

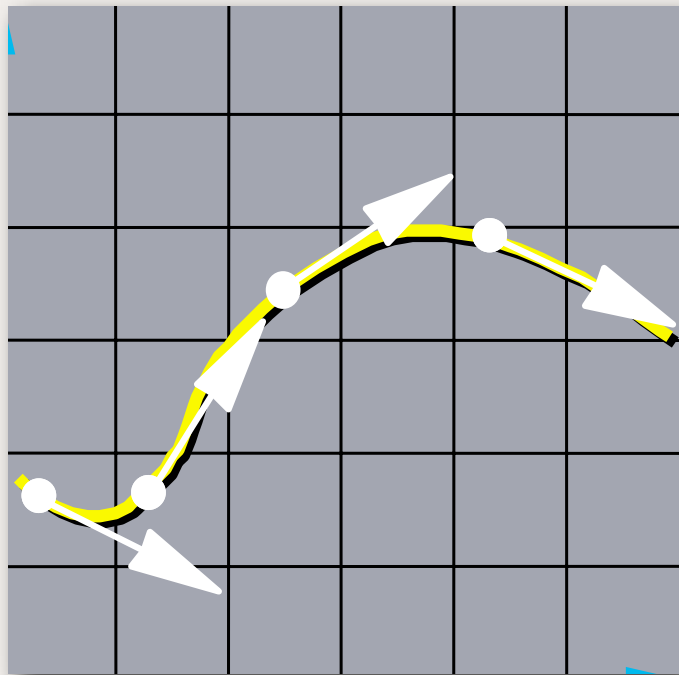
# **Particle Systems**

**(and fun things we can do with them)**

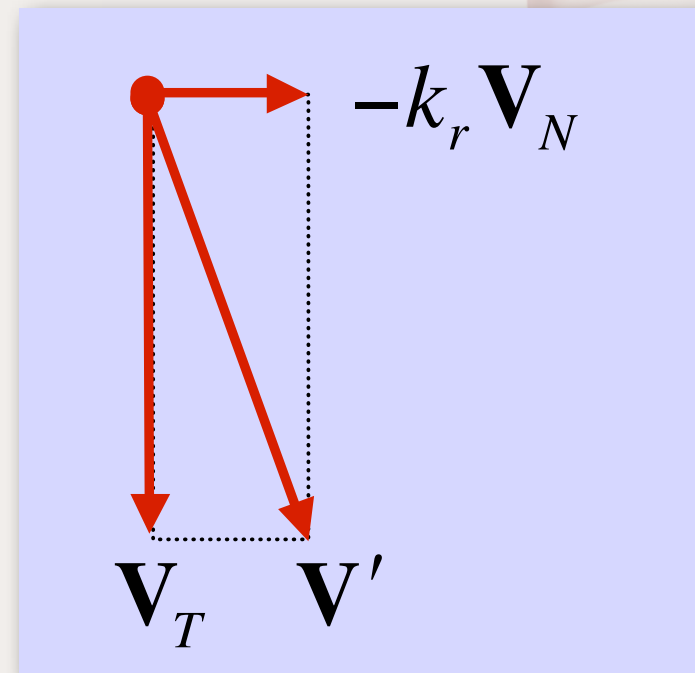


**Adrien Treuille**

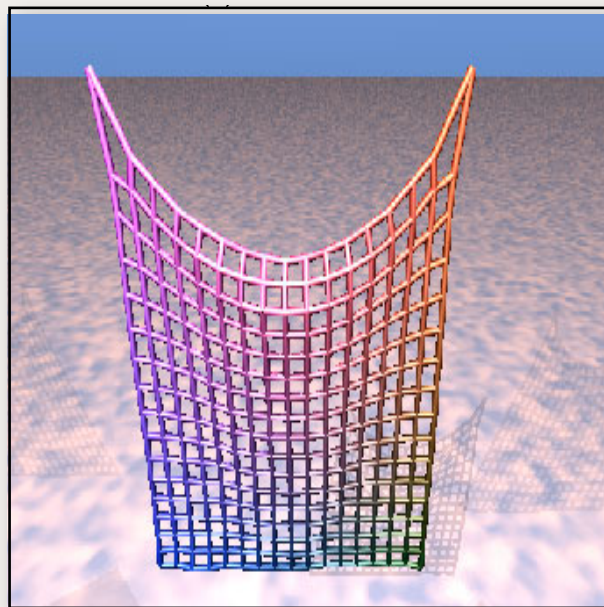
# Overview



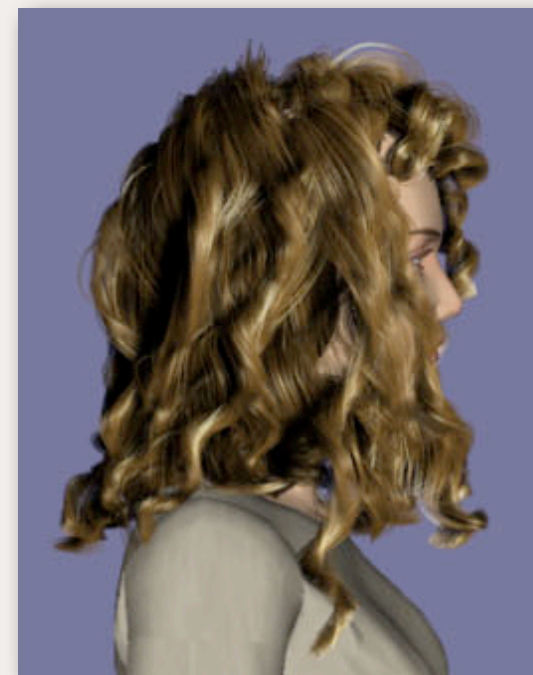
**DiffEQ Review**



**Particle Dynamics**



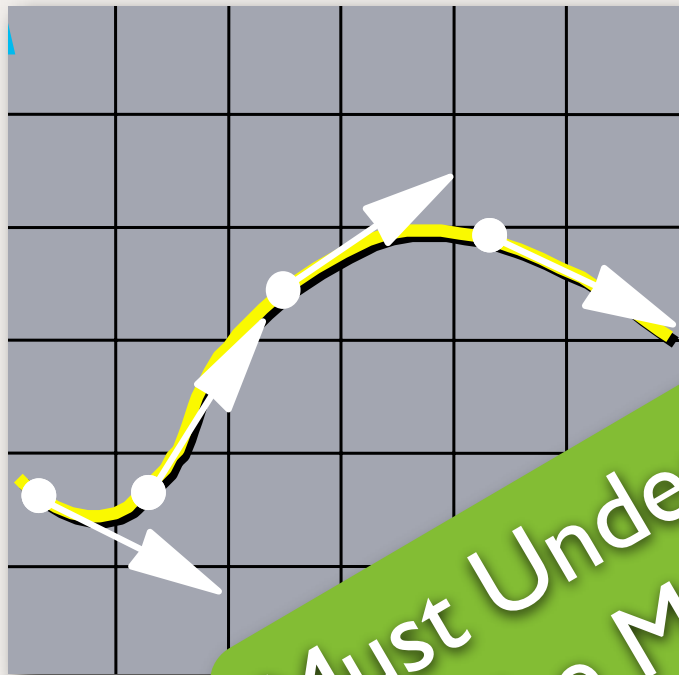
**Cloth**



**Hair**

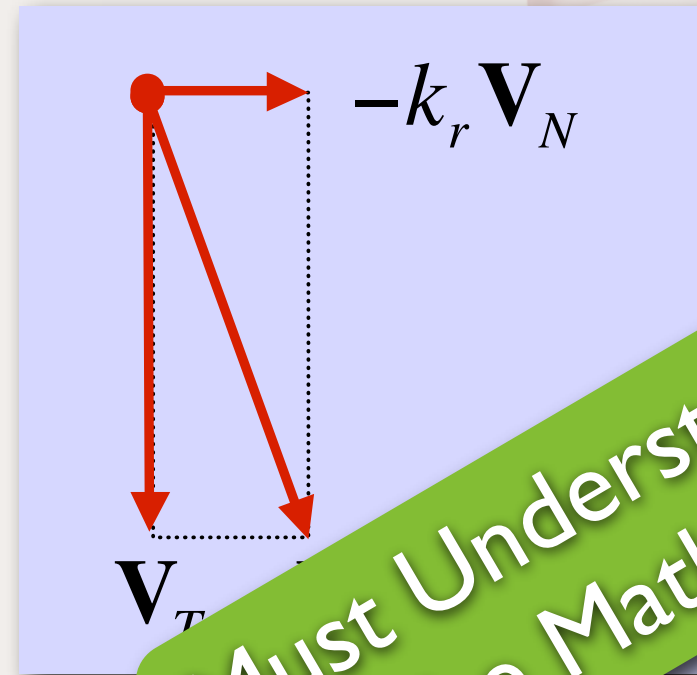


# Overview



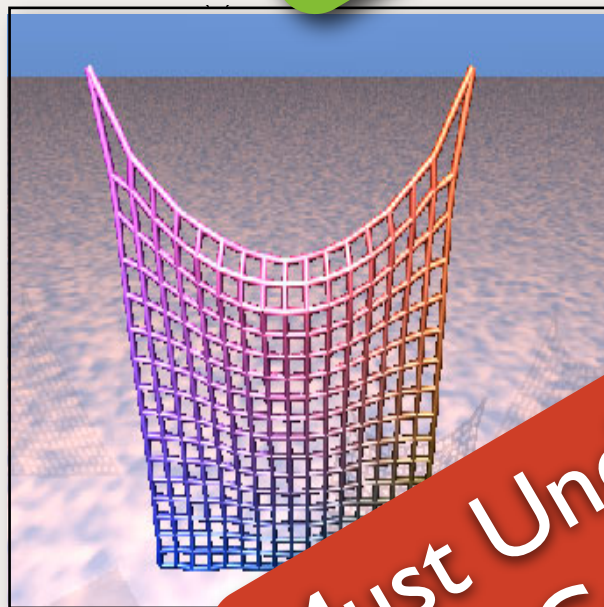
Differential Equations

Must Understand the Math!



Particle Dynamics

Must Understand the Math!



Computational Models

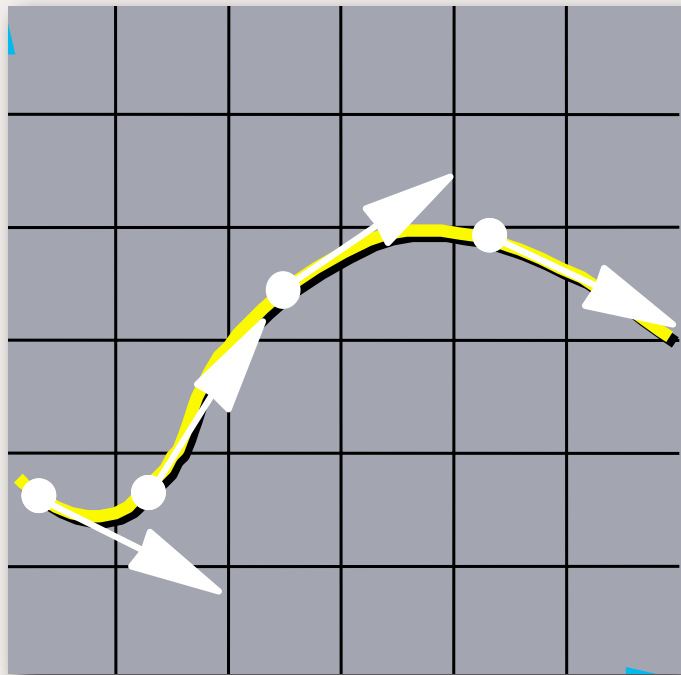
Must Understand the Concepts!



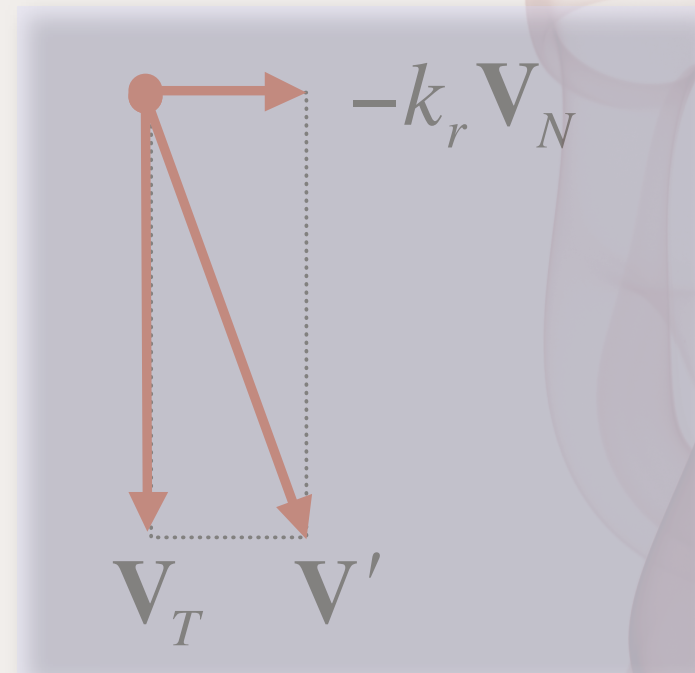
Human Models

Must Understand the Concepts!

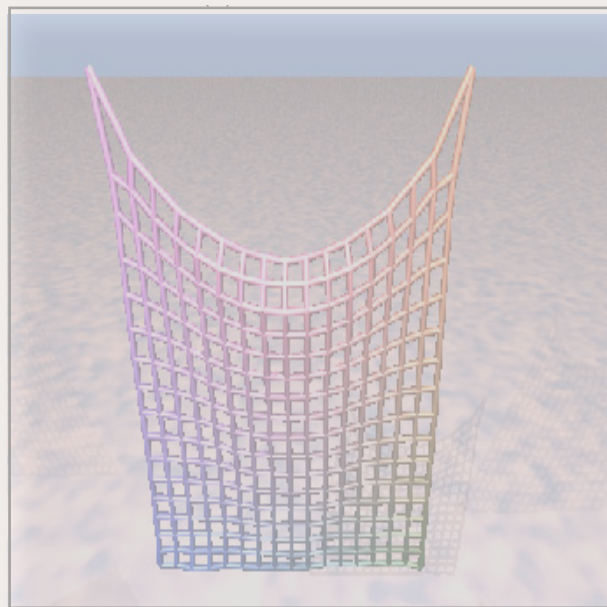
# Overview



**DiffEQ Review**



**Particle Dynamics**



**Cloth**



**Hair**



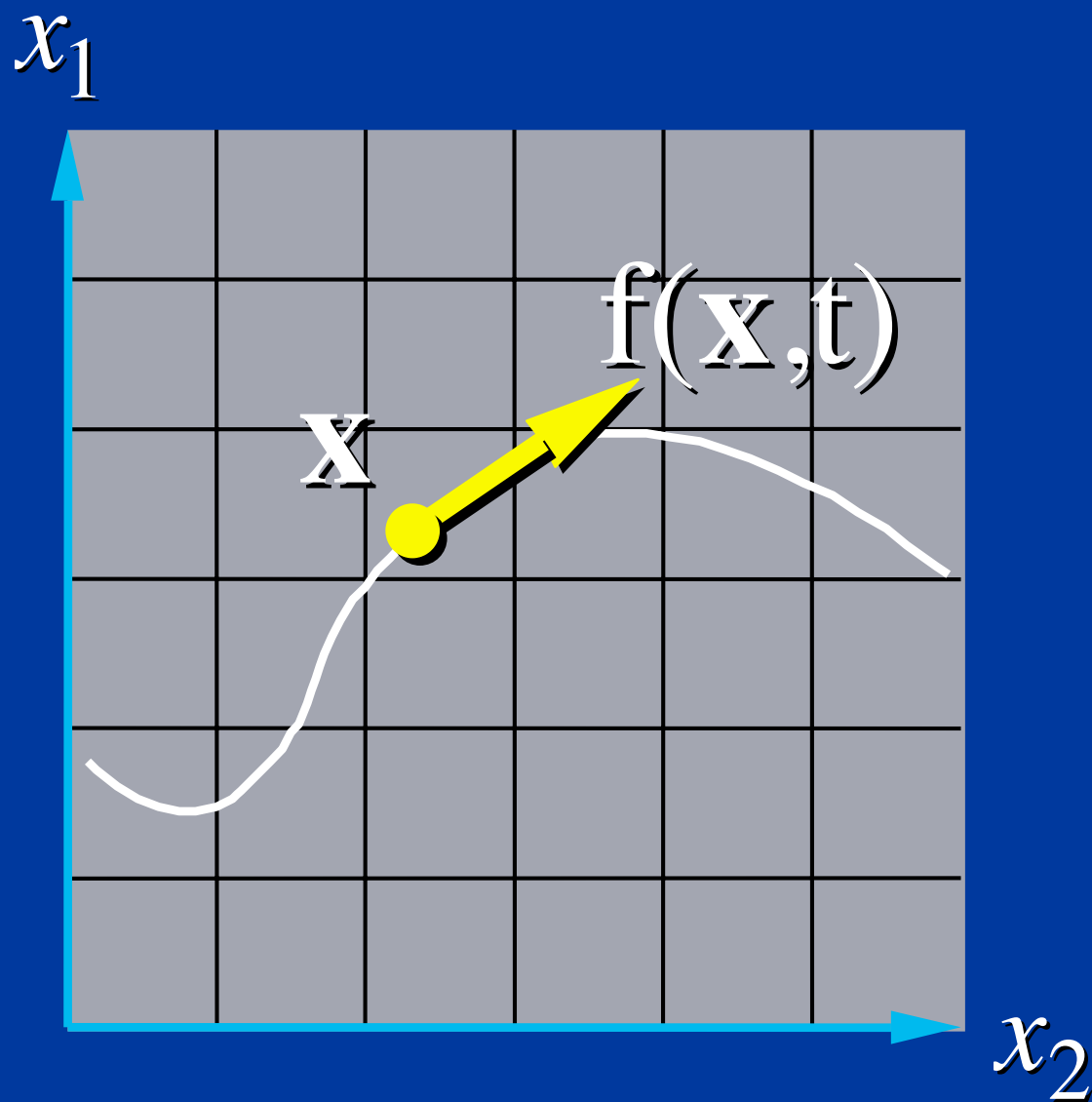
# DiffEQ Integration

## Differential Equation Basics

*Andrew Witkin*



# A Canonical Differential Equation

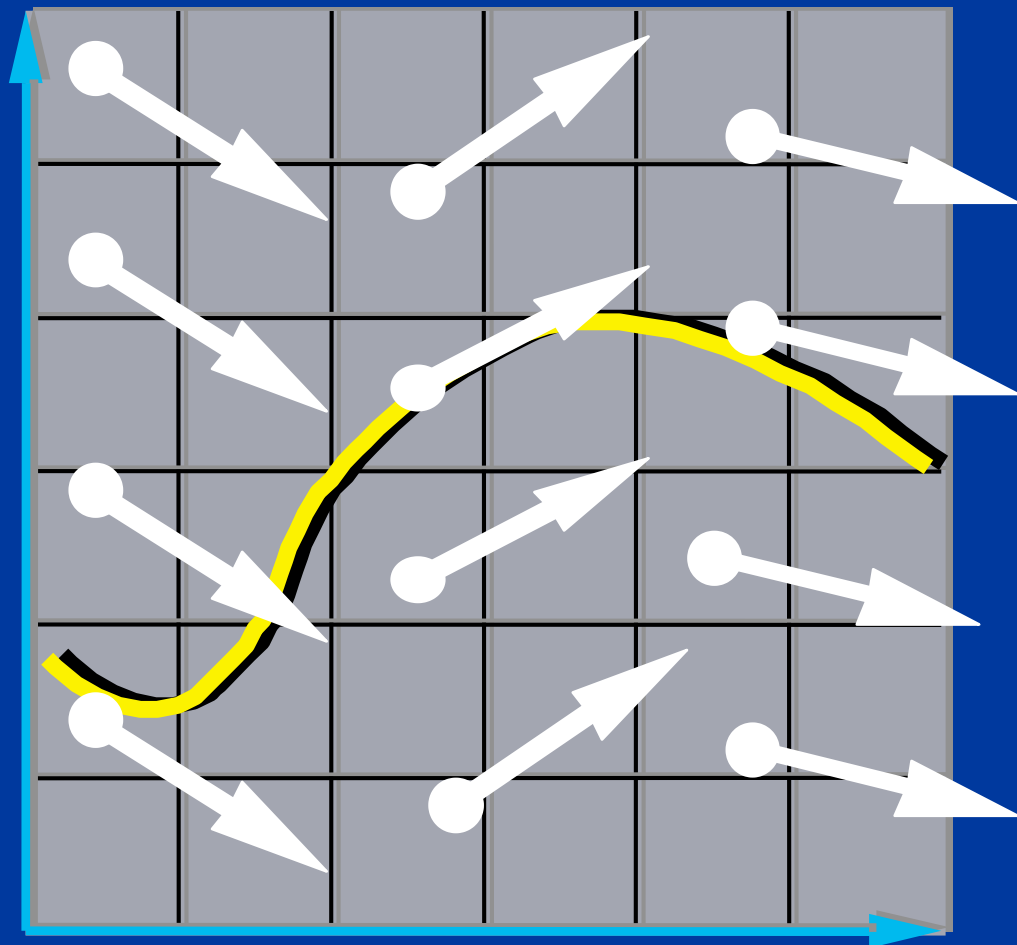


$$\dot{\mathbf{x}} = \mathbf{f}(\mathbf{x}, t)$$

- $\mathbf{x}(t)$ : a moving point.
- $\mathbf{f}(\mathbf{x}, t)$ :  $\mathbf{x}$ 's velocity.



# Vector Field



The differential equation

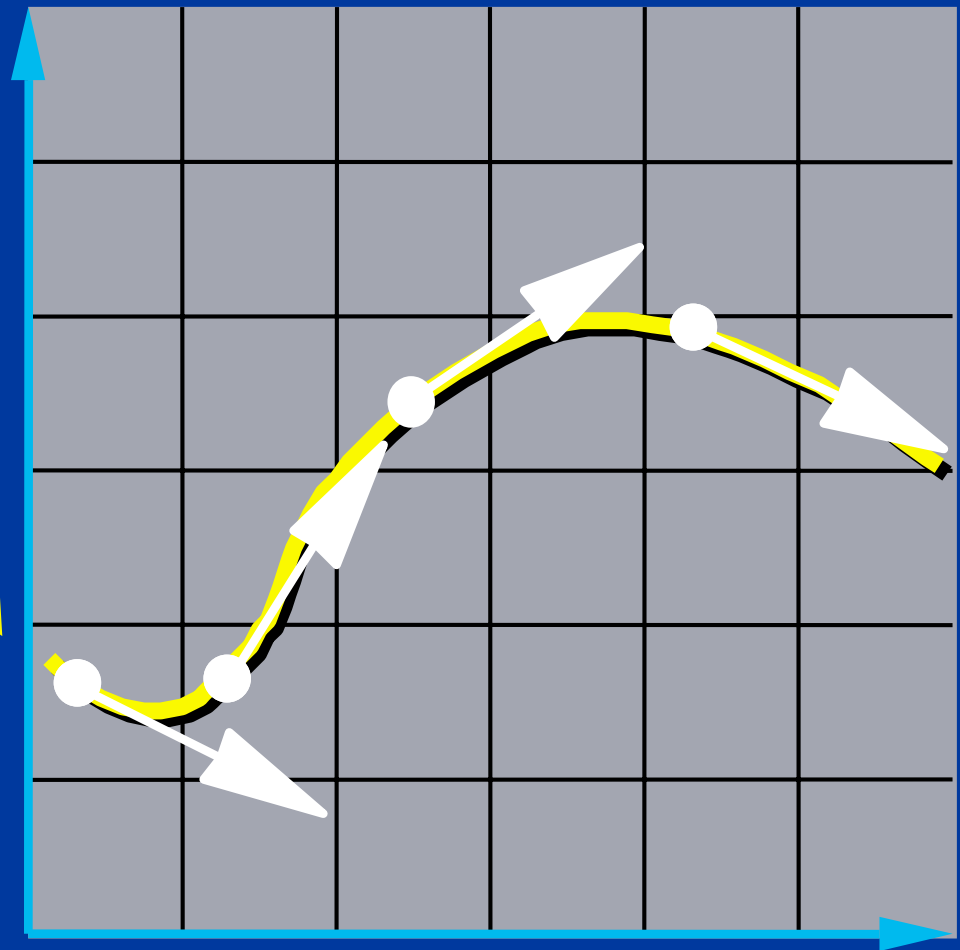
$$\dot{\mathbf{x}} = \mathbf{f}(\mathbf{x}, t)$$

defines a vector field over  $\mathbf{x}$ .

# Integral Curves

Start Here

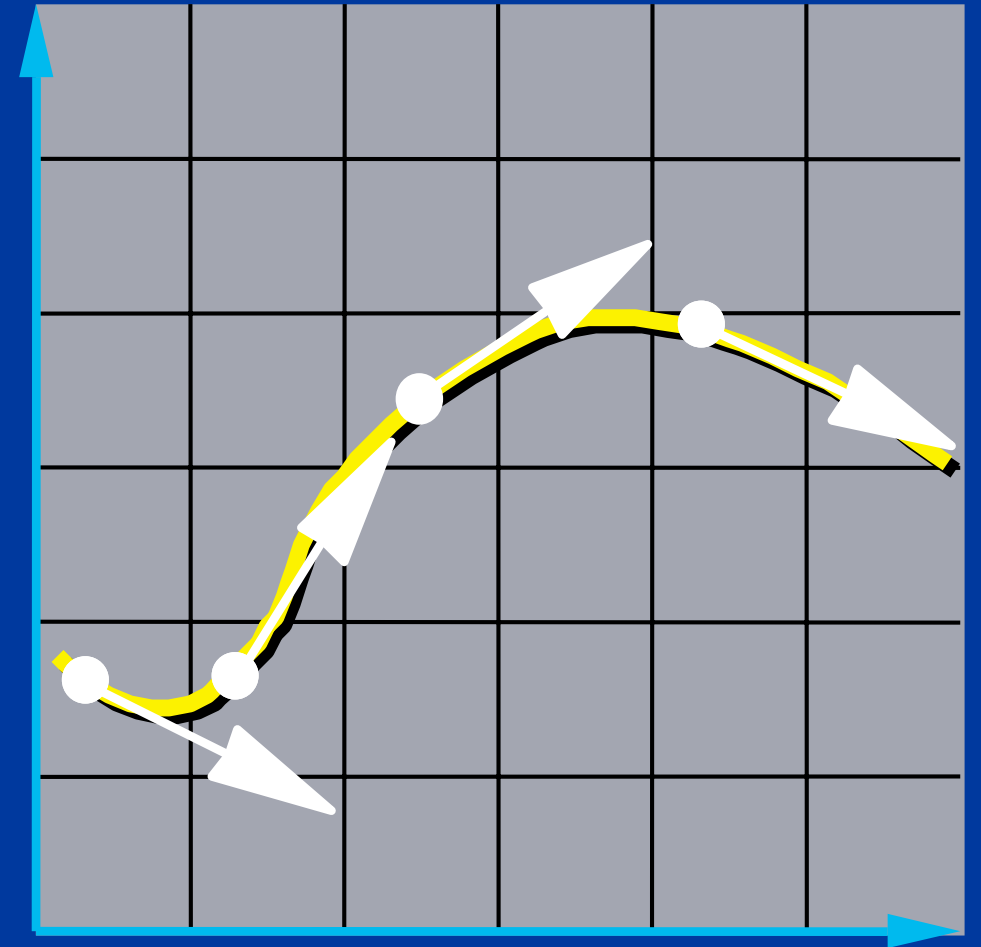
Pick any starting point,  
and follow the vectors.



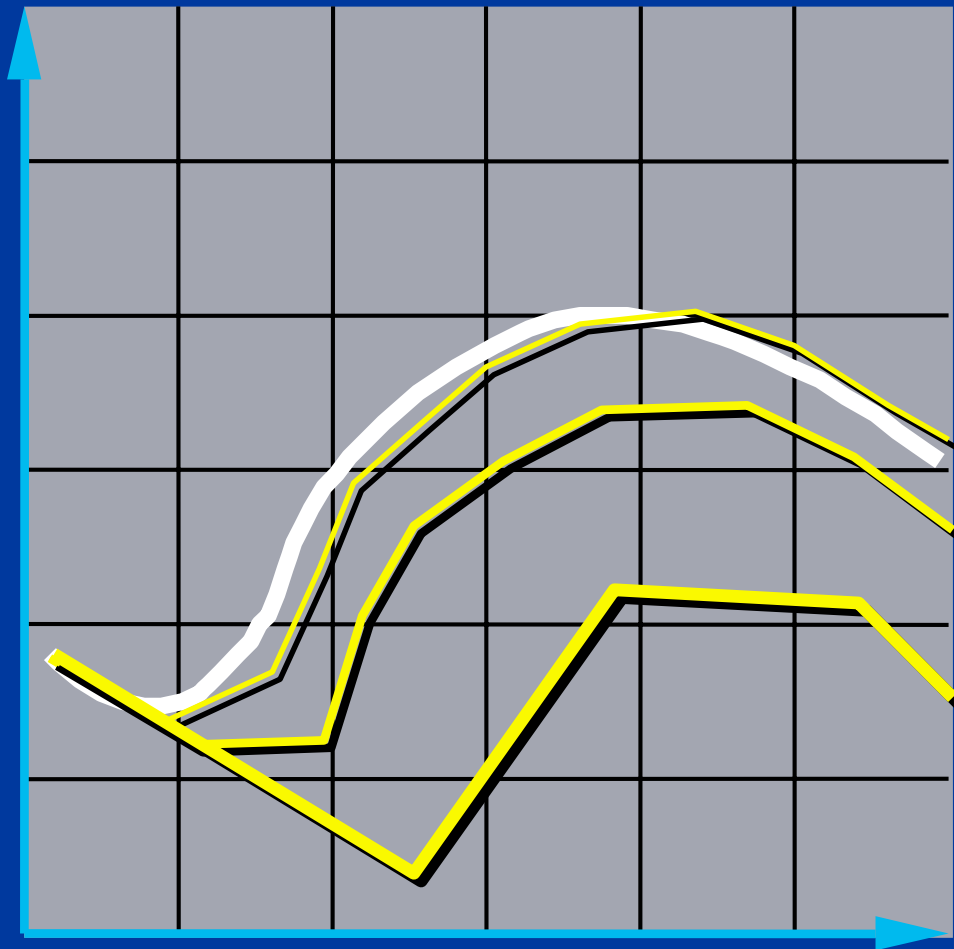


# Initial Value Problems

Given the starting point,  
follow the integral curve.



