  for volume  $i$
- Take constant  $\sigma$  out
- Note integral of normals around closed curve is 0
- Switch to integrating normals along triangle boundary
- So force on  $i$  due to this triangle's strain is
  - $F_i += -\sigma((x_i-x_k)^\perp + (x_j-x_i)^\perp)/2$
- Use the integral of normal=0 over triangle:
  - $F_i += \sigma(x_k-x_j)^\perp/2$

## Path independence

- Note: trick involving switching path integral to triangle boundary works independent of the choice of finite volume
  - Force we compute only depends on where the finite volumes cut the triangle edges - always assume midpoint
- Choice of finite volume does affect body forces and mass calculation
- Might want to connect to centroids instead of circumcentres
  - always well defined (even if not Delaunay)
  - formulas much simpler: sum  $1/3$  triangle area

## Finite Element Method

- #1 most popular method for elasticity problems (and many others too)
- FEM originally began with simple idea:
  - Can solve idealized problems (e.g. that strain is constant over a triangle)
  - Call one of these problems an element
  - Can stick together elements to get better approximation
- Since then has evolved into a rigorous mathematical algorithm, a general purpose black-box method
  - Well, almost black-box...

## Boundary Conditions

- Actually easier to think about numerically
  - Control volumes automatically include boundary
  - Free boundary: do nothing
  - Specified traction: integrate over decomposed boundary mesh
    - E.g. wind forces...
  - Specified displacement (position): just set  $x$  to what it's supposed to be

## Modern Approach

- Galerkin framework (the most common)
- Find vector space of functions that solution (e.g.  $X(p)$ ) lives in
  - E.g. bounded weak 1st derivative:  $H^1$
- Say the PDE is  $L[X]=0$  everywhere (“strong”)
- The “weak” statement is  $\int Y(p)L[X(p)]dp=0$  for every  $Y$  in vector space
- Issue:  $L$  might involve second derivatives
  - E.g. one for strain, then one for div sigma
  - So  $L$ , and the strong form, difficult to define for  $H^1$
- Integration by parts saves the day

## Weak Momentum Equation

- Ignore time derivatives - treat acceleration as an independent quantity
  - We discretize space first, then use “method of lines”: plug in any time integrator

$$\begin{aligned}
 L[X] &= \rho \ddot{X} - f_{body} - \nabla \cdot \sigma \\
 \int_{\Omega} Y L[X] &= \int_{\Omega} Y (\rho \ddot{X} - f_{body} - \nabla \cdot \sigma) \\
 &= \int_{\Omega} Y \rho \ddot{X} - \int_{\Omega} Y f_{body} - \int_{\Omega} Y \nabla \cdot \sigma \\
 &= \int_{\Omega} Y \rho \ddot{X} - \int_{\Omega} Y f_{body} + \int_{\Omega} \sigma \nabla Y
 \end{aligned}$$

## Linear Triangle Elements

- Simplest choice
- Take basis  $\{\phi_i\}$  where  $\phi_i(p) = 1$  at  $p_i$  and 0 at all the other  $p_i$ 's
  - It's a “hat” function
- Then  $X(p) = \sum_i x_i \phi_i(p)$  is the continuous piecewise linear function that interpolates particle positions
- Similarly interpolate velocity and acceleration
- Plug this choice of  $X$  and an arbitrary  $Y = \phi_j$  (for any  $j$ ) into the weak form of the equation
- Get a system of equations (3 eq. for each  $j$ )

## Making it finite

- The Galerkin FEM just takes the weak equation, and restricts the vector space to a finite-dimensional one
  - E.g. Continuous piecewise linear - constant gradient over each triangle in mesh, just like we used for Finite Volume Method
- This means instead of infinitely many test functions  $Y$  to consider, we only need to check a finite basis
- The method is defined by the basis
  - Very general: plug in whatever you want - polynomials, splines, wavelets, RBF's, ...

