

Particle Systems and ODEs



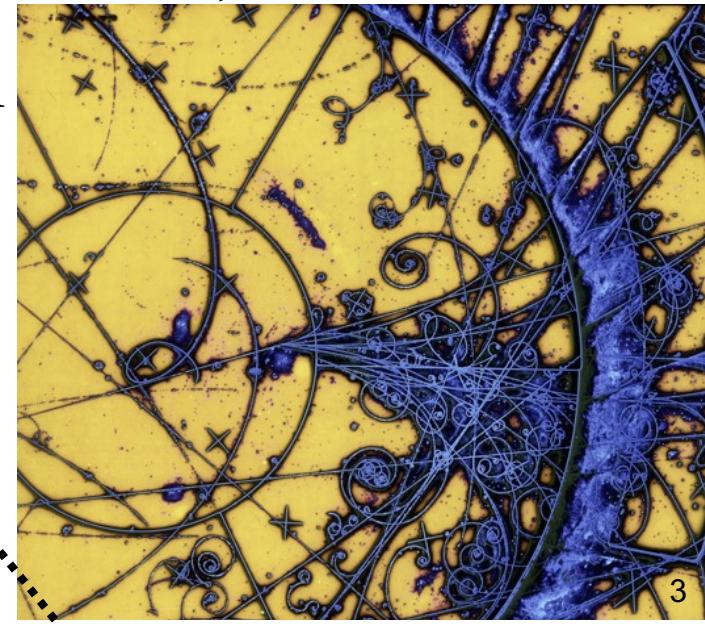
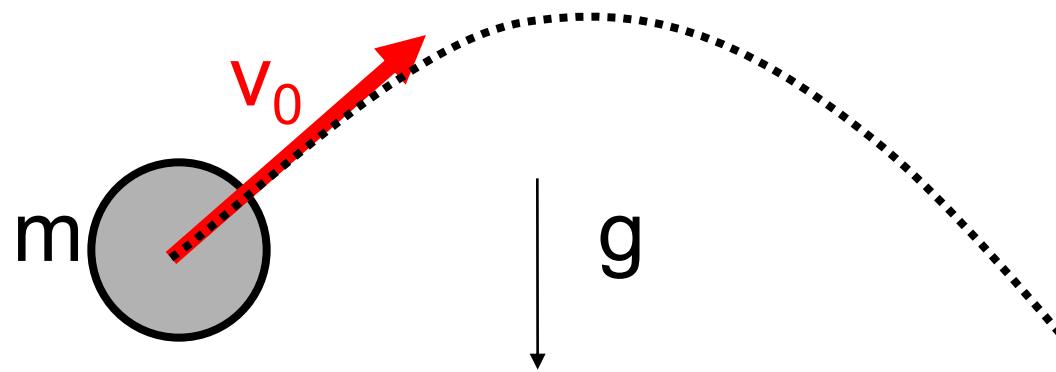
Sai-Kit Yeung

Types of Animation

- Keyframing
- Procedural
- Physically-based
 - Particle Systems: **TODAY**
 - Smoke, water, fire, sparks, etc.
 - Usually heuristic as opposed to simulation, but not always
 - Mass-Spring Models (Cloth) **NEXT CLASS**
 - Continuum Mechanics (fluids, etc.), finite elements
 - Not in this class
 - Rigid body simulation
 - Not in this class

Types of Animation: Physically-Based

- Assign physical properties to objects
 - Masses, forces, etc.
- Also procedural forces (like wind)
- Simulate physics by solving equations of motion
 - Rigid bodies, fluids, plastic deformation, etc.
- Realistic but difficult to control



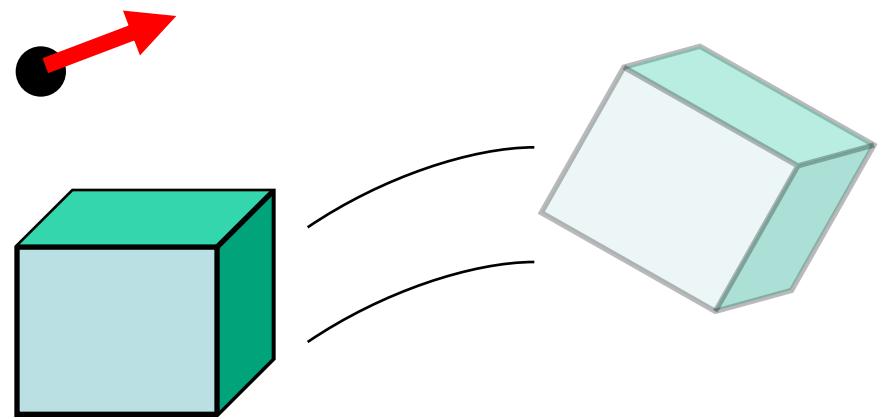
Types of Dynamics

- Point



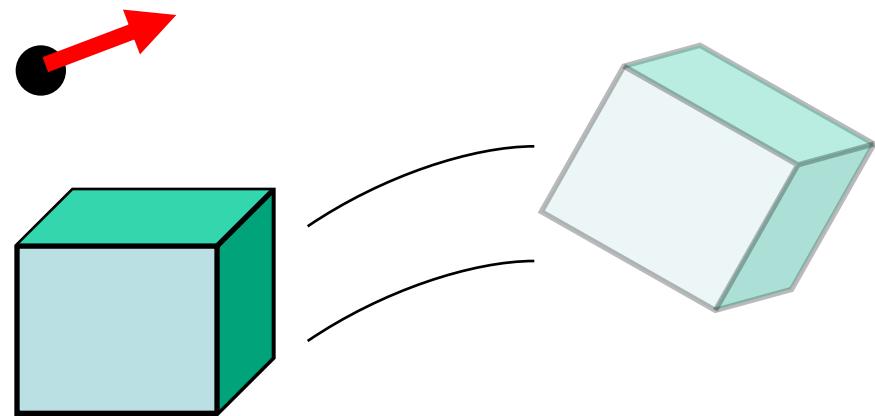
Types of Dynamics

- Point
- Rigid body



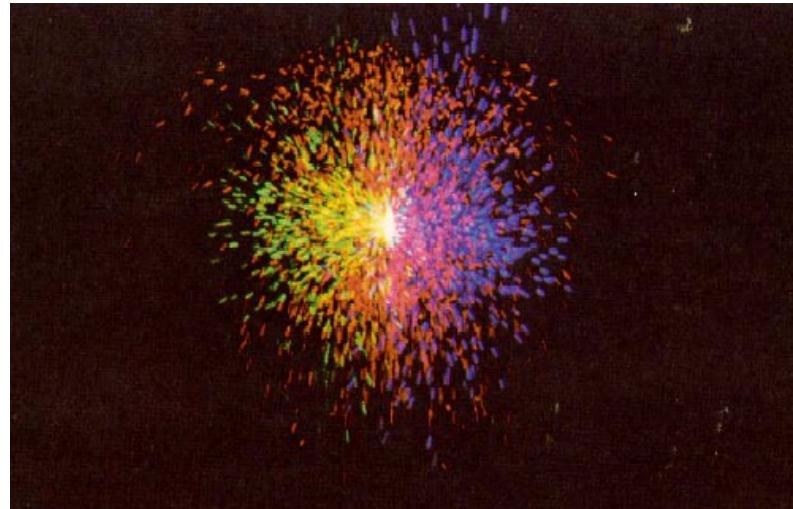
Types of Dynamics

- Point
- Rigid body
- Deformable body
(include clothes, fluids, smoke, etc.)



Today We Focus on Point Dynamics

- Lots of points!
- Particles systems
 - Borderline between procedural and physically-based



Outline

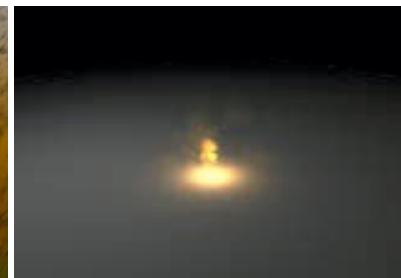
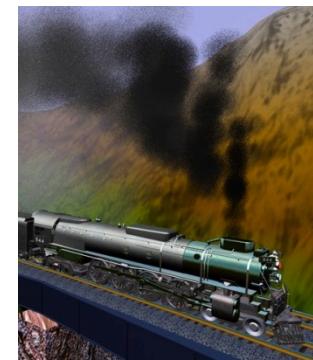
- Particle Systems Overview
- Simple Particle System
 - Algorithm
 - Math (Solving ODE)
- Other Particle Systems (Very Brief)

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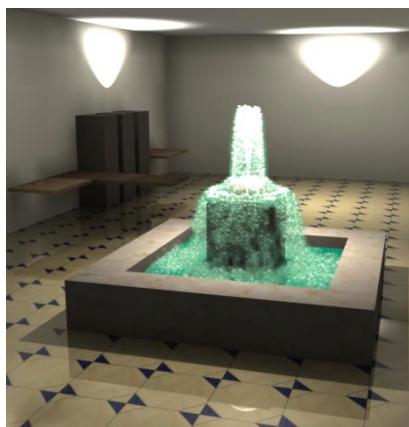
Particle Systems Overview

- Emitters generate tons of “particles”
 - Sprinkler, waterfall, chimney, gun muzzle, exhaust pipe, etc.



Particle Systems Overview

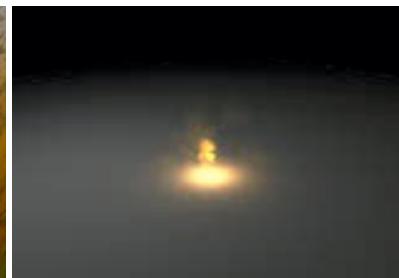
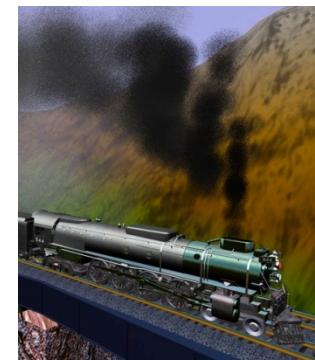
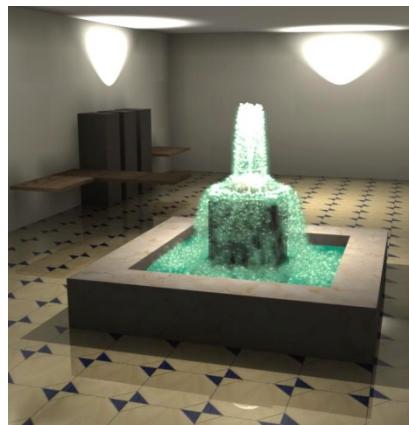
- Emitters generate tons of “particles”
- Describe the external forces with a force field
 - E.g., gravity, wind



Particle Systems Overview

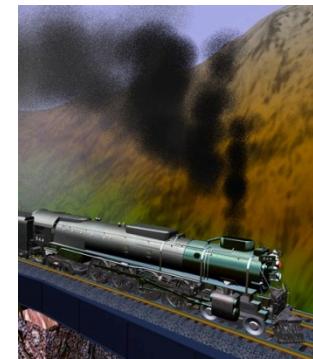
- Emitters generate tons of “particles”
- Describe the external forces with a force field
- Integrate the laws of mechanics (ODEs)
 - Makes the particles move

Image Jeff Lander



Particle Systems Overview

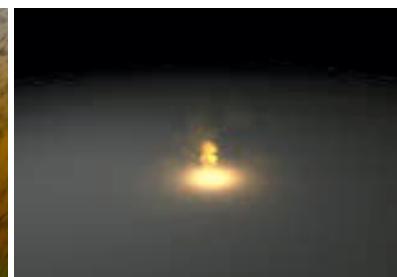
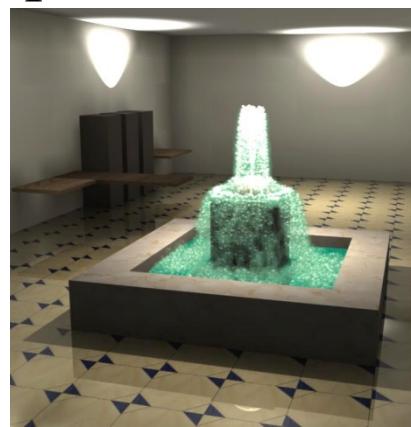
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- Describe the external forces with a force field
- Integrate the laws of mechanics (ODEs)
- In the simplest case, each particle is independent



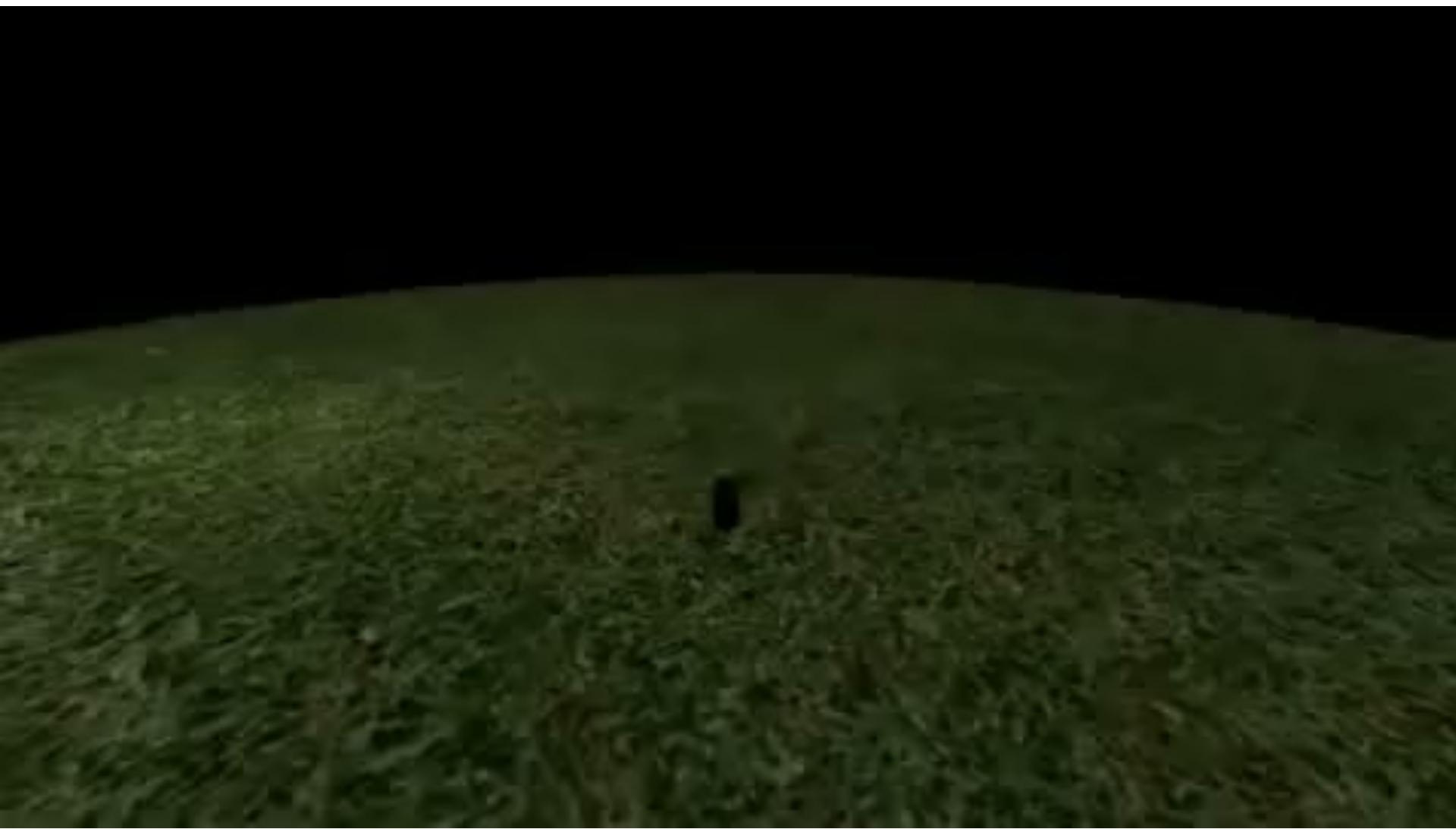
Particle Systems Overview

- Emitters generate tons of “particles”
- Describe the external forces with a force field
- Integrate the laws of mechanics (ODEs)
- In the simplest case, each particle is independent
- If there is enough randomness (in particular at the emitter) you get nice effects
 - sand, dust, smoke, sparks, flame, water, ...