# Euler's Method

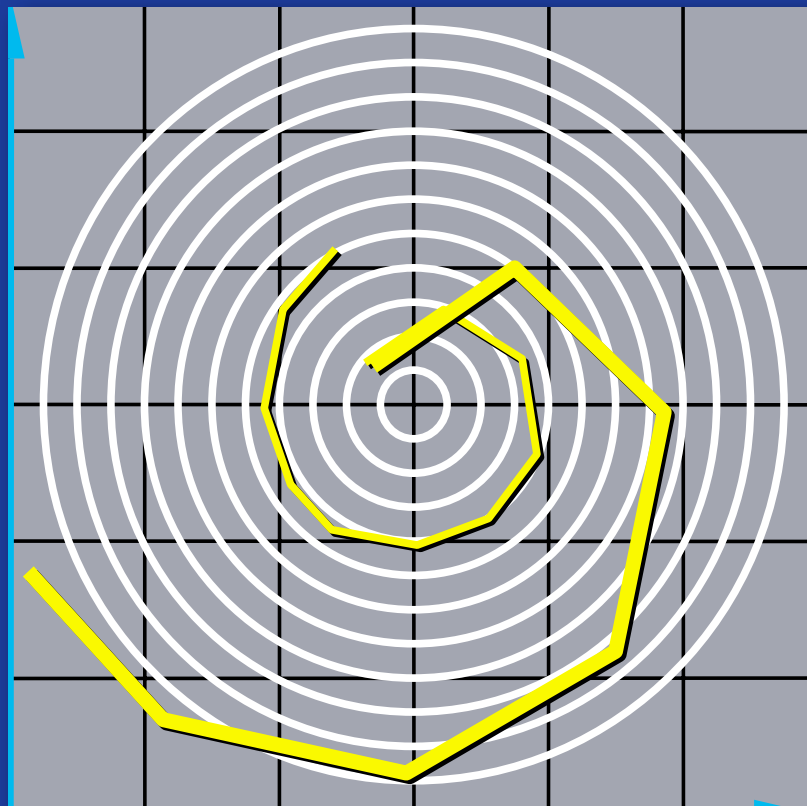


- Simplest numerical solution method
- Discrete time steps
- Bigger steps, bigger errors.

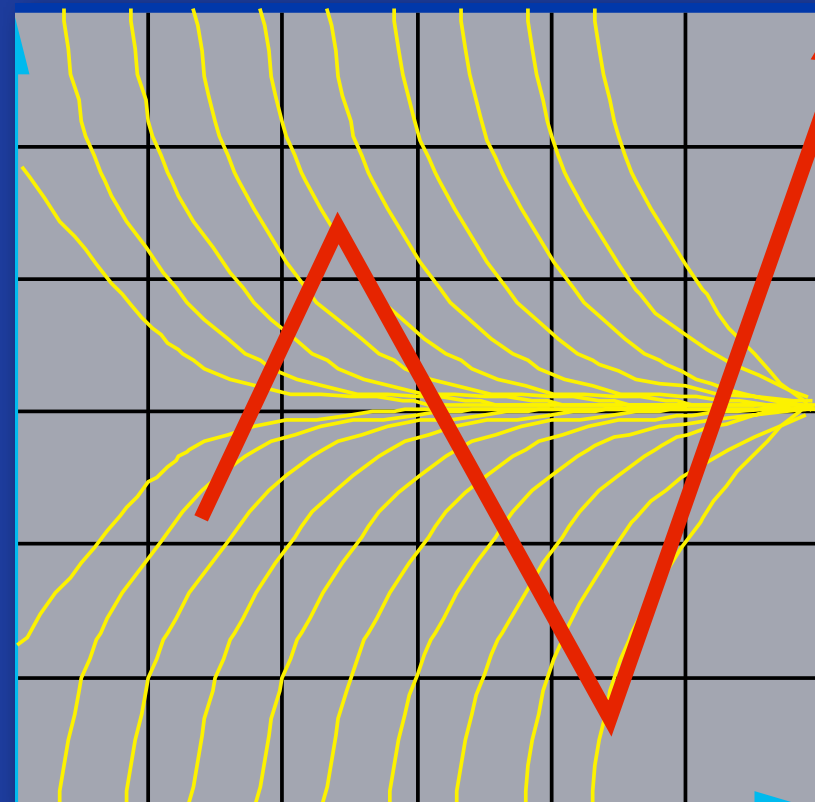
$$\mathbf{x}(t + \Delta t) = \mathbf{x}(t) + \Delta t \mathbf{f}(\mathbf{x}, t)$$



# Two Problems

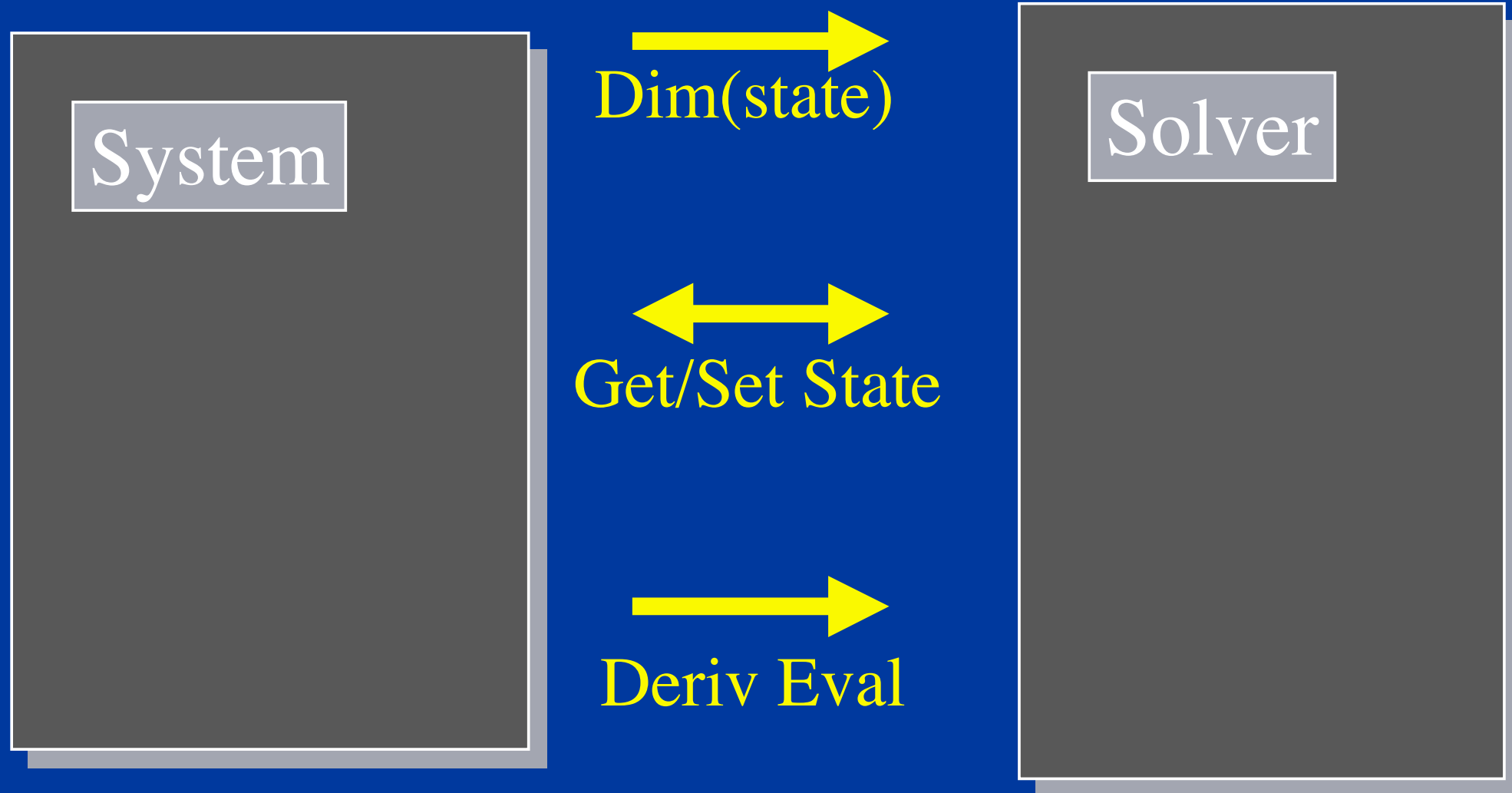


**Accuracy**



**Instability**

# Solver Interface

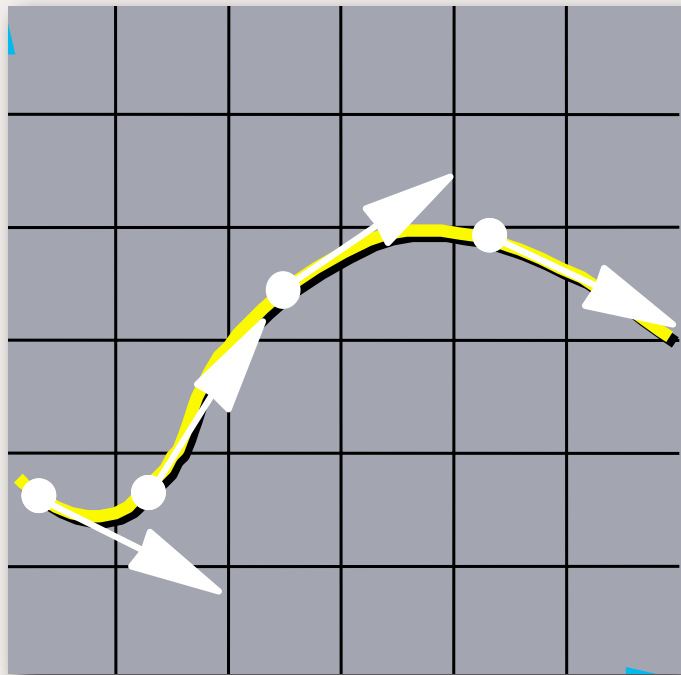




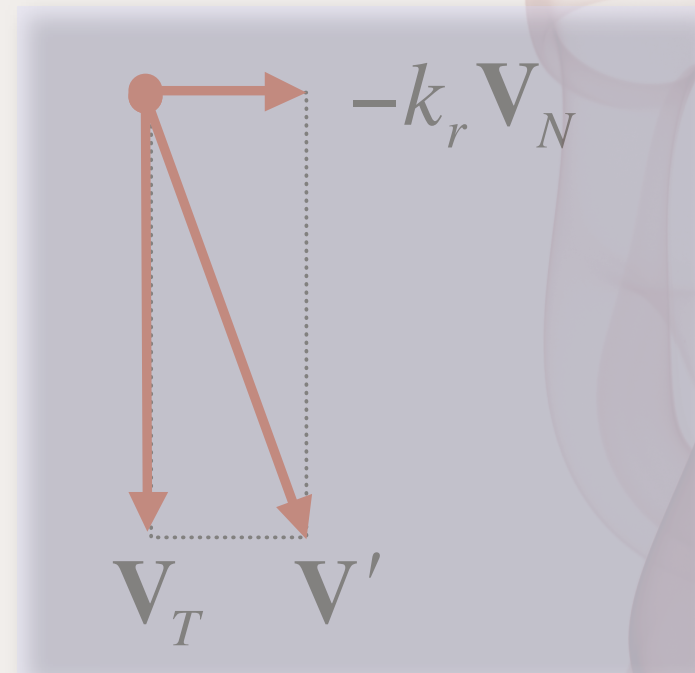
# A Code Fragment

```
void eulerStep(Sys sys, float h) {  
    float t = getTime(sys);  
    vector<float> x0, deltaX;  
  
    t = getTime(sys);  
    x0 = getState(sys);  
    deltaX = derivEval(sys, x0, t);  
    setState(sys, x0 + h*deltaX, t+h);  
}
```

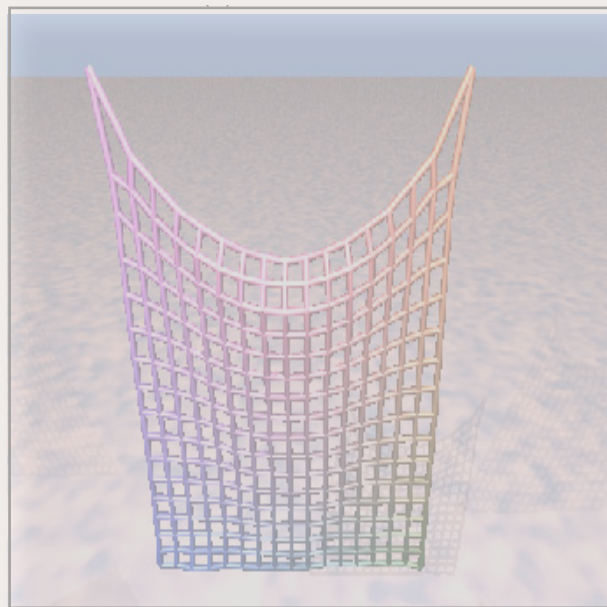
# Overview



**DiffEQ Review**



**Particle Dynamics**

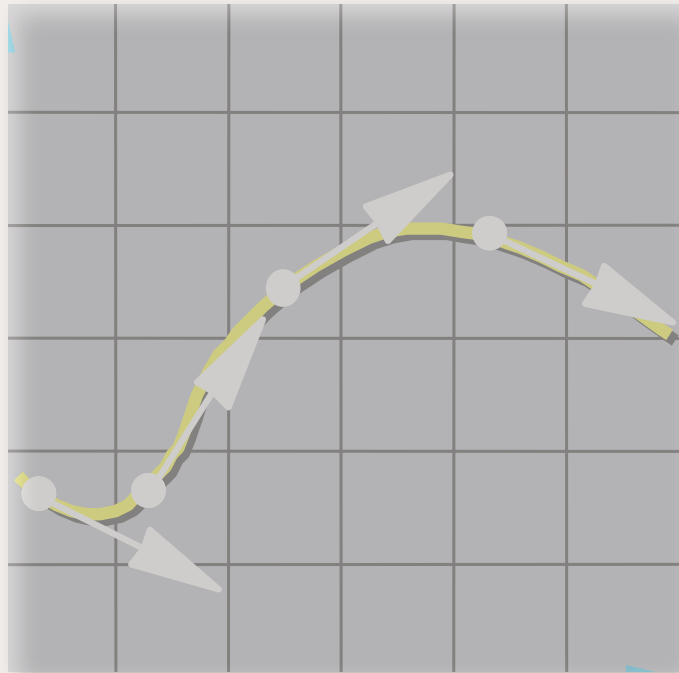


**Cloth**

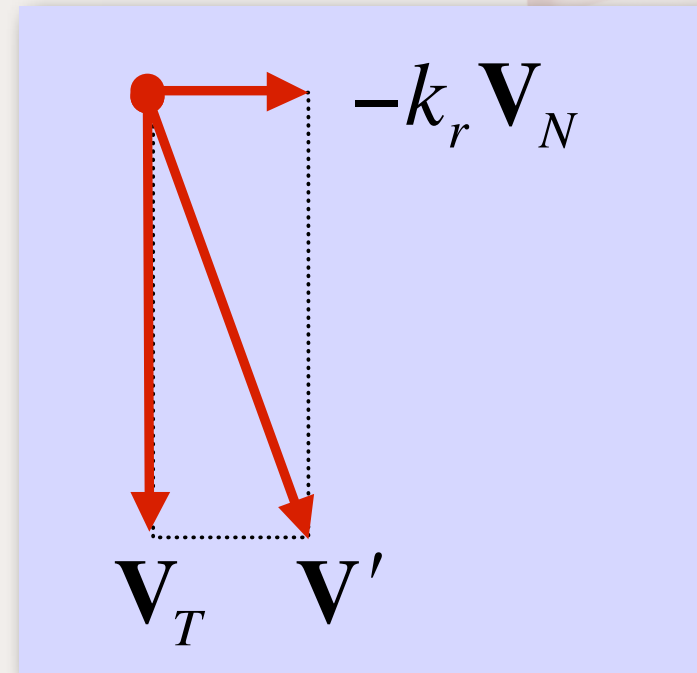


**Hair**

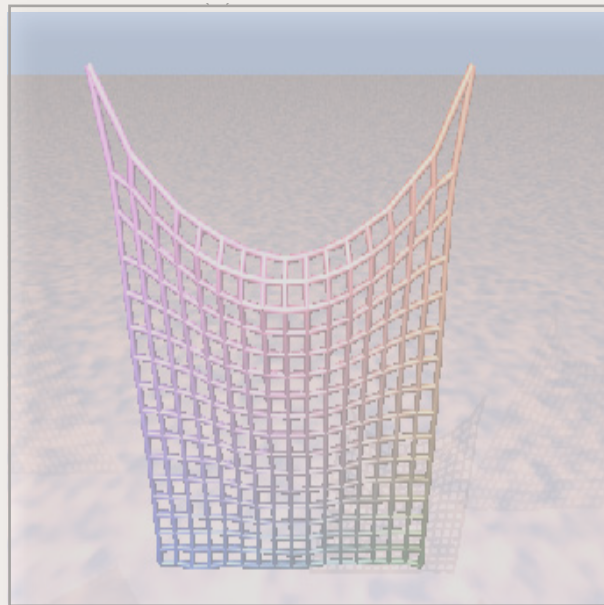
# Overview



**DiffEQ Review**



**Particle Dynamics**



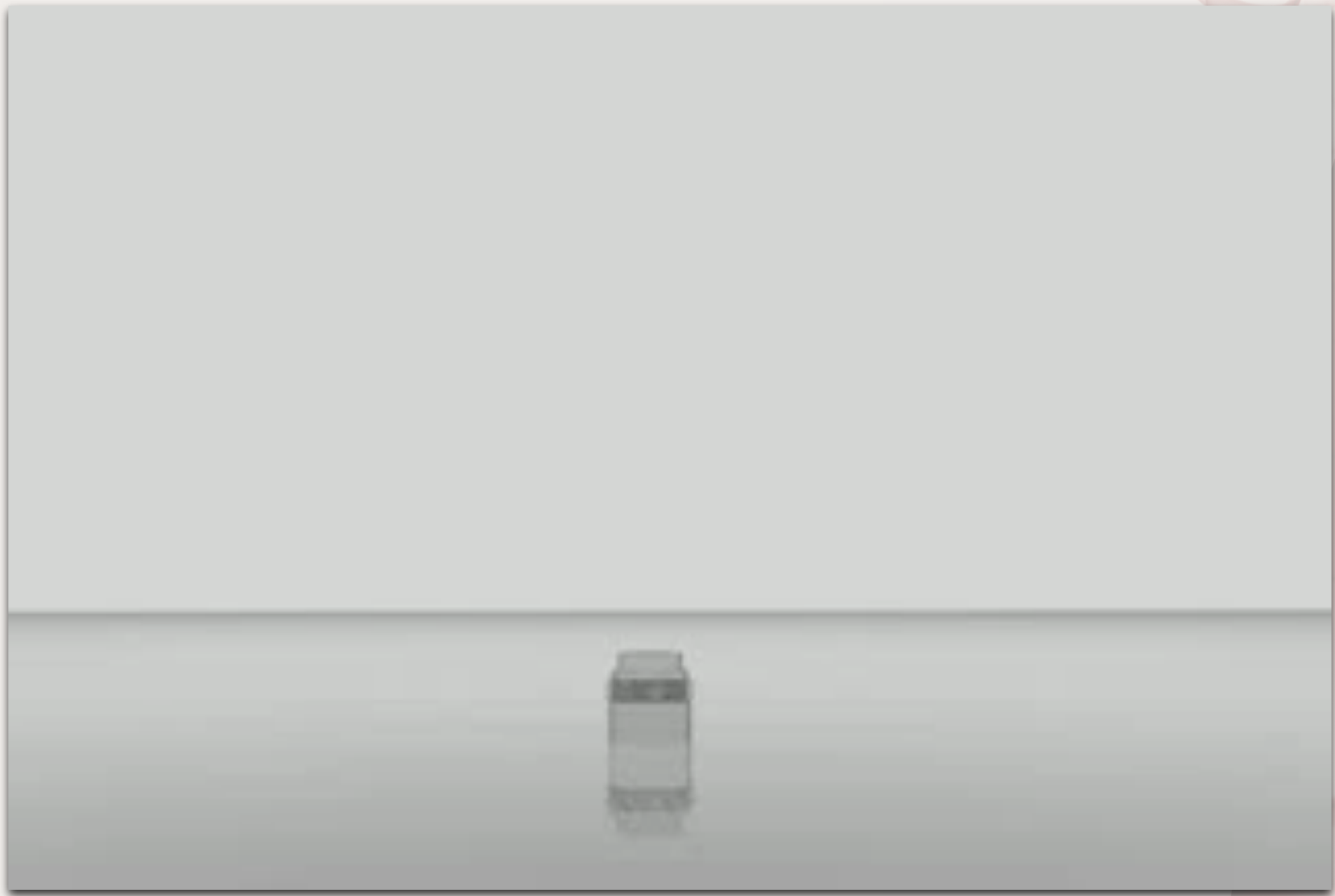
**Cloth**



**Hair**

# Particle Dynamics

**from Zoran Popović**



<http://www.youtube.com/watch?v=N8xNlp00kss>



# Overview

- One lousy particle
- Particle systems
- Forces: gravity, springs
- Implementation

# Newtonian particle

- Differential equations:  $f=ma$
- Forces depend on:
- Position, velocity, time

$$\ddot{x} = \frac{f(x, \dot{x})}{m}$$

# Second order equations

$$\ddot{x} = \frac{f(x, \dot{x})}{m}$$

Has 2<sup>nd</sup> derivatives

$$\dot{x} = v$$

$$\dot{v} = \frac{f(x, \dot{x})}{m}$$

Add a new variable  $v$  to get  
a pair of coupled 1<sup>st</sup> order equations

# Phase space

$$\begin{bmatrix} x \\ v \end{bmatrix}$$

Concatenate x and v to make a 6-vector:  
position in phase space

$$\begin{bmatrix} \dot{\hat{x}} \\ \dot{v} \end{bmatrix}$$

Velocity on Phase space:  
Another 6-vector

$$\begin{bmatrix} \dot{\hat{x}} \\ \dot{v} \end{bmatrix} = \begin{bmatrix} v \\ f / m \end{bmatrix}$$

A vanilla 1<sup>st</sup>-order differential equation

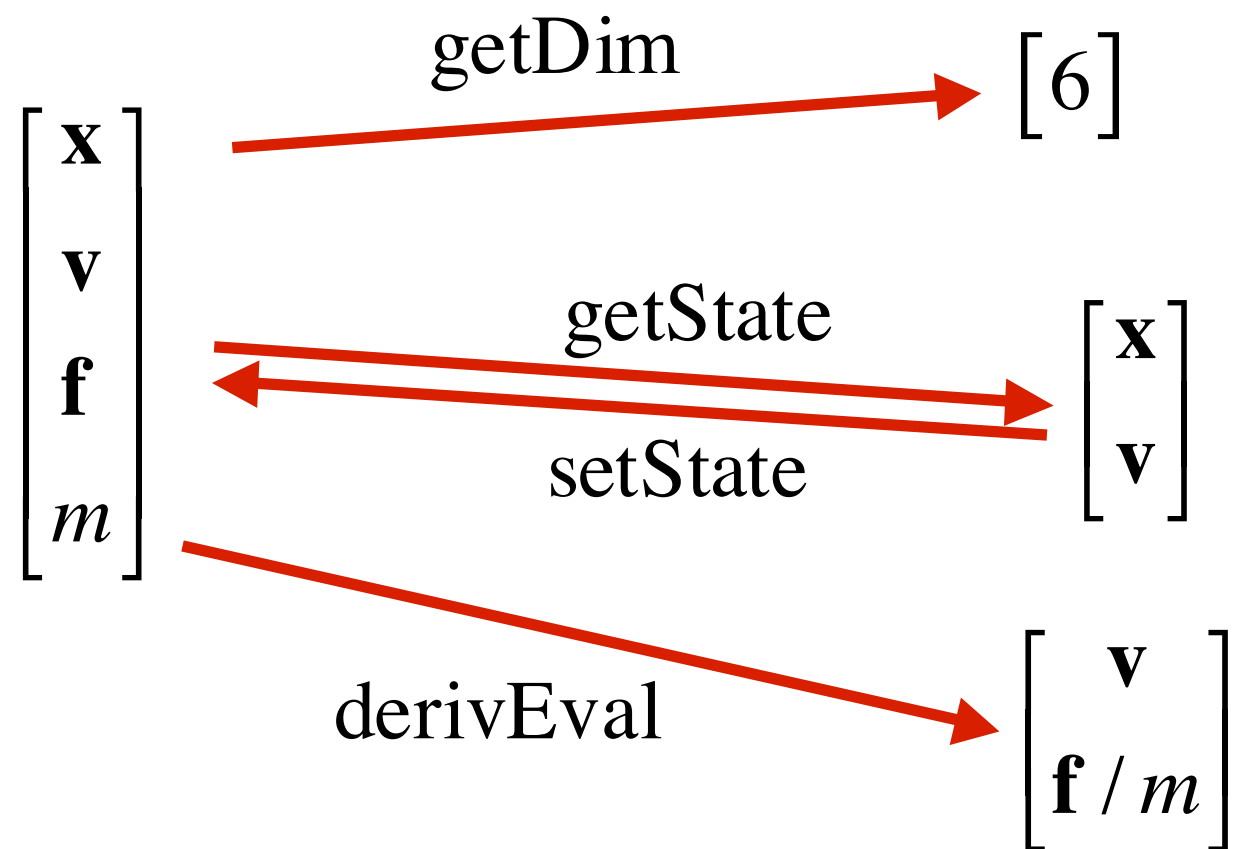
# Particle structure

Position in phase space

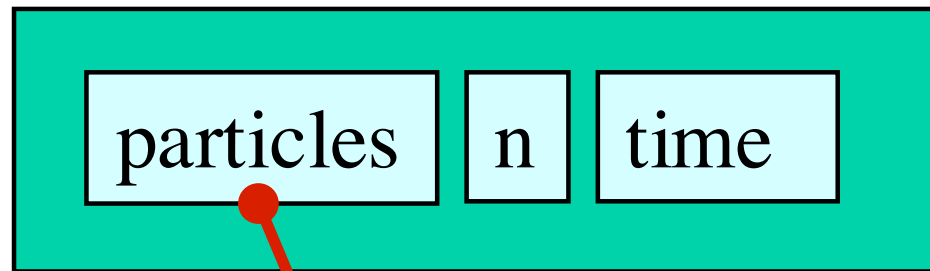
$\mathbf{x}$	← position
$\mathbf{v}$	← velocity
$\mathbf{f}$	← force accumulator
$m$	← mass



