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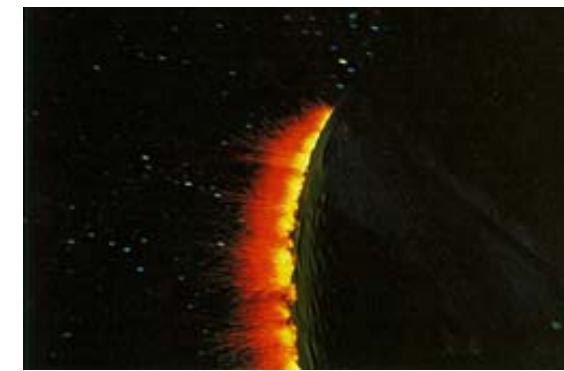
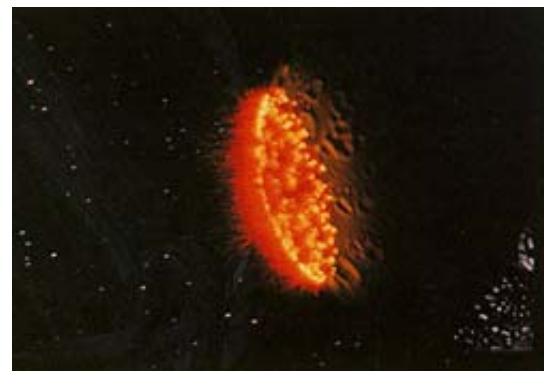
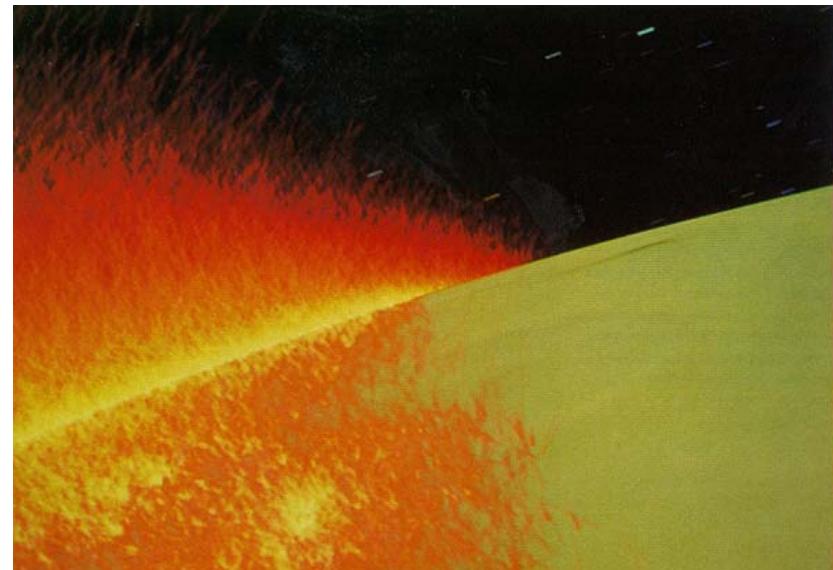
# 02: PARTICLE SYSTEMS

21/01/2016

# PARTICLE SYSTEMS

Particle simulation, though fairly simple to implement can create some very interesting visual effects.

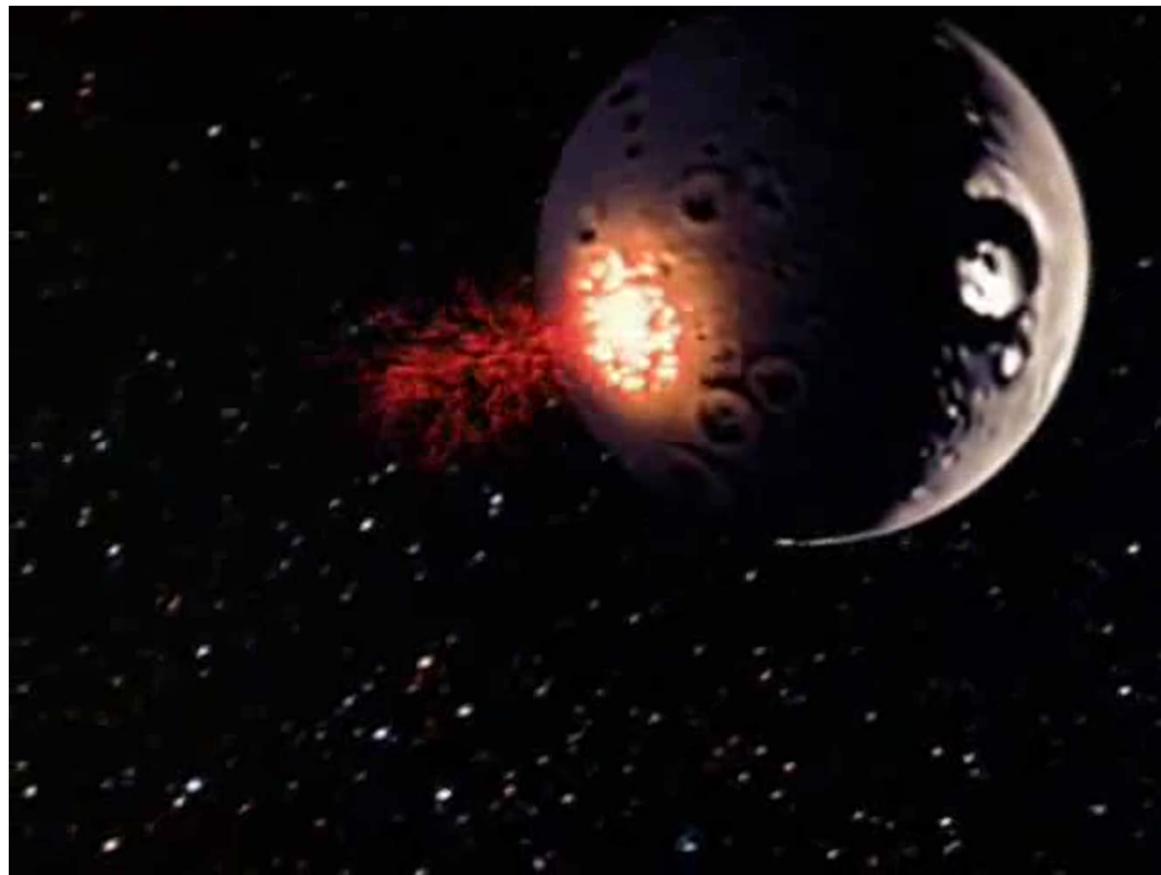
The Genesis Effect - Star Trek II:  
The Wrath of Khan (1983)



<http://www.siggraph.org/education/materials/HyperGraph/animation/movies/genesisp.mpg>

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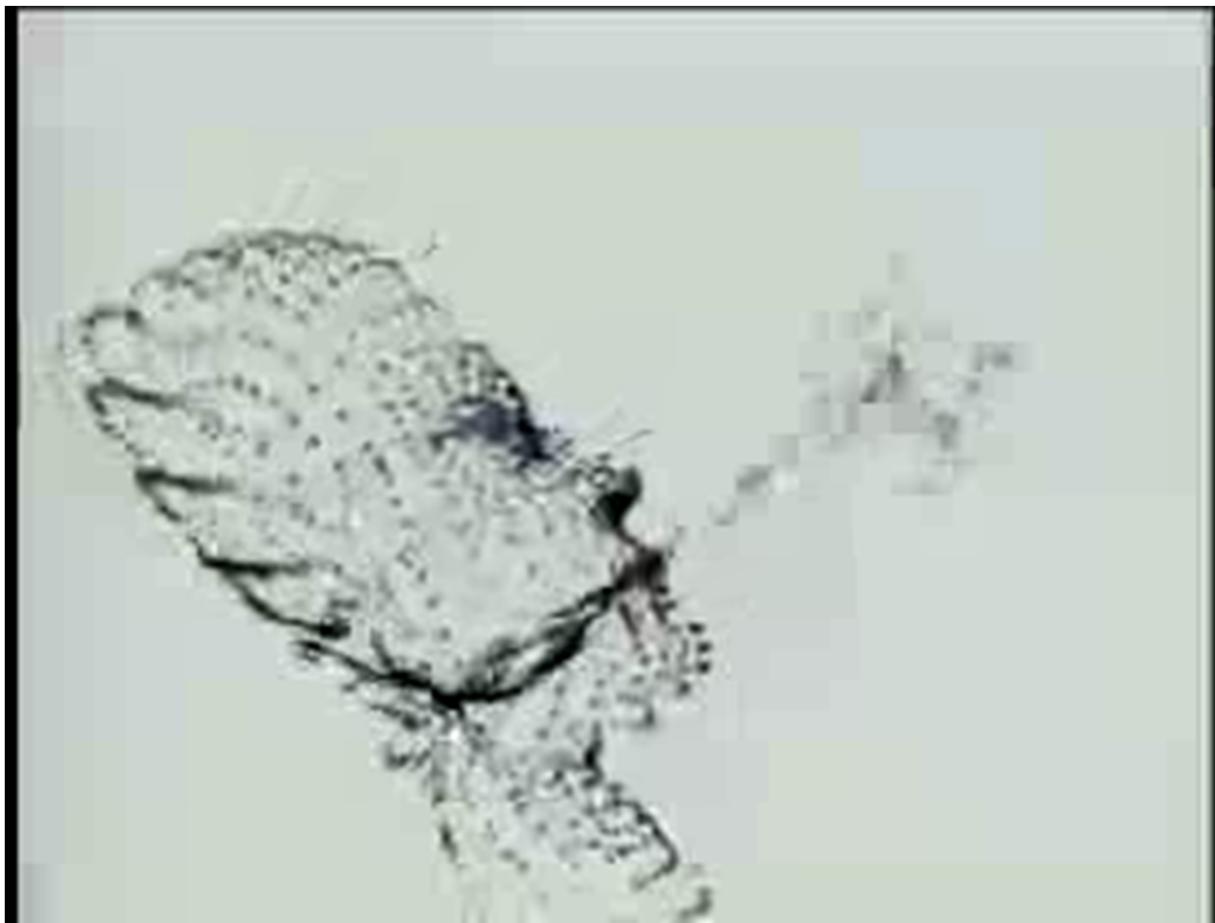
# PARTICLE SYSTEMS