Image Jeff Lander



Sprinkler



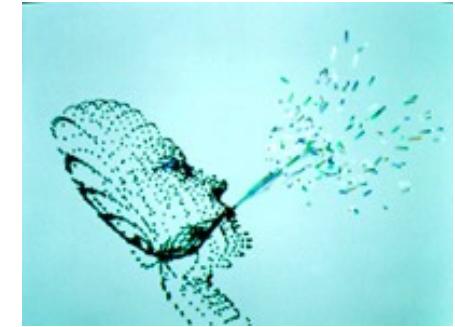
- http://www.youtube.com/watch?v=rhvH12nC6_Q

Fire

- <http://www.youtube.com/watch?v=6hG00etwRBU>

Generalizations

- More advanced versions of behavior
 - flocks, crowds
- Forces between particles
 - Not independent any more



See <http://www.red3d.com/cwr/boids/> for discussion on how to do flocking.

We'll come back to this a little later.

<http://www.blendernation.com/2008/01/05/simulating-flocks-herds-and-swarms-using-experimental-blender-boids-particles/>

Generalizations – Next Class

- Mass-spring and deformable surface dynamics
 - surface represented as a set of points
 - forces between neighbors keep the surface coherent



Image Witkin & Baraff

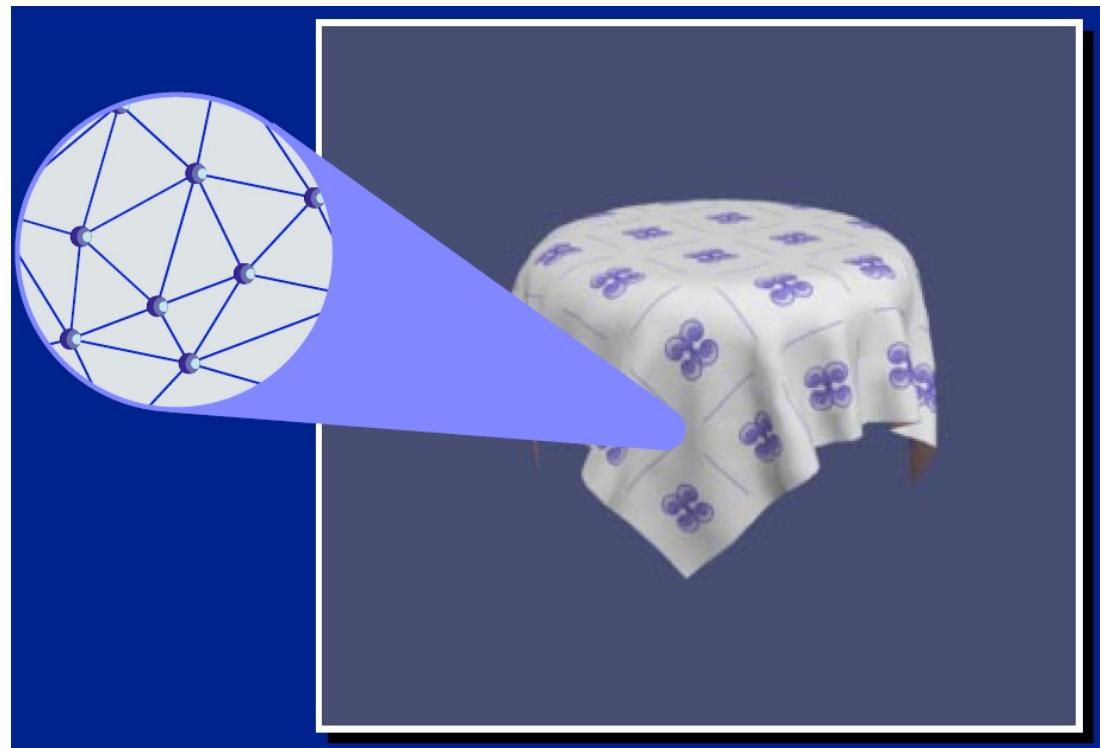
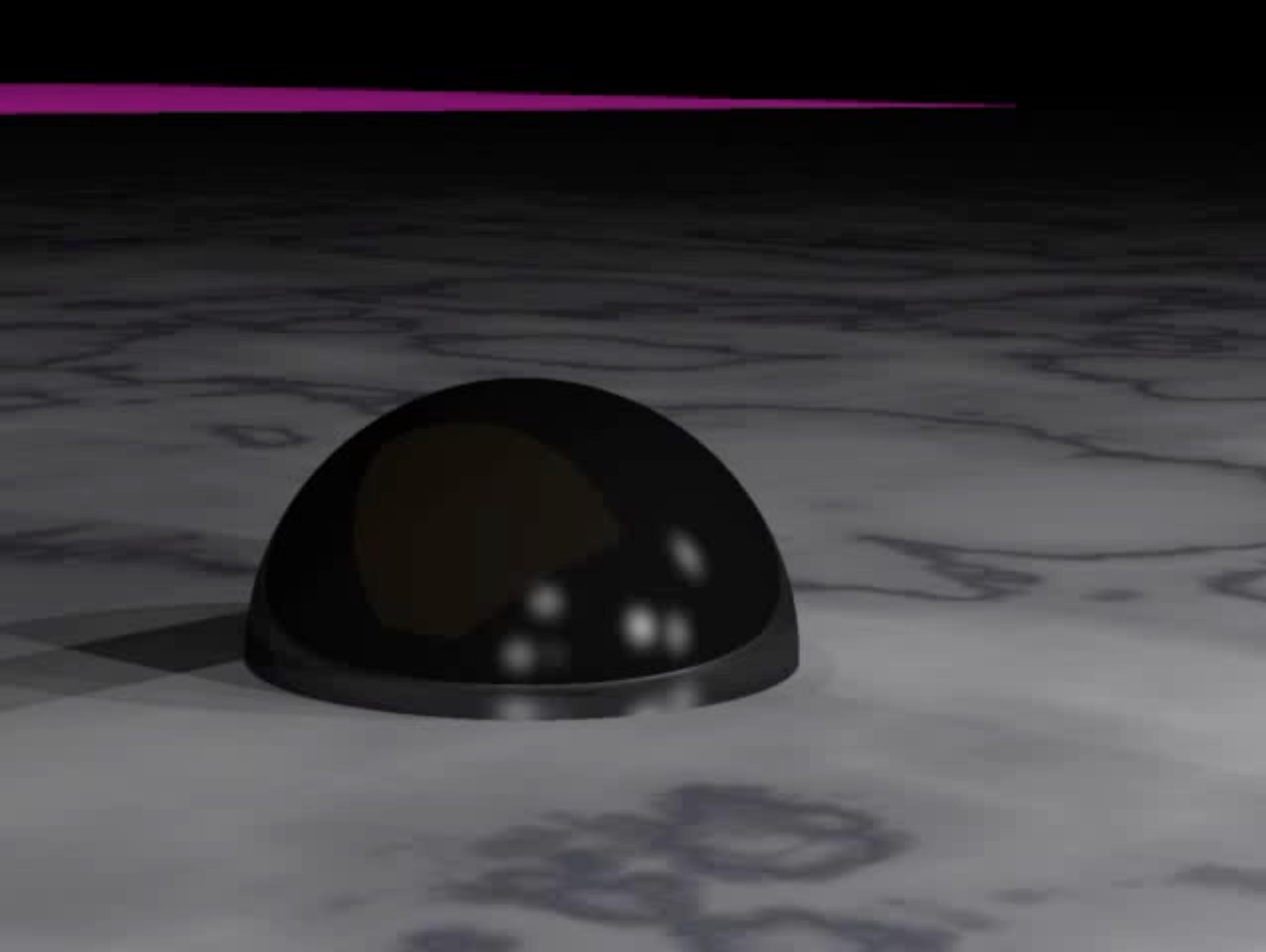


Image Michael Kass



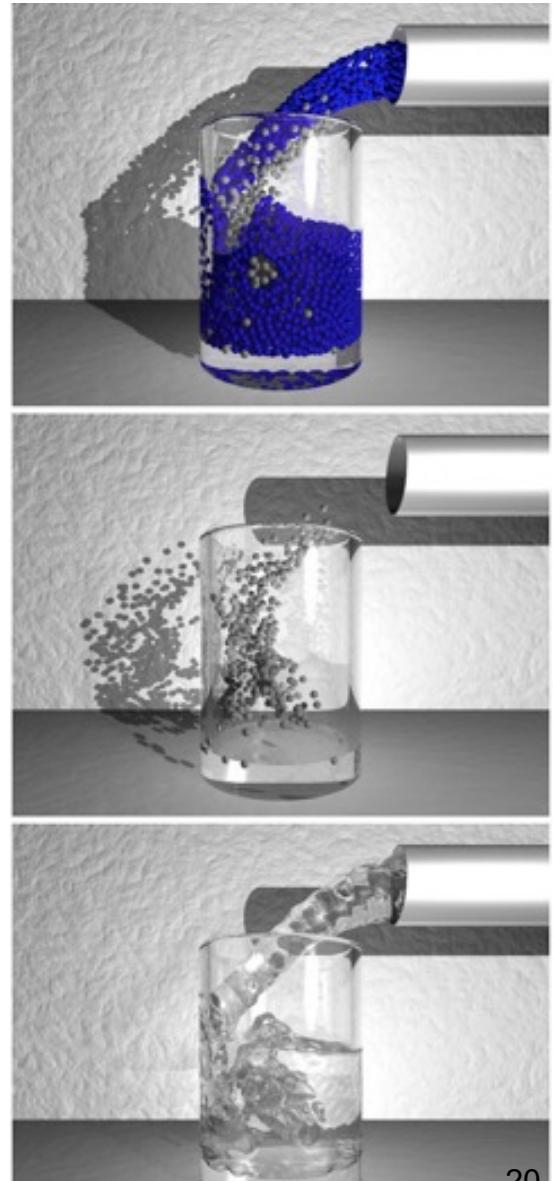
Generalizations

[Müller et al. 2005](#)

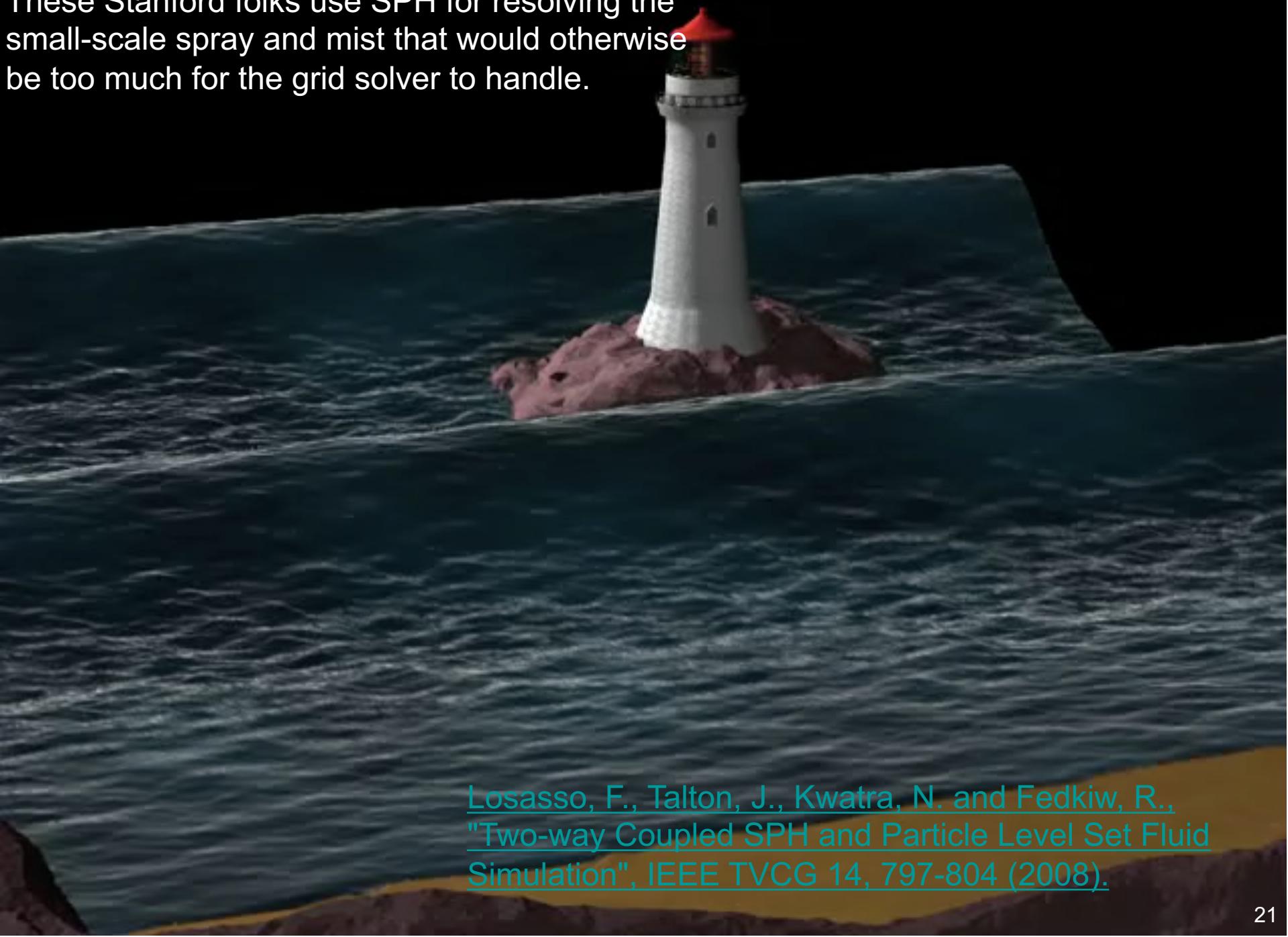
- It's not all hacks:

Smoothed Particle Hydrodynamics (SPH)

- A family of “real” particle-based fluid simulation techniques.
- Fluid flow is described by the Navier-Stokes Equations, a nonlinear partial differential equation (PDE)
 - SPH discretizes the fluid as small packets (particles!), and evaluates pressures and forces based on them.



These Stanford folks use SPH for resolving the small-scale spray and mist that would otherwise be too much for the grid solver to handle.



[Losasso, F., Talton, J., Kwatra, N. and Fedkiw, R., "Two-way Coupled SPH and Particle Level Set Fluid Simulation", IEEE TVCG 14, 797-804 \(2008\).](#)

Real-time particles in games

- <http://www.youtube.com/watch?v=6DicVajK2xQ>



EA Fight Night 4 Physics Trailer

**MAY CONTAIN CONTENT
INAPPROPRIATE FOR CHILDREN**

Visit www.esrb.org
for rating information

This video is intended for promotional purposes only, and may not be sold, rented nor reproduced by any party. Any unauthorized use of this video is prohibited by applicable law.

Take-Home Message

- Particle-based methods can range from pure heuristics (hacks that happen to look good) to “real” simulation
- Basics are the same:
Things always boil down to integrating ODEs!
 - Also in the case of grids/computational meshes

[Andrew Selle et al.](#)



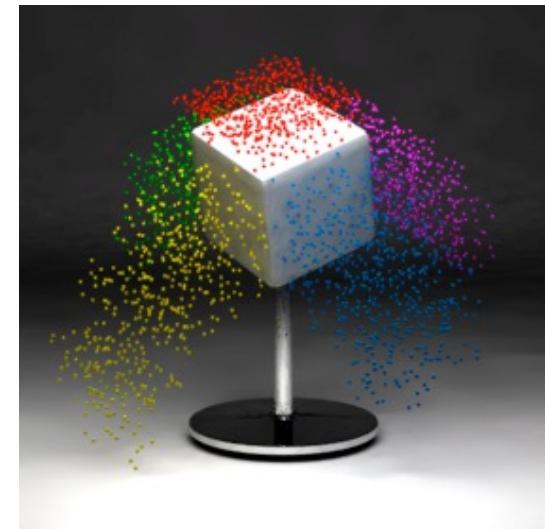
Questions?



<http://www.cs.columbia.edu/cg/ESIC/esic.html>

What is a Particle System?