# Solver interface

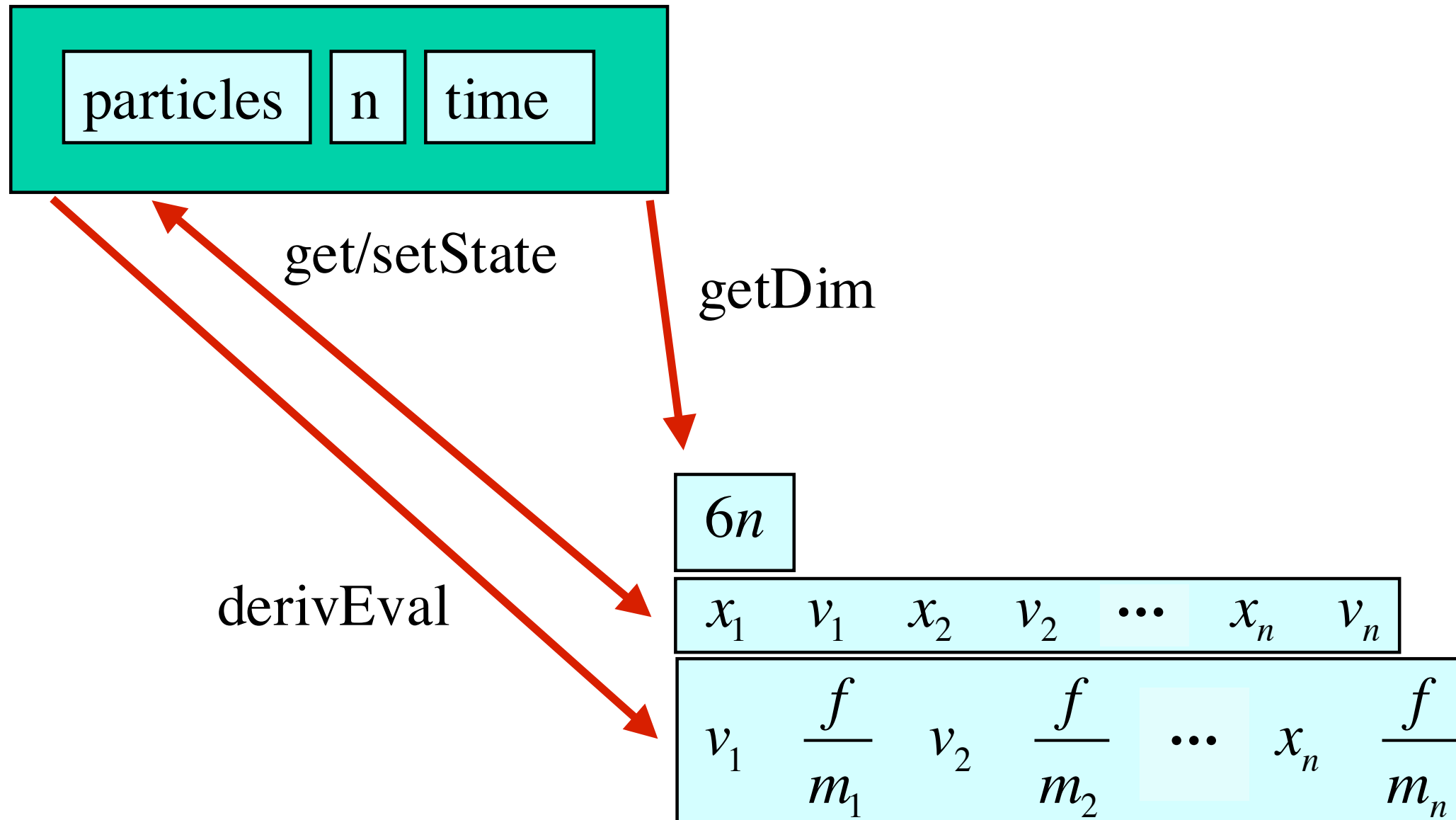


# Particle systems



$$\begin{bmatrix} \mathbf{x} \\ \mathbf{v} \\ \mathbf{f} \\ m \end{bmatrix} \begin{bmatrix} \mathbf{x} \\ \mathbf{v} \\ \mathbf{f} \\ m \end{bmatrix} \begin{bmatrix} \mathbf{x} \\ \mathbf{v} \\ \mathbf{f} \\ m \end{bmatrix} \begin{bmatrix} \mathbf{x} \\ \mathbf{v} \\ \mathbf{f} \\ m \end{bmatrix} \cdots \begin{bmatrix} \mathbf{x} \\ \mathbf{v} \\ \mathbf{f} \\ m \end{bmatrix}$$

# Solver interface



# Differential equation solver

$$\begin{bmatrix} \dot{x} \\ \dot{v} \end{bmatrix} = \begin{bmatrix} v \\ f / m \end{bmatrix}$$

Euler method:  $x(t + h) = x(t) + h \cdot \dot{x}(t)$

$$\mathbf{x}_{i+1} = \mathbf{x}_i + \Delta t \cdot \dot{\mathbf{x}}$$

$$\mathbf{v}_{i+1} = \mathbf{v}_i + \Delta t \cdot \dot{\mathbf{v}}$$

Gets very unstable for large  $\Delta t$

Higher order solvers perform better: (e.g. Runge-Kutta)

# derivEval loop

1. Clear forces
  - Loop over particles, zero force accumulators
2. Calculate forces
  - Sum all forces into accumulators
3. Gather
  - Loop over particles, copying  $v$  and  $f/m$  into destination array



# Forces

- Constant (gravity)
- Position/time dependent (force fields)
- Velocity-dependent (drag)
- N-ary (springs)

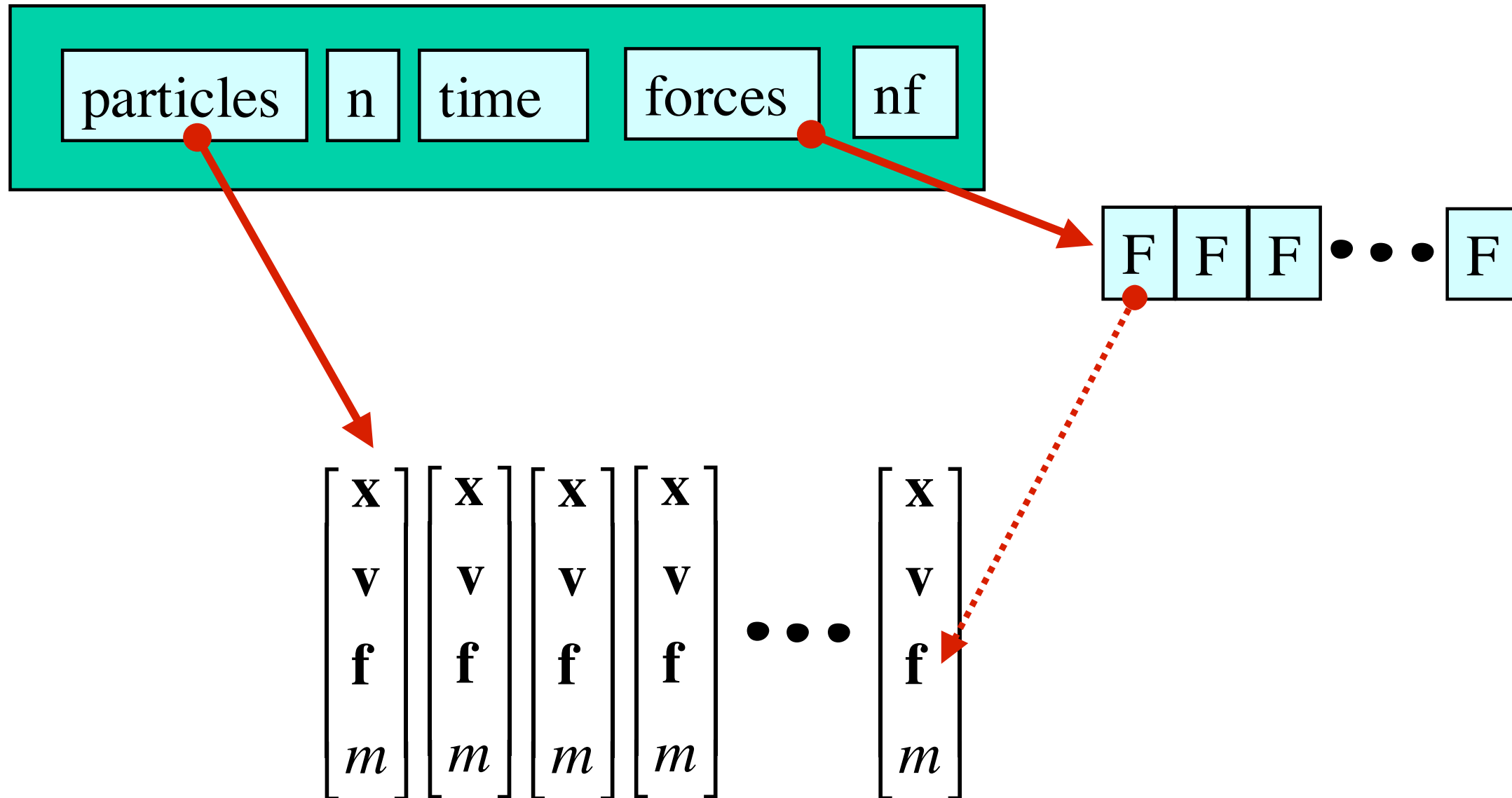
# Force structures

Force objects are black boxes that point to the particles they influence, and add in their contribution into the force accumulator.

Global force calculation:

- Loop, invoking force objects

# Particle systems with forces



# Gravity

Force law:

$$\mathbf{f}_{grav} = m\mathbf{G}$$

$$\mathbf{p} \rightarrow \mathbf{f} += \mathbf{p} \rightarrow \mathbf{m} * \mathbf{F} \rightarrow \mathbf{G}$$

# Viscous drag

Force law:

$$\mathbf{f}_{drag} = -k_{drag} \mathbf{v}$$

$$\mathbf{p} \rightarrow \mathbf{f} \quad \mathrel{==} \quad \mathbf{F} \rightarrow \mathbf{k} \quad * \quad \mathbf{p} \rightarrow \mathbf{v}$$



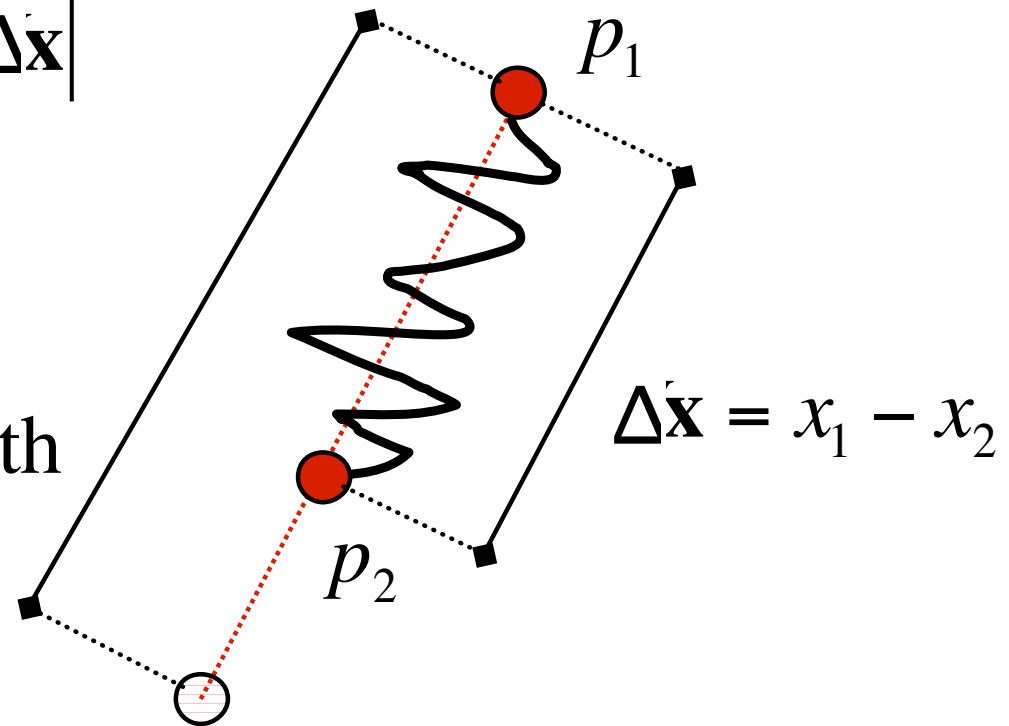
# Damped spring

Force law:

$$\mathbf{f}_1 = - \left[ k_s (|\Delta \dot{\mathbf{x}}| - \mathbf{r}) + k_d \left( \frac{\Delta \dot{\mathbf{v}} \Delta \dot{\mathbf{x}}}{|\Delta \dot{\mathbf{x}}|} \right) \right] \frac{\Delta \dot{\mathbf{x}}}{|\Delta \dot{\mathbf{x}}|}$$

$$\mathbf{f}_2 = -\mathbf{f}_1$$

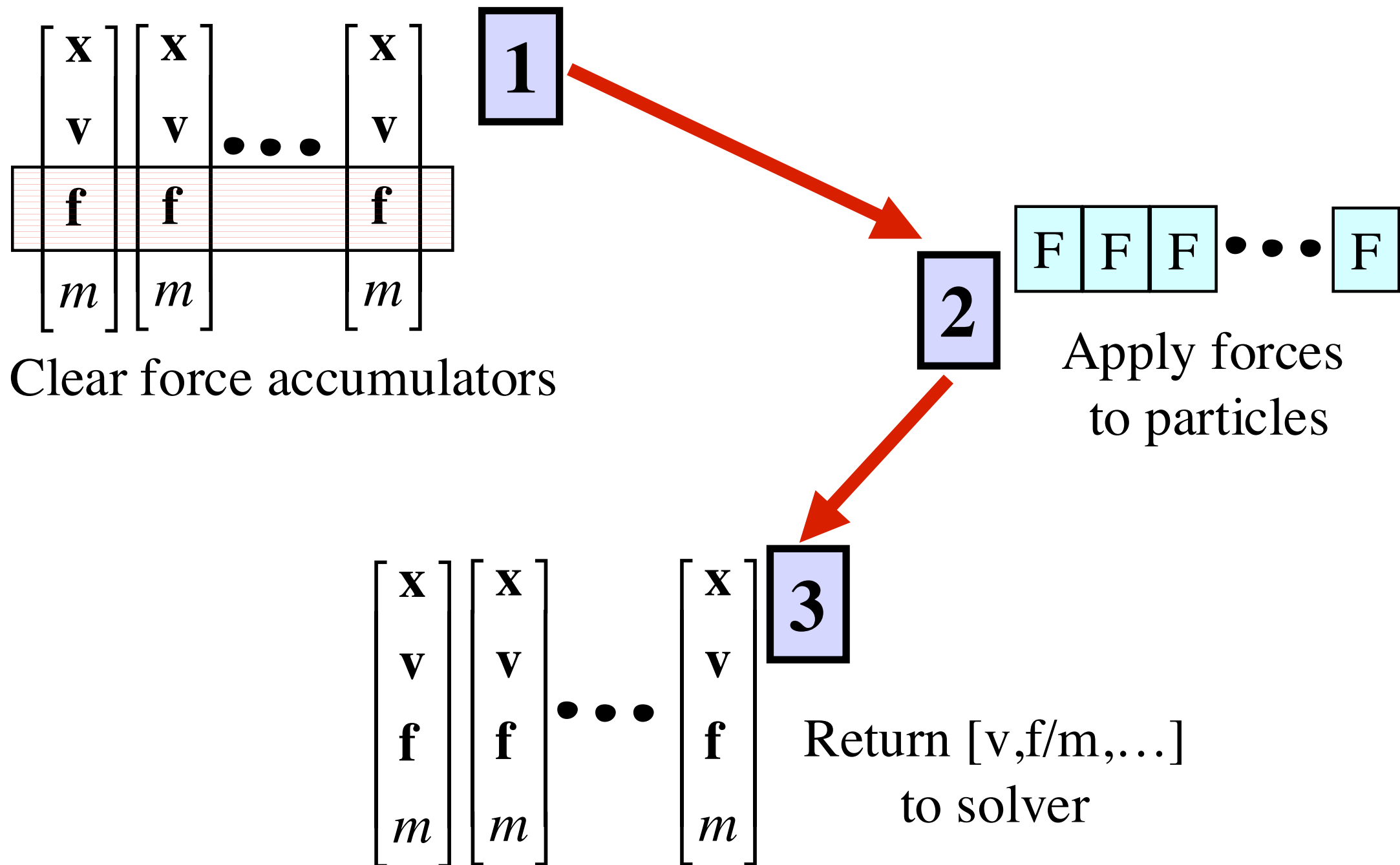
$\mathbf{r}$  = rest length



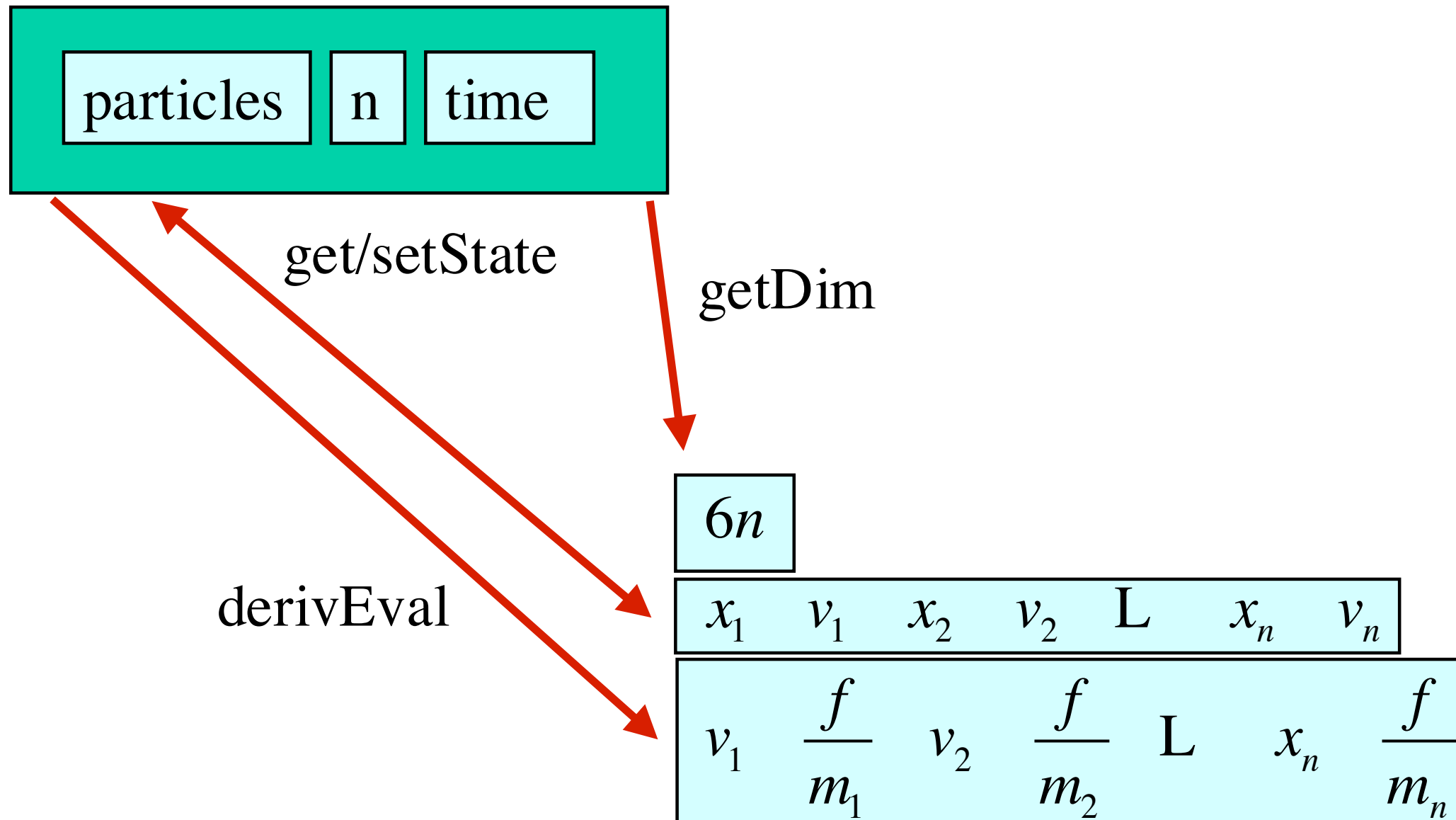


<http://video.google.com/videoplay?docid=-2182452945242275492&ei=ZSjSSbvGKo2grwKm-LHPAQ&q=particle+system+spring&hl=en&client=safari>

# derivEval Loop



# Solver interface



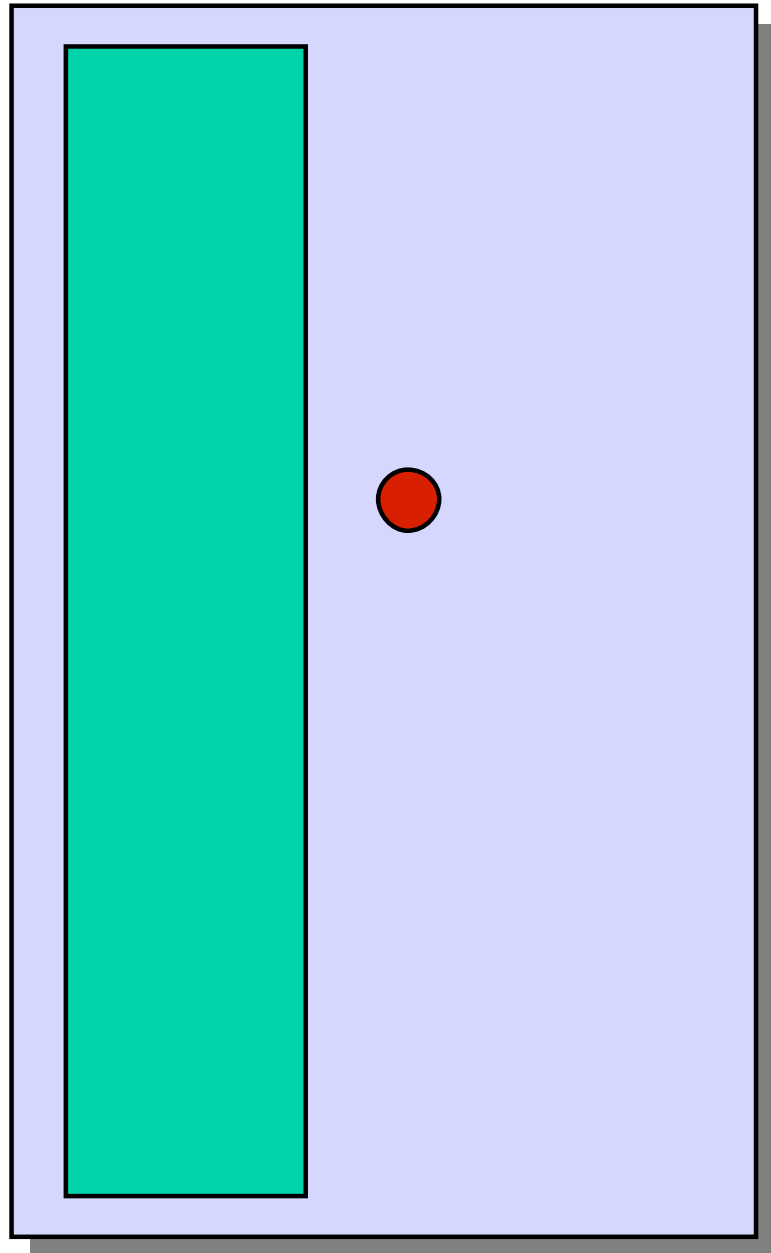
# Differential equation solver

$$\begin{bmatrix} \dot{\hat{x}} \\ \dot{v} \end{bmatrix} = \begin{bmatrix} v \\ f / m \end{bmatrix}$$

Euler method:

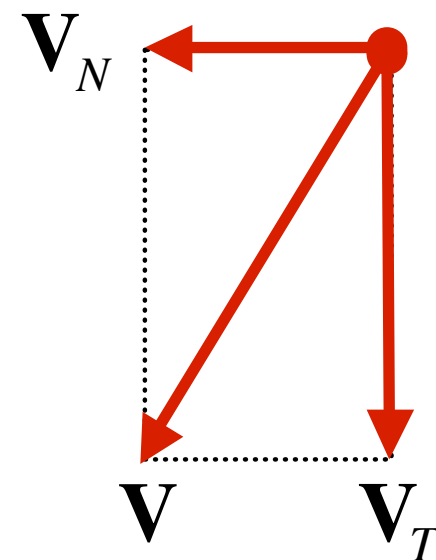
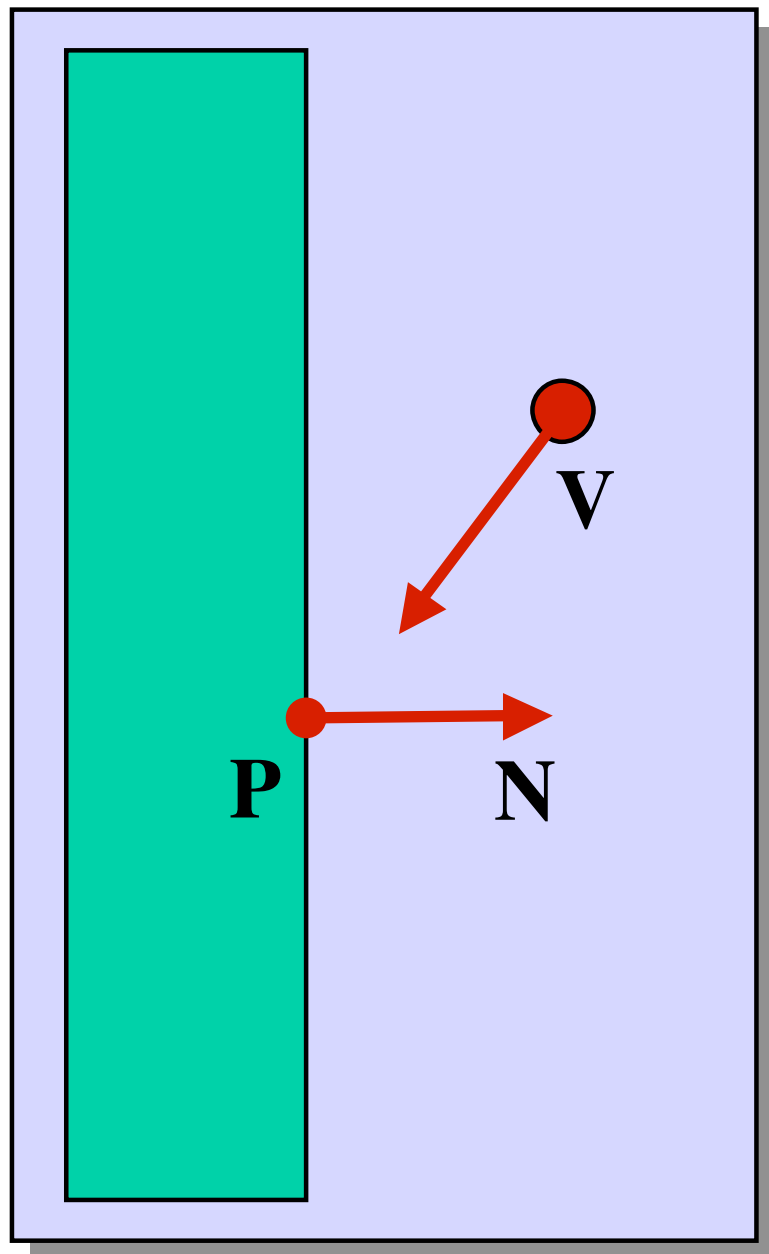
$$\begin{bmatrix} x_1^{i+1} \\ v_1^{i+1} \\ \dots \\ x_n^{i+1} \\ v_n^{i+1} \end{bmatrix} = \begin{bmatrix} x_1^i \\ v_1^i \\ \dots \\ x_n^i \\ v_n^i \end{bmatrix} + \Delta t \begin{bmatrix} v_1^i \\ f_1^i / m_1 \\ \dots \\ v_n^i \\ f_n^i / m_n \end{bmatrix}$$