The Genesis Effect - Star Trek II: The Wrath of Khan (1983)

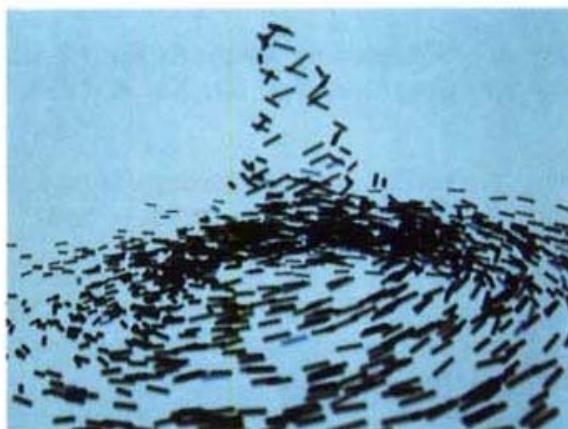
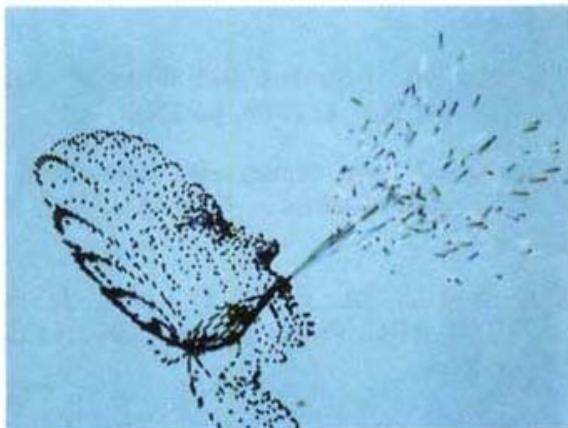
<http://www.siggraph.org/education/materials/HyperGraph/animation/movies/genesisp.mpg>

# PARTICLE SYSTEMS



Karl Sims: Particle Dreams (Siggraph 1988 ) Karl Sims: <http://www.karlsims.com/papers/ParticlesSiggraph90.pdf>

# PARTICLE SYSTEMS



Karl Sims - Particle Dreams (Siggraph 1988 ) Karl Sims:

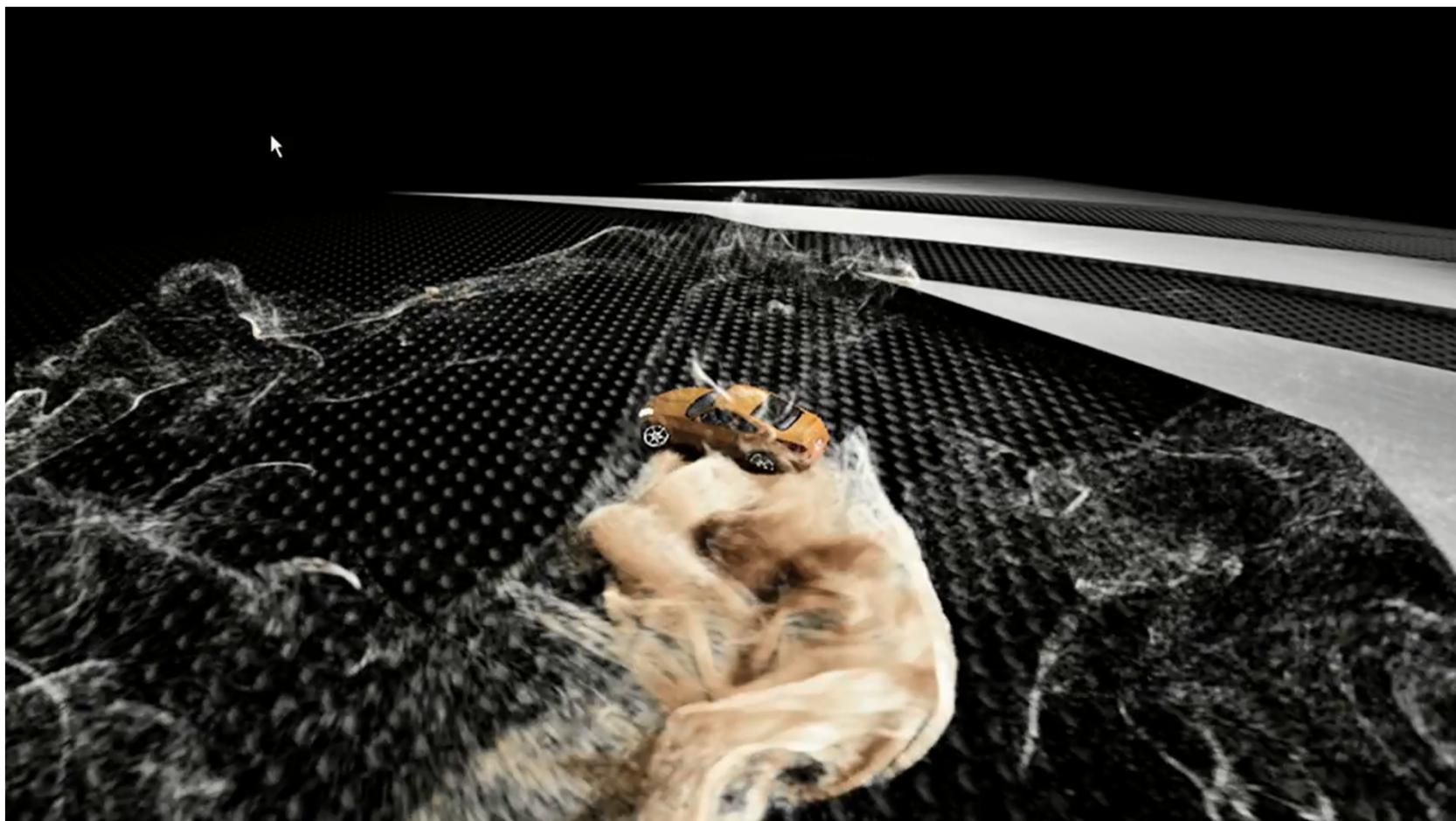
<http://www.karlsims.com/papers/ParticlesSiggraph90.pdf>

# PARTICLE SYSTEMS



The emergent behaviour of particles systems can also be used to simulate some very complex high level phenomena such as cloth, hair and fluids.

# MORE COMPLEX PARTICLES



# NEWTONIAN PARTICLE

Particles don't have shape, orientation, structure, but motions are still dependent on Mass and Forces.

Motion represented by Newton's Second Law

$$\mathbf{f} = m\mathbf{a}$$

- which can be expressed as  $\ddot{\mathbf{x}} = \mathbf{f}(\mathbf{x}, \dot{\mathbf{x}}, t) / m$

For implementation, introduce an extra variable  $\mathbf{v}$  to create a pair of coupled first order equations

$$\dot{\mathbf{x}} = \mathbf{v}$$

$$\dot{\mathbf{v}} = \mathbf{f} / m$$

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# PHASE SPACE

Position and velocity can be grouped together into a 6-d vector called the phase of the particle

$$\begin{bmatrix} \mathbf{x} \\ \mathbf{v} \end{bmatrix} \quad \left\{ x_x, x_y, x_z, v_x, v_y, v_z \right\}$$

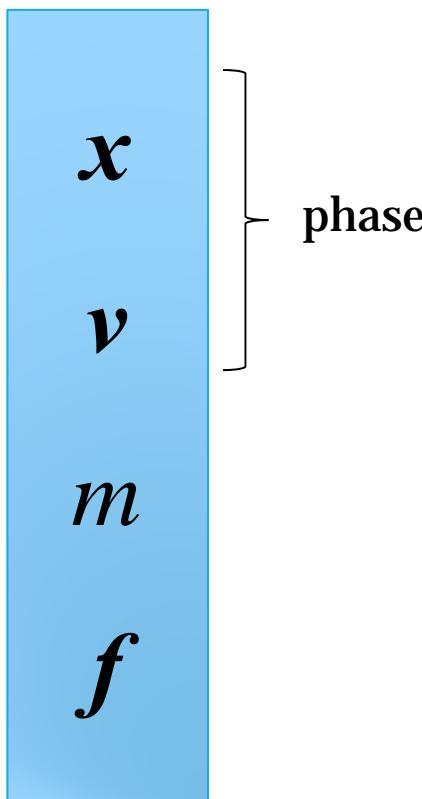
The phase space equation of motion:

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

Integrate this to simulate the movement of the particle

$$\left\{ \dot{x}_x, \dot{x}_y, \dot{x}_z, \dot{v}_x, \dot{v}_y, \dot{v}_z \right\} = \left\{ v_x, v_y, v_z, f_x/m, f_y/m, f_z/m \right\}$$

# PARTICLE STATE REPRESENTATION



```
struct Particle
{
    Vector3 position;
    Vector3 velocity;
    float mass;

    Vector3 force; //force accumulator
};
```