- Collection of many small simple pointlike things
 - Described by their current state: position, velocity, age, color, etc.
- Particle motion influenced by external force fields and internal forces between particles
- Particles created by generators or emitters
 - With some randomness
- Particles often have lifetimes
- Particles are often independent
- Treat as points for dynamics, but rendered as anything you want

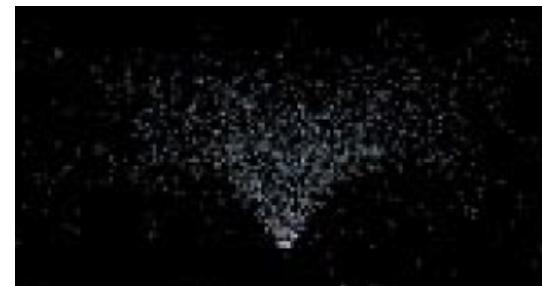


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Simple Particle System: Sprinkler

PL: linked list of particle = empty;



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For each time step
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Simple Particle System: Sprinkler

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For each time step
```

Generate k particles

```
p=new particle();  
p->position=(0,0,0);  
p->velocity=(0,0,1)+spread*(rnd(), rnd(), rnd());  
p.color=(0,0,1)+colorSpread*(rnd(), rnd(),rnd());  
PL->add(p);
```



Simple Particle System: Sprinkler

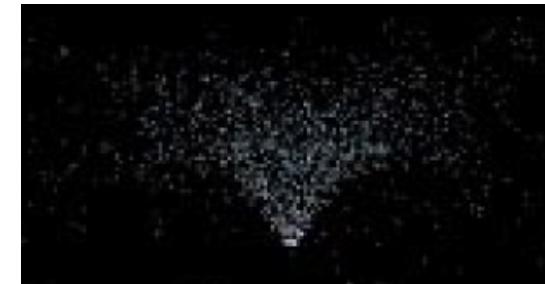
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PL->add(p);
```

For each particle p in PL

```
p->position+=p->velocity*dt; //dt: time step  
p->velocity-=g*dt; //g: gravitation constant  
glColor(p.color);  
glVertex(p.position);
```



Simple Particle System: Sprinkler

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```



Questions?

Path forward

- Basic particle systems are simple hacks
- Extend to physical simulations, e.g., clothes
- For this, we need to understand numerical integration
- This lecture: point particles
- Next lecture: mass-spring and clothes

Ordinary Differential Equations

$$\frac{d \mathbf{X}(t)}{dt} = f(\mathbf{X}(t), t)$$

Derivative of function over time relates (f) to the function at the current time

- Given a function $f(\mathbf{X}, t)$ compute $\mathbf{X}(t)$
- Typically, initial value problems:
 - Given values $\mathbf{X}(t_0) = \mathbf{X}_0$
 - Find values $\mathbf{X}(t)$ for $t > t_0$
- We can use lots of standard tools

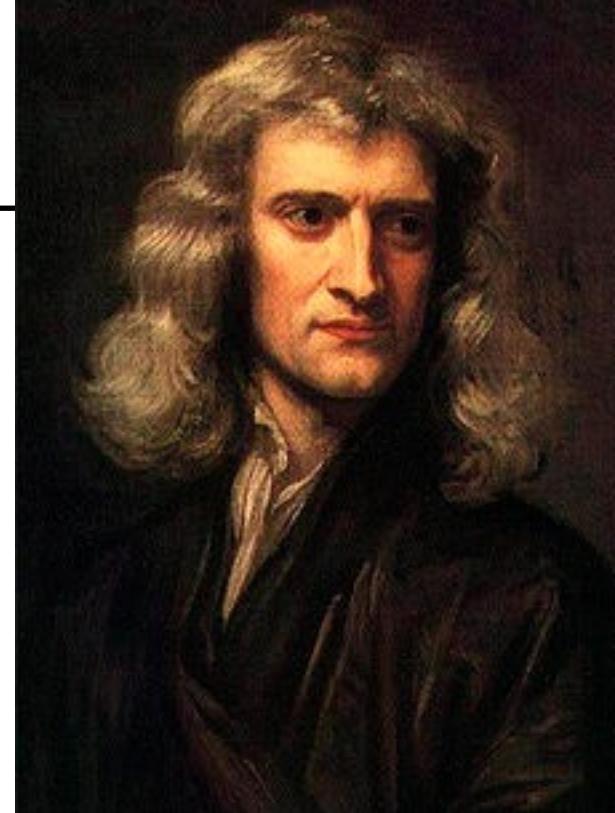
X - state

Did we just see it?

Newtonian Mechanics

- Point mass: 2nd order ODE

$$\vec{F} = m\vec{a} \quad \text{or} \quad \vec{F} = m \frac{d^2\vec{x}}{dt^2}$$



- Position \vec{x} and force \vec{F} are vector quantities
 - We know \vec{F} and m , want to solve for \vec{x}
- You have all seen this a million times before

e.g., particle in the middle of the wind

\vec{F} – constant or depend
on X

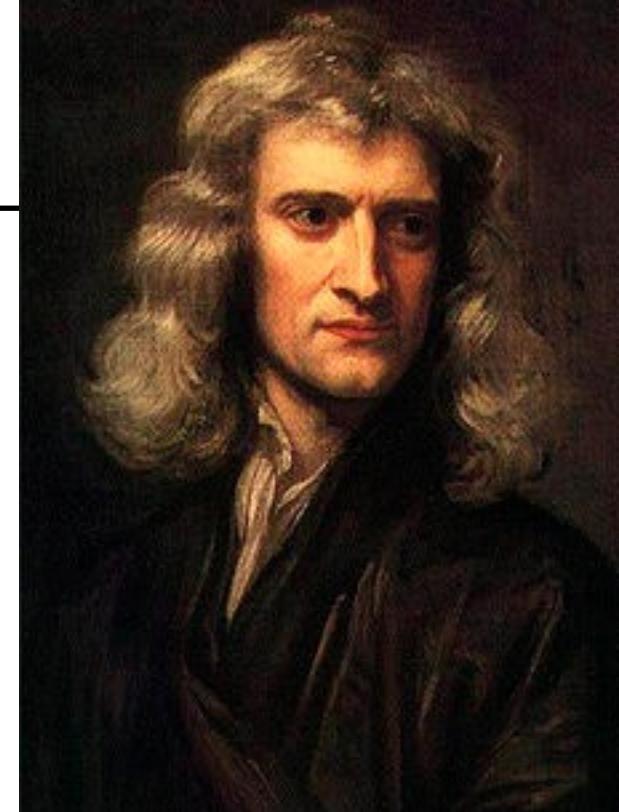
Reduction to 1st Order

- Point mass: 2nd order ODE

$$\vec{F} = m\vec{a} \quad \text{or} \quad \vec{F} = m \frac{d^2\vec{x}}{dt^2}$$

- Corresponds to system of first order ODEs

$$\begin{cases} \frac{d}{dt}\vec{x} = \vec{v} \\ \frac{d}{dt}\vec{v} = \vec{F}/m \end{cases}$$



2 unknowns (x, v)
instead of just x

Reduction to 1st Order

$$\begin{cases} \frac{d}{dt}\vec{x} = \vec{v} \\ \frac{d}{dt}\vec{v} = \vec{F}/m \end{cases}$$

2 variables (x, v)
instead of just one

- Why reduce?

Reduction to 1st Order

$$\begin{cases} \frac{d}{dt}\vec{x} = \vec{v} \\ \frac{d}{dt}\vec{v} = \vec{F}/m \end{cases}$$

2 variables (x, v)
instead of just one

- Why reduce?
 - Numerical solvers grow more complicated with increasing order, can just write one 1st order solver and use it
 - Note that this doesn't mean it would always be easy :-)

Notation

- Let's stack the pair (x, v) into a bigger state vector X

$$X = \begin{pmatrix} \vec{x} \\ \vec{v} \end{pmatrix}$$

For a particle in
3D, state vector X
has 6 numbers

$$\frac{d}{dt} X = f(X, t) = \begin{pmatrix} \vec{v} \\ \vec{F}(x, v)/m \end{pmatrix}$$

Now, Many Particles

- We have N point masses
 - Let's just stack all xs and vs in a big vector of length 6N

$$\mathbf{X} = \begin{pmatrix} \mathbf{x}_1 \\ \mathbf{v}_1 \\ \vdots \\ \mathbf{x}_N \\ \mathbf{v}_N \end{pmatrix} \quad f(\mathbf{X}, t) = \begin{pmatrix} \mathbf{v}_1 \\ \mathbf{F}^1(\mathbf{X}, t) \\ \vdots \\ \mathbf{v}_N \\ \mathbf{F}^N(\mathbf{X}, t) \end{pmatrix}$$

Now, Many Particles

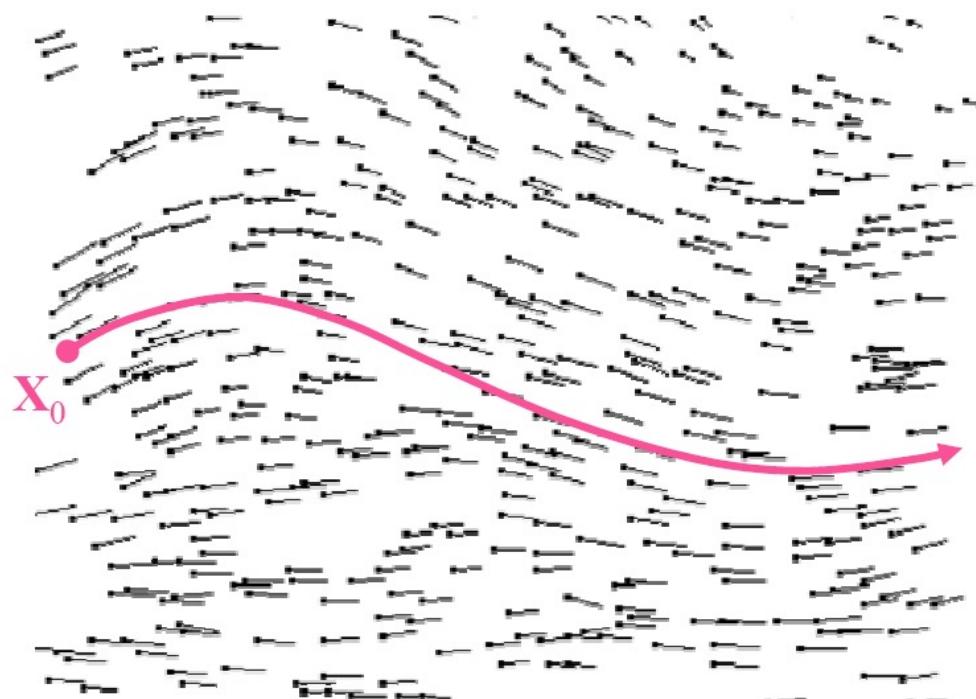
- We have N point masses
 - Let's just stack all x s and v s in a big vector of length $6N$
 - F^i denotes the force on particle i
 - When particles don't interact, F^i only depends on x_i and v_i .

$$\mathbf{X} = \begin{pmatrix} \mathbf{x}_1 \\ \mathbf{v}_1 \\ \vdots \\ \mathbf{x}_N \\ \mathbf{v}_N \end{pmatrix} \quad f(\mathbf{X}, t) = \begin{pmatrix} \mathbf{v}_1 \\ \mathbf{F}^1(\mathbf{X}, t) \\ \vdots \\ \mathbf{v}_N \\ \mathbf{F}^N(\mathbf{X}, t) \end{pmatrix}$$

↑
f gives $d/dt X$, remember!

Path through a Vector Field

- $X(t)$: path in multidimensional phase space

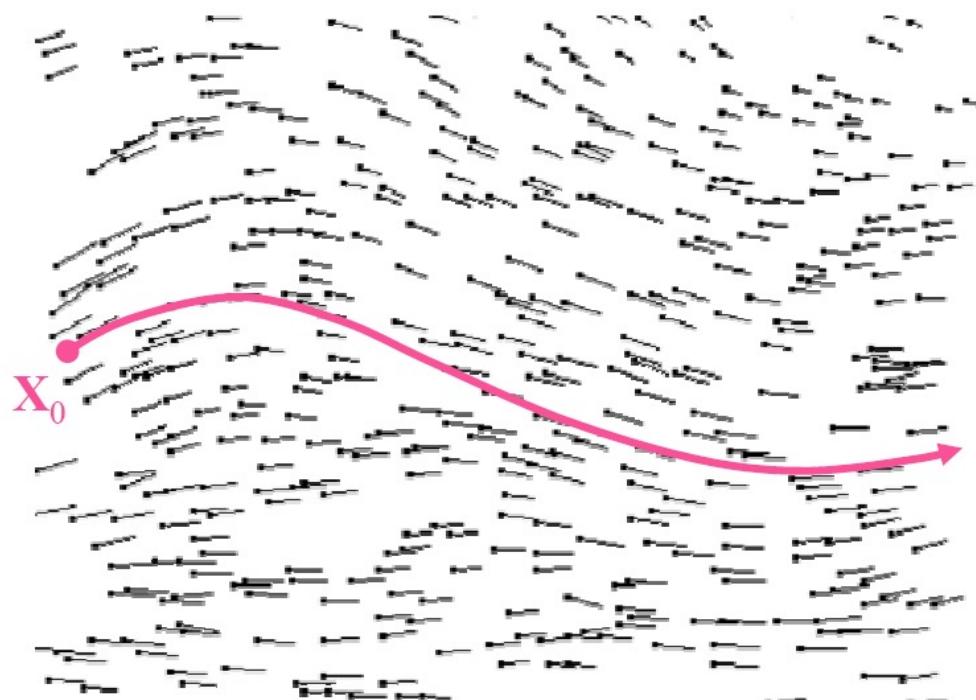


$$\frac{d}{dt} \mathbf{X} = f(\mathbf{X}, t)$$

“When we are at state \mathbf{X} at time t , where will \mathbf{X} be after an infinitely small time interval dt ?”

Path through a Vector Field

- $X(t)$: path in multidimensional phase space



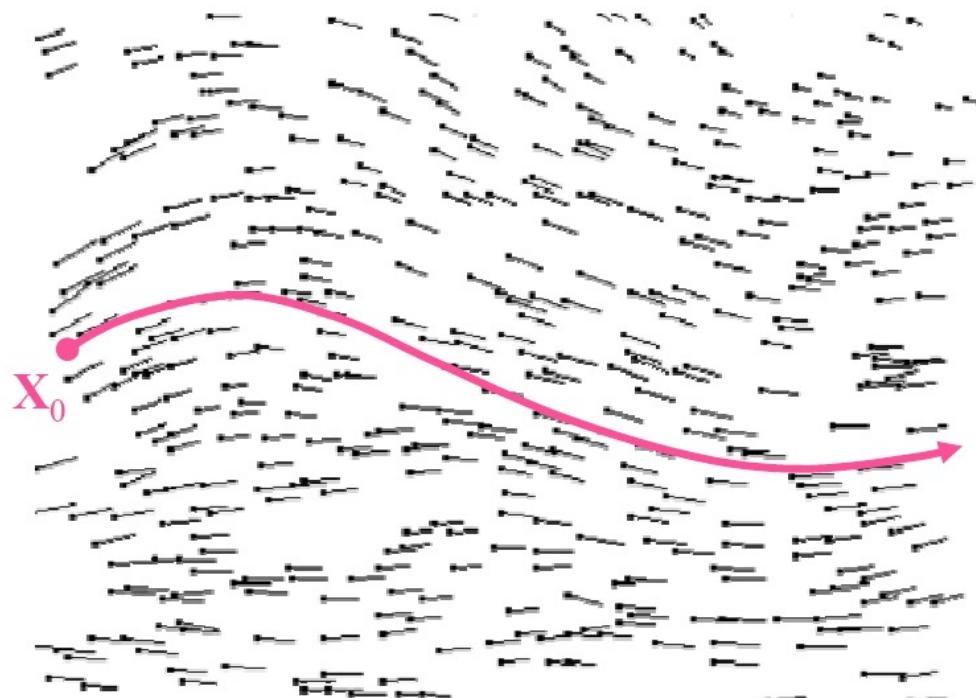
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“When we are at state \mathbf{X} at time t , where will \mathbf{X} be after an infinitely small time interval dt ?”