# Bouncing off the walls



- Add-on for a particle simulator
- For now, just simple point-plane collisions

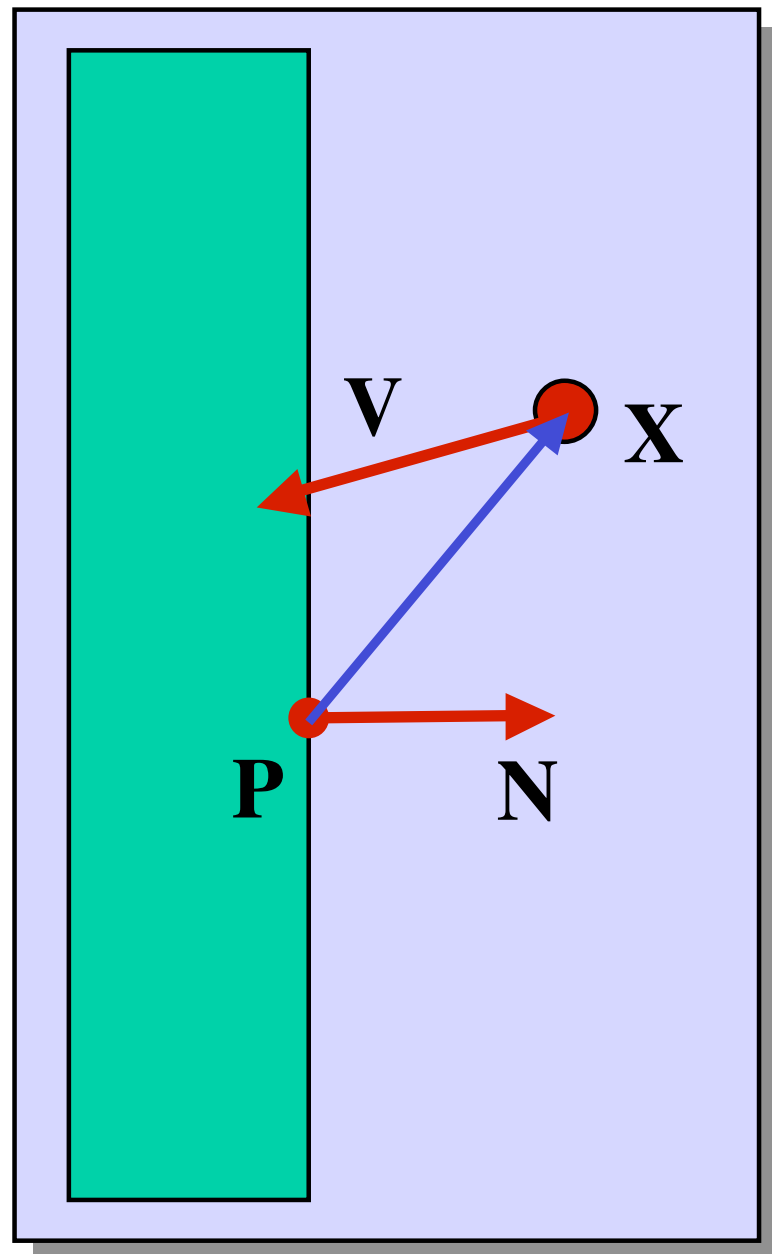
# Normal and tangential components



$$V_N = (N \cdot V)N$$

$$V_T = V - V_N$$

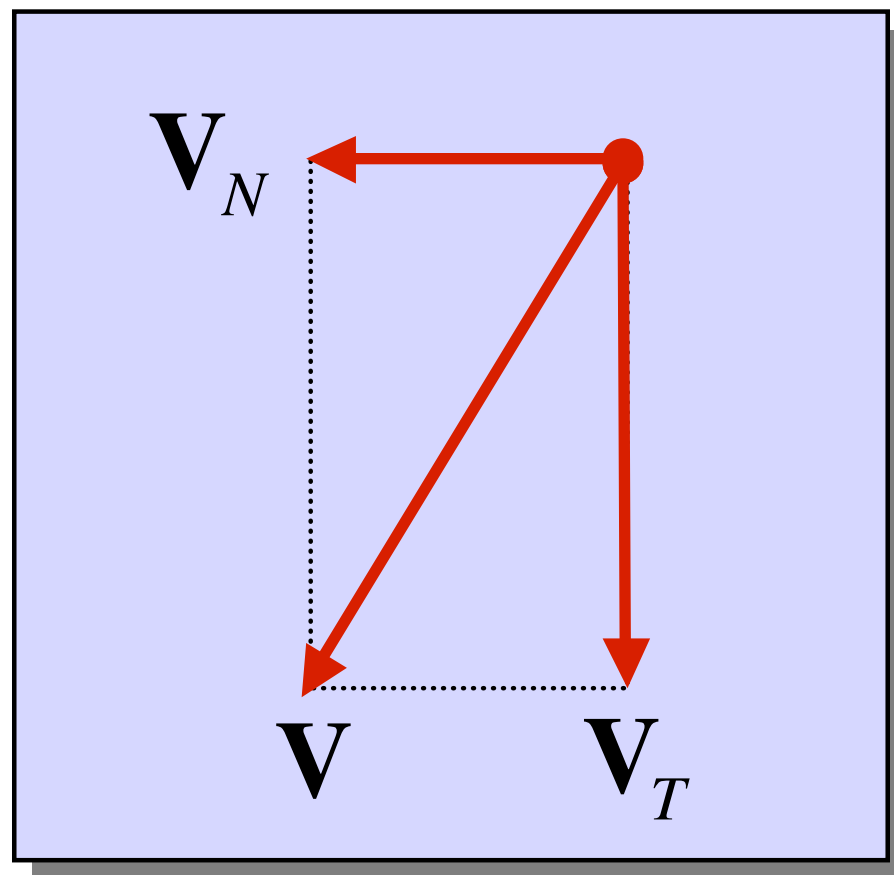
# Collision Detection



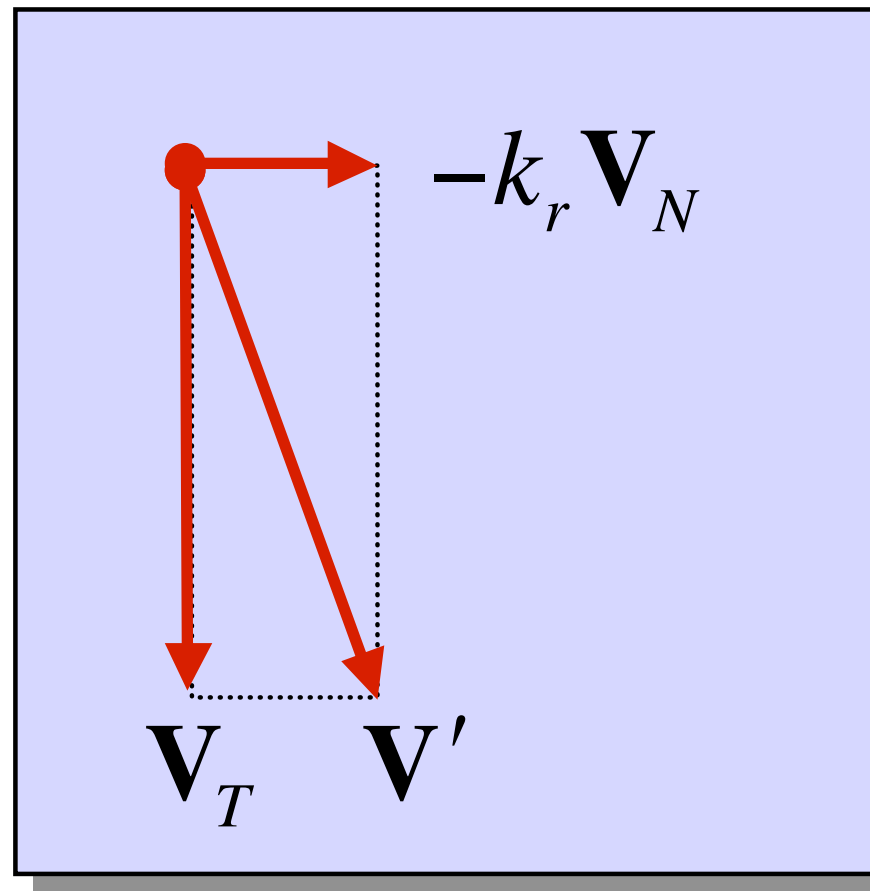
$(X - P) \cdot N < \varepsilon$     Within  $\varepsilon$  of the wall  
 $N \cdot V < 0$             Heading in



# Collision Response



before



after

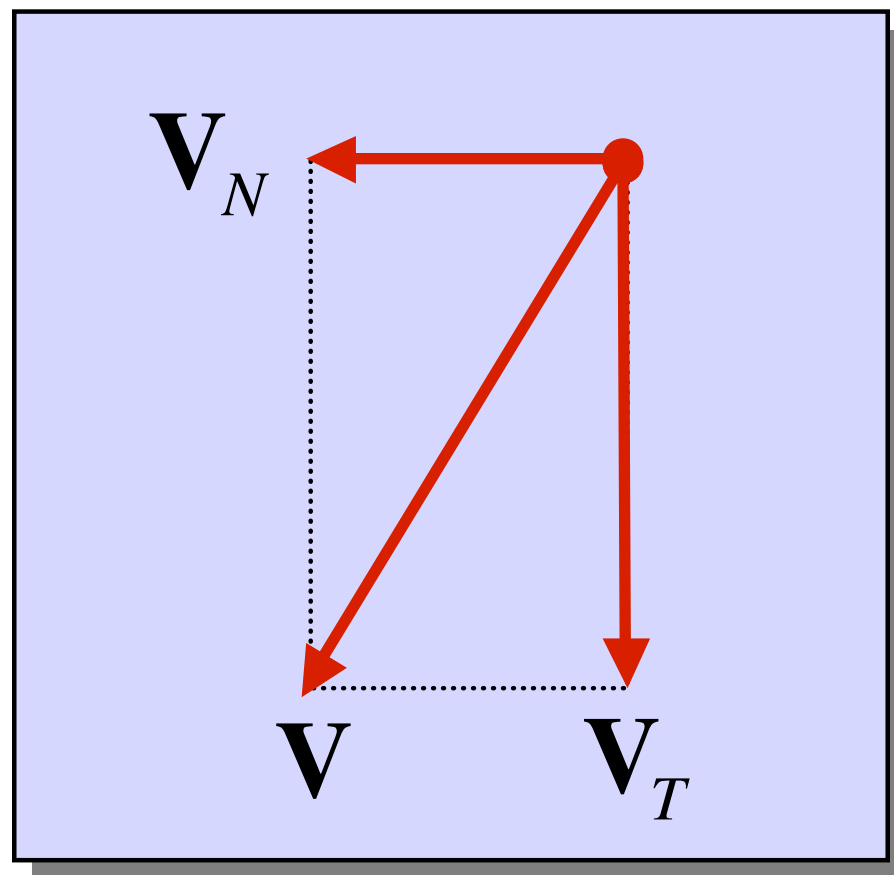
$$\mathbf{V}' = \mathbf{V}_T - k_r \mathbf{V}_N$$

# Collision Response

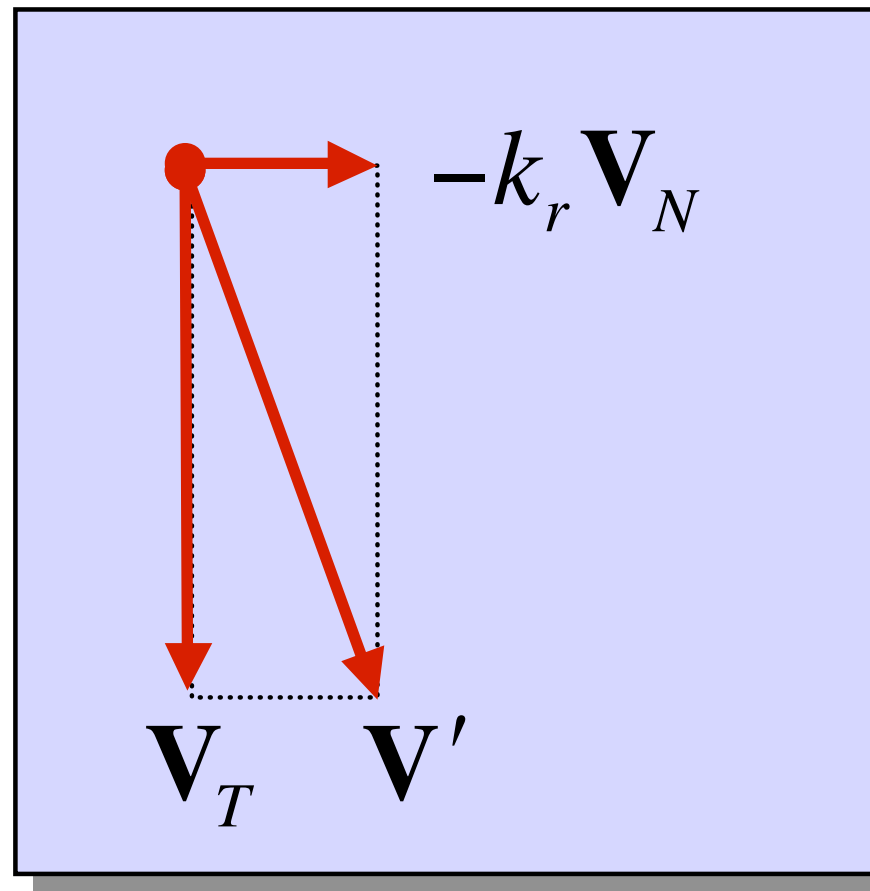


$$\mathbf{V}' = \mathbf{V}_T - k_r \mathbf{V}_N$$

# Collision Response



before



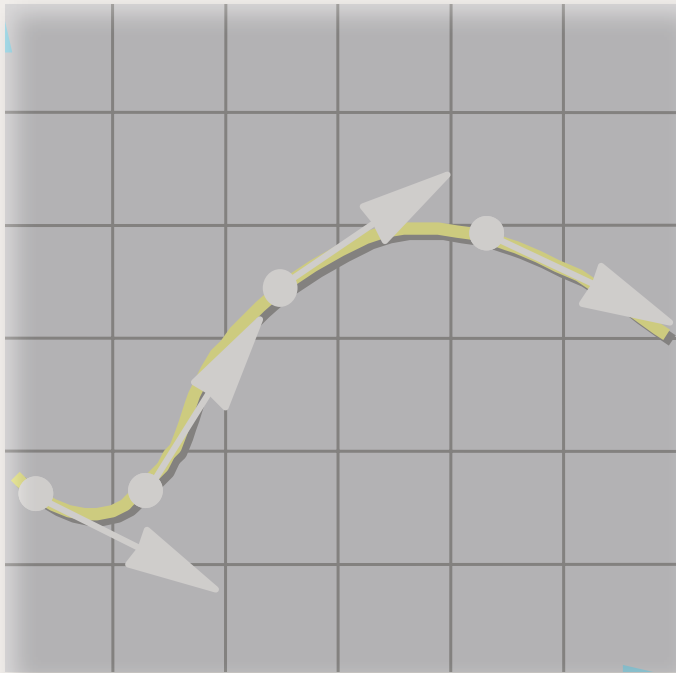
after

$$\mathbf{V}' = \mathbf{V}_T - k_r \mathbf{V}_N$$

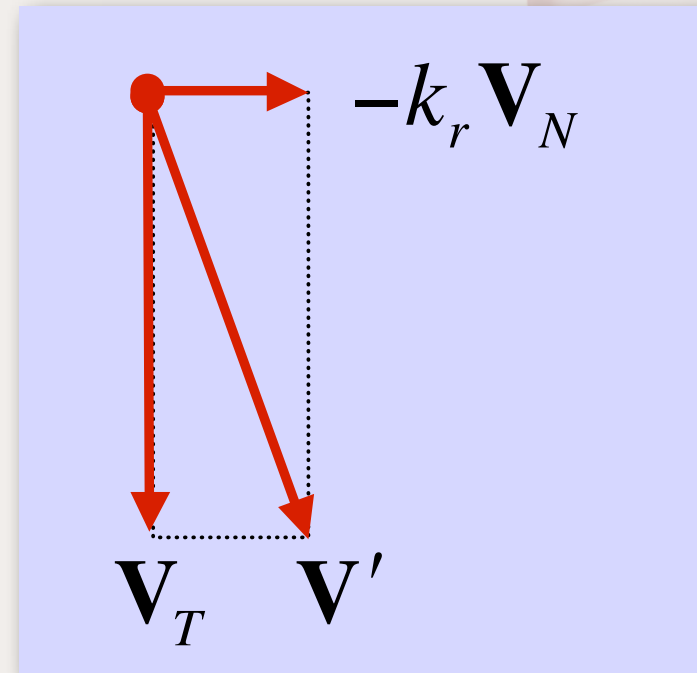
# Summary

- Physics of a particle system
- Various forces acting on a particle
- Combining particles into a particle system
- Euler method for solving differential equations

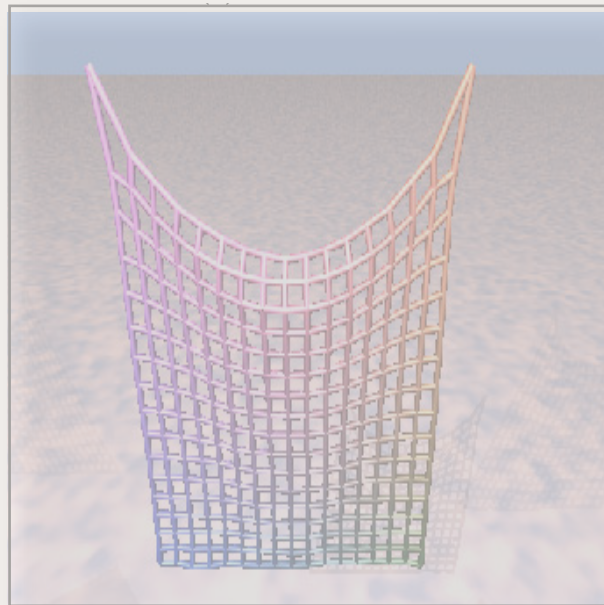
# Overview



**DiffEQ Review**



**Particle Dynamics**

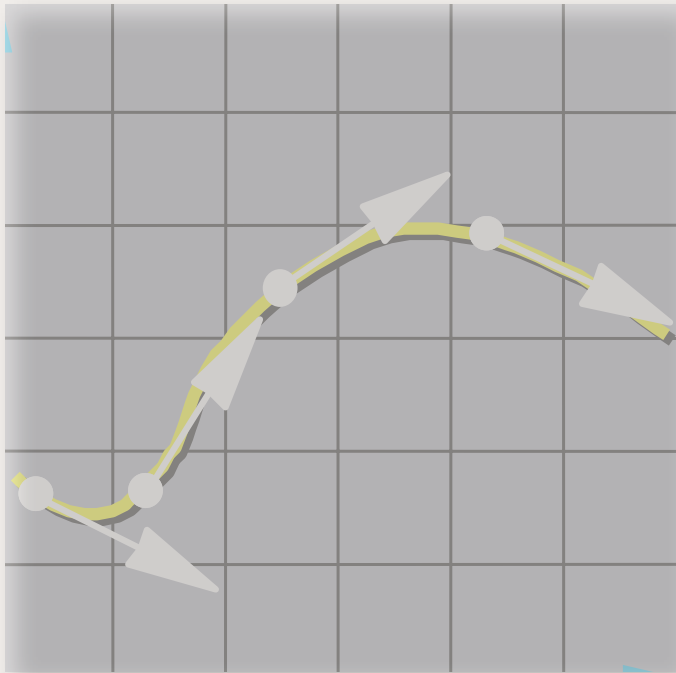


**Cloth**

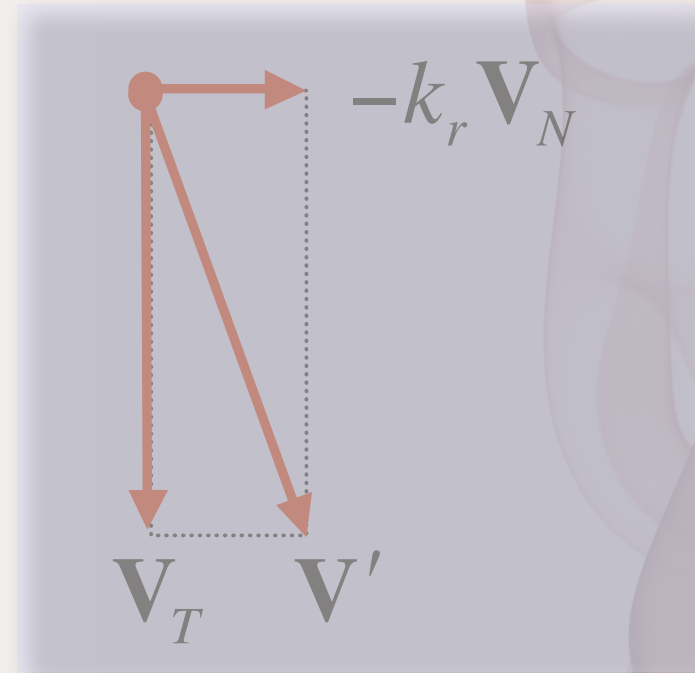


**Hair**

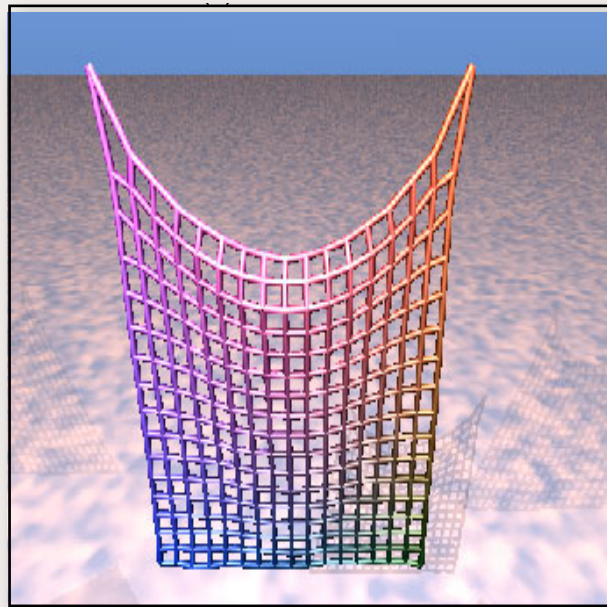
# Overview



DiffEQ Review



Particle Dynamics



Cloth



Hair



# What is cloth?

Two basic types...



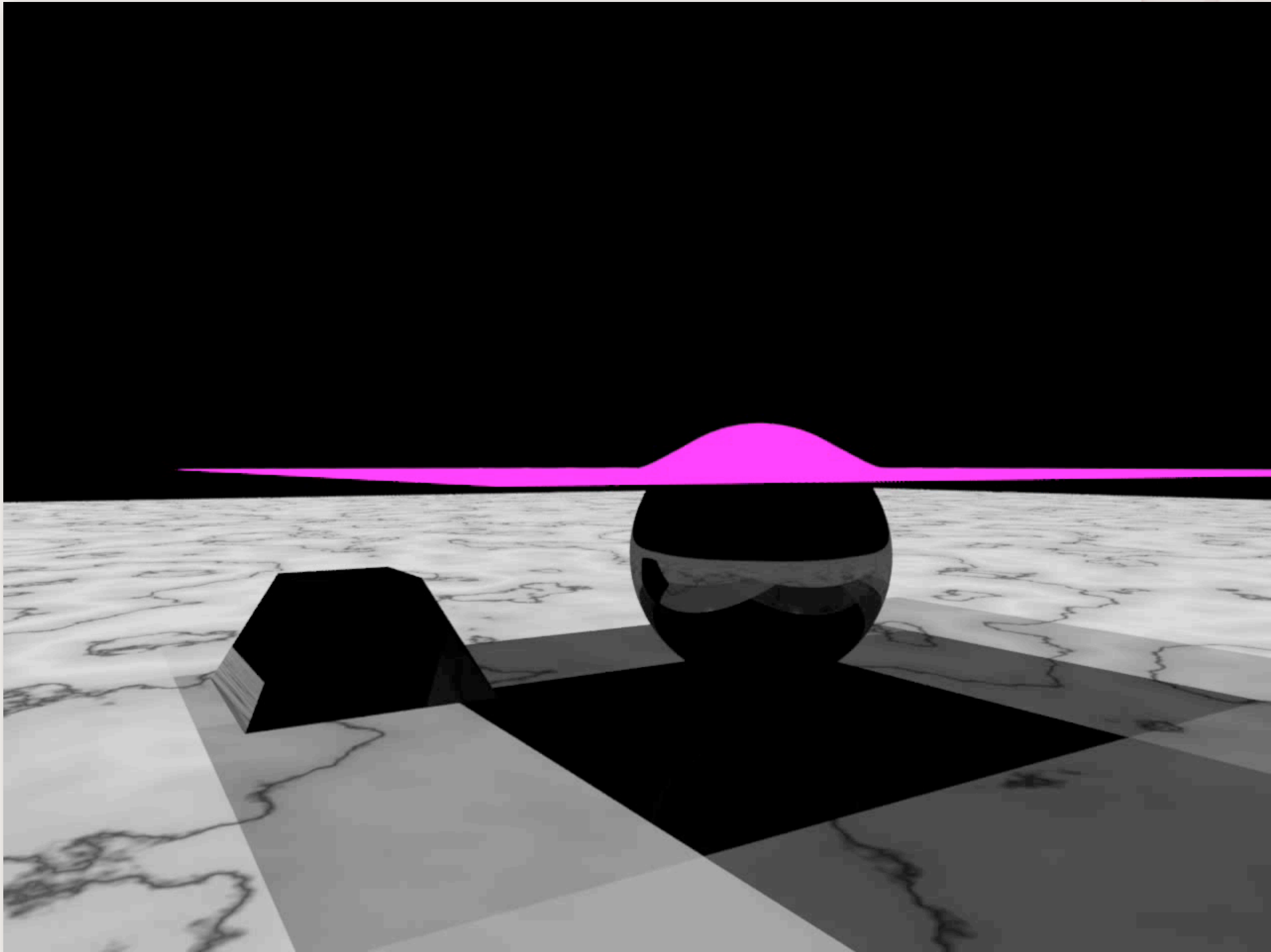
**Woven**



**Knit**



# Woven Cloth



Bridson, R., Marino, S. and Fedkiw, R., "Simulation of Clothing with Folds and Wrinkles", ACM SIGGRAPH/Eurographics Symposium on Computer Animation (SCA), edited by D. Breen and M. Lin, pp. 28-36, 2003.



# Knit Cloth



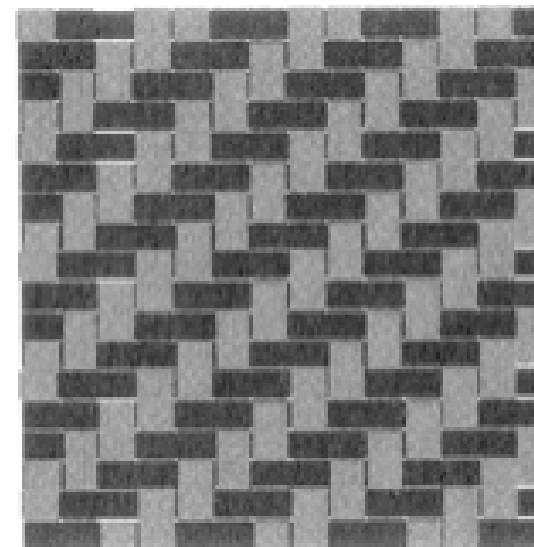
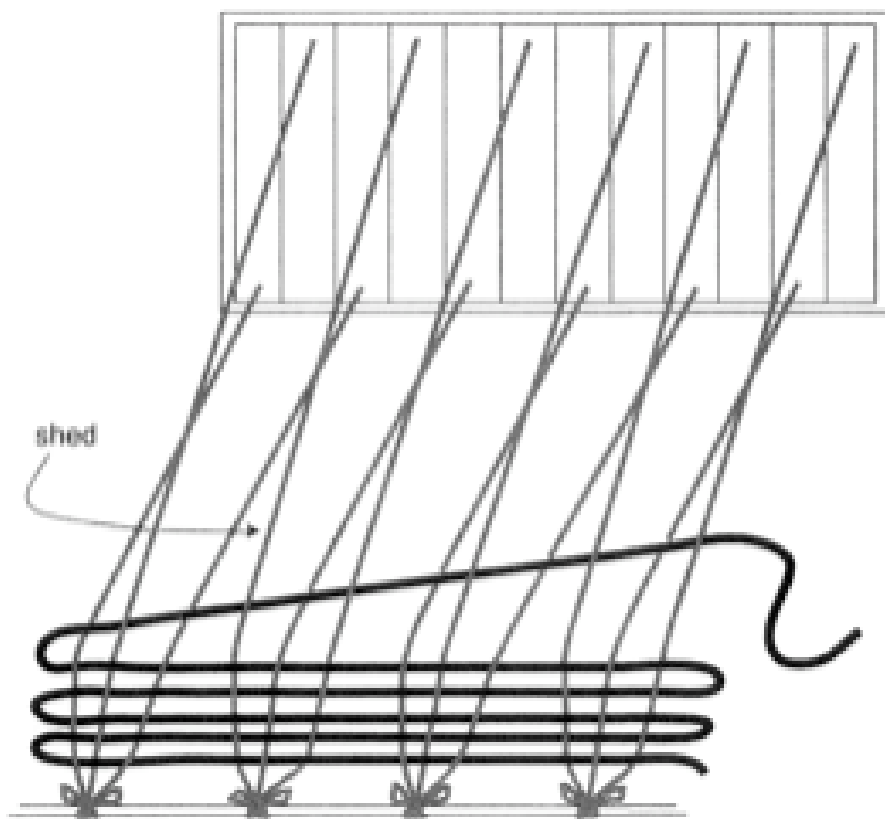
Jonathan Kaldor, Doug L. James, and Steve Marschner. Simulating Knitted Cloth at the Yarn Level. SIGGRAPH 2008.