# EXAMPLE

For a force take Gravity

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

Thus equations of motion are

$$\dot{\mathbf{x}} = \mathbf{v}$$

$$\dot{\mathbf{v}} = \frac{\mathbf{f}_{grav}}{m} = -\mathbf{G}$$

Euler Integration:

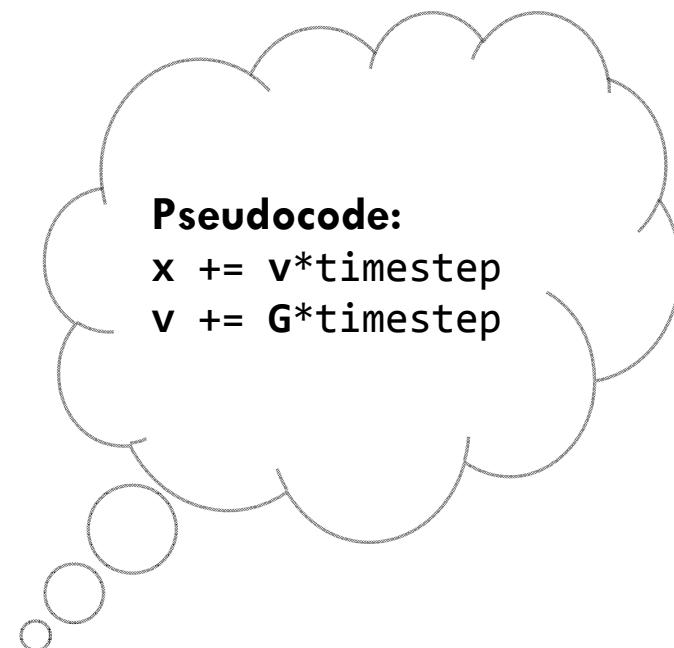
$$\Delta\mathbf{x} = \mathbf{v}\Delta t$$



$$\mathbf{x}_i = \mathbf{x}_{i-1} + \mathbf{v}_i \Delta t$$

$$\Delta\mathbf{v} = -\mathbf{G}\Delta t$$

$$\mathbf{v}_i = \mathbf{v}_{i-1} - \mathbf{G}\Delta t$$



# ADDING FORCES

**Forces on a particle can depend on**

- Constant: gravity
- Position/time: force fields
- Velocity: drag, friction
- Links with other particles (n-ary): spring forces

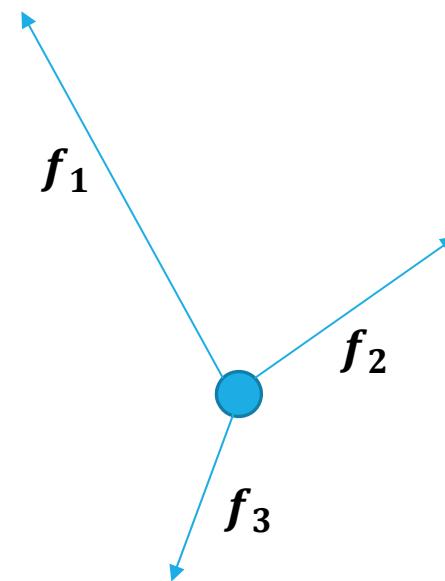
**N.B. multiple forces may act on a single particle at any one time**

**But thankfully this is easy to deal with for particles...**

# NET FORCE

If multiple forces act on a particle (or through centre of mass of a rigid body), it behaves as if acted on by a single net force

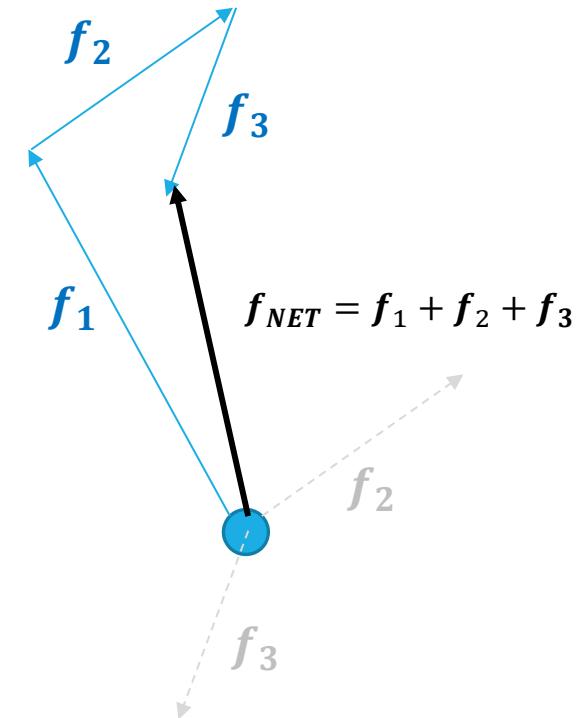
Net force = vector sum of all forces through the centre of mass



# NET FORCE

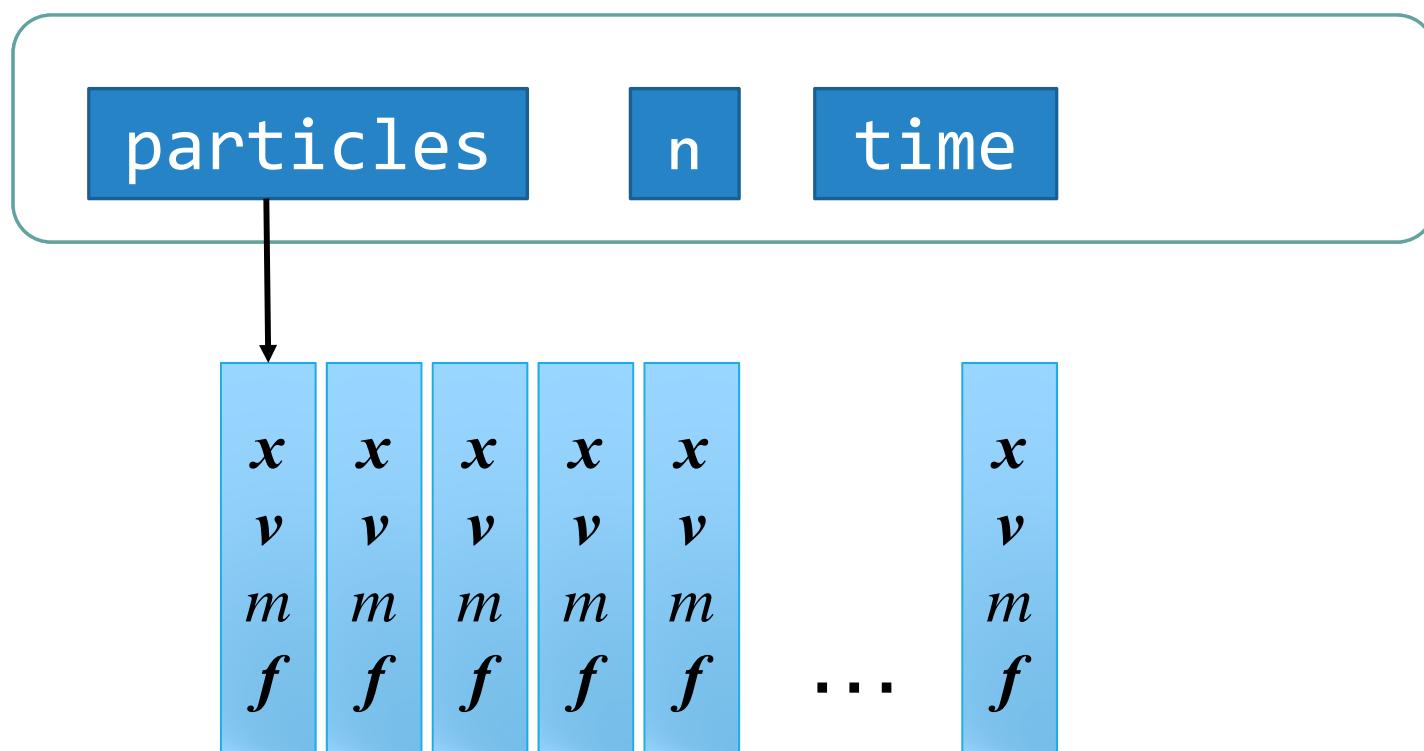
If multiple forces act on a particle (or through centre of mass of a rigid body), it behaves as if acted on by a single net force