- $f = d/dt \mathbf{X}$ is a vector that sits at each point in phase space, pointing the direction. (Given!)

Path through a Vector Field

- $X(t)$: path in multidimensional phase space



$$\frac{d}{dt} \mathbf{X} = f(\mathbf{X}, t)$$

“When we are at state \mathbf{X} at time t , where will \mathbf{X} be after an infinitely small time interval dt ?”

- f is a function of \mathbf{X} and t , but not necessarily depends on t . If it does, the vector field will keep changing

Think an example?

Recap: ODE

$$\frac{d \mathbf{X}(t)}{dt} = f(\mathbf{X}(t), t)$$

- *** Given a function $f(\mathbf{X}, t)$ compute $\mathbf{X}(t)$ ***
- Typically, initial value problems:
 - *** Given values $\mathbf{X}(t_0) = \mathbf{X}_0$ ***
 - Find values $\mathbf{X}(t)$ for $t > t_0$
- f may or may not depends on t
- Think about a point on the ocean, f is the ocean current, \mathbf{X} should be the path of the point driven by f

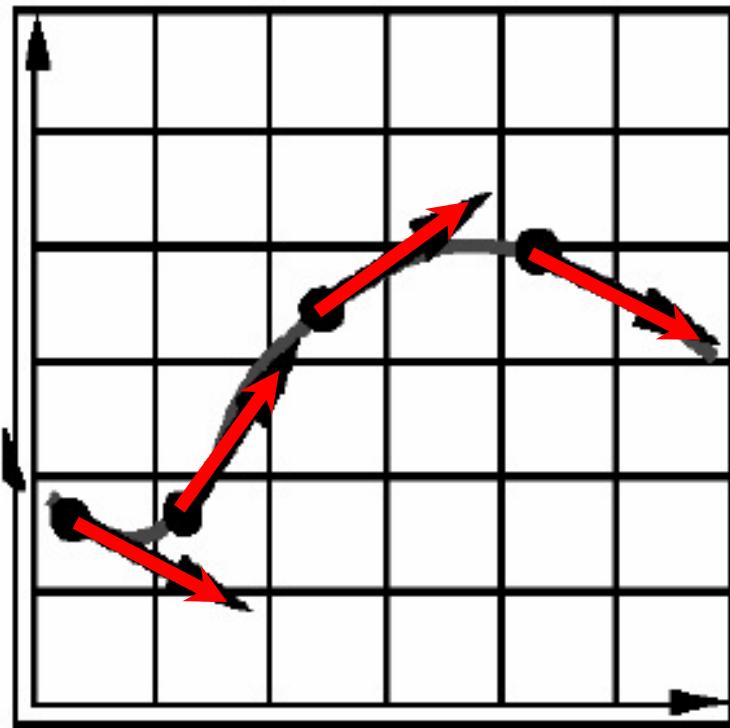
Questions?

Numerics of ODEs

- Numerical solution is called “integration of the ODE”
- Many techniques
 - Today, the simplest one
 - Next class, we’ll look at some more advanced techniques

Intuitive Solution: Take Steps

- Current state X
- Examine $f(X,t)$ at (or near) current state
- Take a step to new value of X



$$\frac{d}{dt} \mathbf{X} = f(\mathbf{X}, t)$$

⇒ “ $d\mathbf{X} = dt f(\mathbf{X}, t)$ ”

$f = d/dt X$ is a vector
that sits at each
point in phase
space, pointing the
direction.

Euler's Method

- Simplest and most intuitive
- Pick a step size h
- Given $\mathbf{X}_0 = \mathbf{X}(t_0)$, take step:

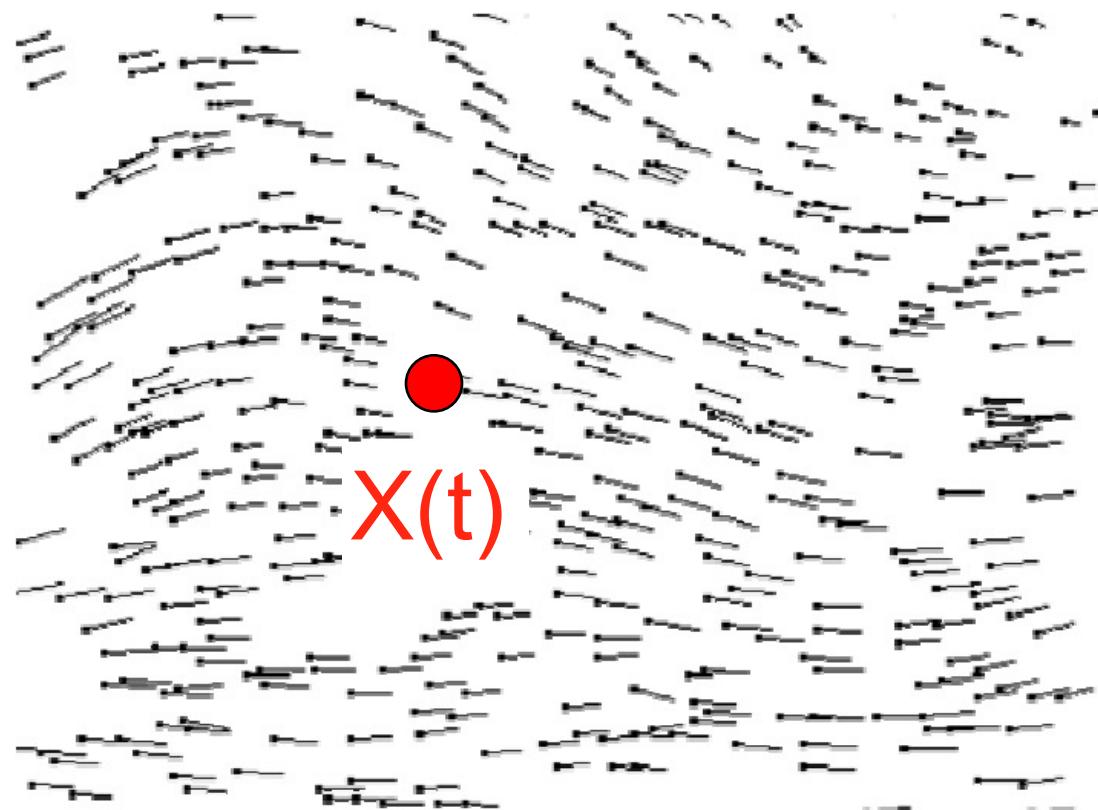
$$t_1 = t_0 + h$$

$$\mathbf{X}_1 = \mathbf{X}_0 + h f(\mathbf{X}_0, t_0)$$

- Piecewise-linear approximation to the path
- Basically, just replace dt by a small but finite number

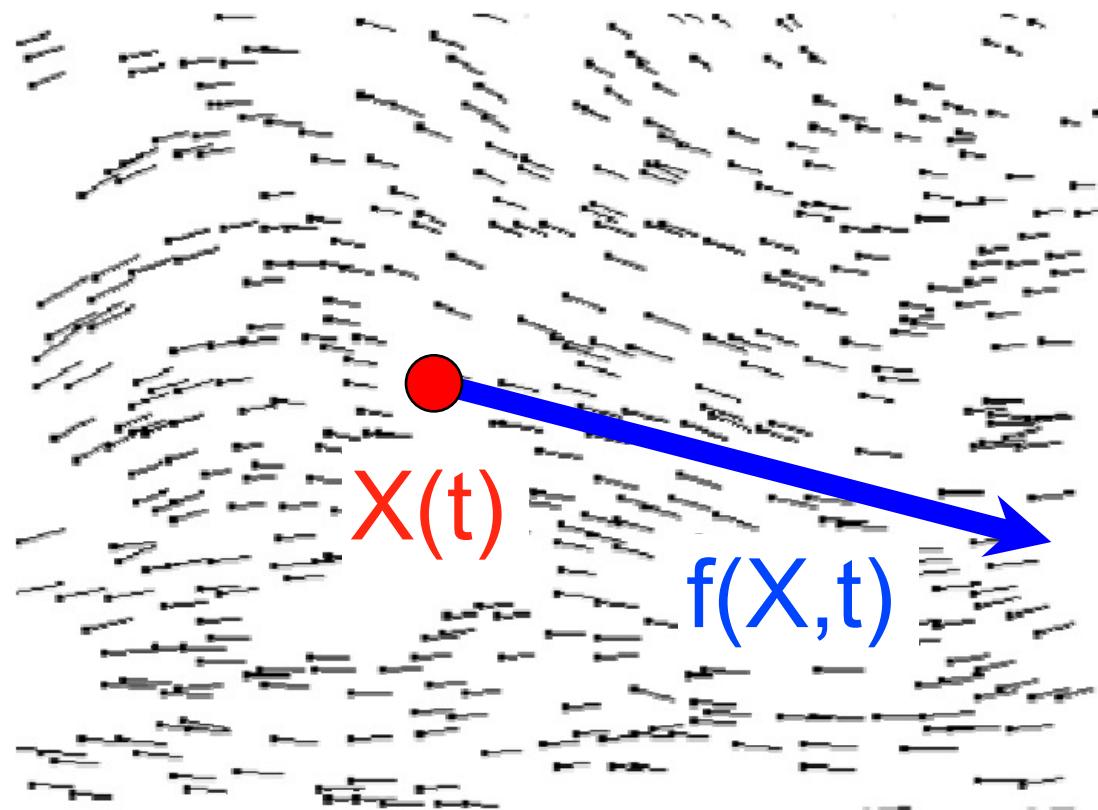
Euler, Visually

$$\frac{d}{dt} \mathbf{X} = f(\mathbf{X}, t)$$



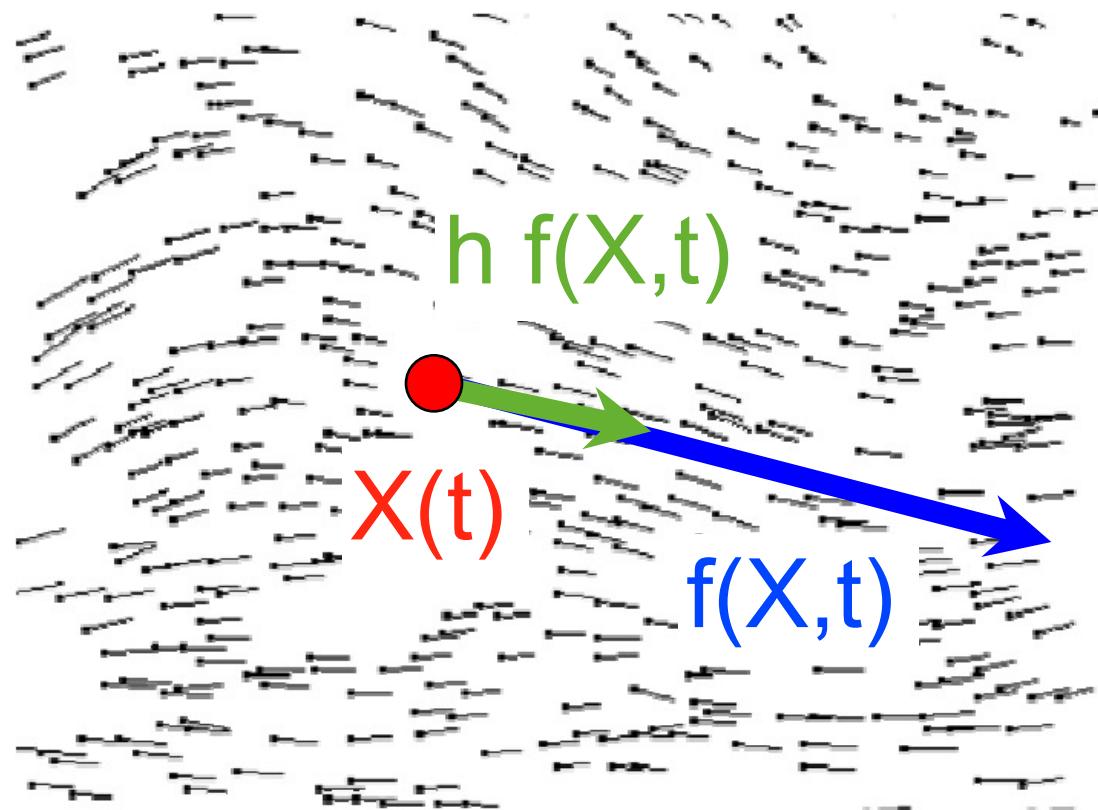
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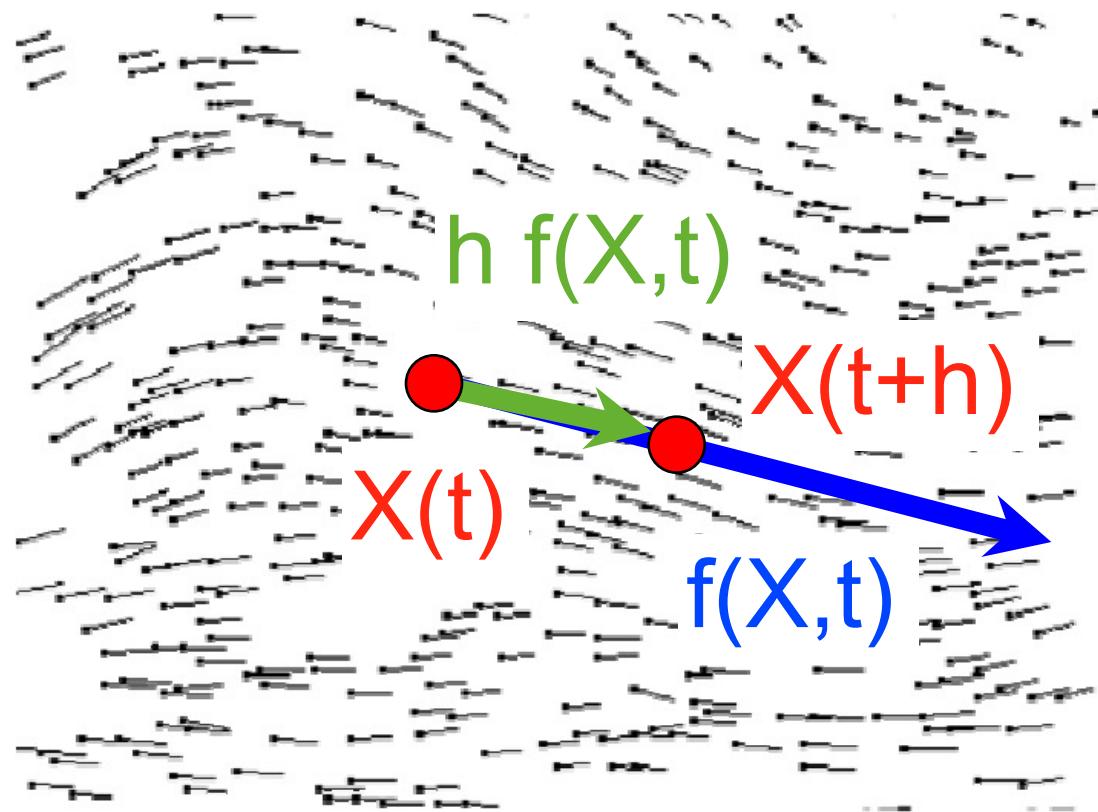
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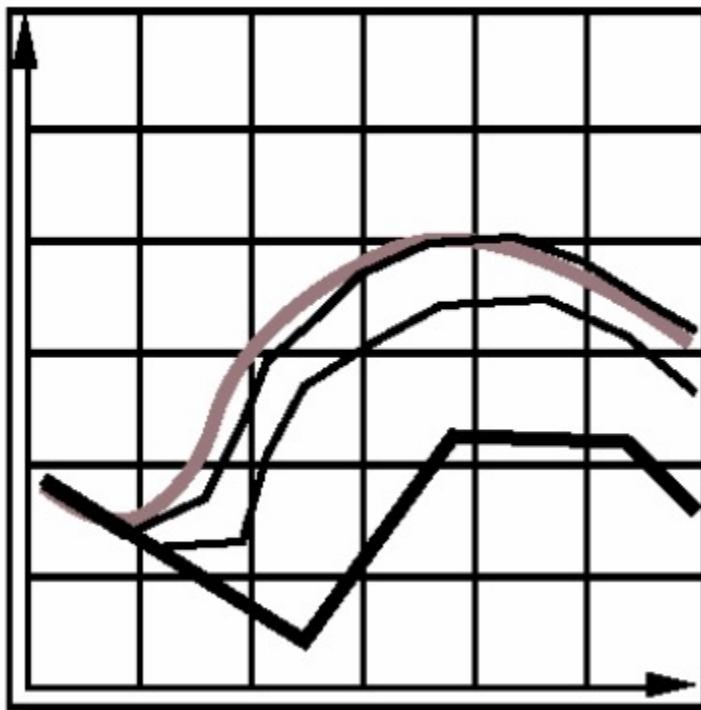


Questions?