# What is cloth?

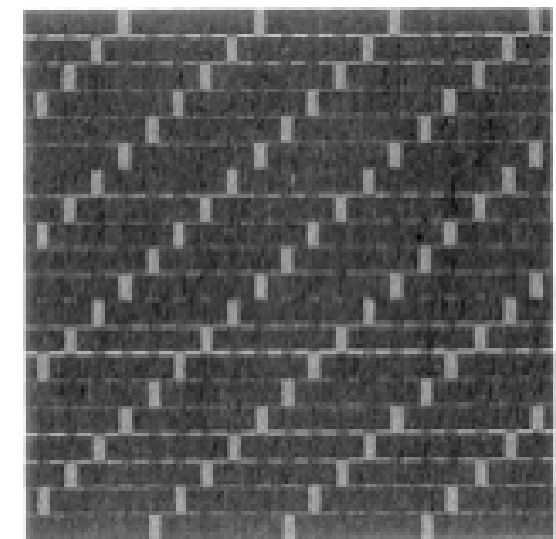
## Cloth Animation

Christopher Twigg  
March 4, 2003

- 2 basic types: woven and knit
- We'll restrict to woven
  - Warp vs. weft



b) twill

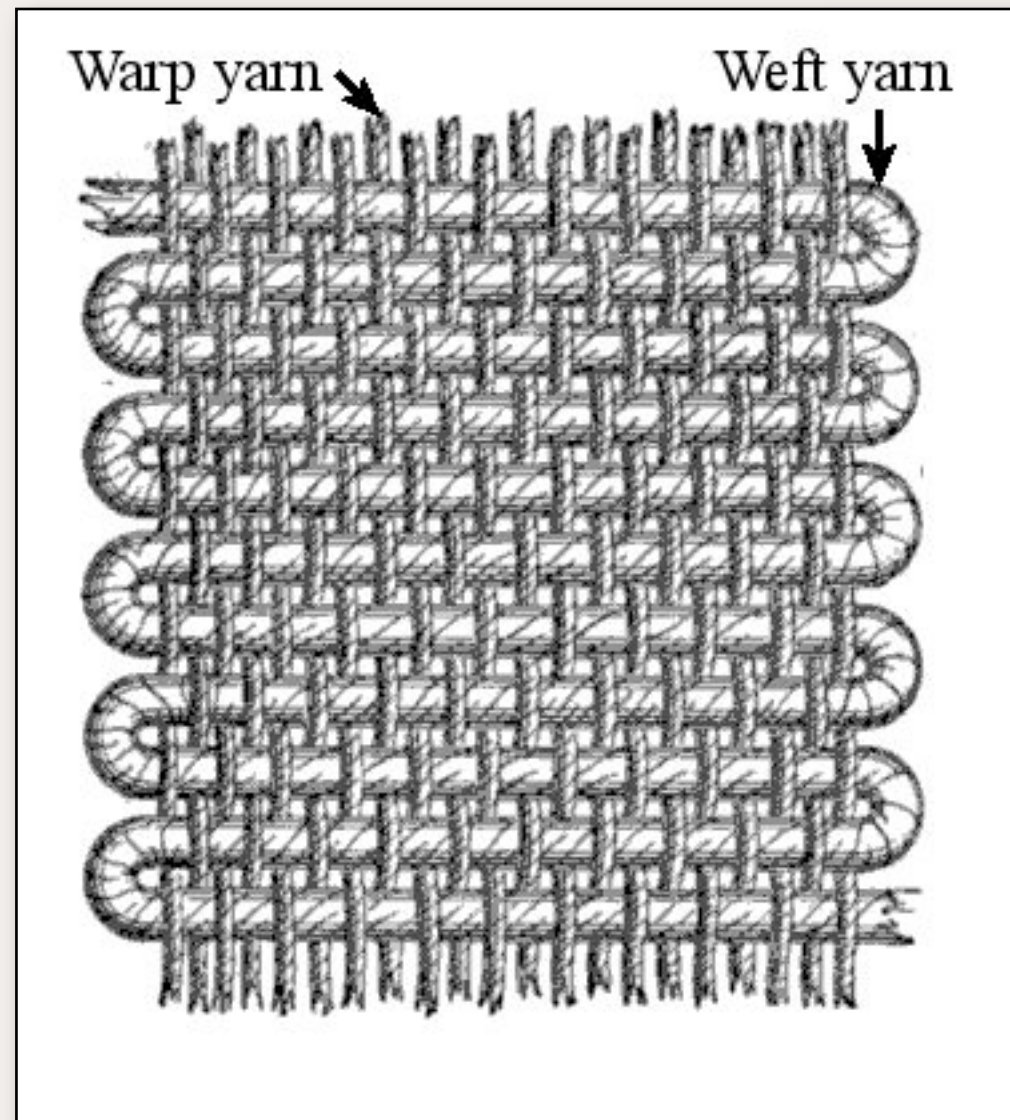


c) satin

Figure 1.8. The weaving process.



# Warp and Weft



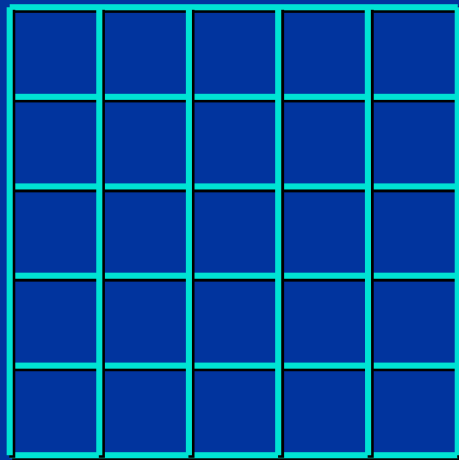
source: Wikipedia

# Cloth and Fur Energy Functions

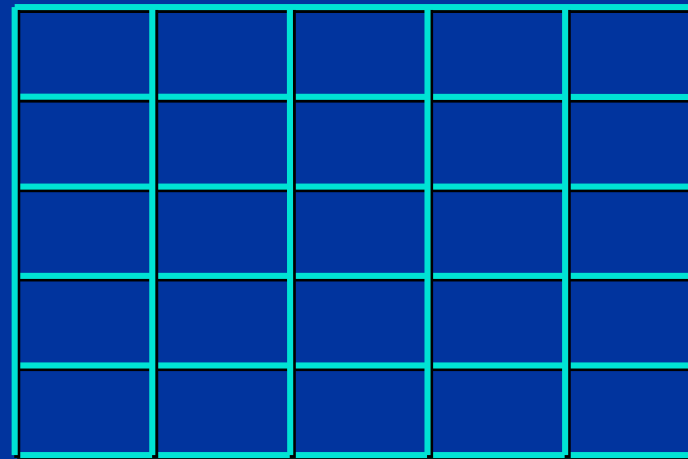
*Michael Kass*



## Stretch (Continuum Version)



$(u, v)$

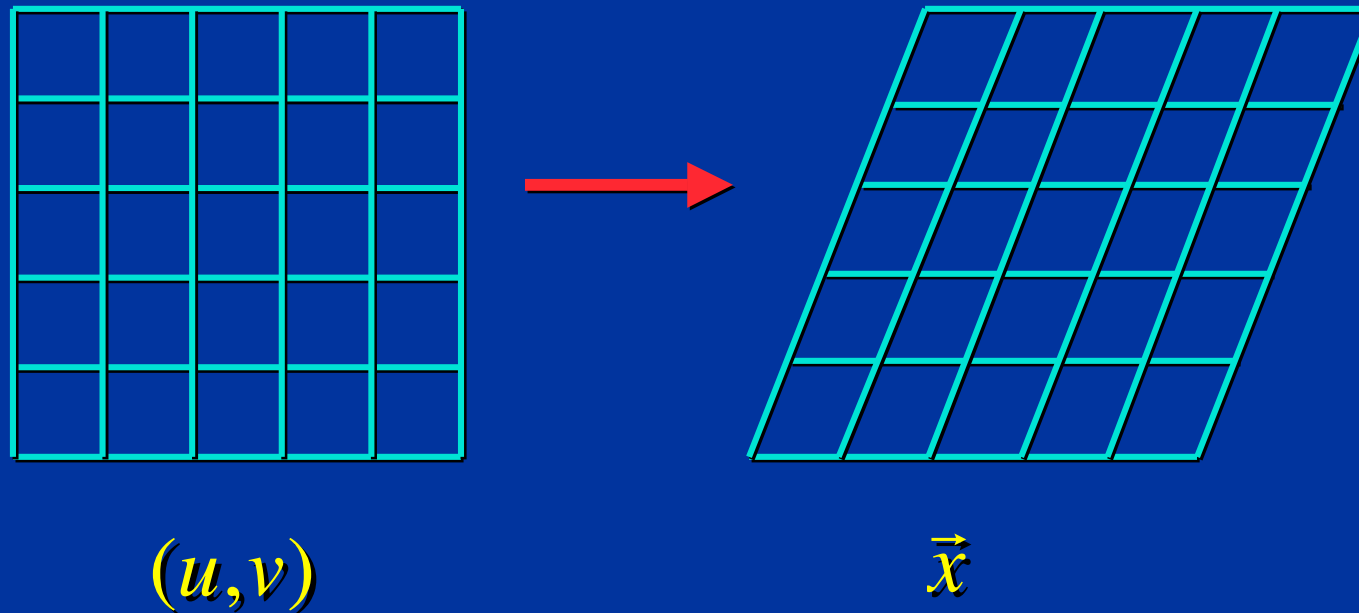


$\vec{x}$

$$S_u = \left\| \frac{\partial \vec{x}}{\partial u} \right\| - 1$$

$$E = \frac{1}{2} k \int (S_u^2 + S_v^2) du dv$$

## Shear (Continuum Version)

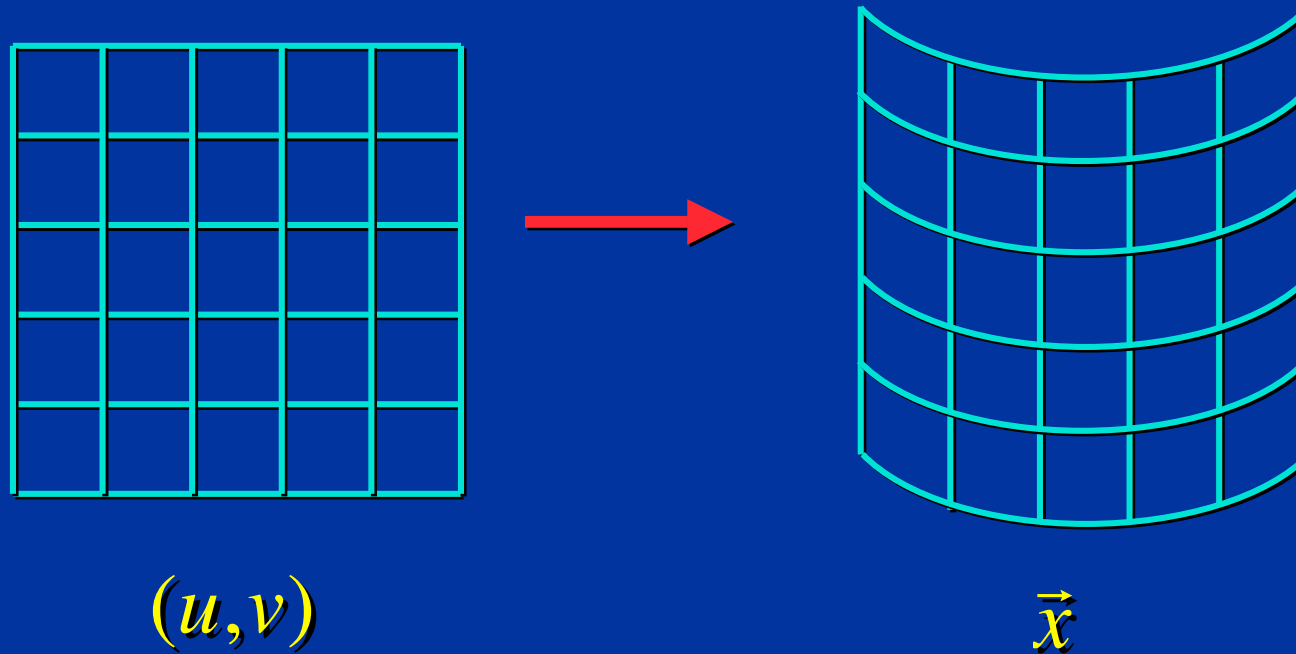


$$\theta = \cos^{-1} \left( \frac{\widehat{\partial \vec{x}}}{\partial u} \cdot \frac{\widehat{\partial \vec{x}}}{\partial v} \right)$$

$$E = \frac{1}{2} k \int \theta^2 du dv$$



## Bend (Continuum Version)



$$E = \frac{1}{2}k \int (\kappa_u^2 + \kappa_v^2) du dv$$

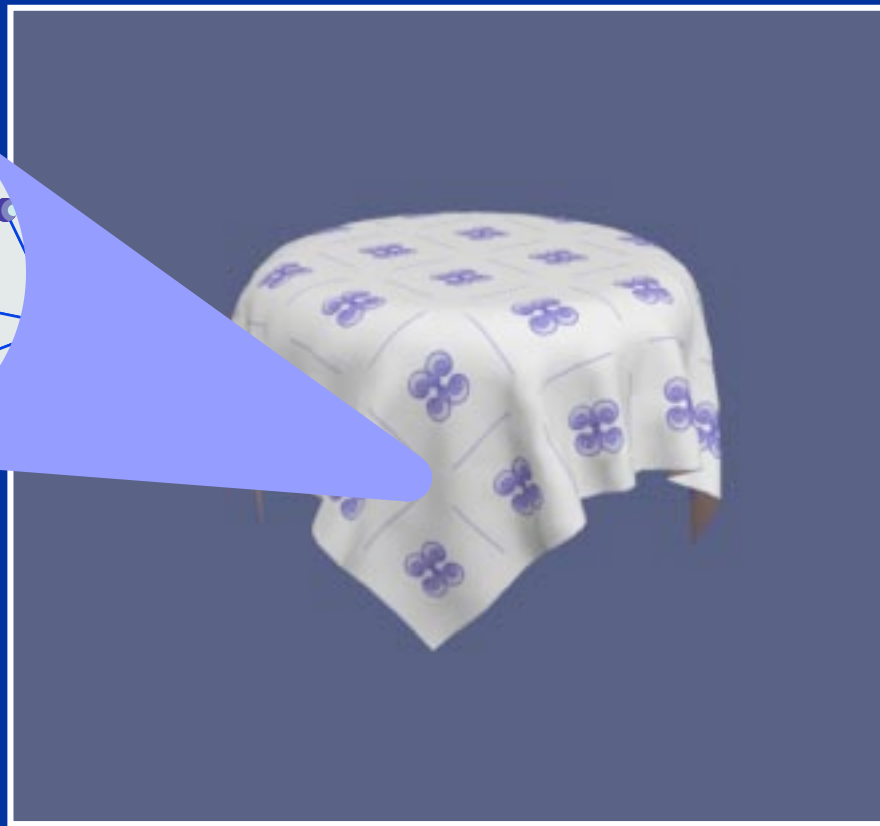
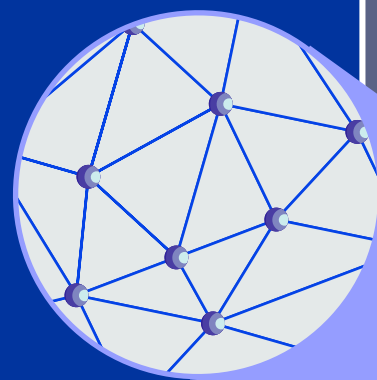
# Resitence To...

- **Stretching**
- **Shearing**
- **Bending**

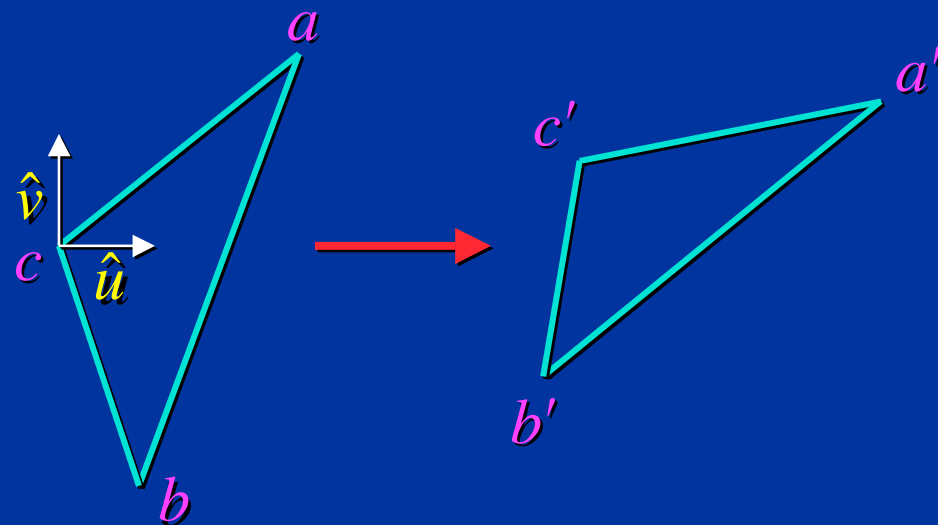




# Discretization



# Triangle Energy



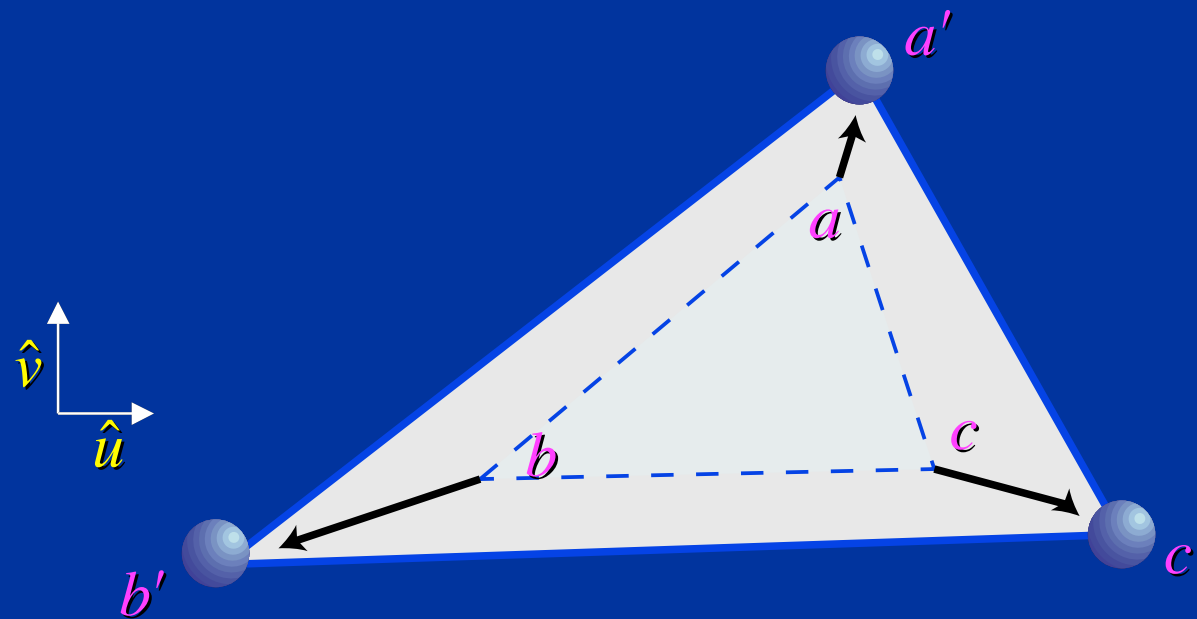
First, compute the affine transformation  $T$  that maps:

$$T : a \rightarrow c'$$

$$b \rightarrow b'$$

$$c \rightarrow c'$$

# Triangle Stretch Energy

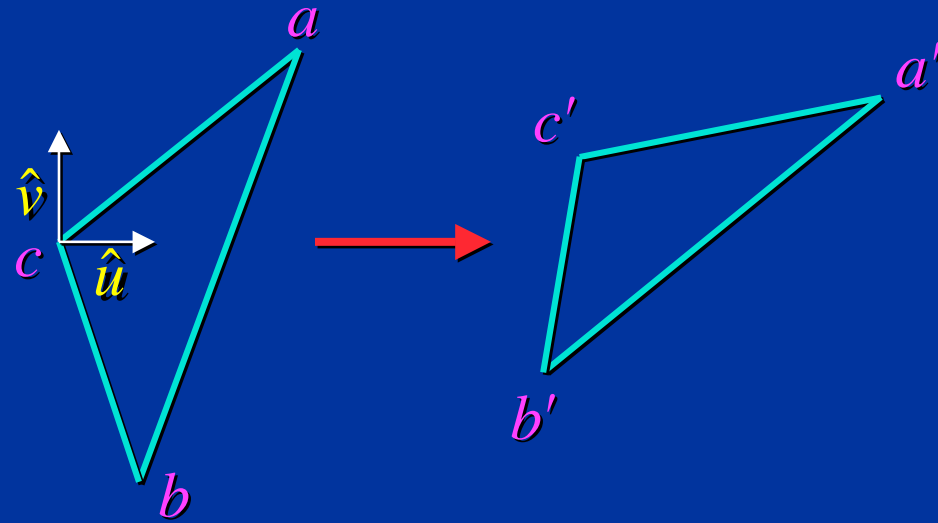


Now compute the stretch energy.

$$S_u = \|T(\hat{u})\| - 1$$

$$E_{\text{stretch}} = \frac{1}{2} k (S_u^2 + S_v^2) A$$

# Triangle Shear Energy

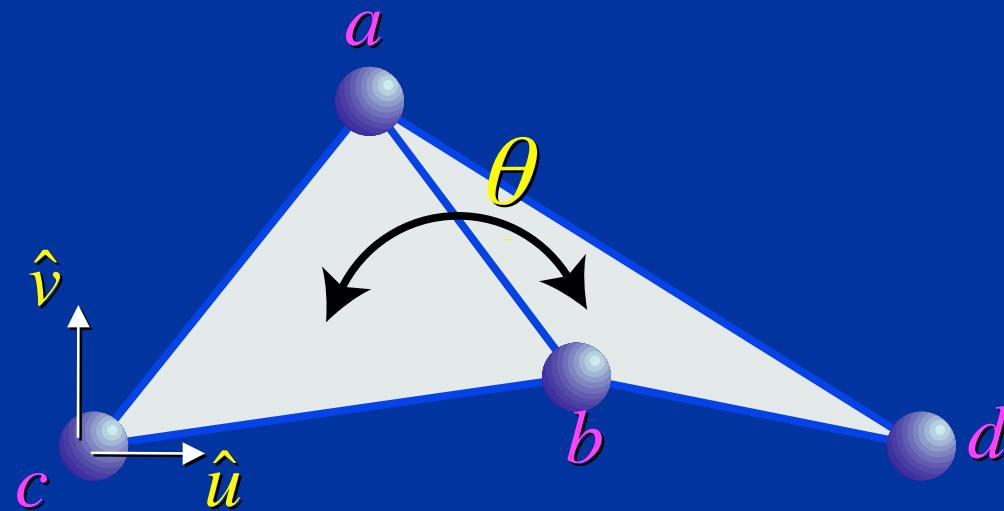


Next compute the shear energy.

$$\theta = \cos^{-1}(T(\hat{u}) \cdot T(\hat{v}))$$

$$E_{\text{shear}} = \frac{1}{2} k \theta^2 A$$

# Triangle Bend Energy



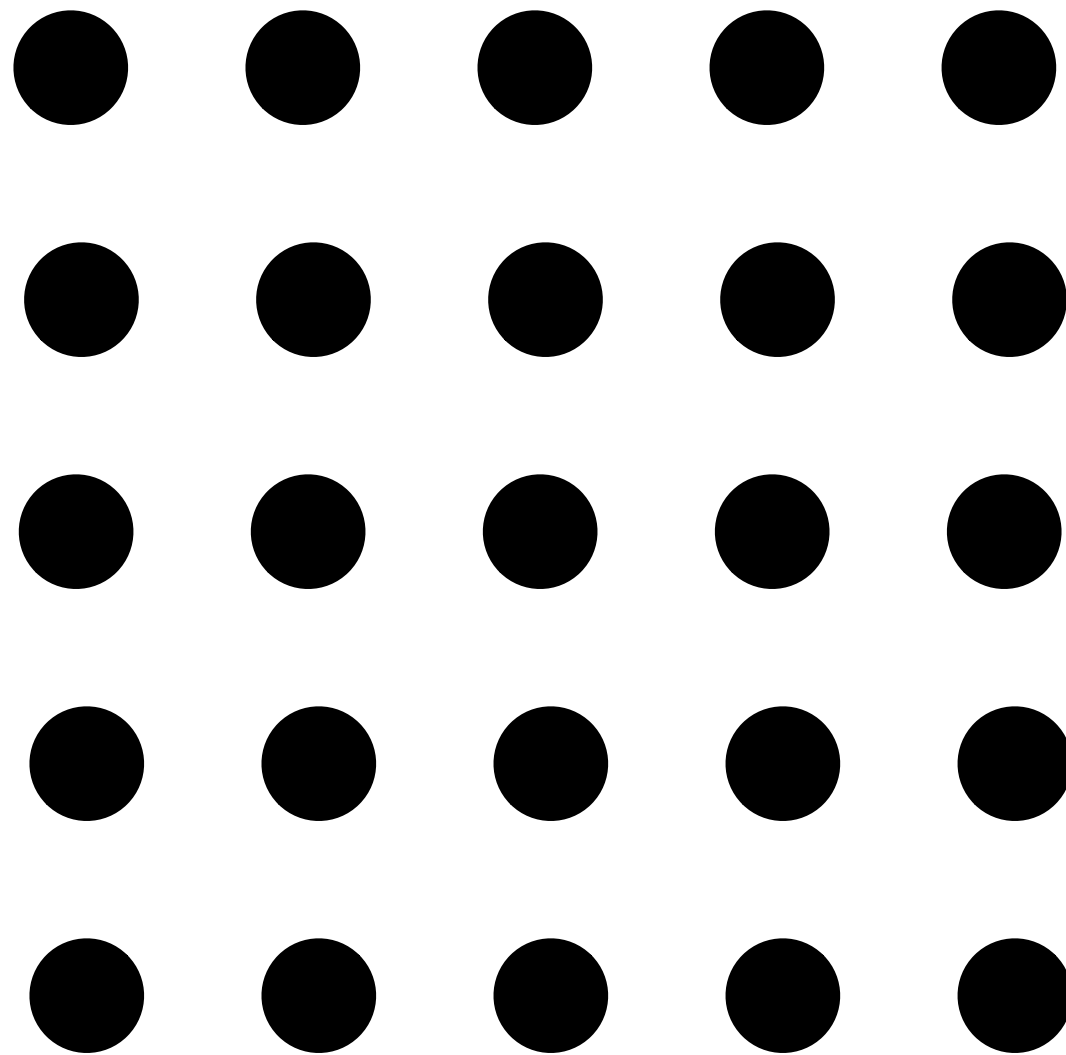
Finally compute the bend energy.

$$\kappa = \frac{\theta}{l_{\text{perp}}}$$

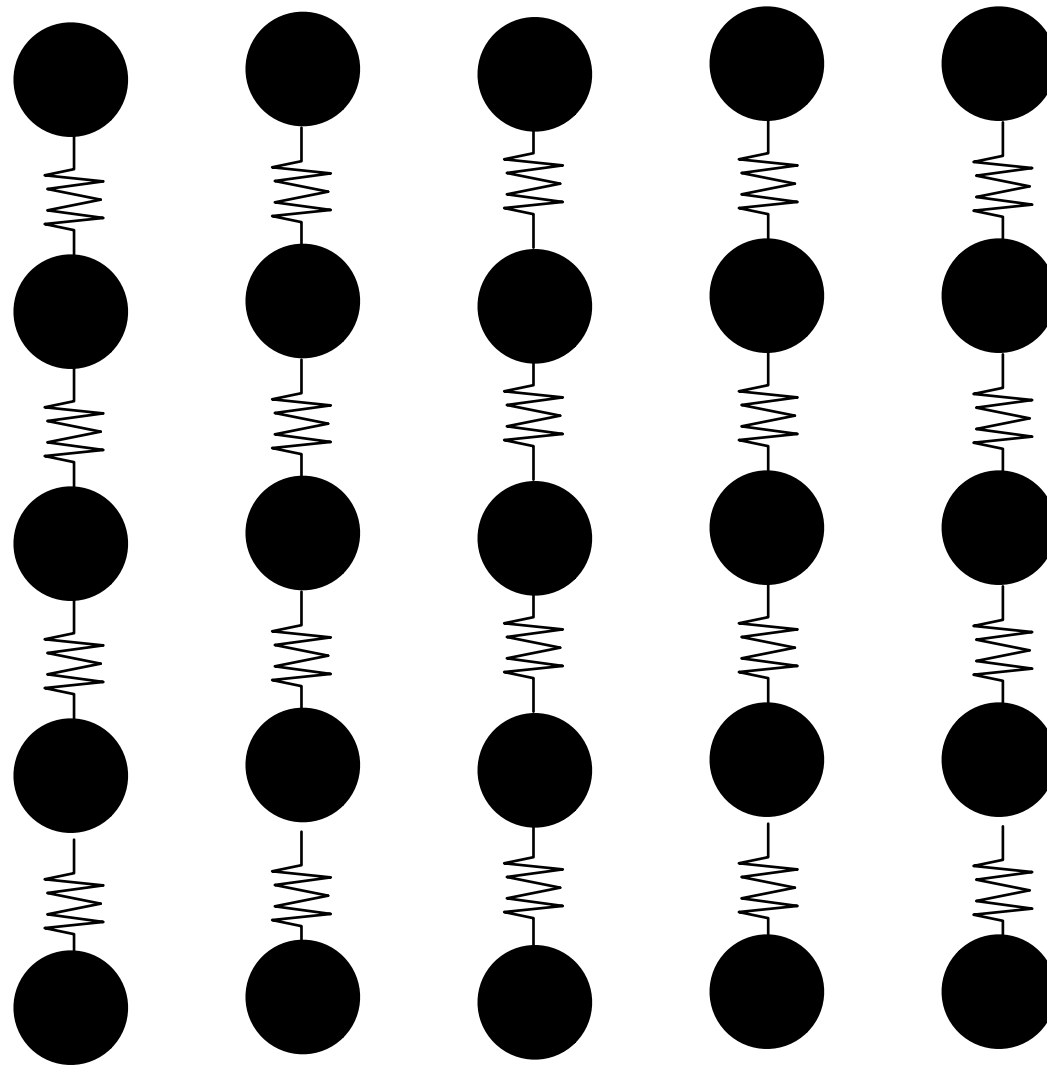
$$E_{\text{bend}} = \frac{k}{2}(\kappa^2)A$$