Net force = vector sum of all forces through the centre of mass



# PARTICLE SYSTEM

List of  $n$  Particles and their states at the current timestep



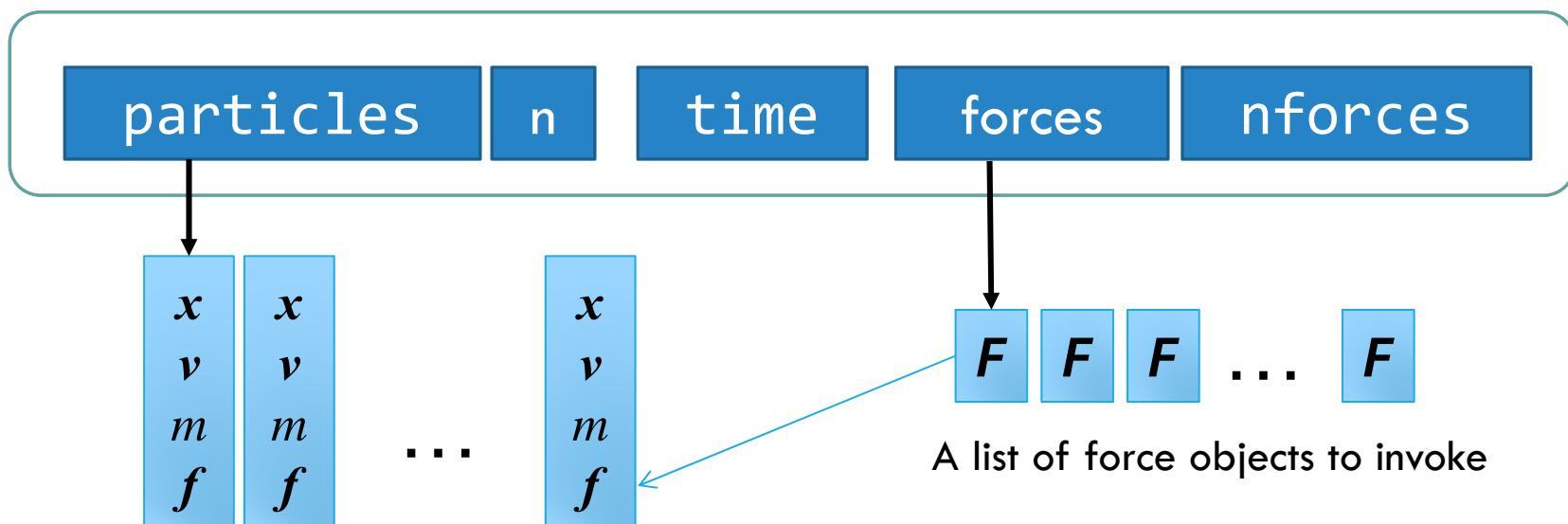
# FORCE OBJECTS

## List of force objects

- Each points to particles they influence

## Global force calculation

- Loop through force list invoking force objects
- Add in their own influences to particles force accumulator



# PARTICLE SYSTEM SIMULATION

## Particle Update

1. Clear Force from particle  $\mathbf{f} = 0$
2. Accumulate Forces

Add forces to particle (loop through force list and invoke each)

```
pcl[i].f += f[j]
```

3. Apply Forces

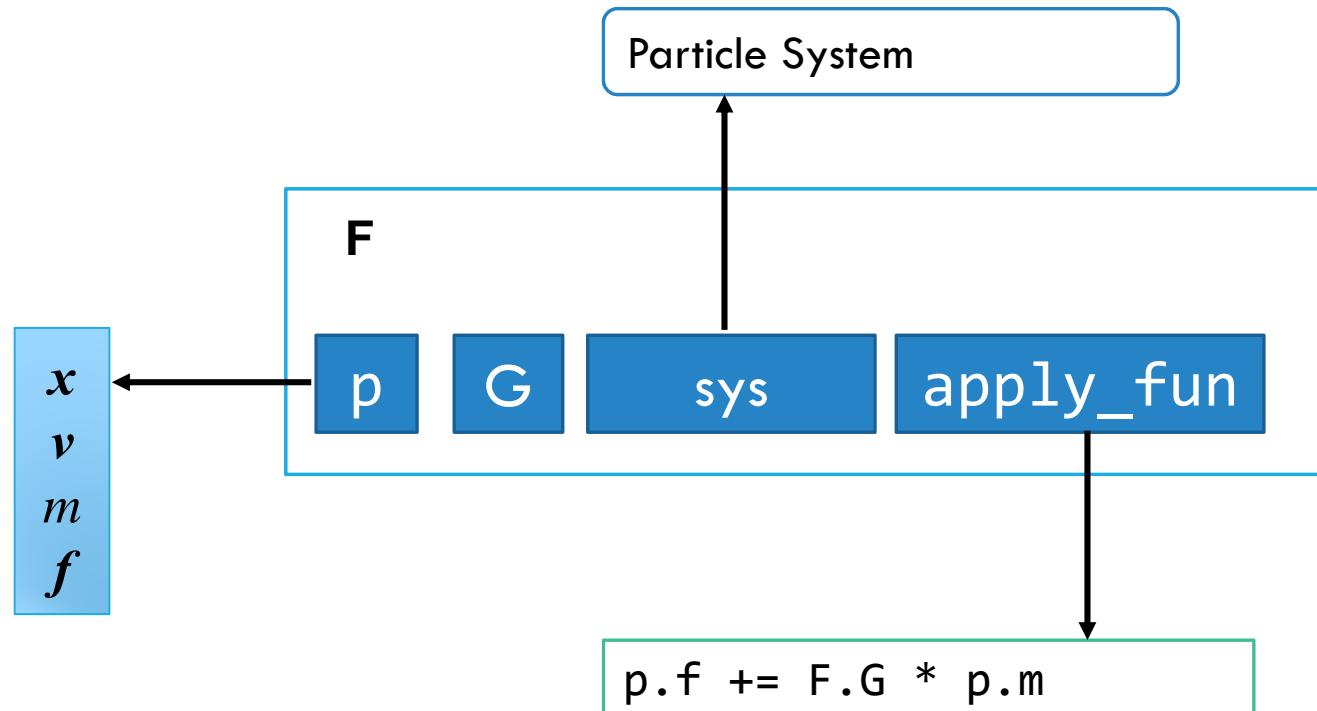
Solve for the phase of the particle  $\{\mathbf{x}, \mathbf{v}\}$ :

Integrate  $\dot{\mathbf{v}} = \frac{\mathbf{f}}{m}$  ,  $\dot{\mathbf{x}} = \mathbf{v}$