Effect of Step Size

- Step size controls accuracy
- Smaller steps more closely follow curve
 - May need to take many small steps per frame
 - Properties of $f(X, t)$ determine this (more later)



Euler's method: Inaccurate

- Moves along tangent; can leave solution curve, e.g.:

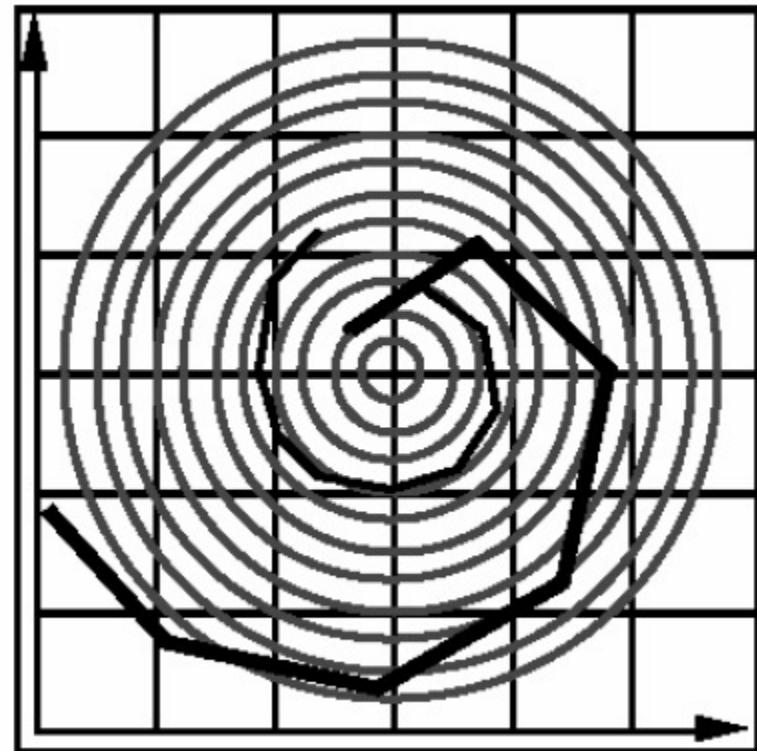
$$f(\mathbf{X}, t) = \begin{pmatrix} -y \\ x \end{pmatrix}$$

- Exact solution is circle:

$$\mathbf{X}(t) = \begin{pmatrix} r \cos(t+k) \\ r \sin(t+k) \end{pmatrix}$$



The true form that
you want to recover



Euler's method: Inaccurate

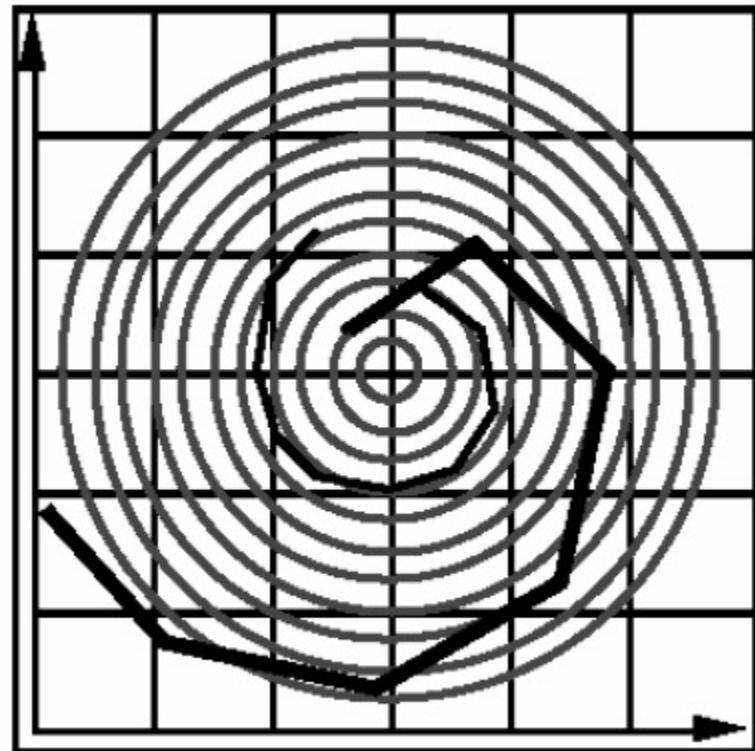
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- Euler spirals outward
no matter how small h is
 - will just diverge more slowly



More Accurate Alternatives

- Midpoint, Trapezoid, Runge-Kutta

More on this during next
class

- Extremely valuable resource: [SIGGRAPH 2001 course notes on physically based modeling](#)

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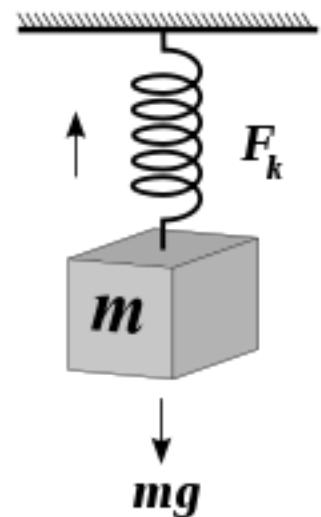
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Other Particle Systems

- Particles are not independent
 - Force among them!

What is a Force?

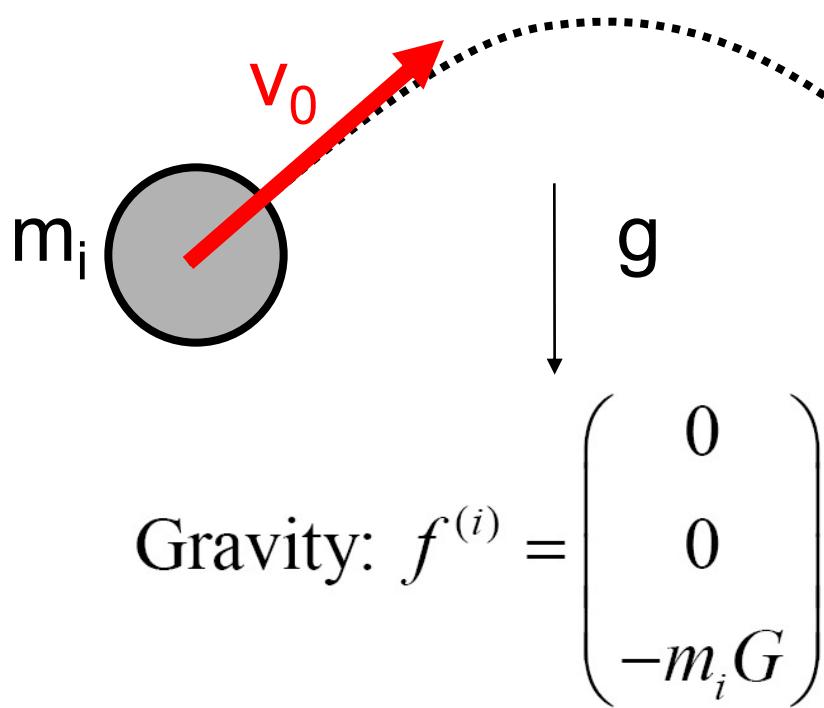
- A force changes the motion of the system
 - Newton says: When there are no forces, motion continues uniformly in a straight line (good enough for us)
- Forces can depend on location, time, velocity
 - Gravity, spring, viscosity, wind, etc.
- For point masses, forces are vectors
 - Ie., to get total force, take vector sum of everything



Wikipedia

Forces: Gravity on Earth

- Depends only on particle mass
- $f(X,t) = \text{constant}$
- Hack for smoke, etc: make gravity point up!
 - Well, you can call this buoyancy, too.



http://en.wikipedia.org/wiki/Image:Falling_ball.jpg

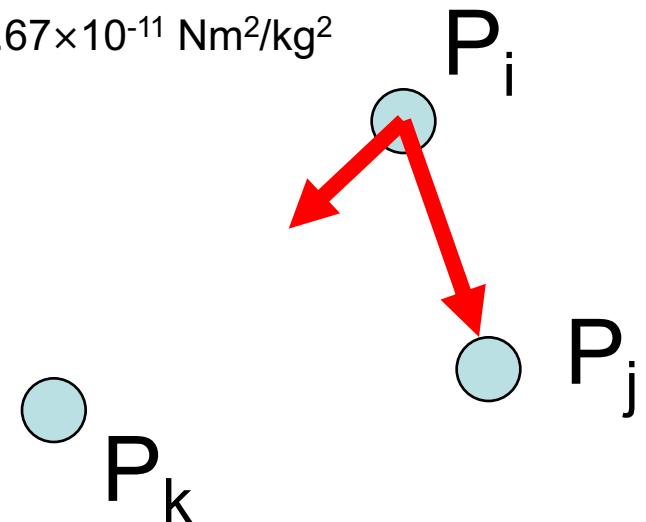


Forces: Gravity (N-body problem)

- Gravity depends on all other particles
- Opposite for pairs of particles
- Force in the direction of $p_i - p_j$ with magnitude inversely proportional to square distance

$$\|F_{ij}\| = \frac{G m_i m_j}{r^2} \quad \text{where } G=6.67 \times 10^{-11} \text{ Nm}^2/\text{kg}^2$$

- Testing all pairs is $O(n^2)$!



Particles are not
independent!

Real-Time Gravity Demo

NVIDIA

<http://www.youtube.com/watch?v=uhTuJZiAG64>

An Aside on Gravity

- That was Brute Force
 - Meaning all $O(n^2)$ pairs of particles were considered when computing forces
 - Yes, computers are fast these days, but this gets prohibitively expensive soon. (The square in n^2 wins.)
- Hierarchical techniques approximate forces caused by many distant attractors by one force, yields $O(n)!$
 - Fast Multipole Method”, Greengard and Rokhlin, J Comput Phys 73, p. 325 (1987)
 - This inspired very cool hierarchical illumination rendering algorithms in graphics (hierarchical radiosity, etc.)

Forces: Viscous Damping

$$f^{(i)} = -d\dot{v}^{(i)}$$

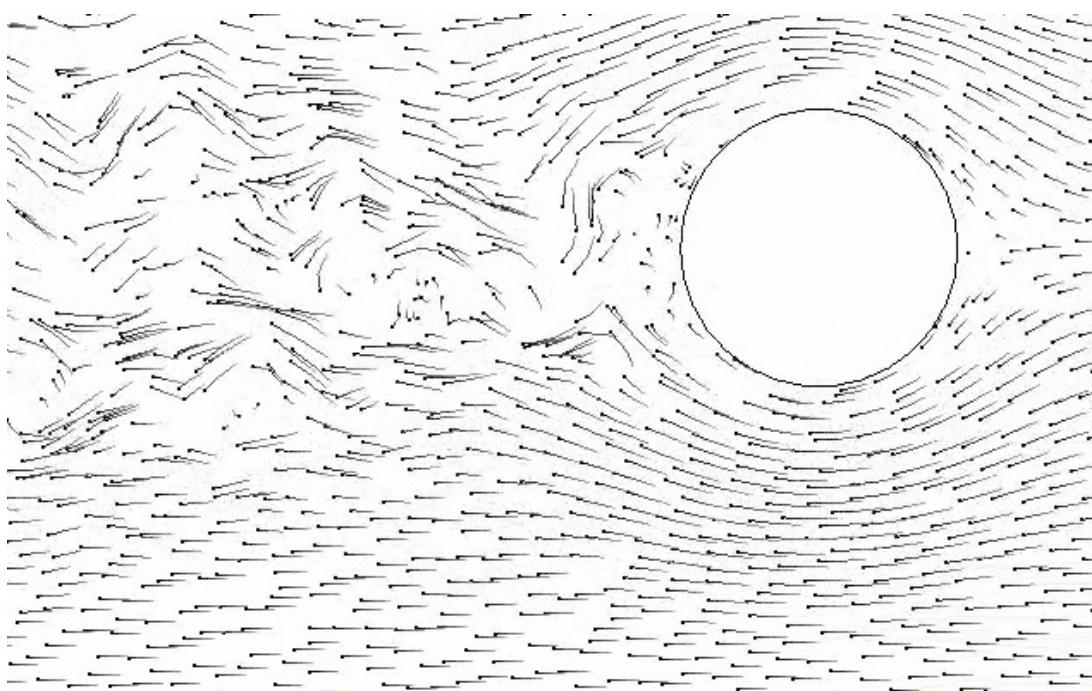
- Damping force on particle i determined its velocity
 - Opposes motion
 - E.g. wind resistance
- Removes energy, so system can settle
- Small amount of damping can stabilize solver
- Too much damping makes motion like in glue

Forces: Spatial Fields

- Externally specified force (or velocity) fields in space
- Force on particle i depends only on its position
- Arbitrary functions
 - wind
 - attractors, repulsors
 - vortices
- Can depend on time
- Note: these add energy, may need damping

Example: Procedural Spatial Field

- Curl noise for procedural fluid flow, R. Bridson, J. Hourihan, and M. Nordenstam, Proc. ACM SIGGRAPH 2007.



Plausible, controllable
force fields – just
advection particles
along the flow gives
cool results!

And it's simple, too!

Curl-Noise for Procedural Fluid Flow

Robert Bridson

Jim Hourihan

Markus Nordenstam

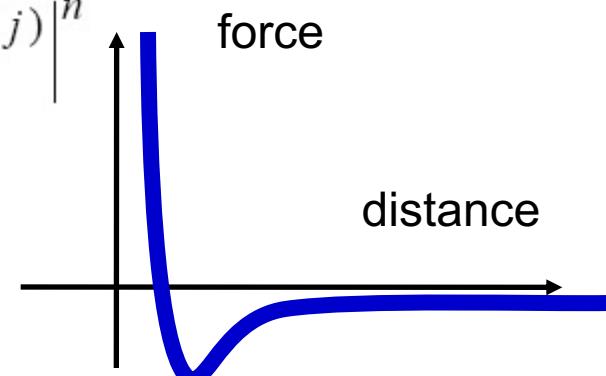
Forces: Other Spatial Interaction

Spatial interaction: $f^{(i)} = \sum_j f(x^{(i)}, x^{(j)})$

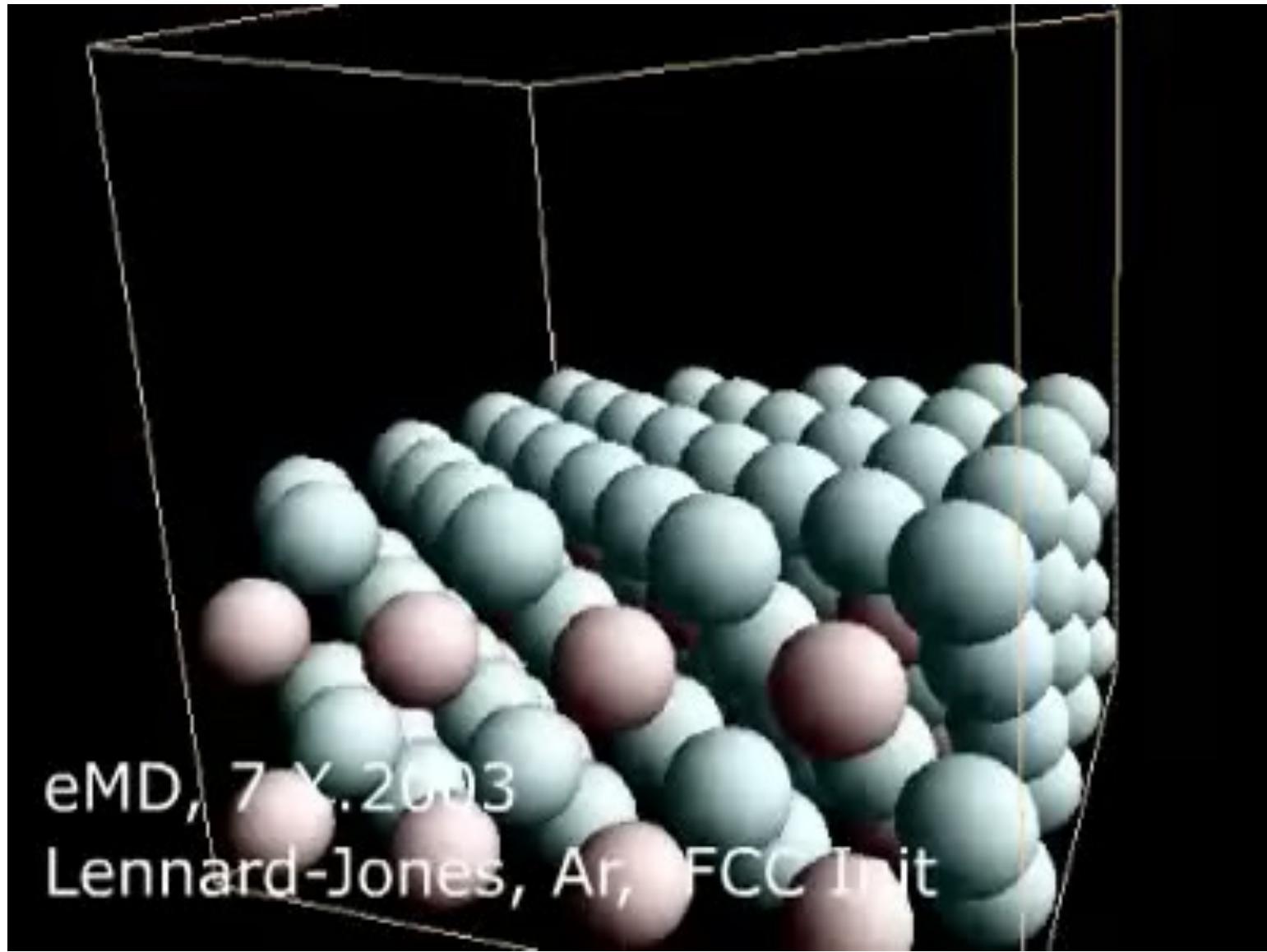
- E.g., approximate fluid using Lennard-Jones force:

$$f(x^{(i)}, x^{(j)}) = \frac{k_1}{|x^{(i)} - x^{(j)}|^m} - \frac{k_2}{|x^{(i)} - x^{(j)}|^n}$$

- Repulsive + attractive force
- Again, $O(N^2)$ to test all pairs
 - usually only local
 - Use buckets to optimize

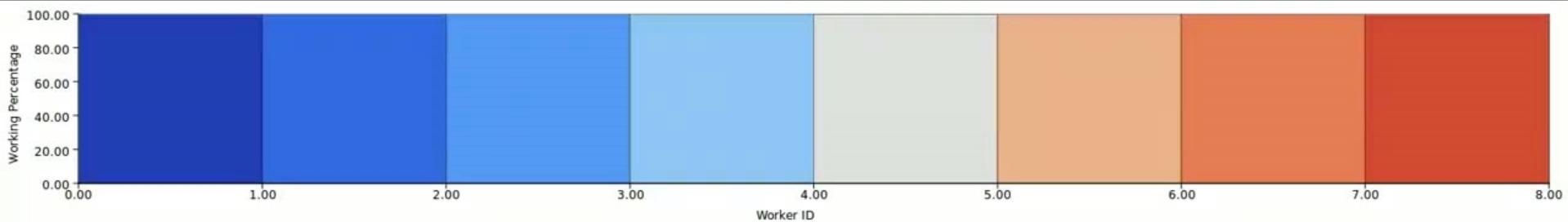
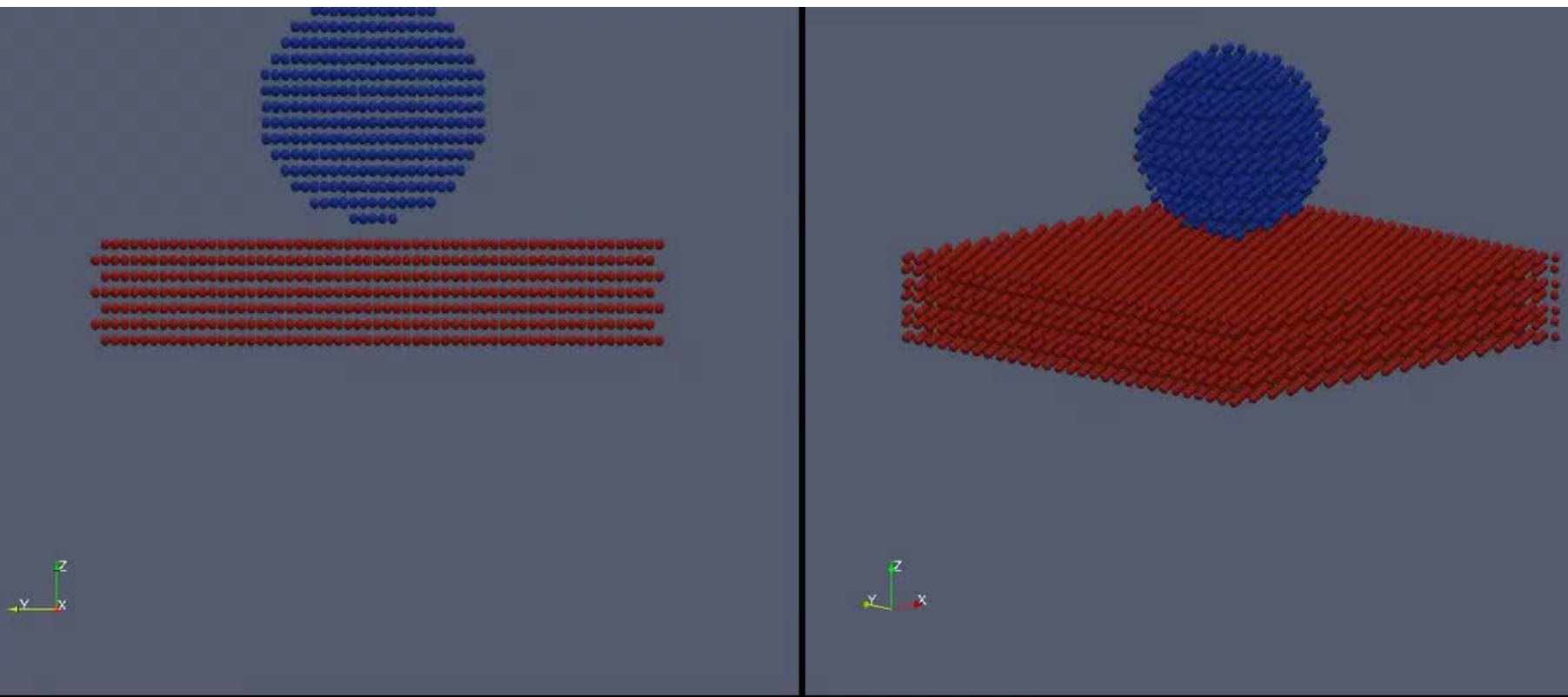


Particles are not
independent!



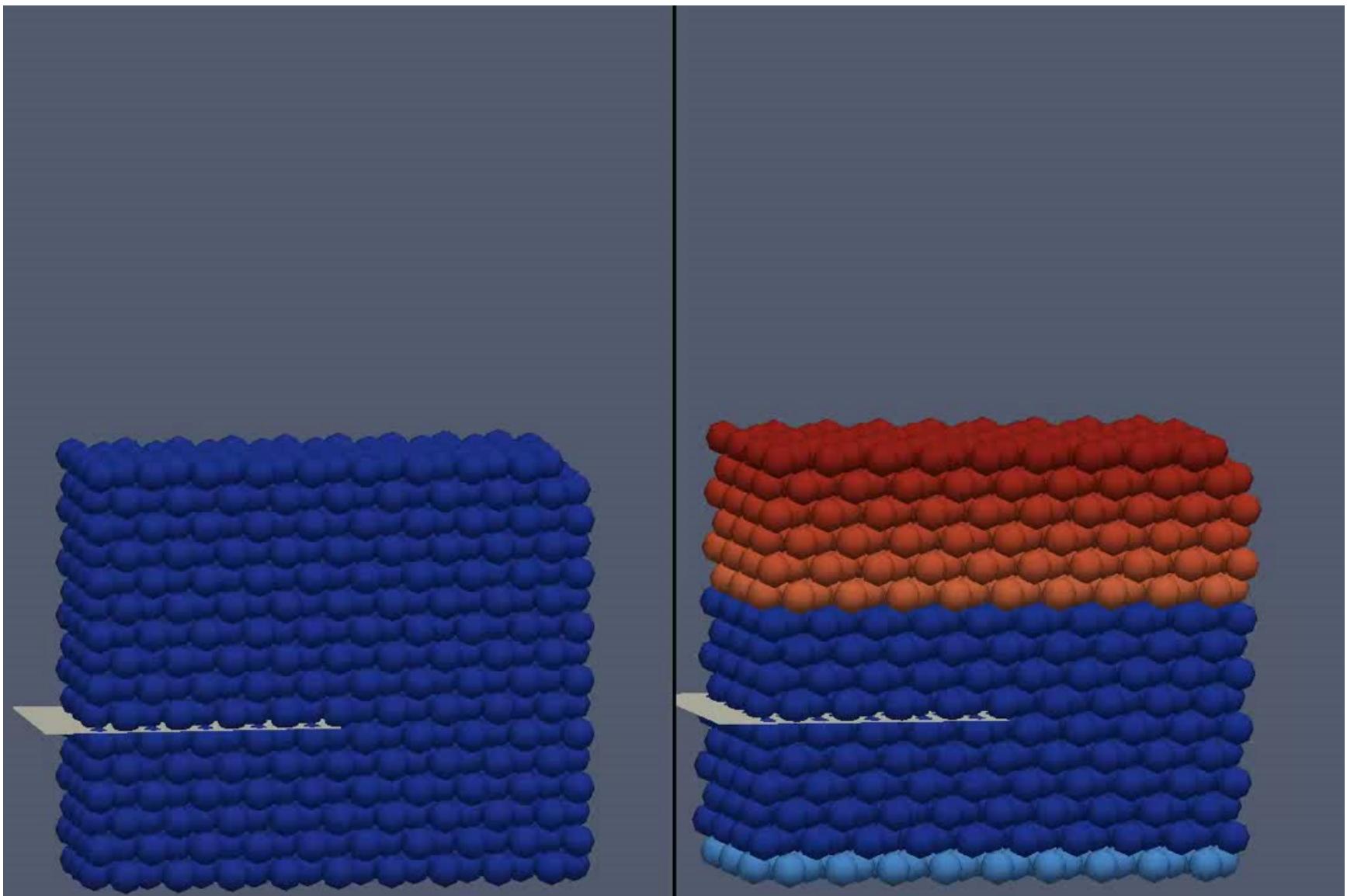
<http://www.youtube.com/watch?v=nI7maklgYnI&feature=related>

Lennard-Jones forces



<http://www.youtube.com/watch?v=XfjYIKxKIWQ&feature=autoplay&list=PL0605C44C6E8D5EDB&if=autoplay&playnext=2>

Questions?



More Eyecandy from NVIDIA

- Fluid flow solved using a regular grid solver
 - This gives a velocity field
- 0.5M smoke particles advected using the field
 - That means particle velocity is given by field
- Particles are
for rendering,
motion solved
using other
methods



More Eyecandy from NVIDIA

More Advanced “Forces”

- Flocking birds, fish shoals
 - <http://www.red3d.com/cwr/boids/>
- Crowds (www.massivesoftware.com)

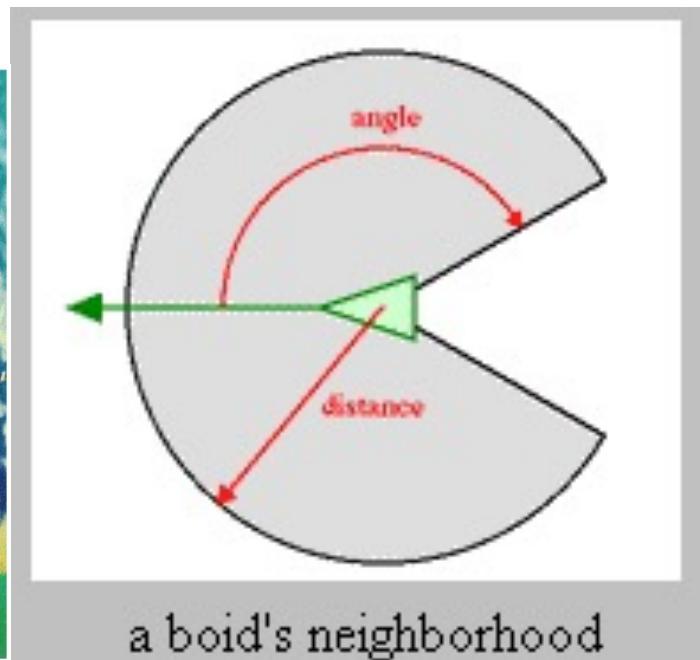
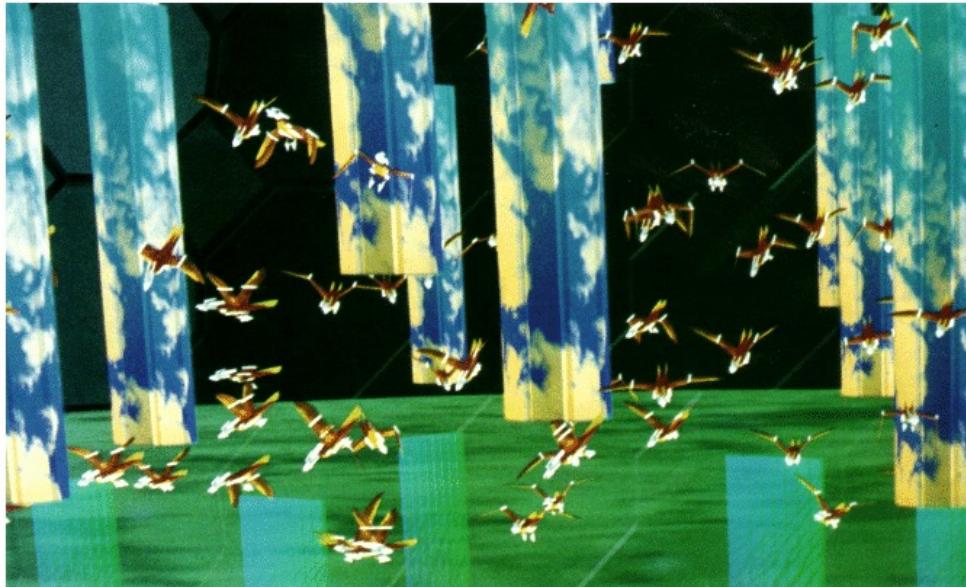


Battle of Helm's Deep, LOTR



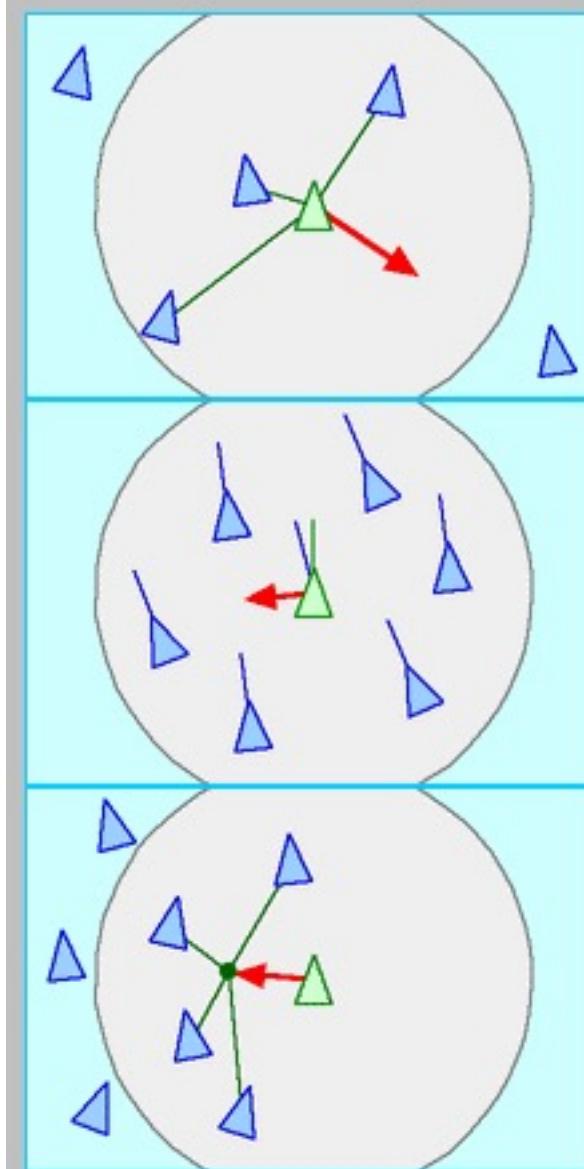
Flocks (“Boids”)

- From Craig Reynolds
- Each bird modeled as a complex particle (“boid”)
- A set of forces control its behavior
- Based on location of other birds and control forces



Flocks (“Boids”)

- (“Boid” was an abbreviation of “birdoid”. His rules applied equally to simulated flocking birds, and shoaling fish.)