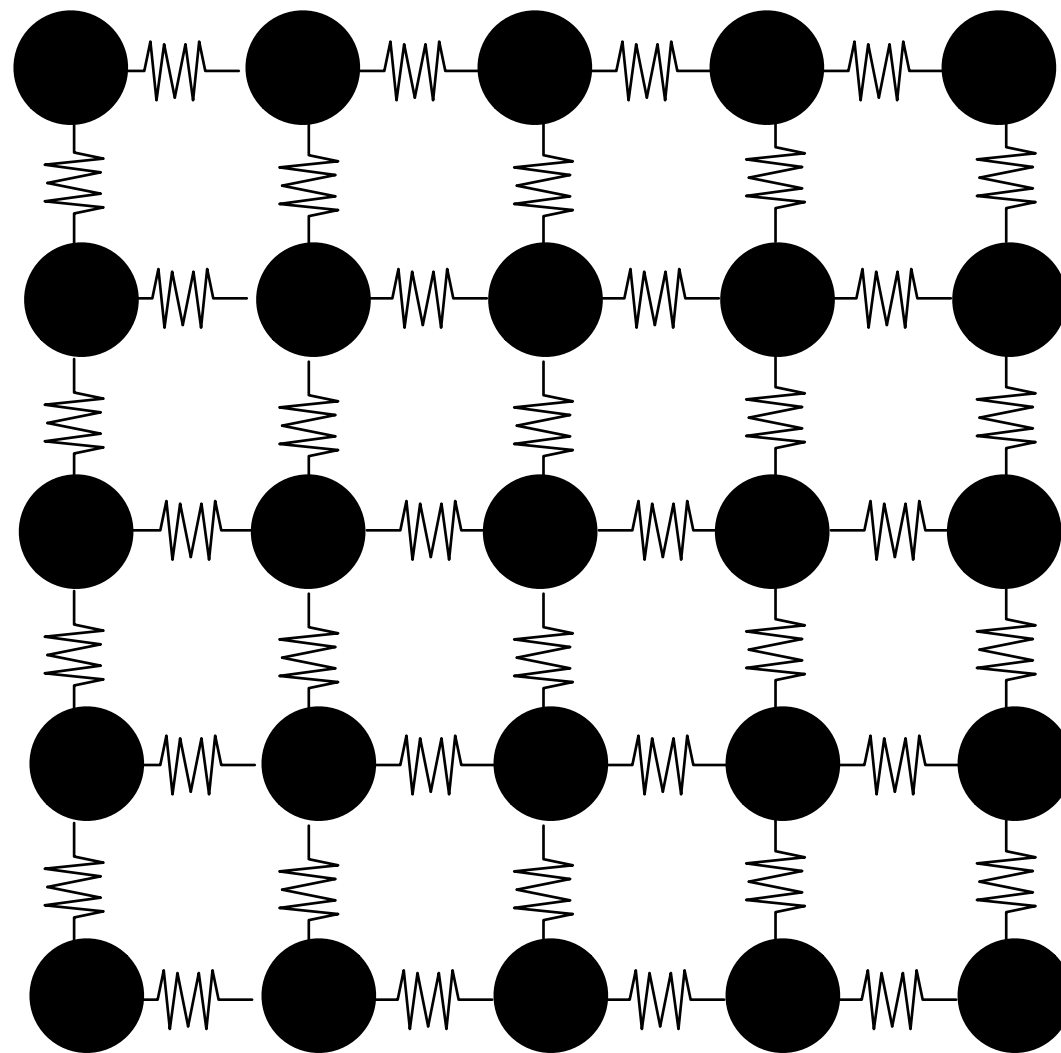
# Basic Model



# Warp Springs

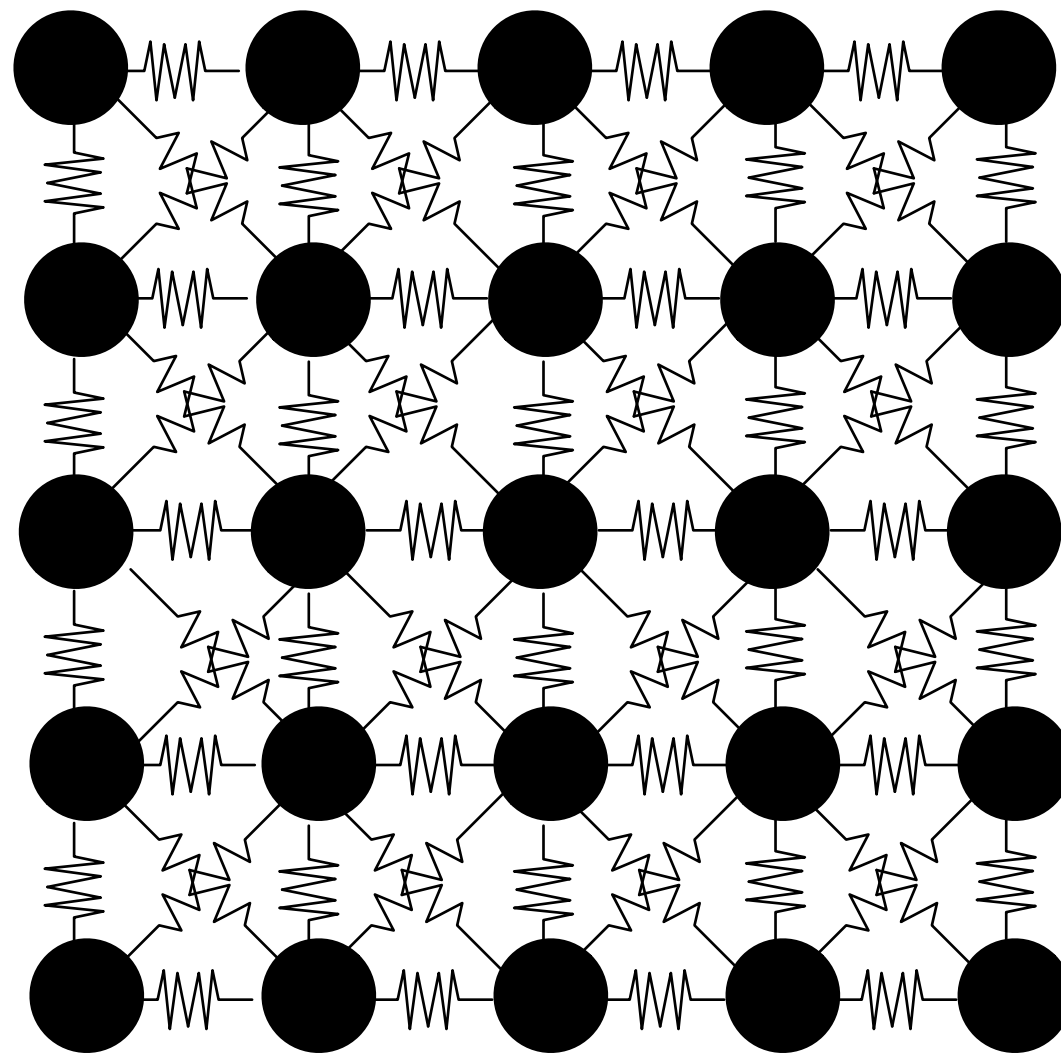


# Weft Springs

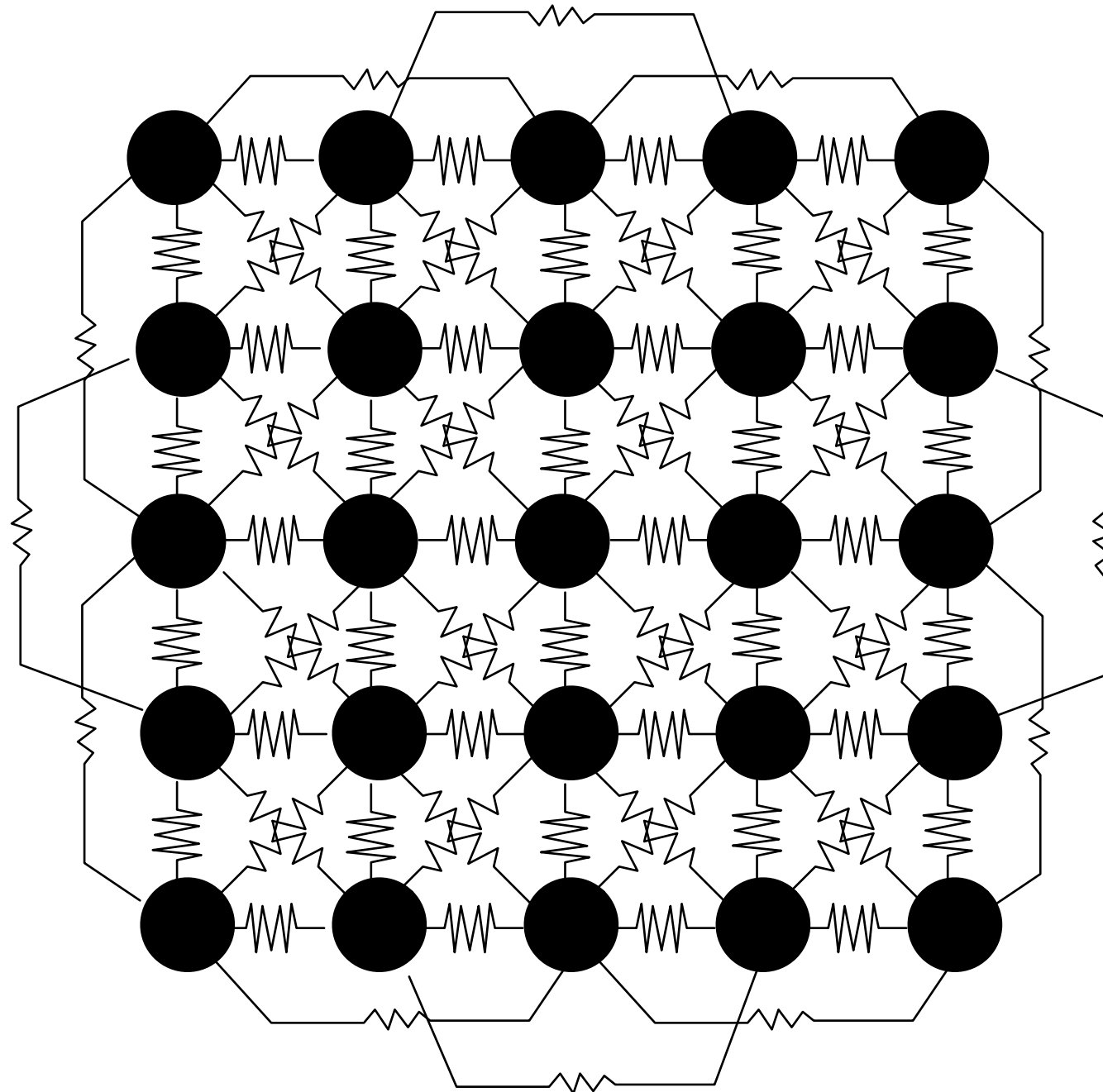




# Shear Springs



# Bend Springs





# Parameters

- Given stretch, shear, and bending constants...
- How would you make a **wrinkly t-shirt**, **thick cloth**, or **non-uniform cloth**?



# Creating Clothes

- **How could we create the 3D model the clothes for a character?**





# Non-flat Cloth

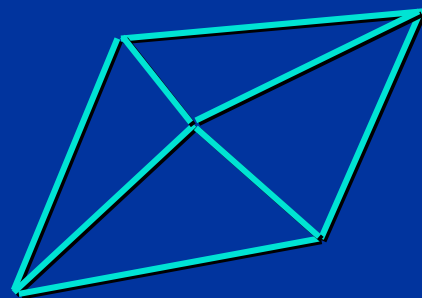
Non-flat cloth is strange stuff:

A baseball with no seams?

Wrinkles give strength?

Clothing cut out of a volume?

Convexities that pop?



Even 4 Triangles are over-constrained:  
16 rest angles, 8 rest lengths.  
24 constraints on 15 dofs.  
Must be consistent!

# Rest Mesh Options

## Model in 3D

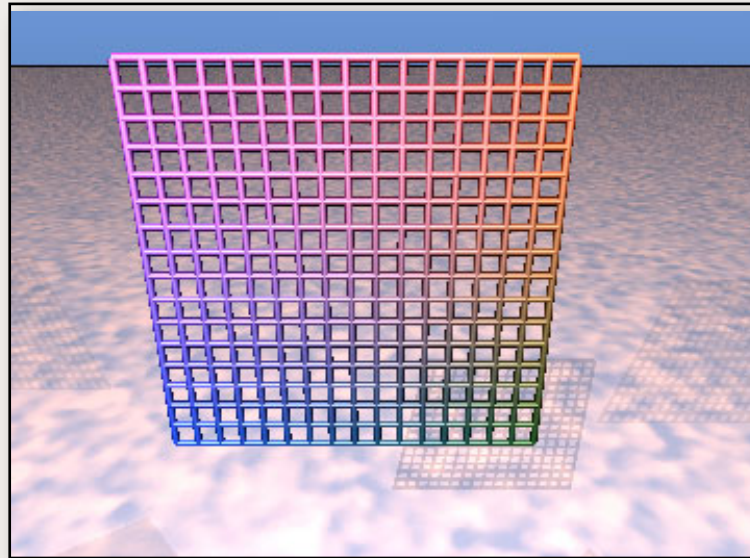
- Clothing already on characters.
- Can directly craft desired 3D shape.
- Annotate warp/weft directions.
- Clothing probably will not locally flatten.

## Model in 2D

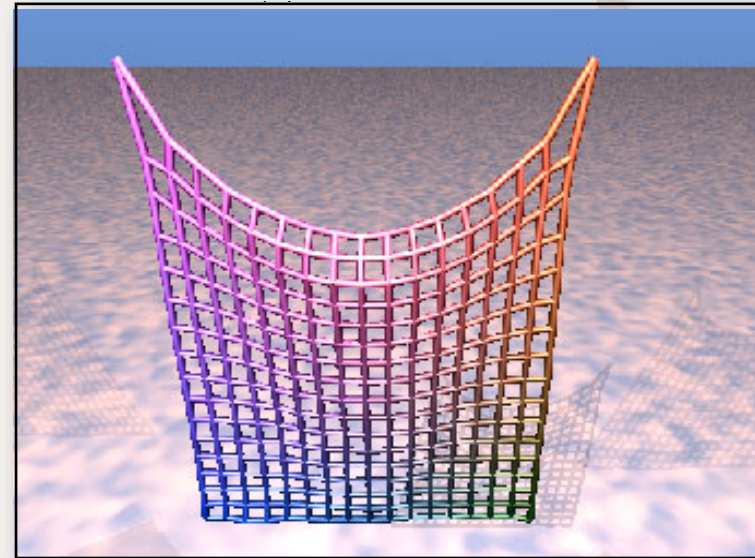
- Must put clothing on characters
- Hire a tailor to get the pattern right.
- Sew parts together.
- Clothing guaranteed to flatten locally.
- Greater realism.



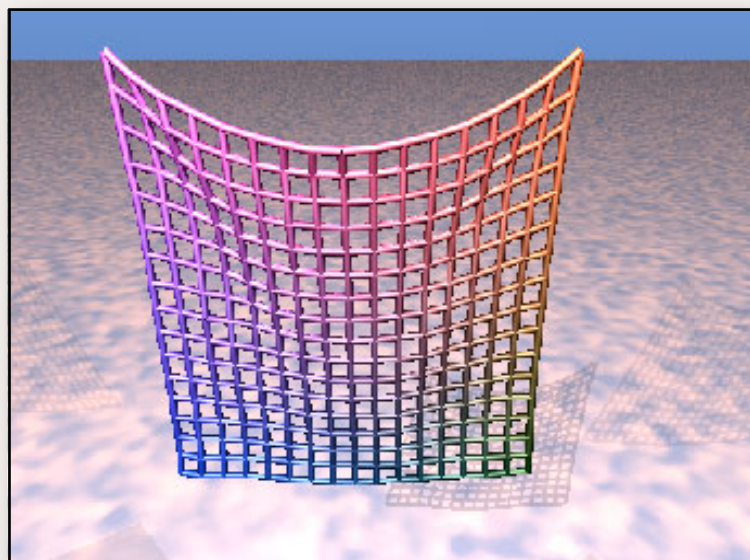
# Springs vs. Constraints



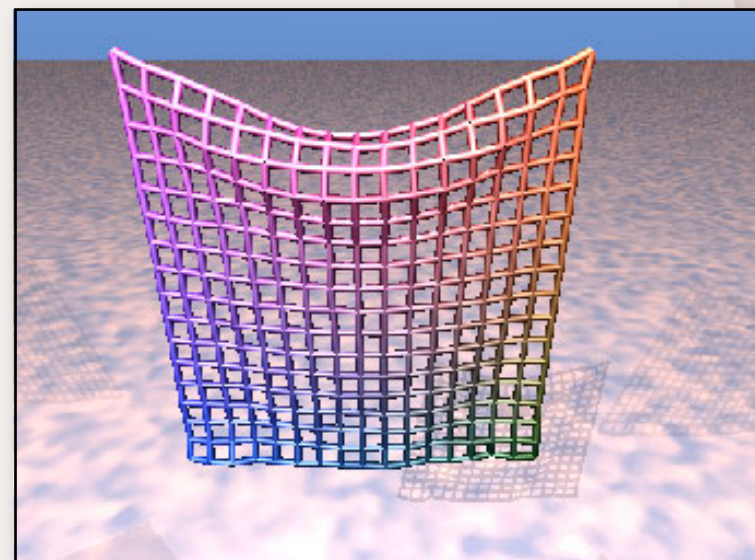
**Before Simulation**



**Only Springs**



**Stretch Constraints**

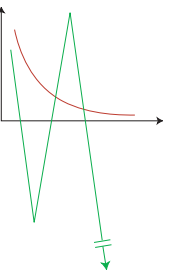


**Stretch+Shear Constraints**

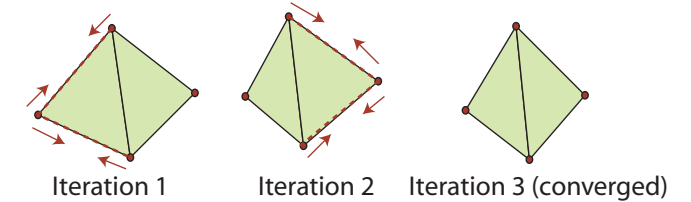
Source: Xavier Provot

*Deformation Constraints in a Mass-Spring Model to Describe Rigid Cloth Behavior*

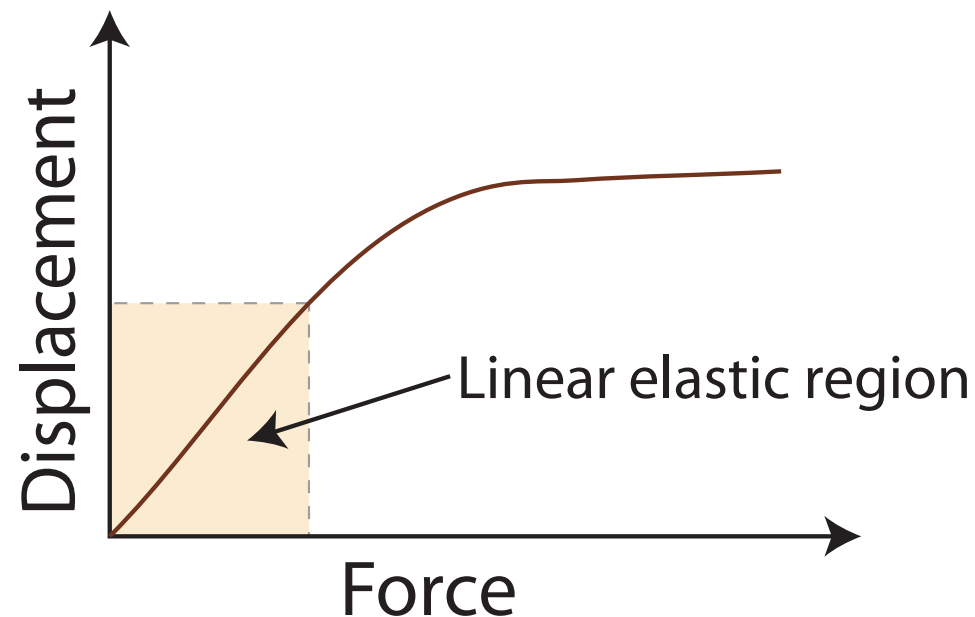
# Avoiding stiffness (2)



- Popular for interactive applications
- Justification



- Biphasic spring model



From Desbrun, Meyer, Barr [2000]

- Plausible dynamics

Cloth Animation

Christopher Twigg  
March 4, 2003



# Efficient Simulation of Inextensible Cloth

Rony Goldenthal  
The Hebrew University  
Columbia University

David Harmon  
Columbia University

Raanan Fattal  
UC Berkeley

Michel Bercovier  
The Hebrew University

Eitan Grinspun  
Columbia University

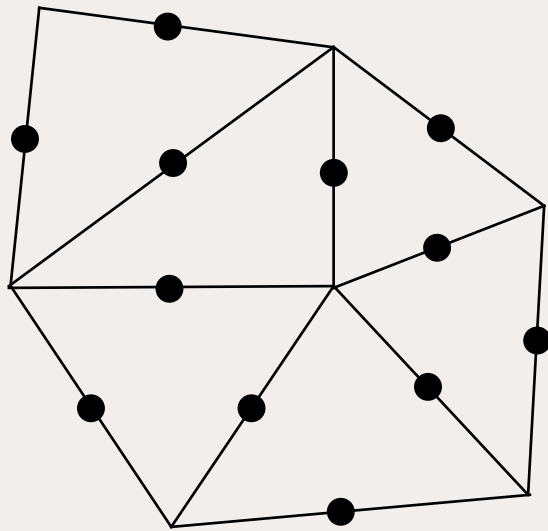


# Developable Surfaces

Animating Developable Surfaces  
using Nonconforming Elements

Elliot English & Robert Bridson  
University of British Columbia

# Developable Surfaces



**Figure 2:** *Schematic of nonconforming variables, located at mid-points of edges between triangles. While continuous at these points, the surface may be discontinuous along the rest of each edge.*

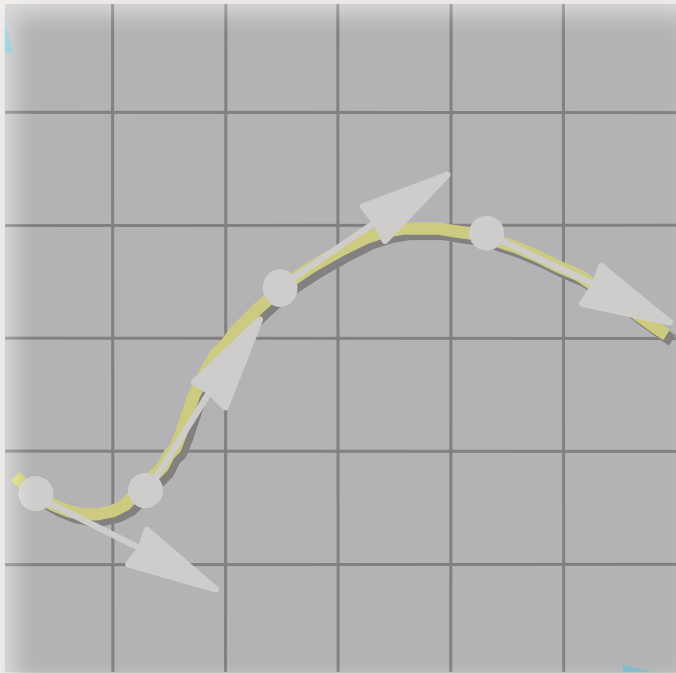
# Developable Surfaces

Animating Developable Surfaces  
using Nonconforming Elements

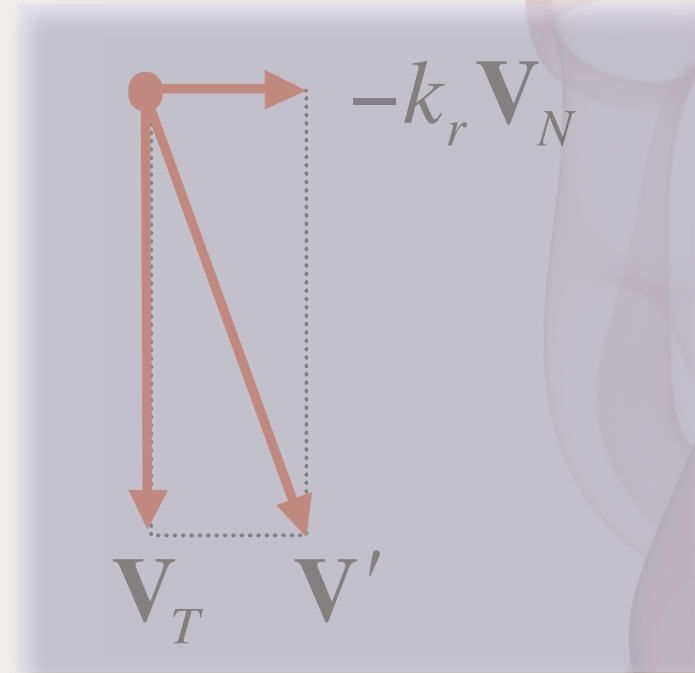
Elliot English & Robert Bridson  
University of British Columbia



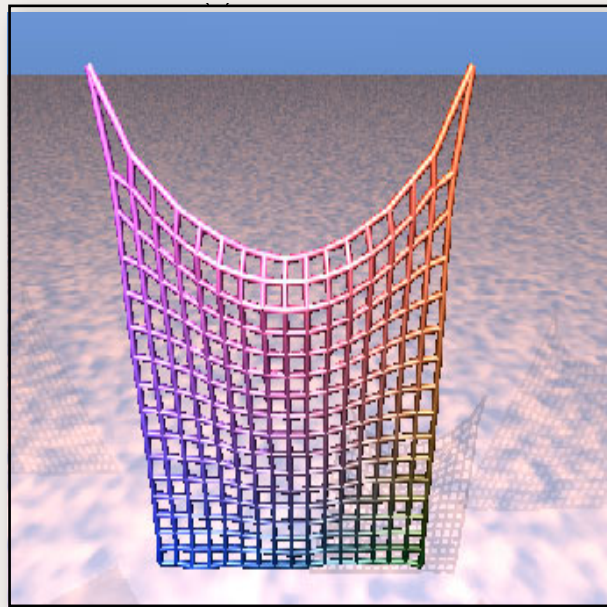
# Overview



DiffEQ Review



Particle Dynamics

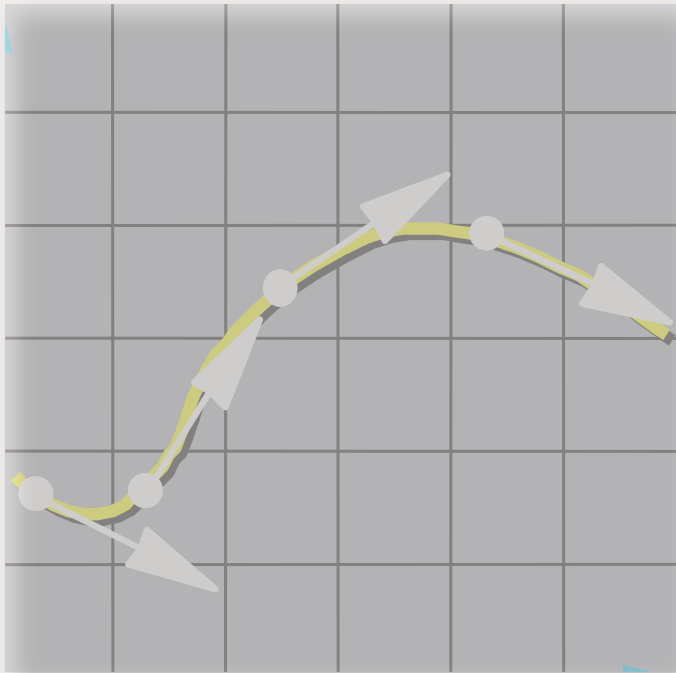


Cloth

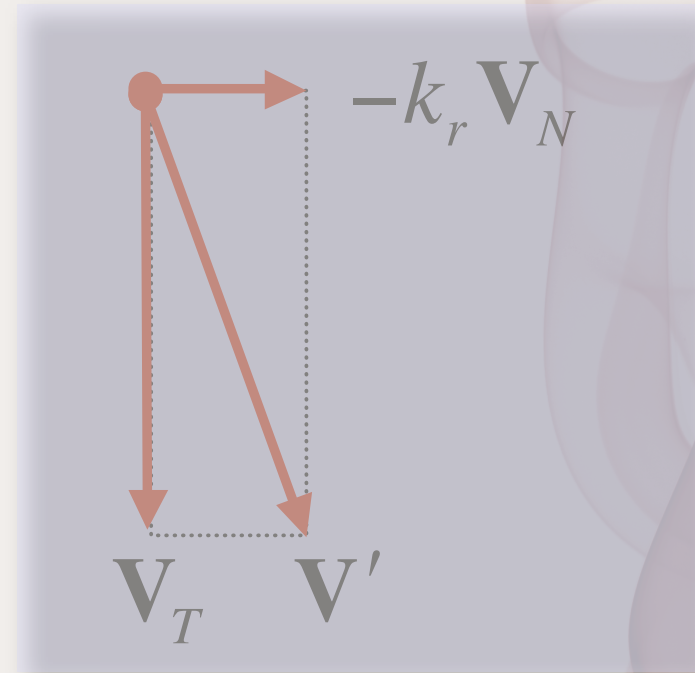


Hair

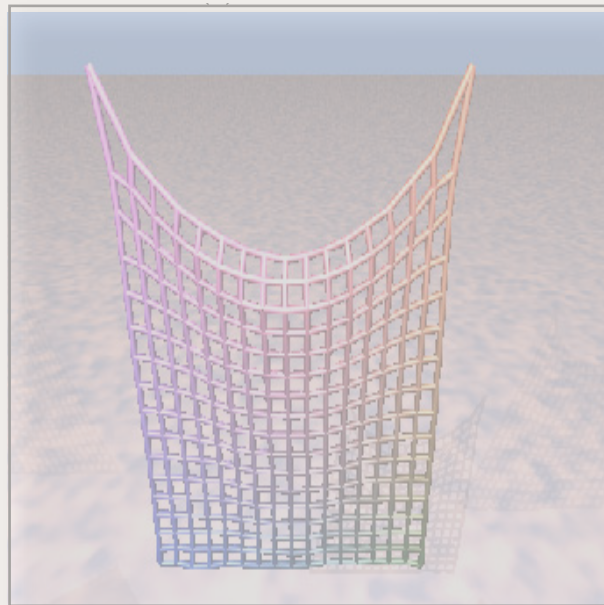
# Overview



**DiffEQ Review**



**Particle Dynamics**



**Cloth**



**Hair**

# Real Hair: Curly

**Short  
curly hair**



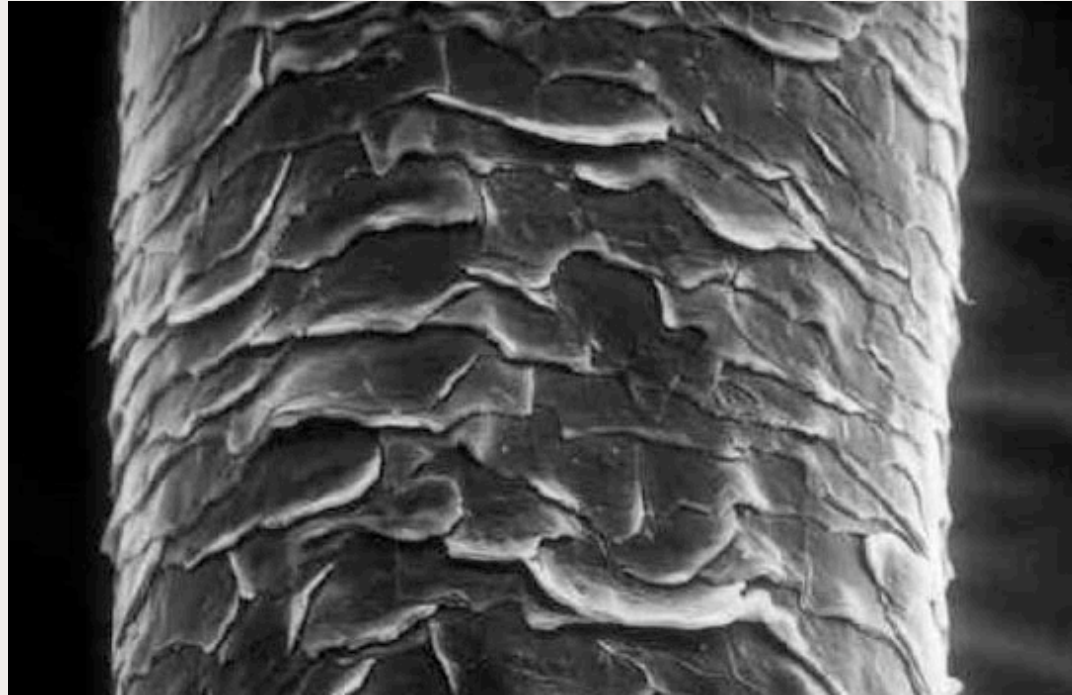


# Real Hair: Straight

**Long  
smooth hair**



# Real Hair



- **Typical human head has 150k-200k individual strands.**
- **Dynamics not well understood.**
  - **Subject still open to debate.**