4. Do collision handling

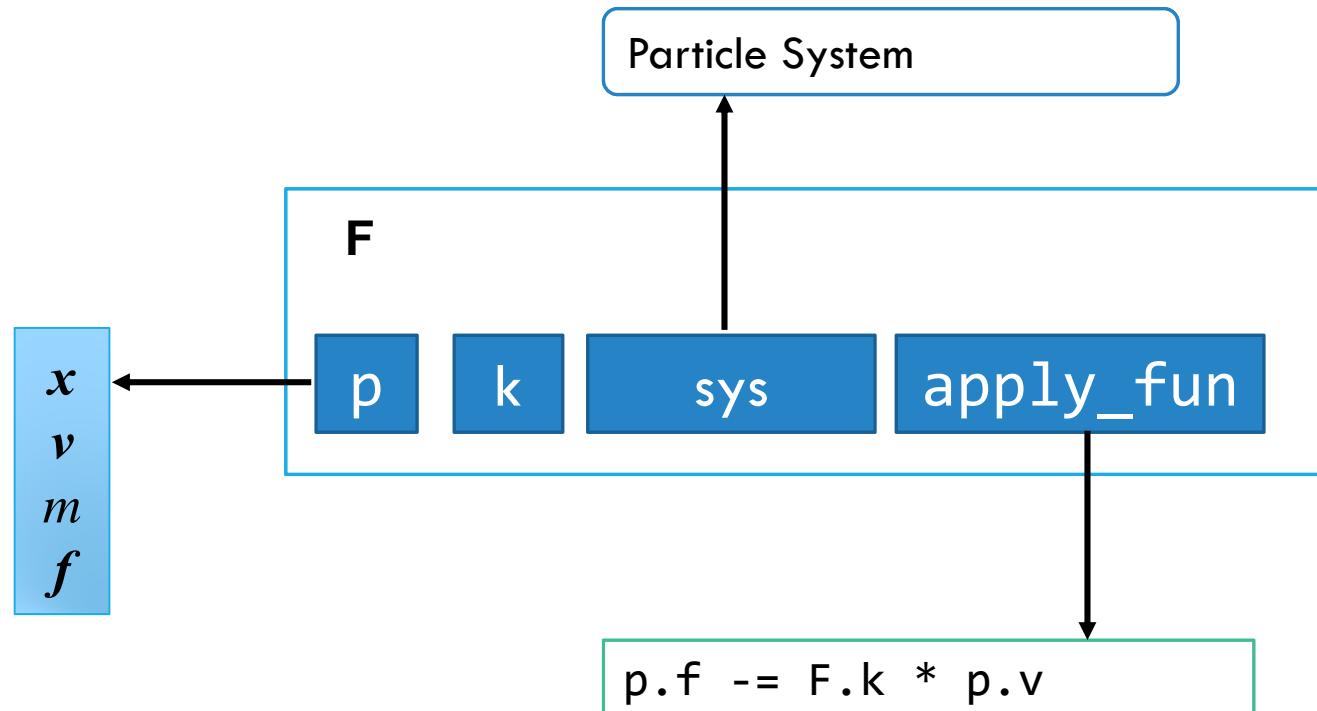
# FORCE EXAMPLE: GRAVITY

Force Law:  $f_{grav} = mG$



# FORCE EXAMPLE: VISCOUS DRAG

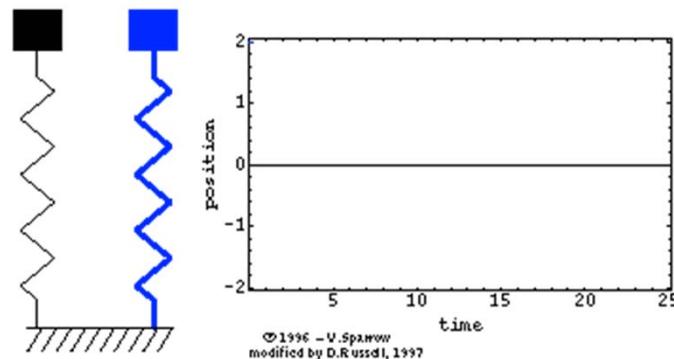
Force Law:  $f_{drag} = -k_{drag}v$



# FORCE EXAMPLE: SPRING

**Basic Spring (Hooke's Law):**

- Restoring force
- $f_{spring} = -k_{spring}(\Delta x - r)$



**Damped Spring**

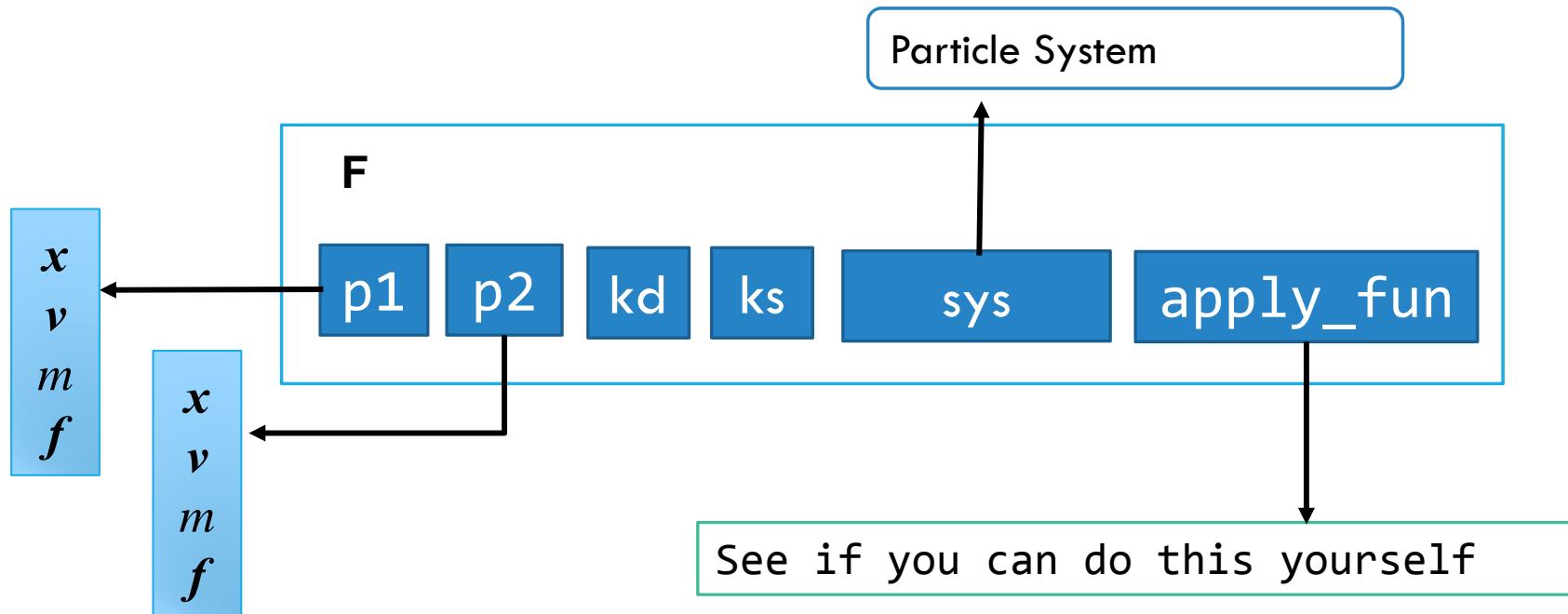
- Damping force (for now, let's just use viscous drag - effectively damps oscillation and other motions)
- $f_{drag} = -k_{drag}v$

# FORCE EXAMPLE: DAMPED SPRING

Force Law:

$$f_1 = - \left[ k_s (|\Delta x| - r) + k_d \left( \frac{\Delta v - \Delta x}{|\Delta x|} \right) \right] \frac{\Delta x}{|\Delta x|}$$

$$f_2 = -f_1$$



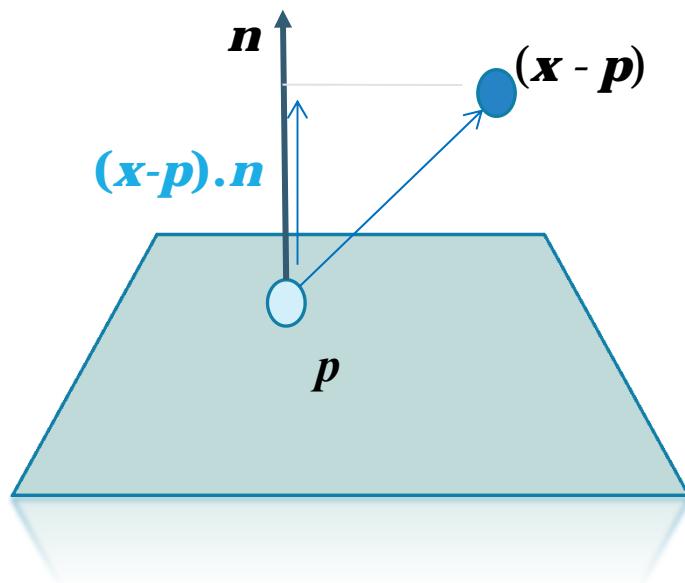


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# COLLISION HANDLING

# PARTICLE POSITION



Given normal  $\mathbf{n}$  and any point  $\mathbf{p}$  on plane

Particle is on the “inside” of the plane  
(i.e. intersecting)

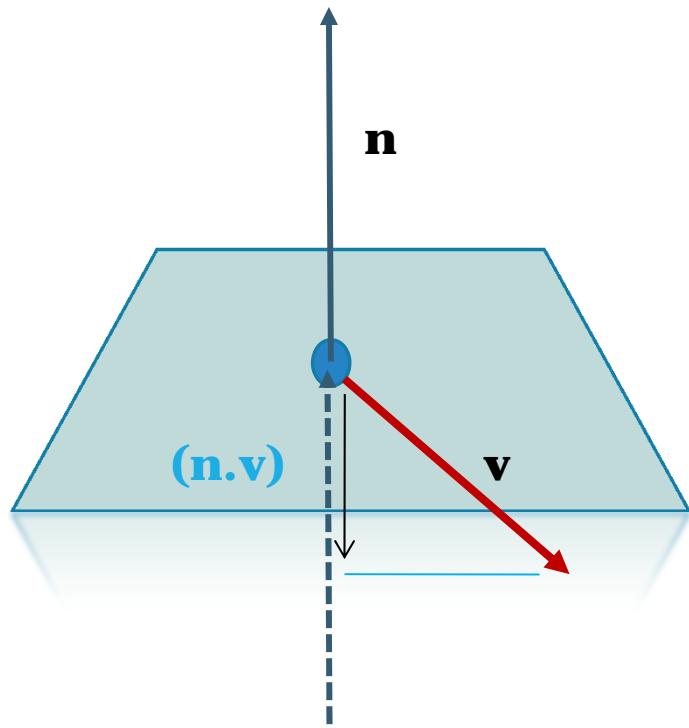
IF  $(\mathbf{x} - \mathbf{p}) \cdot \mathbf{n} < 0$

In practice we take a threshold  
distance  $e$  i.e. Particle is intersecting

...

IF  $(\mathbf{x} - \mathbf{p}) \cdot \mathbf{n} < \varepsilon$

# PARTICLE VELOCITY

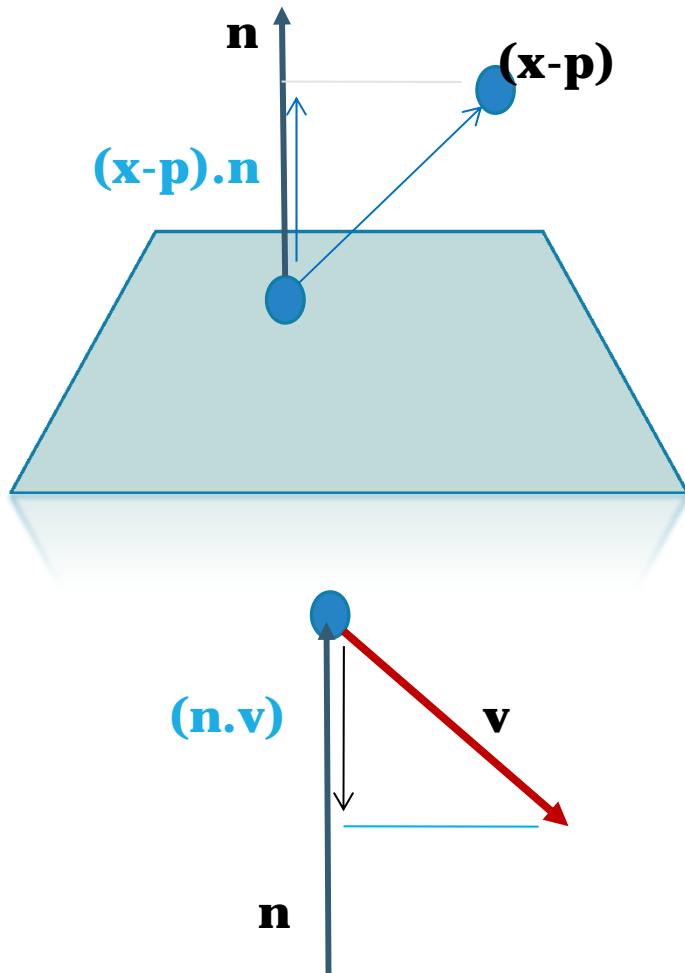


If intersecting we should also check whether the particle is moving further into the plane