## The equations

$$\begin{aligned}
 \int_{\Omega} \phi_j \sum_i \rho \ddot{x}_i \phi_i - \int_{\Omega} \phi_j f_{body} + \int_{\Omega} \sigma \nabla \phi_j &= 0 \\
 \sum_i \int_{\Omega} \rho \phi_j \phi_i \ddot{x}_i &= \int_{\Omega} \phi_j f_{body} - \int_{\Omega} \sigma \nabla \phi_j
 \end{aligned}$$

- Note that  $\phi_j$  is zero on all but the triangles surrounding  $j$ , so integrals simplify
- Also: naturally split integration into separate triangles

## Change in momentum term

- Let  $m_{ij} = \int \rho \phi_i \phi_j$
- Then the first term is just  $\sum_i m_{ji} \ddot{x}_i$
- Let  $M=[m_{ij}]$ : then first term is  $M\ddot{x}$
- $M$  is called the mass matrix
  - Obviously symmetric (actually SPD)
  - Not diagonal!
- Note that once we have the forces (the other integrals), we need to invert  $M$  to get accelerations

## Stress term

- Calculate constant strain and strain rate (so constant stress) for each triangle separately
- Note  $\nabla \phi_j$  is constant too
- So just take  $\sigma \nabla \phi_j$  times triangle area
- [derive what  $\nabla \phi_j$  is]
- Magic: exact same as FVM!
  - In fact, proof of convergence of FVM is often (in other settings too) proved by showing it's equivalent or close to some kind of FEM

## Body force term

- Usually just gravity:  $f_{\text{body}} = \rho g$
- Rather than do the integral with density all over again, use the fact that  $\phi_i$  sum to 1
  - They form a “partition of unity”
  - They represent constant functions exactly - just about necessary for convergence
- Then body force term is  $gM1$
- More specifically, can just add  $g$  to the accelerations; don't bother with integrals or mass matrix at all

## The algorithm

- Loop over triangles
  - Loop over corners
  - Compute integral terms
    - only need to compute  $M$  once though - it's constant
  - End up with row of  $M$  and a “force”
- Solve  $Ma=f$
- Plug this a into time integration scheme

## Lumped Mass

- Inverting mass matrix unsatisfactory
  - For particles and FVM, each particle had a mass, so we just did a division
  - Here mass is spread out, need to do a big linear solve - even for explicit time stepping
- Idea of lumping: replace  $M$  with the “lumped mass matrix”
  - A diagonal matrix with the same row sums
  - Inverting diagonal matrix is just divisions - so diagonal entries of lumped mass matrix are the particle masses
  - Equivalent to FVM with centroid-based volumes

## Locking

- Simple linear basis actually has a major problem: locking
- Notion of numerical stiffness
  - Instead of thinking of numerical method as just getting an approximate solution to a real problem,
  - Think of numerical method as exactly solving a problem that's nearby
  - For elasticity, we're exactly solving the equations for a material with slightly different (and not quite homogeneous/isotropic) stiffness
- Locking comes up when numerical stiffness is MUCH higher than real stiffness

## Consistent vs. Lumped

- Original mass matrix called “consistent”
- Turns out its strongly diagonal dominant (fairly easy to solve)
- Multiplying by mass matrix = smoothing
- Inverting mass matrix = sharpening
- Rule of thumb:
  - Implicit time stepping - use consistent  $M$  (counteract over-smoothing, solving system anyways)
  - Explicit time stepping - use lumped  $M$  (avoid solving systems, don't need extra sharpening)

## Locking and linear elements

- Look at nearly incompressible materials
- Can a linear triangle mesh deform incompressibly?
  - [derive problem]
- Then linear elements will resist far too much: numerical stiffness much too high
- Numerical material “locks”
- FEM isn't really a black box!
- Solutions:
  - Don't do incompressibility
  - Use other sorts of elements (quads, higher order)

## Quadrature

- Formulas for linear triangle elements and constant density simple to work out
- Formulas for subdivision surfaces (or high-order polynomials, or splines, or wavelets...) and varying density are NASTY
- Instead use “quadrature”
  - I.e. numerical approximation to integrals
- Generalizations of midpoint rule
  - E.g. Gaussian quadrature (for intervals, triangles, tets) or tensor products (for quads, hexes)
- Make sure to match order of accuracy [or not]

## Accuracy

- At least for SPD linear problems (e.g. linear elasticity) FEM selects function from finite space that is “closest” to solution
  - Measured in a least-squares, energy-norm sense
- Thus it’s all about how well you can approximate functions with the finite space you chose
  - Linear or bilinear elements:  $O(h^2)$
  - Higher order polynomials, splines, etc.: better

## Other elements

- Not so obvious ones:
  - Isoparametric elements (meshes with curved edges)
  - Radial-basis functions (mesh-free methods)
  - Mixed element meshes (triangles and quads together)
  - Embedded elements
  - Special-purpose elements (e.g. for cracks)