# Recall...

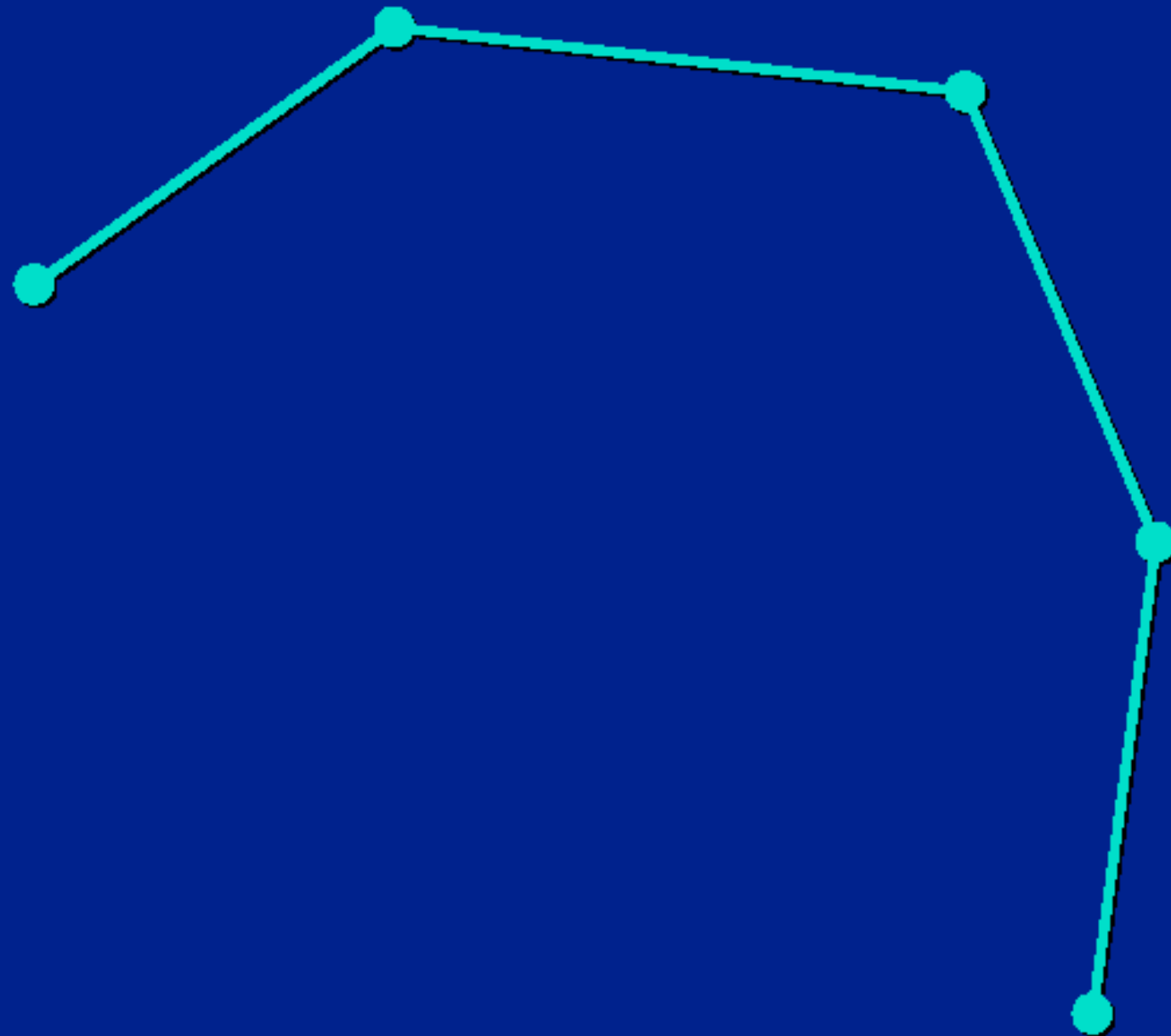
## Cloth and Fur Energy Functions

*Michael Kass*



# Hair Model

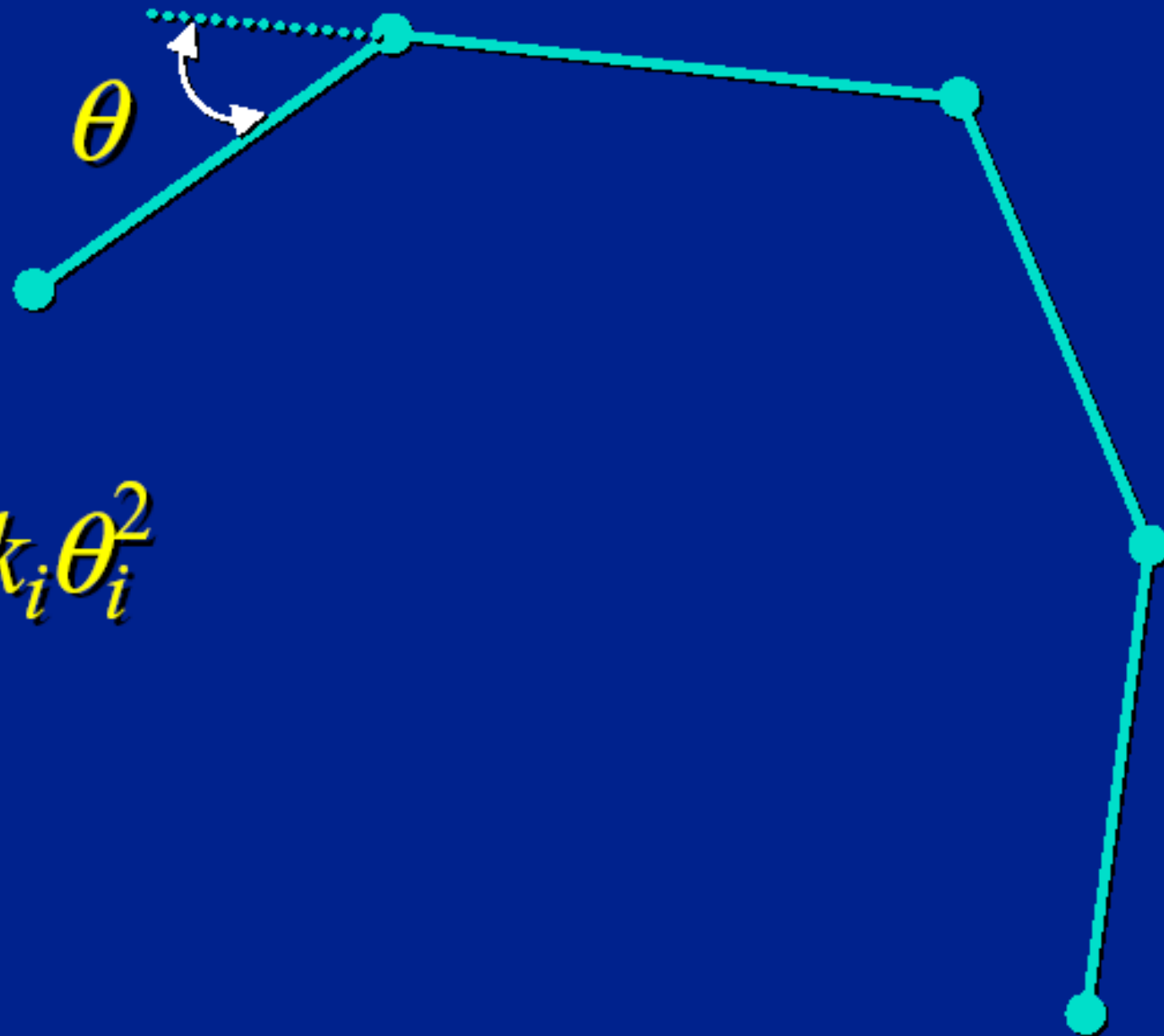
Limp hair: Just a set of springs.





# Hair Model

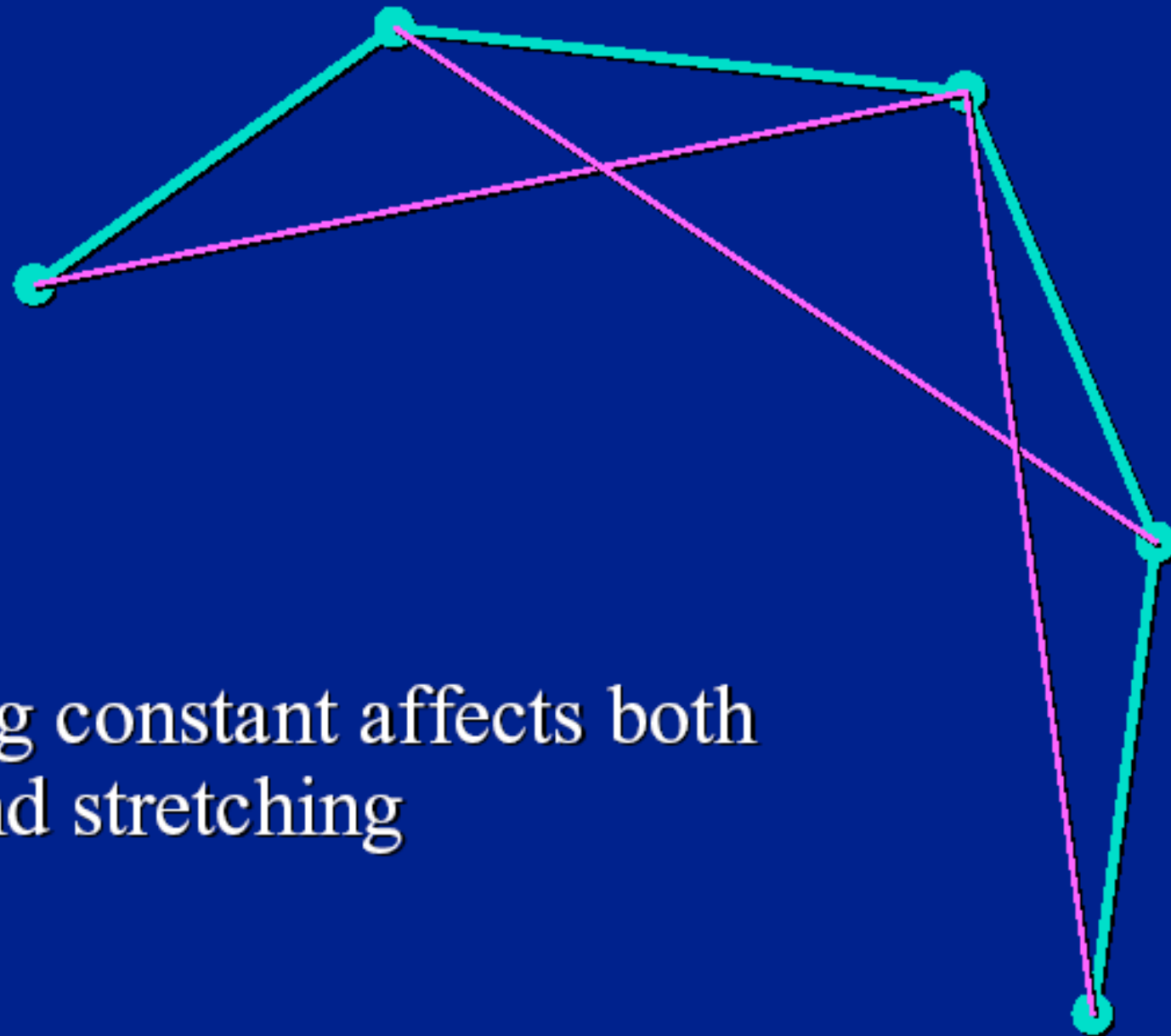
Add body: Angular Springs



$$E = \frac{1}{2} \sum_i k_i \theta_i^2$$

# Hair Model

Alternative: More Linear Springs



Difficulty:

Each spring constant affects both bending and stretching



# Problems

**The linear spring model is very simple but has several problems:**

- **Not length preserving.**
- **No torsion forces (twist).**



# Problems

The linear spring model is very simple but has several problems:

- **Not length preserving.**
- **No torsion forces (twist).**



# Hair simulation in Rhythm and Hues - The Chronicles of Narnia

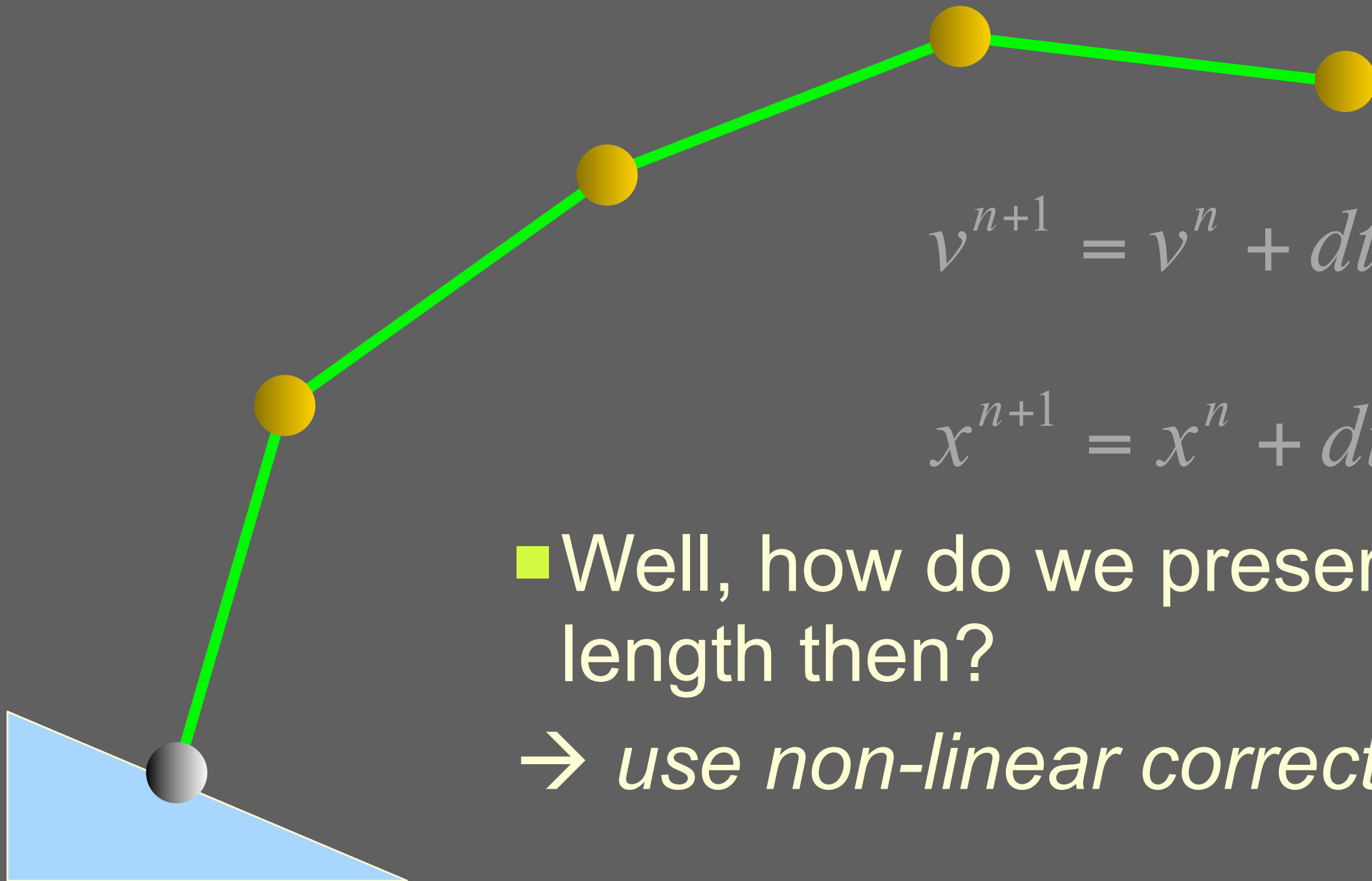


Tae-Yong Kim  
Rhythm and Hues Studios

Rhythm + Hues Studios



# $k$ Is infinity!



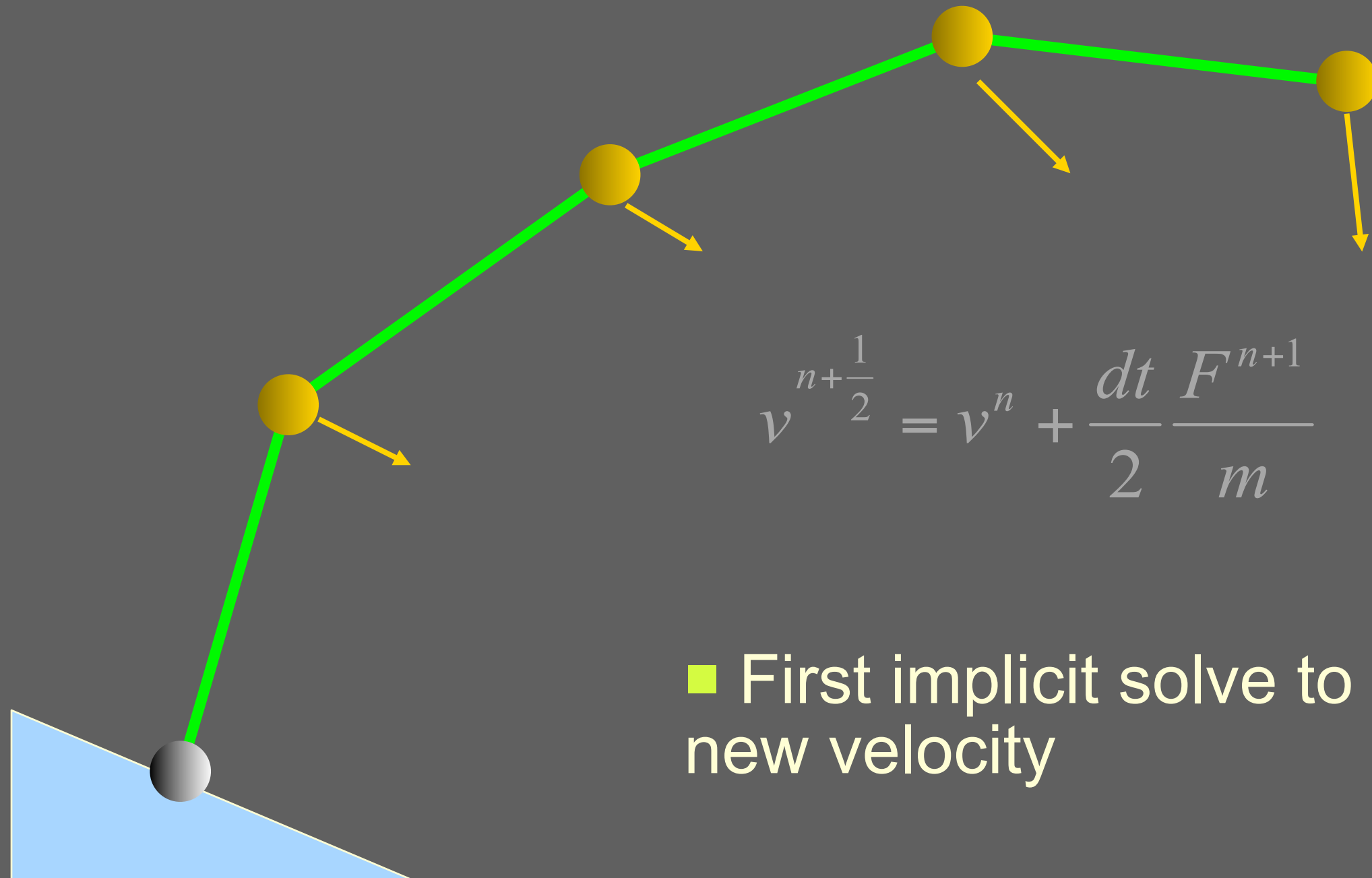
$$v^{n+1} = v^n + dt \frac{F}{m}$$

$$x^{n+1} = x^n + dt v^{n+1}$$

■ Well, how do we preserve length then?