Separation: steer to avoid crowding local flockmates

Alignment: steer towards the average heading of local flockmates

Cohesion: steer to move toward the average position of local flockmates

Flocks (“Boids”)

COURSE: 07

COURSE ORGANIZER: DEMETRI TERZOPoulos

"BOIDS DEMOS"

CRAIG REYNOLDS

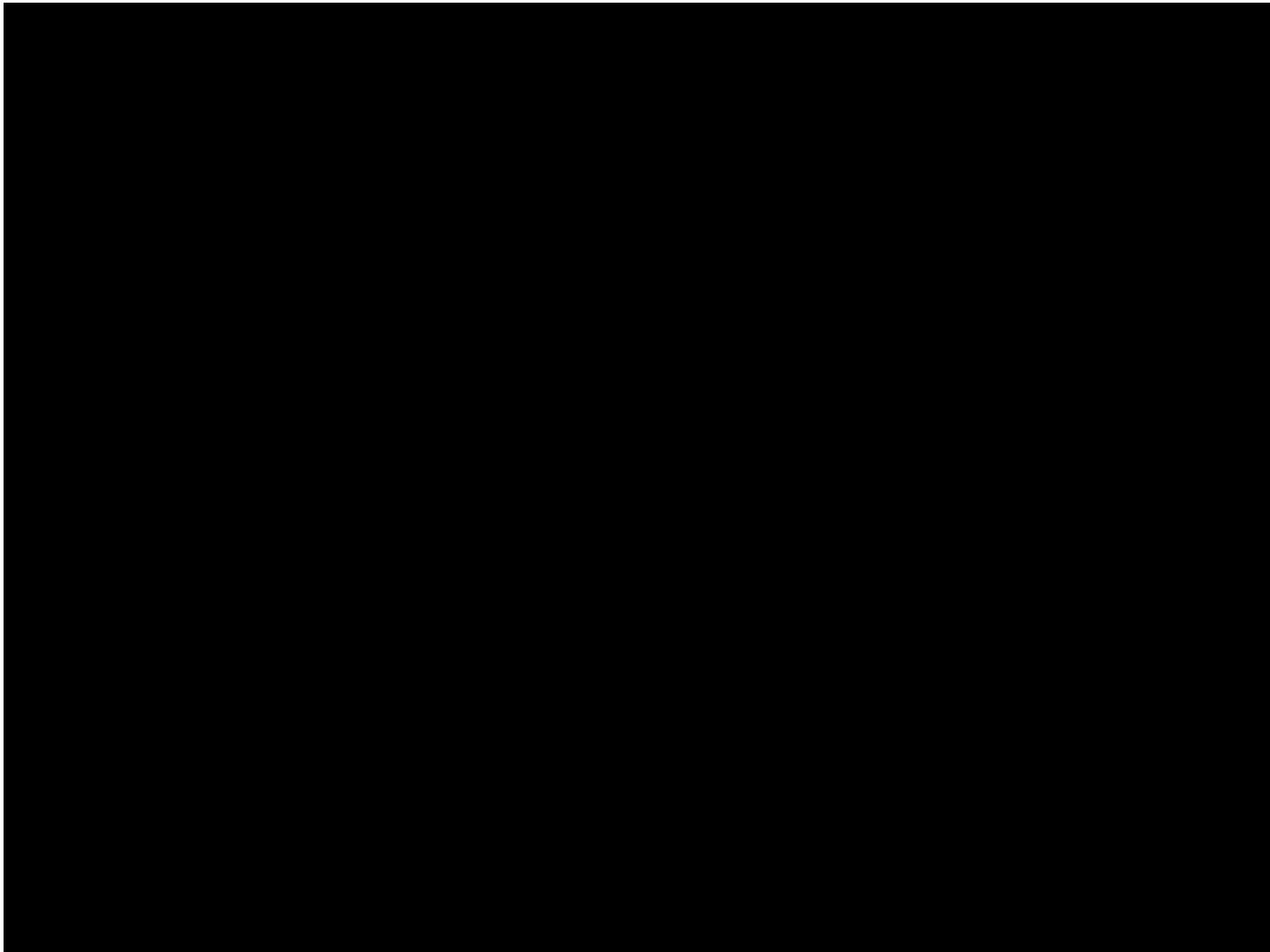
SILICON STUDIOS, MS 3L-980

2011 NORTH SHORELINE BLVD.

MOUNTAIN VIEW, CA 94039-7311

Predator-Prey

- <http://www.youtube.com/watch?v=rN8DzIgMt3M>



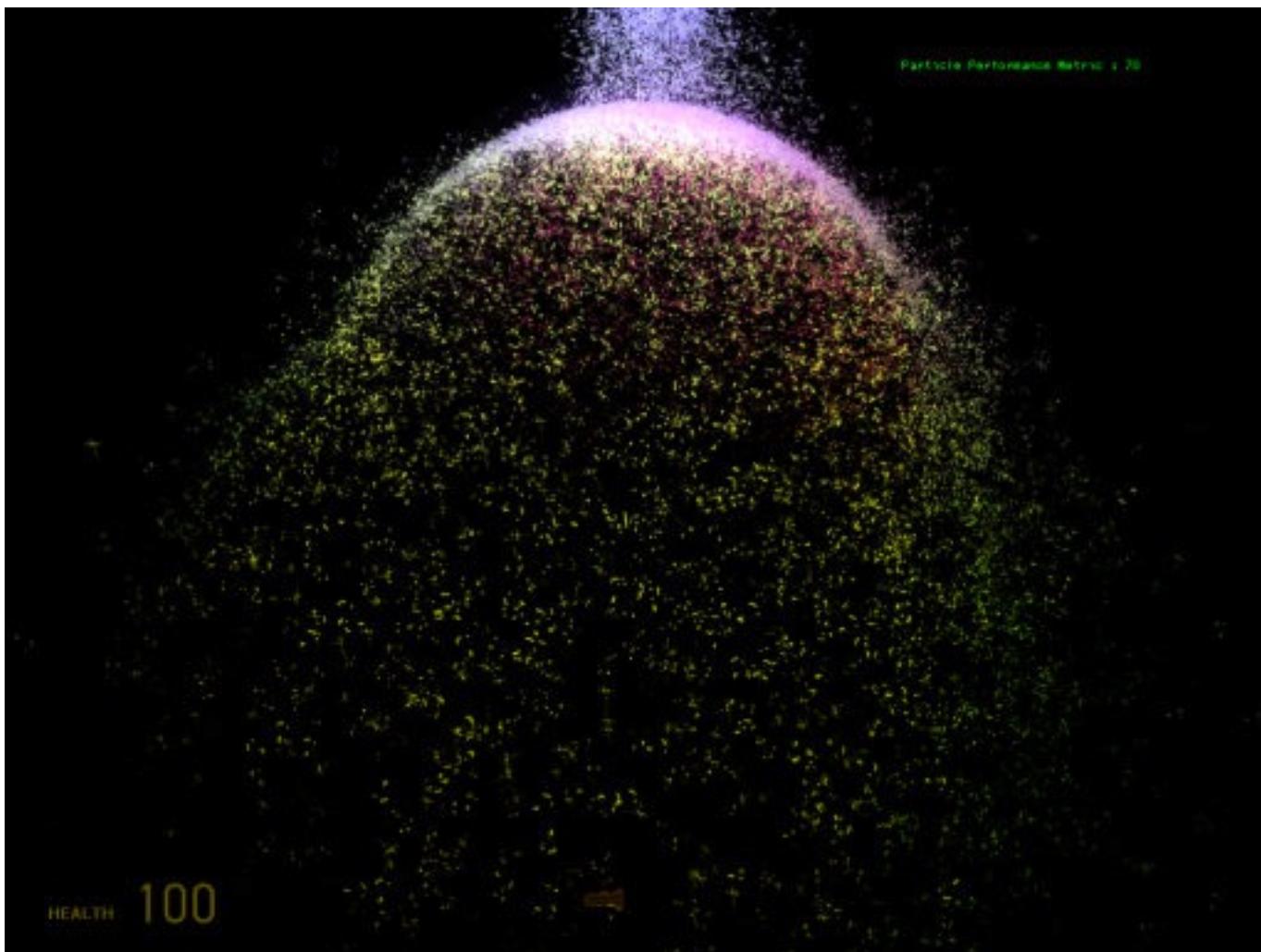
Massive software

- <http://www.massivesoftware.com/>
- Used for battle scenes in the Lord of The Rings



<https://www.fxguide.com/featured/massive-gets-bigger/>

Questions?



Valve Software

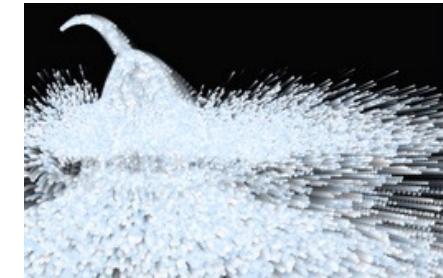
Where do particles come from?

- Often created by generators or emitters
 - Can be attached to objects in the model
- Given rate of creation: particles/second
 - record t_{last} of last particle created

$$n = \lfloor (t - t_{last}) \text{rate} \rfloor$$

- create n particles.
update t_{last} if $n > 0$

- Create with (random) distribution of initial x and v
 - if creating $n > 1$ particles at once, spread out on path

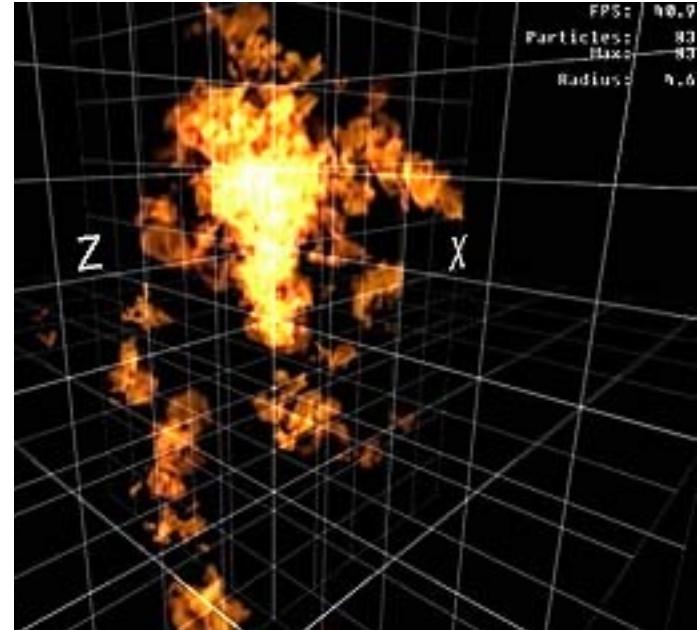


<http://www.particulsystems.org/>

Particle Controls

MAX PAYNE 2

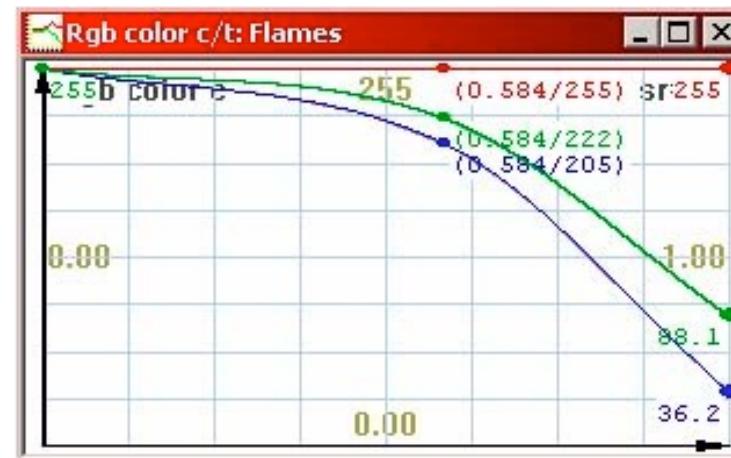
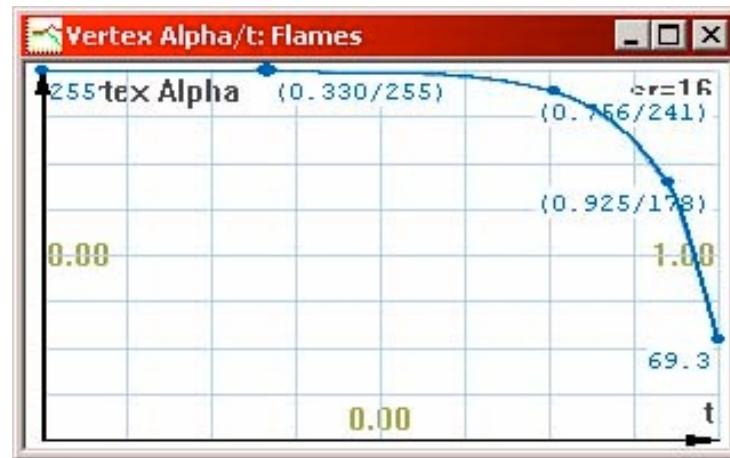
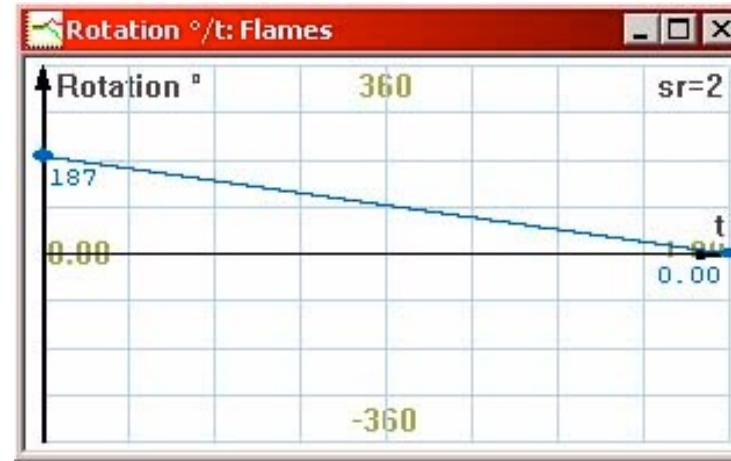
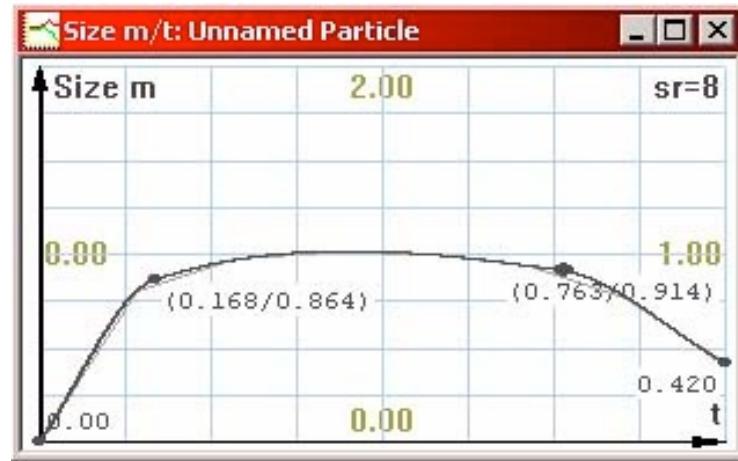
- In production tools, all these variables are time-varying and controllable by the user (artist)
 - Emission rate, color, velocity distribution, direction spread, textures, etc. etc.
 - All as a function of time!
 - Example: ParticleFX
(Max Payne Particle Editor)
 - Custom editor software
 - You can [download it](#) (for Windows) and easily create your own particle systems. Comes with examples!
 - This is what we used for all the particles in the game!