- If  $(\mathbf{n} \cdot \mathbf{v} < \varepsilon)$

Particle is heading deeper  
into plane

# PARTICLE - PLANE COLLISION DETECTION



Given normal  $n$  and any point  $p$  on plane

- if  $( (x-p).n < \epsilon \quad \&\& \quad (n.v < \epsilon) )$
- i.e. penetrating and going deeper
  - Cancel force into plane
  - Repulse object for physically based “bounce” response

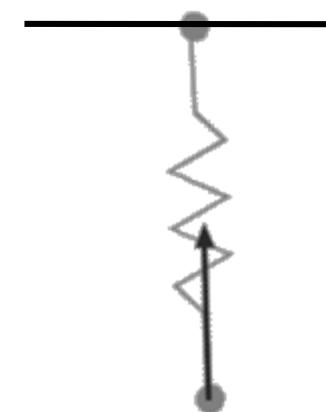
# COLLISION RESPONSE: FORCES

Non-interpenetration: Some force opposing the penetrating force should be applied in the opposite direction to cancel out movement into the plane

$$\mathbf{f}_{nonpen} = -(\mathbf{f} \cdot \mathbf{n})\mathbf{n}$$

E.g. We could apply a spring force proportional to the interpenetration: (usually called a *penalty method*)

$$\mathbf{f}_{nonpen} = -k_{pen} \mathbf{n} \Delta q$$



# COLLISION RESPONSE: IMPULSES

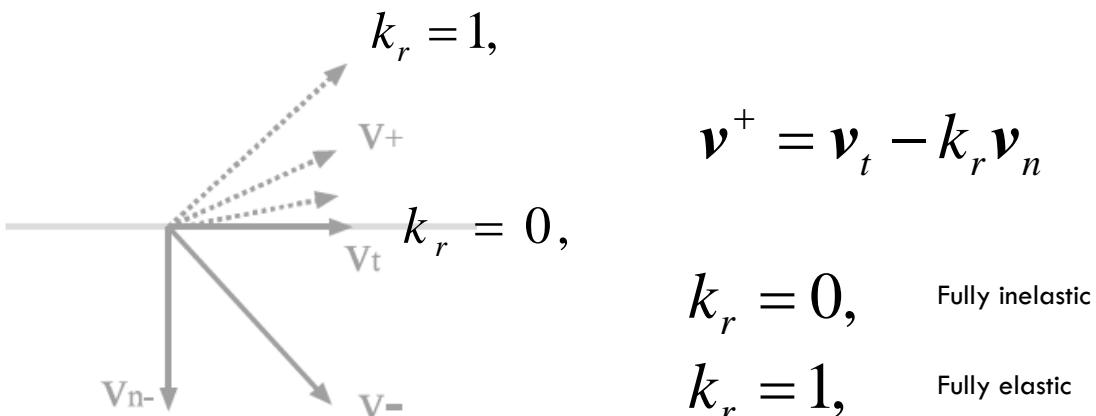
N.B. THIS IS AN ALTERNATIVE TO THE PREVIOUS SLIDE

Commonly used option is to apply an instantaneous change of velocity: impulse model

For collision response, velocity in the tangential direction is preserved and velocity in normal direction is scaled by  $-k_r$ , the coefficient of restitution

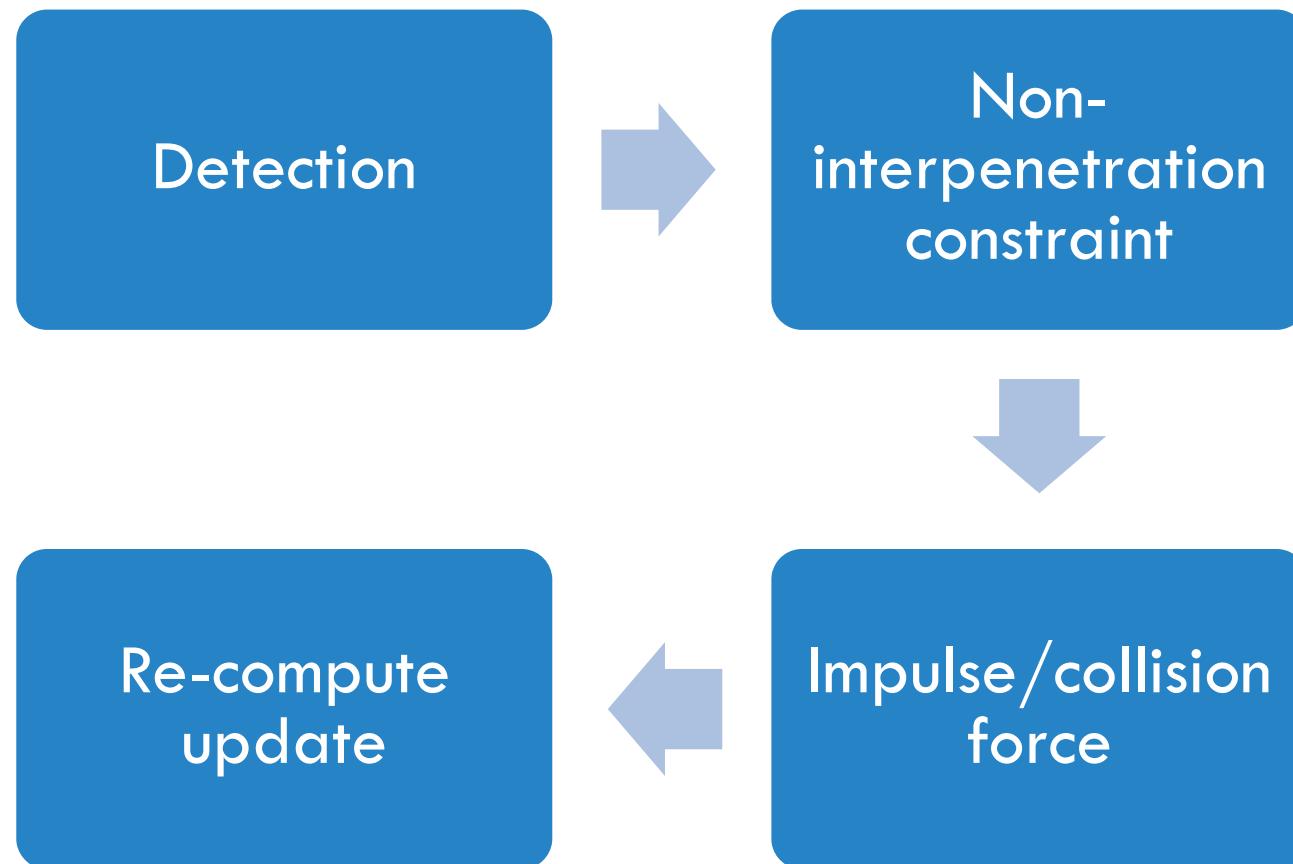
$$\begin{aligned} \mathbf{v}_t^+ &= \mathbf{v}_t^- \\ \mathbf{v}_n^+ &= k_r \mathbf{v}_n^- \end{aligned}$$

v+: post collision velocity  
 v-: initial velocity  
 t: tangential to collision plane  
 n: perpendicular to collision plane



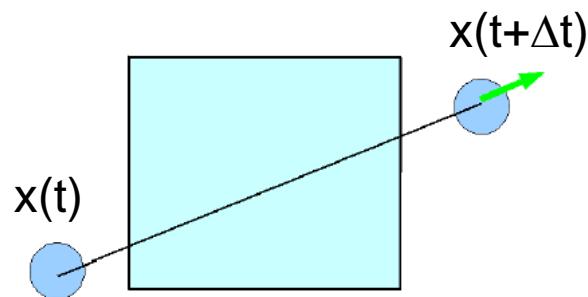
N.B. Impulse or collision force is only created when the object is tending to penetrate further (otherwise you'll add energy into the system)

# COLLISION HANDLING



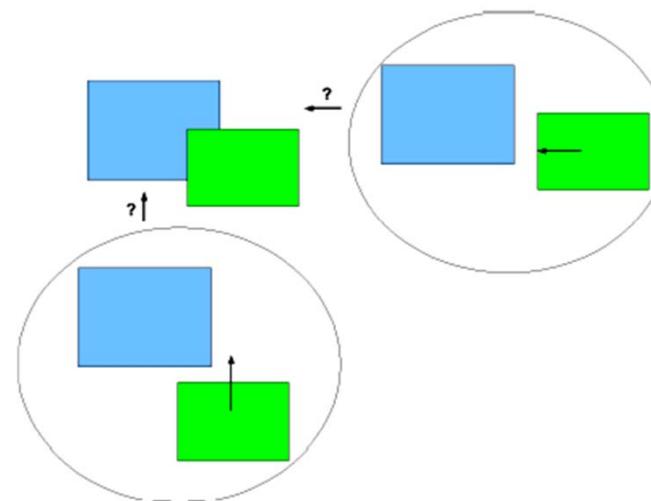
## ASIDE: DISCRETE TIME LIMITATIONS

Tunnelling: bullet through paper effect



Undetected traversal through thin objects or high velocities

Penetration-depth ambiguity: what just happened?



# BACKTRACKING

N.B. This example is for illustrative purposes and is not a hard and fast solution.