→ *use non-linear correction*

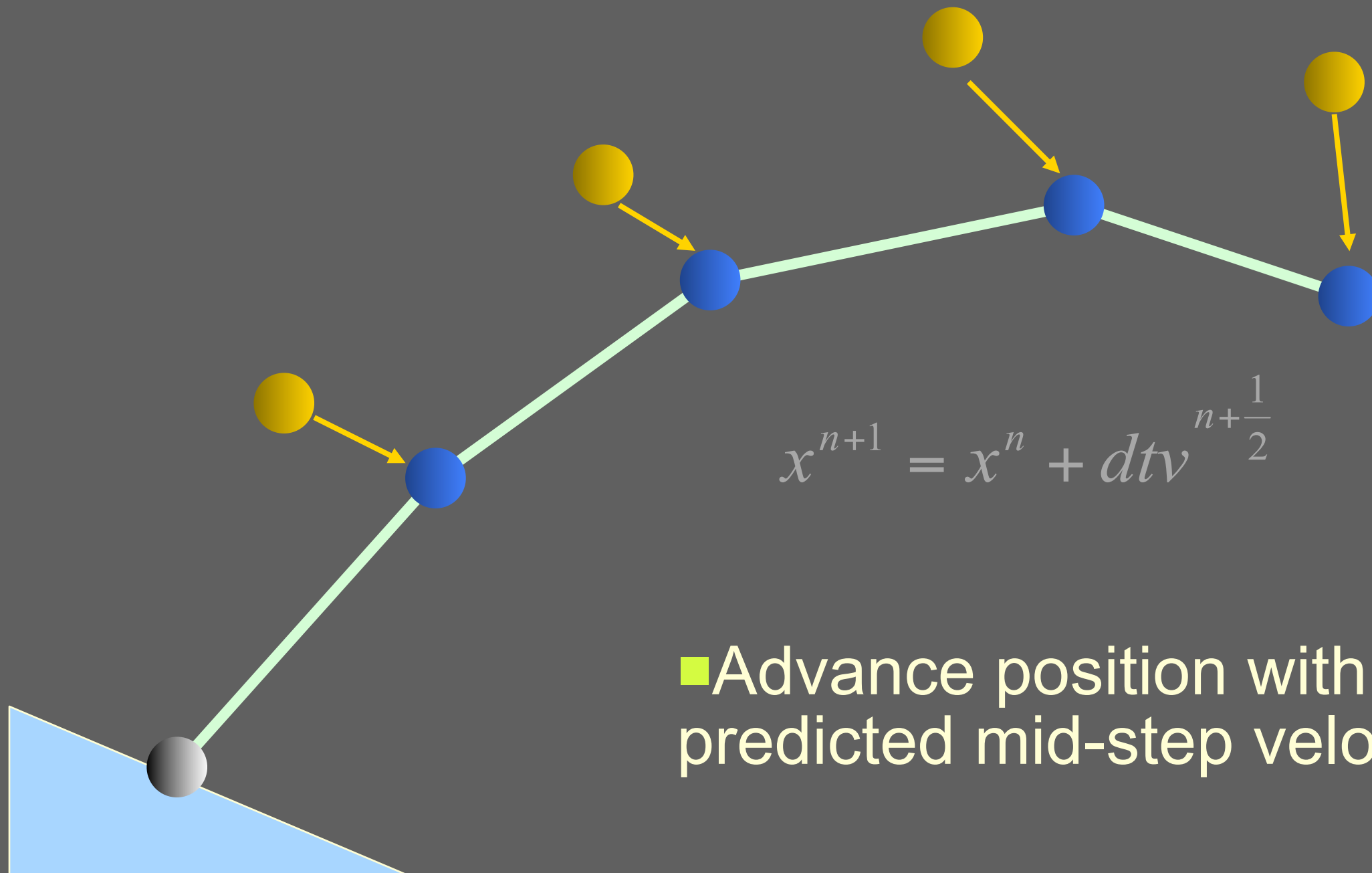
# 1. First pass-implicit integration



$$v^{n+\frac{1}{2}} = v^n + \frac{dt}{2} \frac{F^{n+1}}{m}$$

- First implicit solve to get new velocity

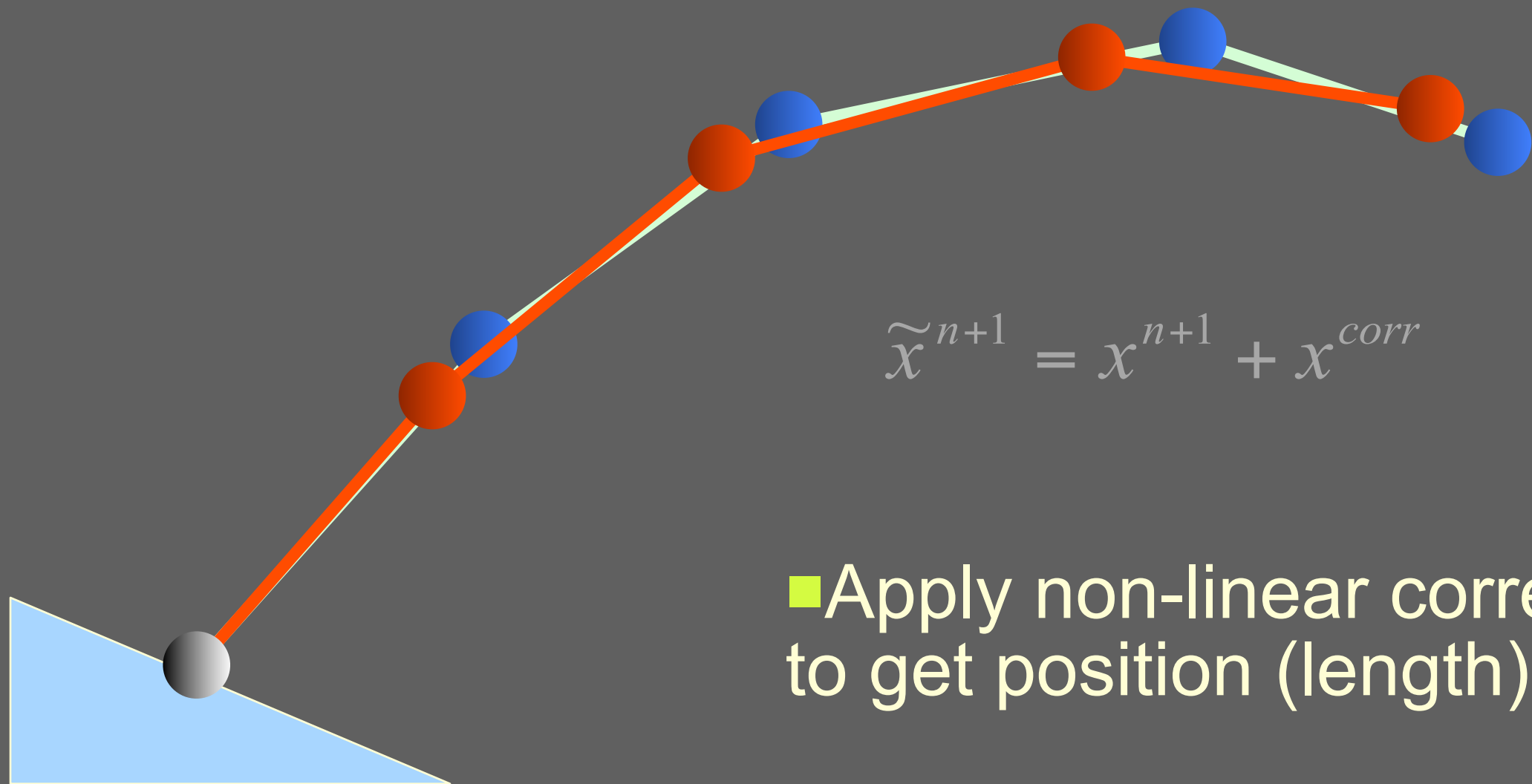
## 2. First pass-implicit integration



- Advance position with the predicted mid-step velocity



# 3. Non-linear Correction

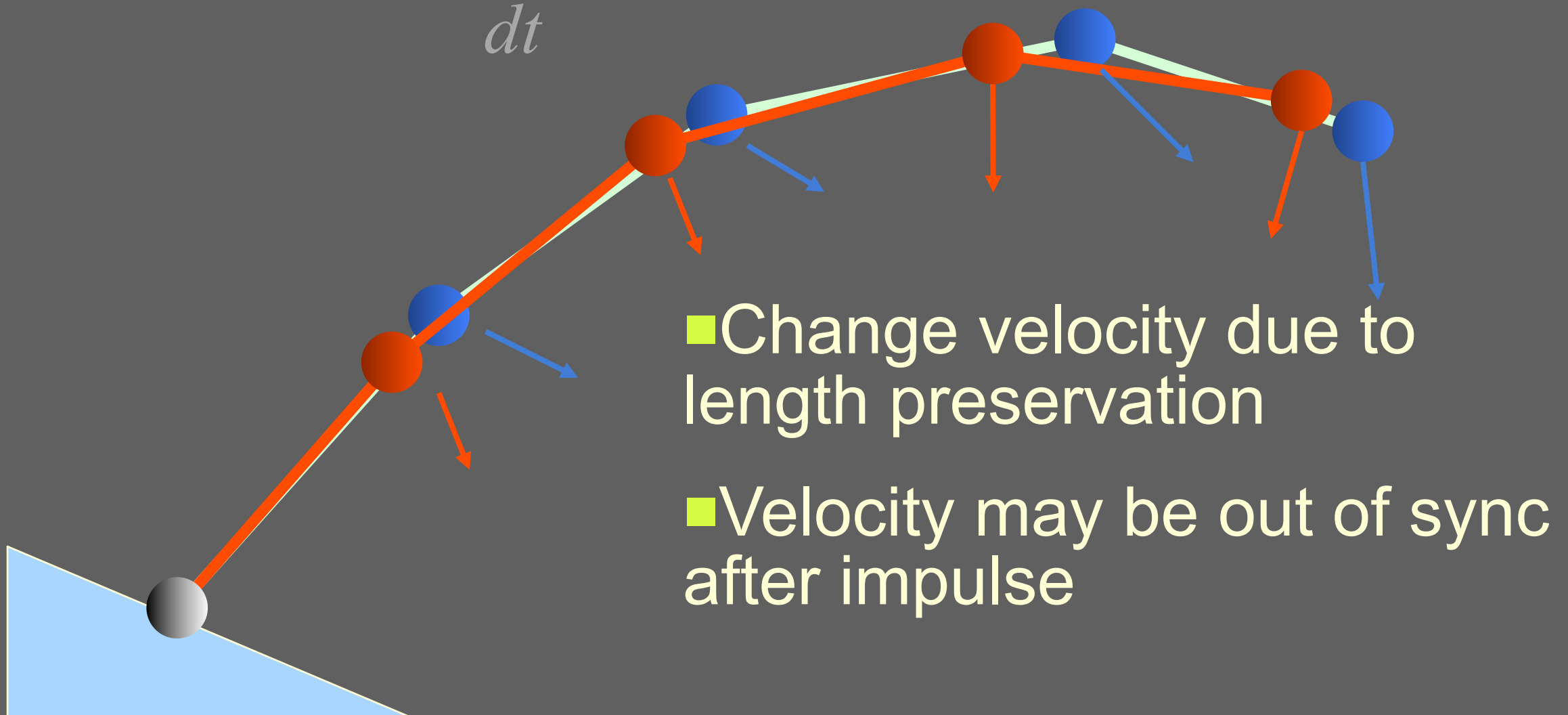


$$\tilde{\mathbf{x}}^{n+1} = \mathbf{x}^{n+1} + \mathbf{x}^{corr}$$

- Apply non-linear corrector to get position (length) right

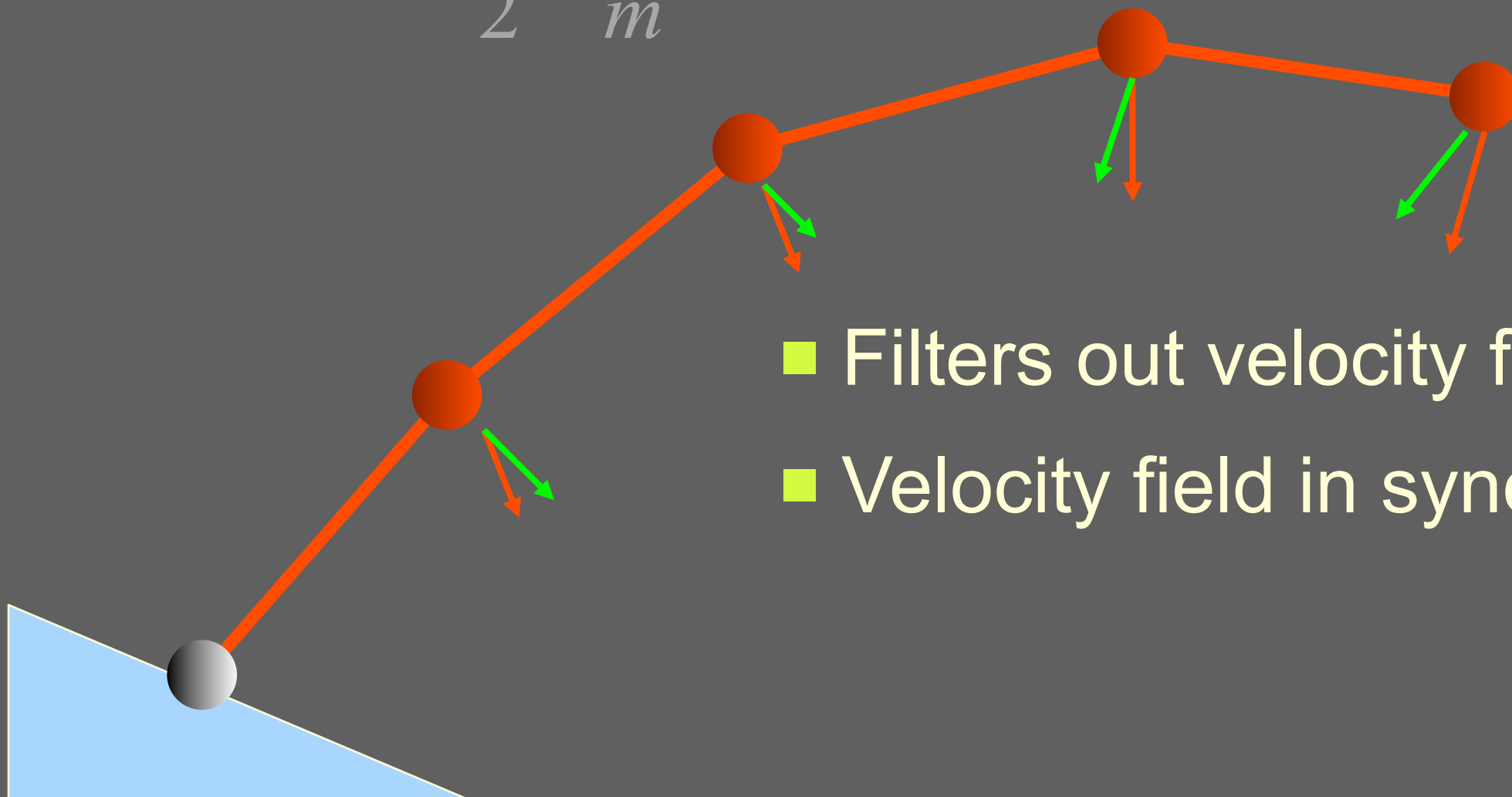
# 4. Impulse

$$\tilde{v}^{n+\frac{1}{2}} = v^{n+\frac{1}{2}} + \frac{x^{corr}}{dt}$$



# 5. Second implicit integration

$$v^{n+1} = \tilde{v}^{n+\frac{1}{2}} + \frac{dt}{2} \frac{F^{n+1}}{m}$$



- Filters out velocity field
- Velocity field in sync again



nVidia 'nalu' demo - <http://www.youtube.com/watch?v=e0m0o6lbmeM>

# Problems

**The linear spring model is very simple but has several problems:**

- **Not length preserving.**

- **No torsion forces (twist).**



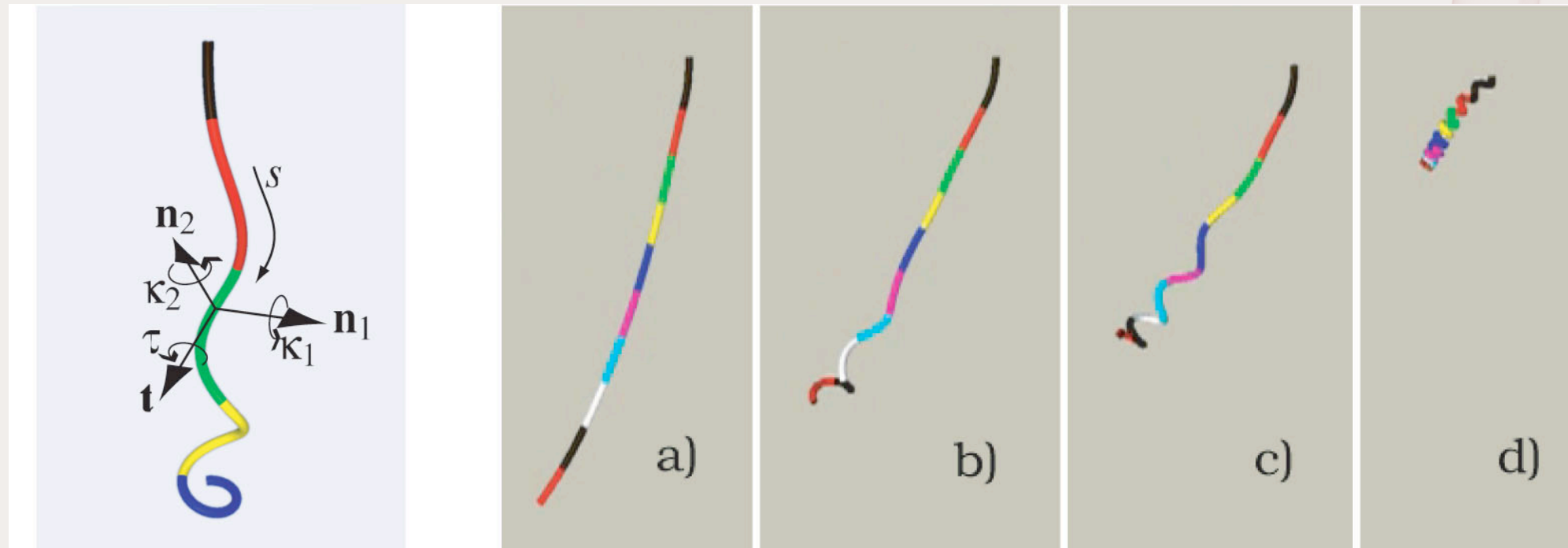


# Super Helices

**Why just use straight rods?**

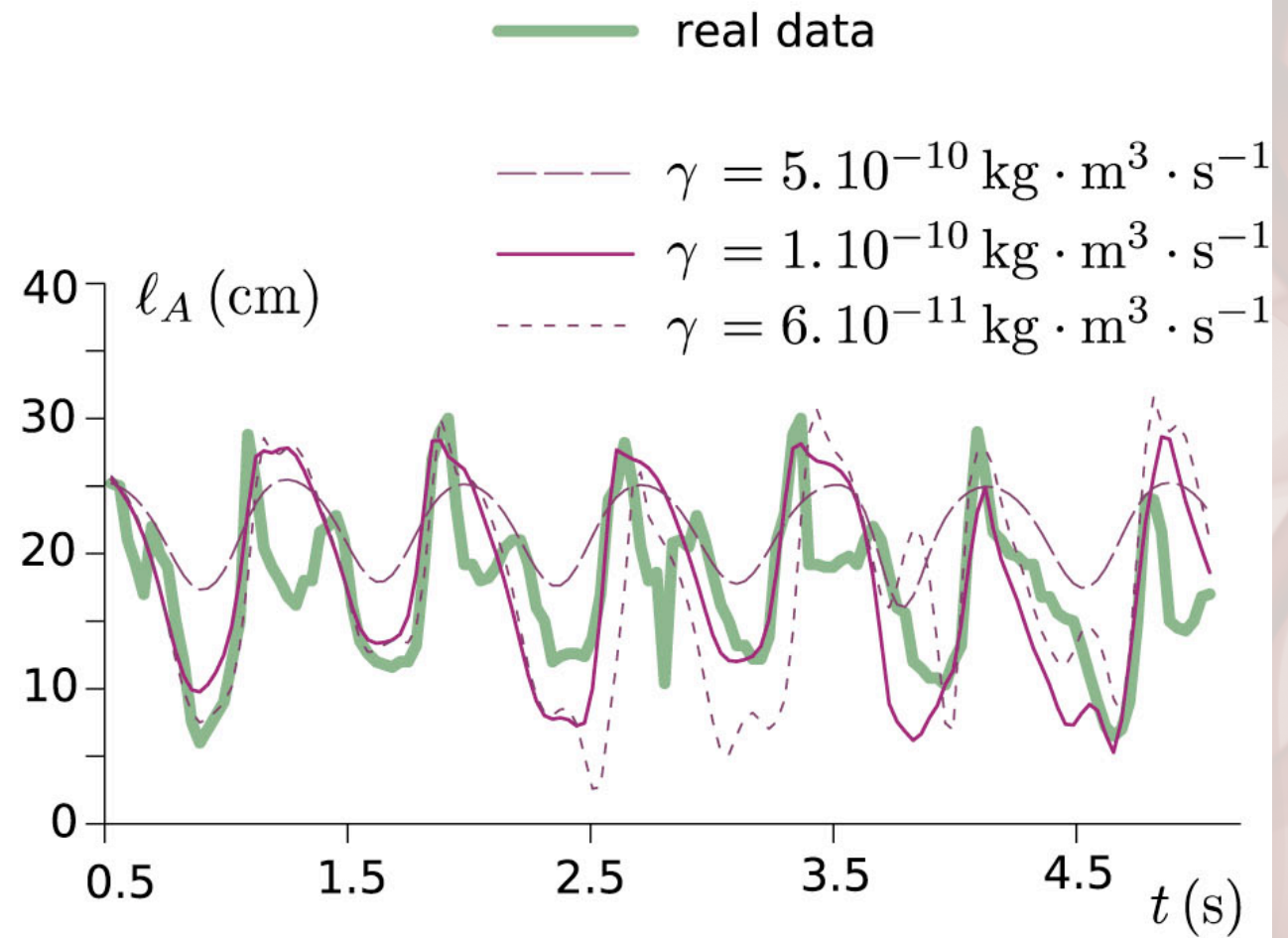
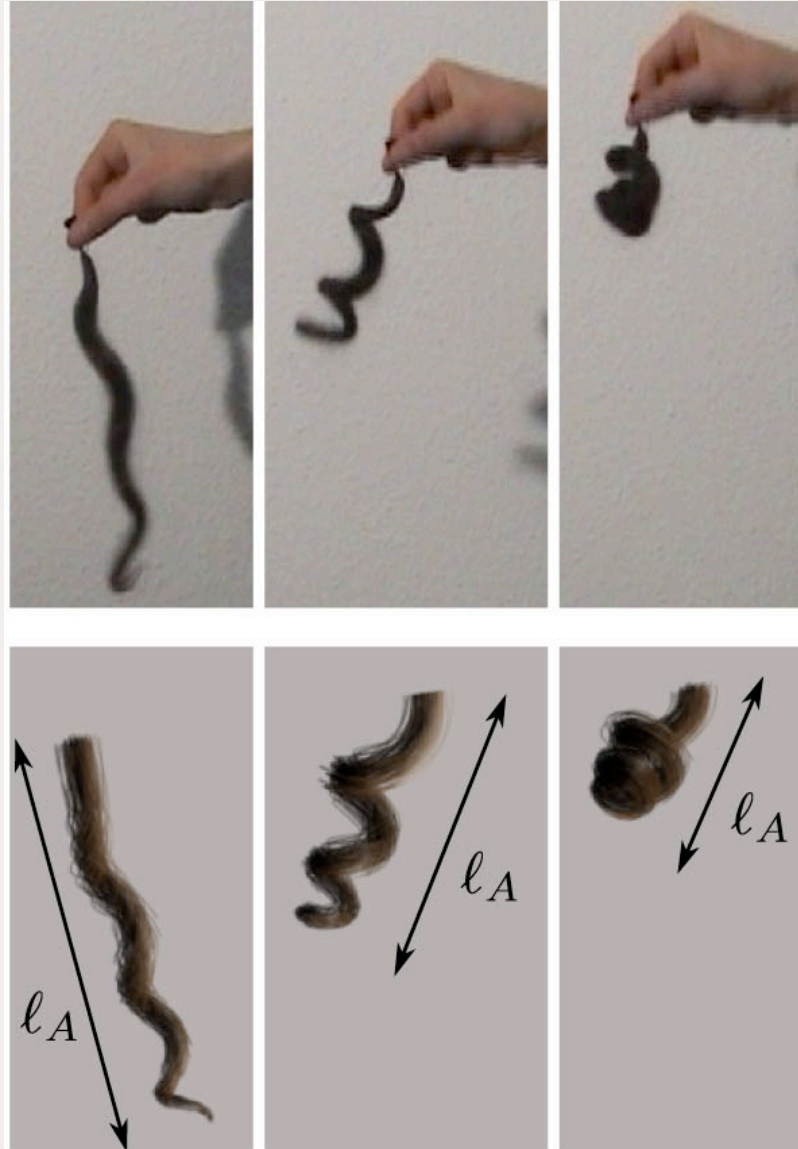


# Super Helices



$$\mathbb{M}[s, \mathbf{q}] \cdot \ddot{\mathbf{q}} + \mathbb{K} \cdot (\mathbf{q} - \mathbf{q}^n) = \mathbf{A}[t, \mathbf{q}, \dot{\mathbf{q}}] + \int_0^L \mathbf{J}_{iQ}[s, \mathbf{q}, t] \cdot \mathbf{F}^i(s, t) ds.$$

# Super Helices





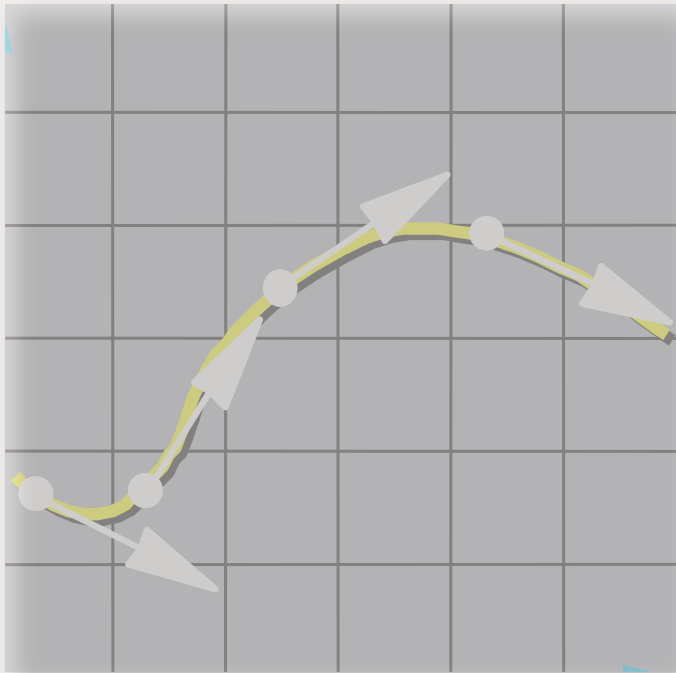
# Super Helices

*Part 3*

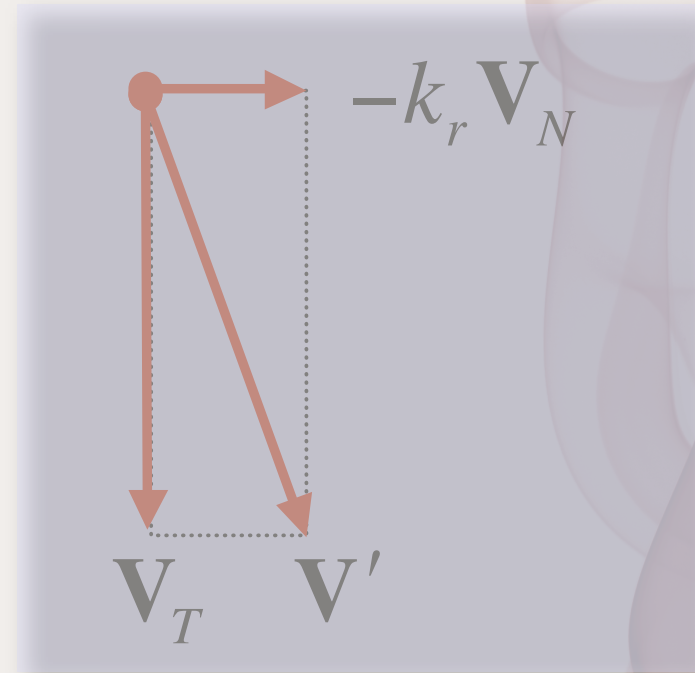
**Animation  
of a full head of hair**



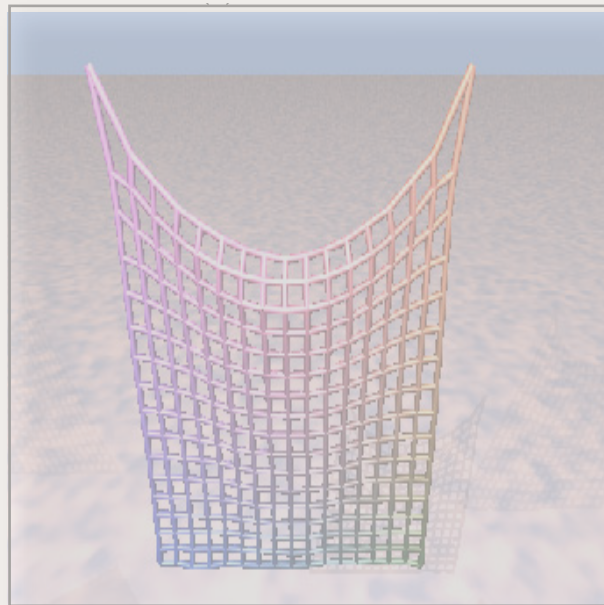
# Overview



**DiffEQ Review**



**Particle Dynamics**



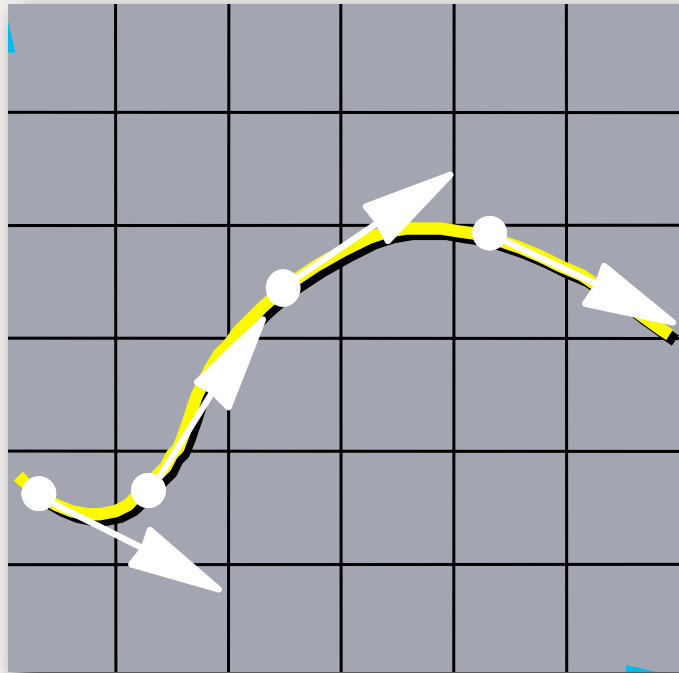
**Cloth**



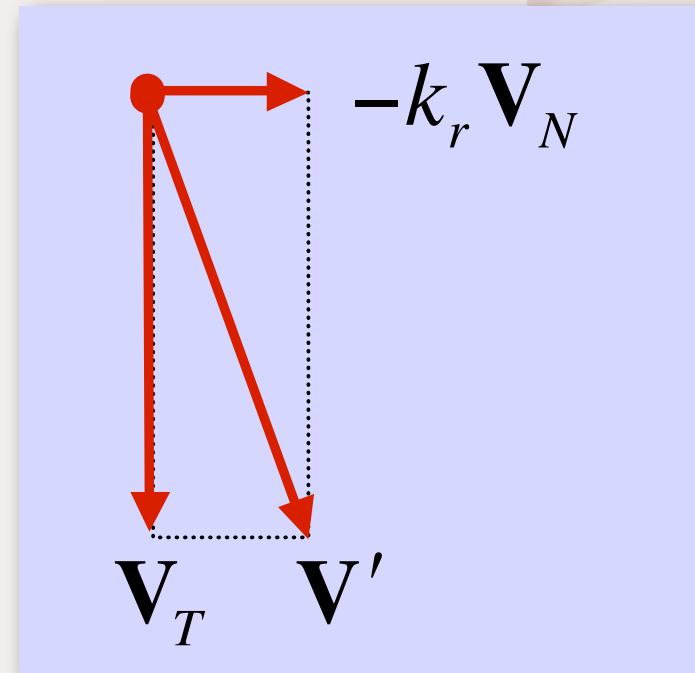
**Hair**



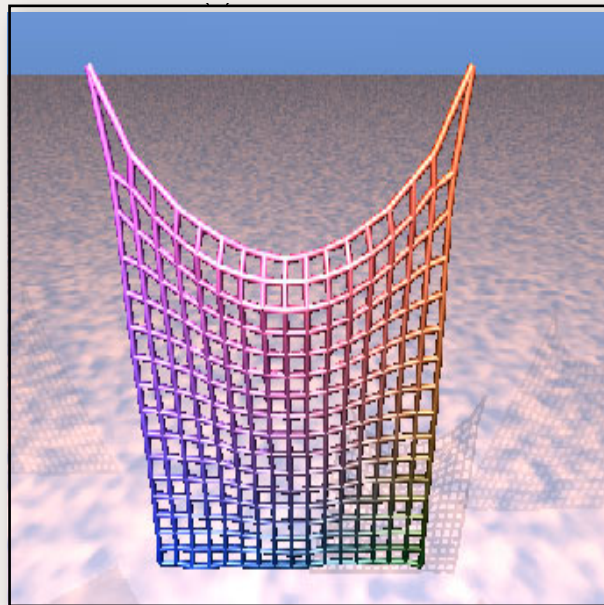
# Overview



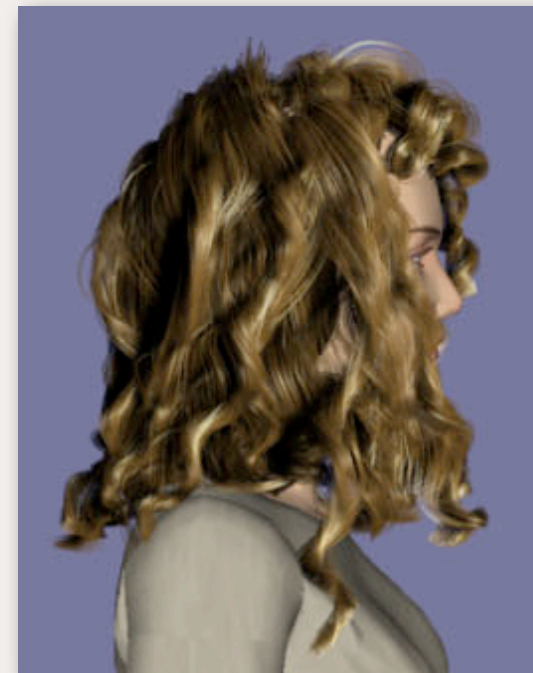
**DiffEQ Review**



**Particle Dynamics**



**Cloth**



**Hair**