Emitter Controls

MAX PAYNE 2

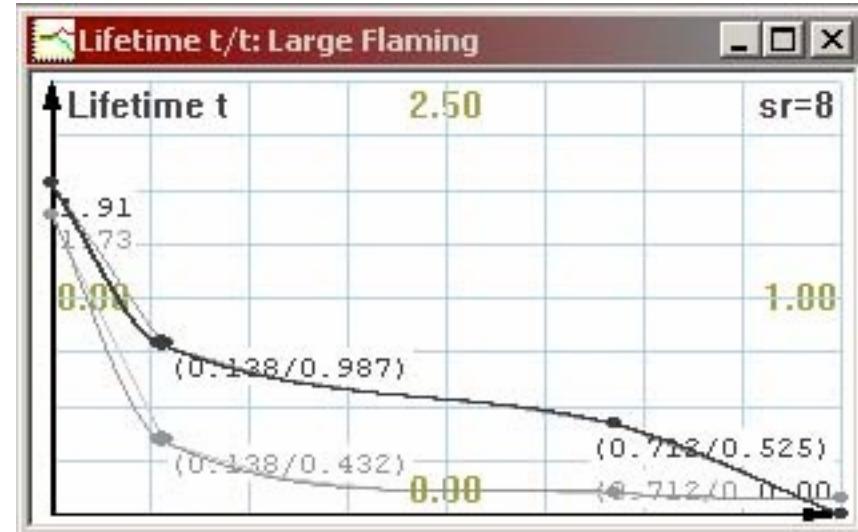
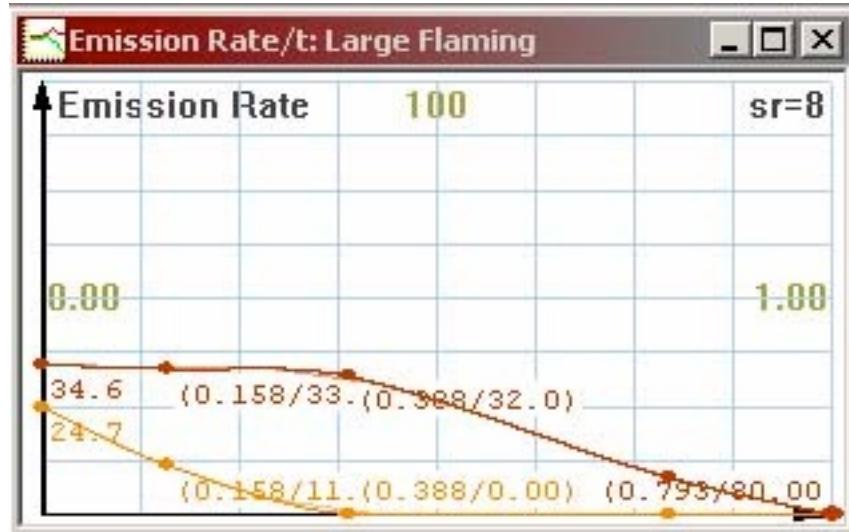
- Again, reuse splines!



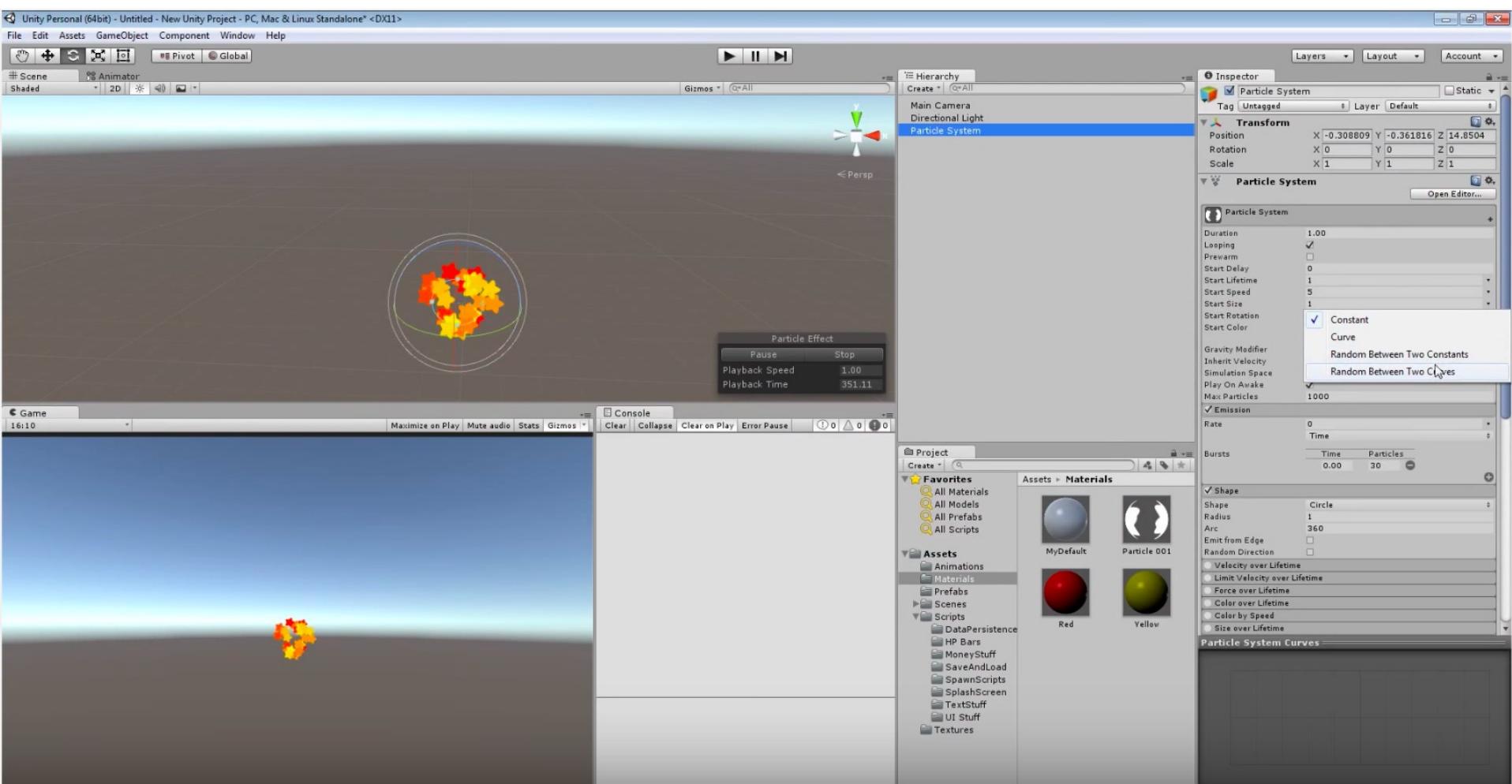
Emitter Controls

MAX PAYNE 2

- Again, reuse splines!



Unity Engine



Rendering and Motion Blur

- Often not shaded (just emission, think sparks)
 - But realistic non-emissive particles needs shadows, etc.
- Most often, particles don't contribute to the z-buffer, i.e., they do not fully occlude stuff that's behind
 - Rendered with z testing on
(particles get occluded by solid stuff)
- Draw a line for motion blur
 - $(x, x+v \ dt)$
 - Or an elongated quad with texture



Metal Gear Solid by Konami

Rendering and Motion Blur



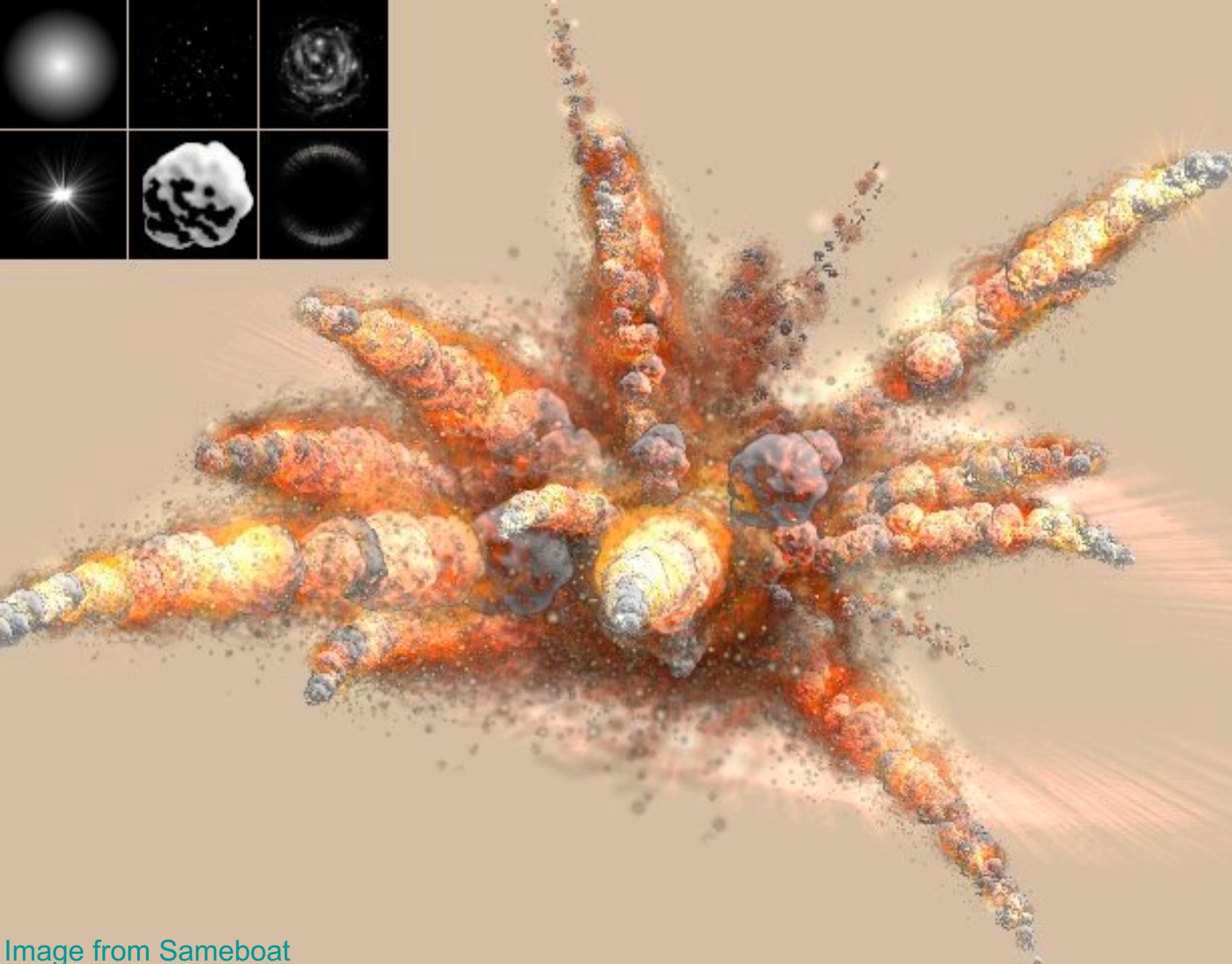
Metal Gear Solid by Konami

Rendering and Motion Blur

3DMARK[®]



- Often use texture maps (fire, clouds, smoke puffs)
 - Called “billboards” or “sprites”
 - Always parallel to image plane

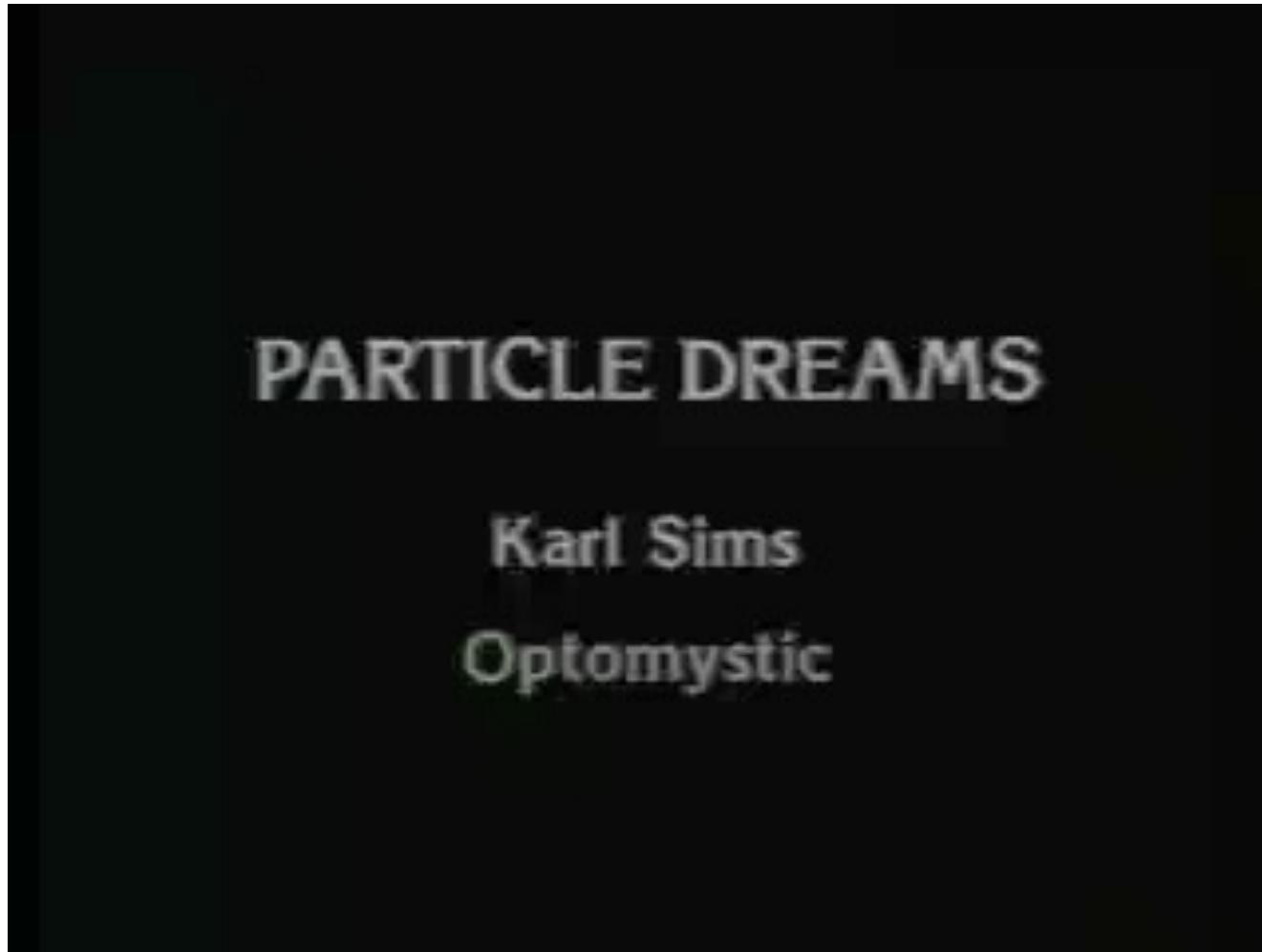


Star Trek 2 – The Wrath of Khan

- One of the earliest particle systems (from 1982)
- Also, fractal landscapes
- Described in [Reeves, 1983]



Questions?



Early particle fun by Karl Sims

http://archive.org/details/sims_particle_dreams_1988

Additional materials

- Further reading
 - Witkin, Baraff, Kass: Physically-based Modeling Course Notes, SIGGRAPH 2001
 - Extremely good, easy-to-read resource. Highly recommended!
 - William Reeves: Particle systems—a technique for modeling a class of fuzzy objects, Proc. SIGGRAPH 1983
 - The original paper on particle systems