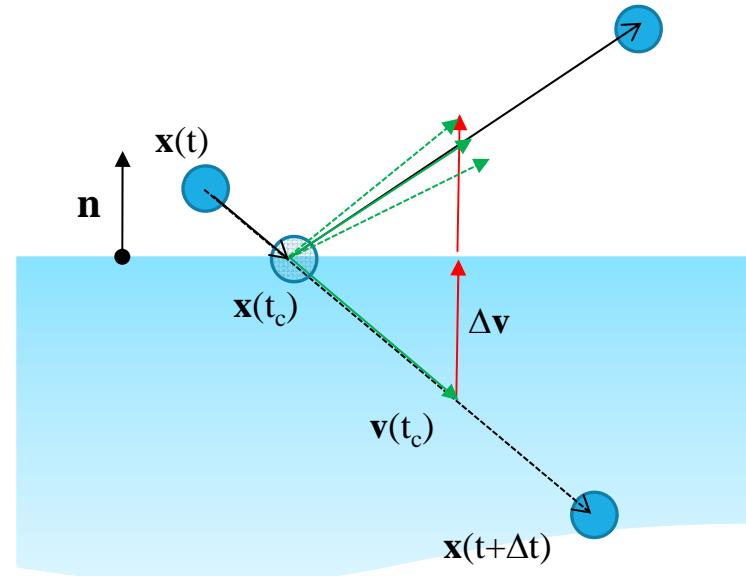
**if**  $(x-p).n < 0$

- Backtrack to collision time  $t_c$ 
  - Assume Linear trajectory within timestep
  - Compute change in velocity for elastic collision

$$\Delta v = -(v \cdot n)n$$

- Apply co-efficient of restitution
 
$$v' = (1 + k_r) \Delta v$$
- Continue simulation

**Problem:** multiple backtracks may become necessary



# POST-PROCESSING

A.k.a. Projection method

Similar but do not backtrack

$\text{if } (\mathbf{x} - \mathbf{p}) \cdot \mathbf{n} < 0$

- compute positional increment to project the particle back to surface

$$\Delta\mathbf{x} = -((\mathbf{x} - \mathbf{p}) \cdot \mathbf{n})\mathbf{n}$$

- Apply correction to position

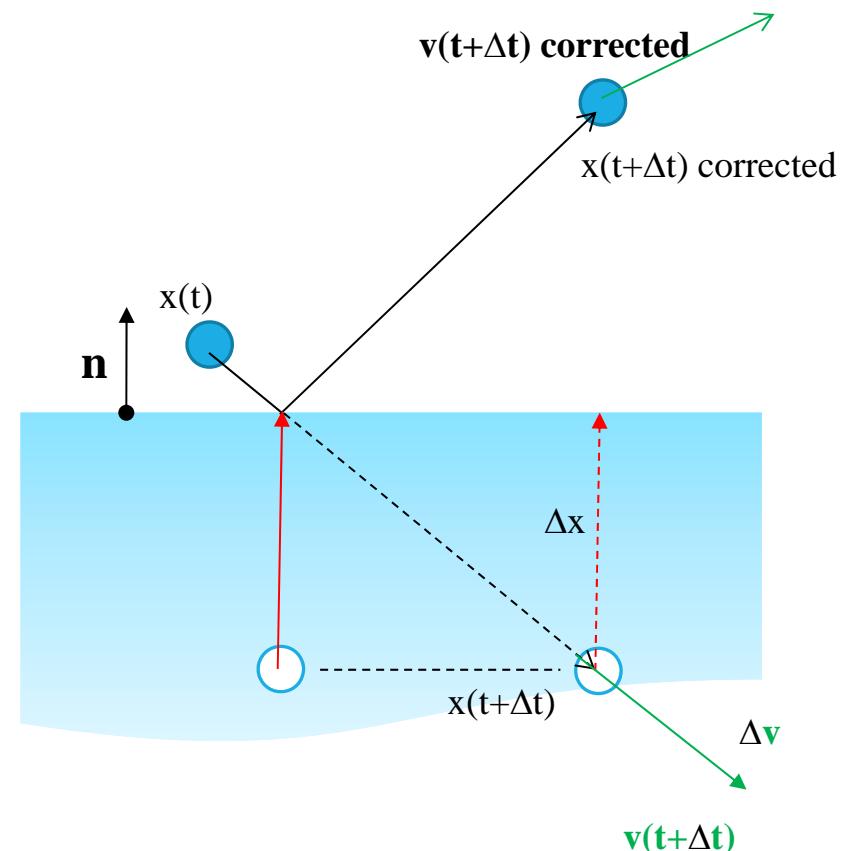
$$\mathbf{x} += \Delta\mathbf{x}$$

Or even (if big  $\Delta t$ ):  $\mathbf{x} += (1 + k_r)\Delta\mathbf{x}$

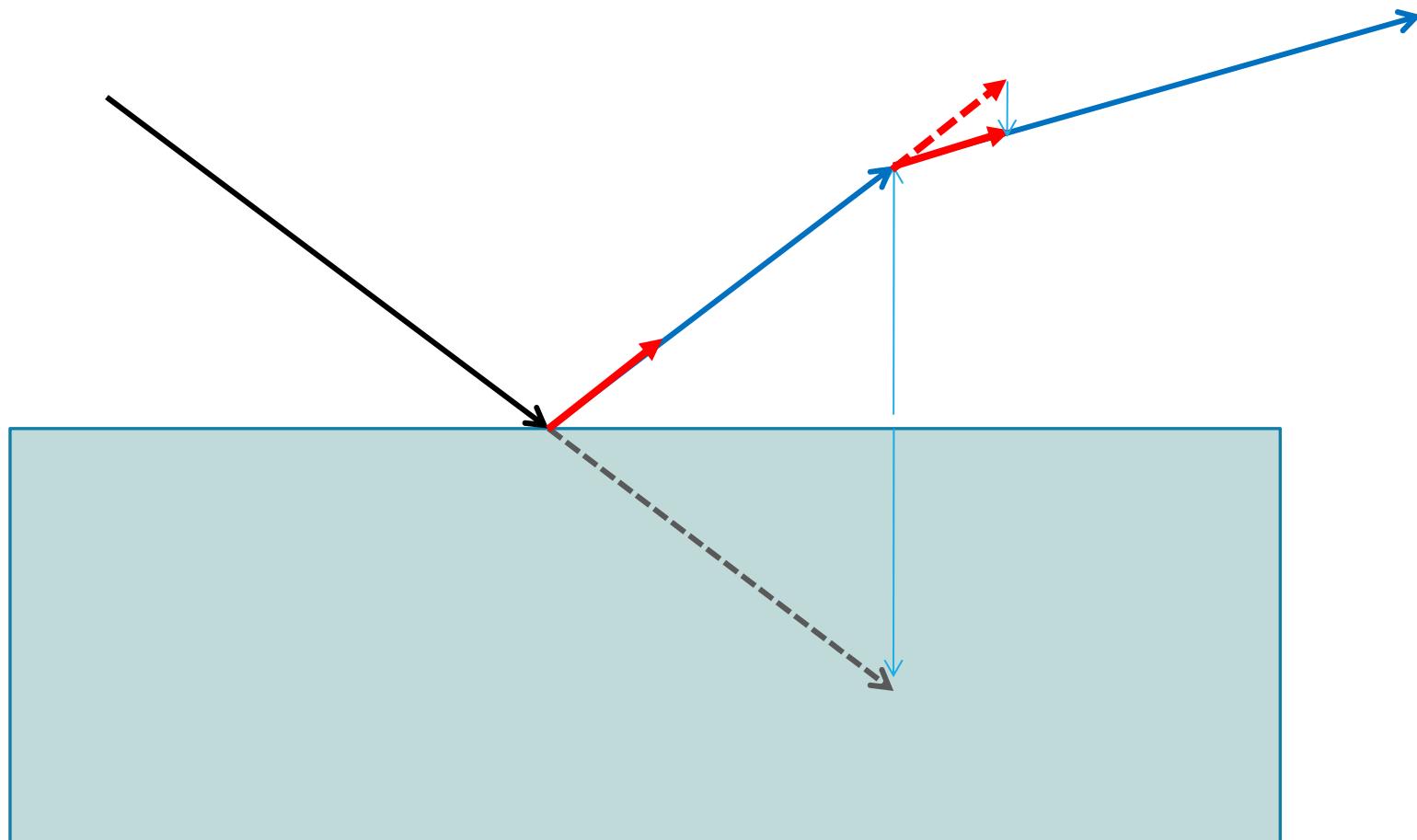
- $\Delta\mathbf{v}$  calculated as before

Advantage: all collisions handled at the same time

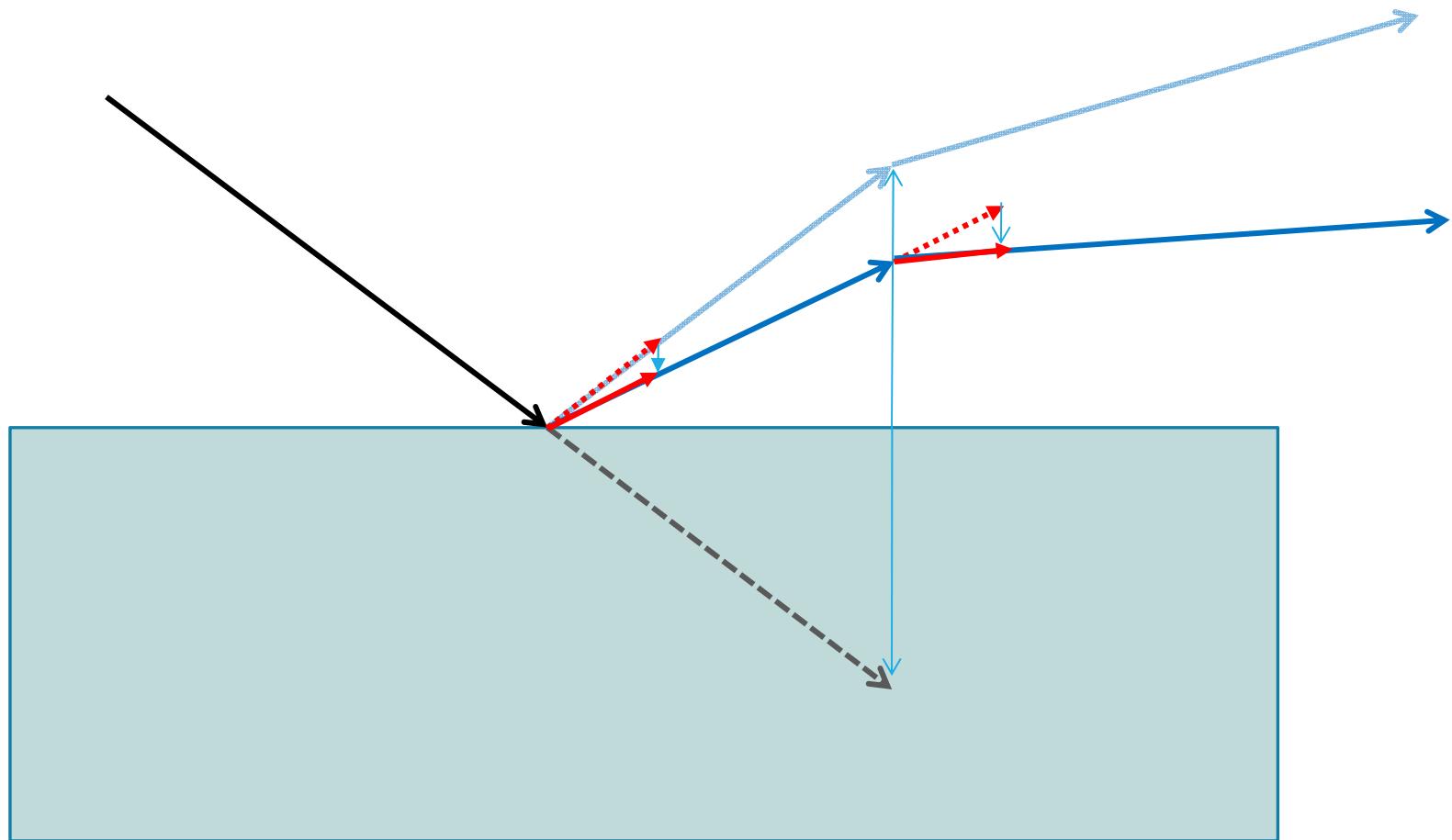
N.B. This example is for illustrative purposes and is not a hard and fast solution.



# POST-PROCESSING



# BACK-TRACKING



# BACKTRACKING VS. POSTPROCESSING

## Backtracking

- More accurate solution
- Expensive
  - Particularly with more complex objects + simultaneous interactions
  - Potential for infinite loop?

## Post-processing

- Suitable for some simple interactions
- May not be guaranteed a solution

## Other techniques:

- Backtrack using Time-step bisection
- Simply move particle to previous time step
- Gradually apply projection over several iterations
- Use penalty method (spring)



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# INTEGRATION

# EXAMPLE

**An object is moving at 3 meters per second**

- After 1 second how much has it moved : 3 meters
- After 2 second ... 6 meters
- After 2.5 seconds ... 7.5 meters

**But what if the speed is also changing?**

# EXAMPLE

We could say:

- Position = Position + Velocity \* timestep;
- Velocity = Velocity + Acceleration \* timestep;

Time	Acceleration	Position	Velocity
0	2	0	0
1	2	0	2
2	2	2	4
3	2	6	6
4	2	12	8

**NOTE this is an approximation**

- Dependent on timestep

# EXAMPLE 2 (DIFFERENT TIMESTEP)

$\Delta t = 1$

Time	Acceleration	Position	Velocity
0	2	0	0
1	2	0	2
2	2	2	4
3	2	6	6
4	2	12	8

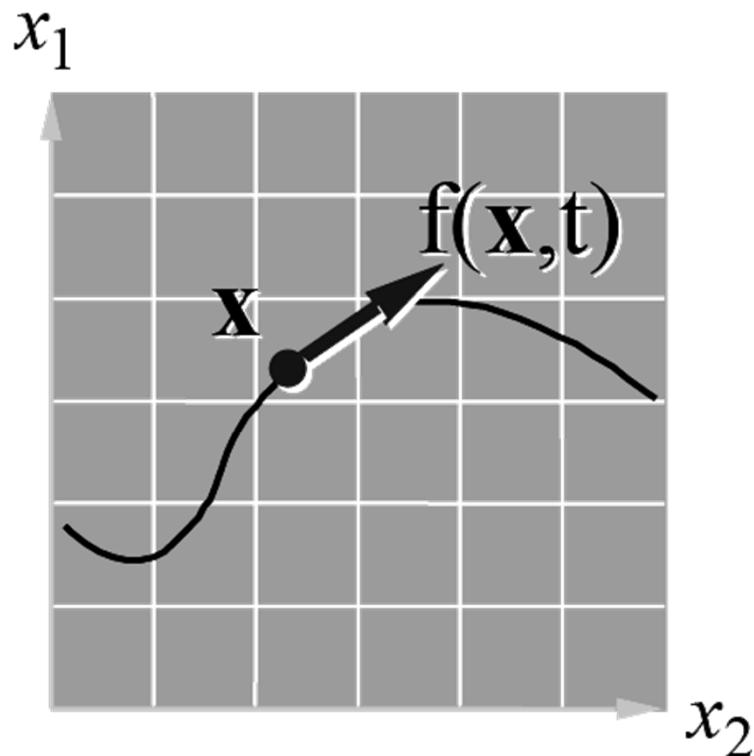
$\Delta t = 0.5$

Time	Acceleration	Position	Velocity
0	2	0	0
0.5	2	0	1
1	2	1	2
1.5	2	1	3
2	2	2.5	4
2.5	2	4.5	5
3	2	7	6
3.5	2	10	7
4	2	13.5	8
4.5	2	17.5	9

Position = Position + Velocity \* timestep;

Velocity = Velocity + Acceleration \* timestep;

# A CANONICAL DIFFERENTIAL EQUATION

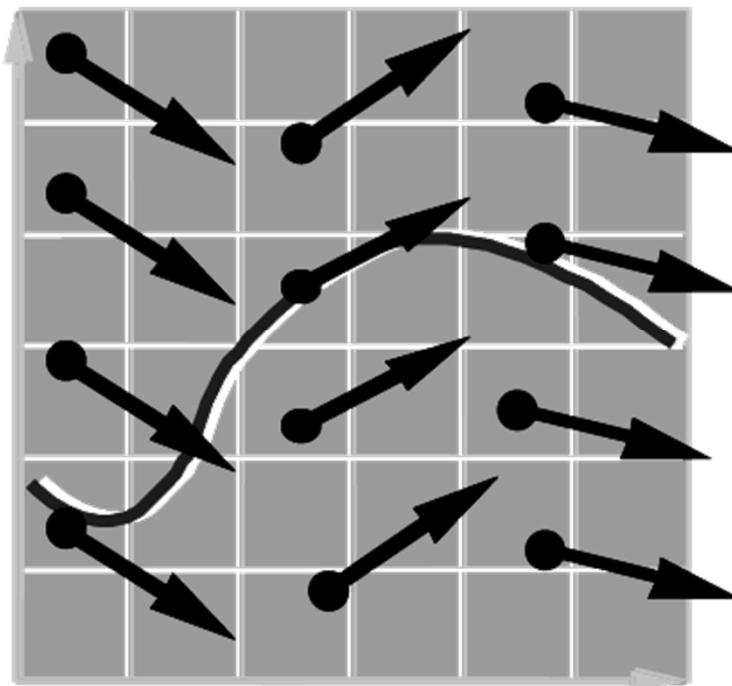


$$\dot{\mathbf{x}} = f(\mathbf{x}, t)$$

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

N.B.  $f$  doesn't mean force here

# VECTOR FIELD



**The differential equation**

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

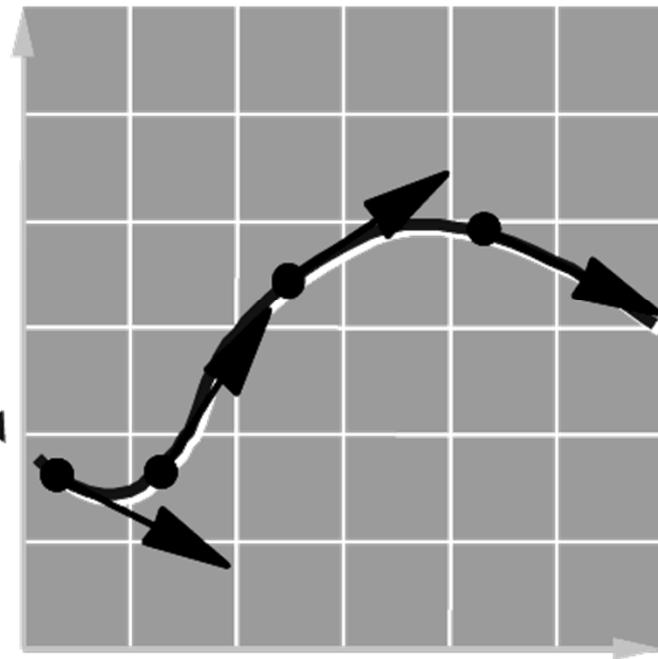
**defines a vector field over x.**

# INTEGRAL CURVE

**Start Here**

N.B. An Initial Value Problem

**Pick any starting point,  
and follow the vectors.**

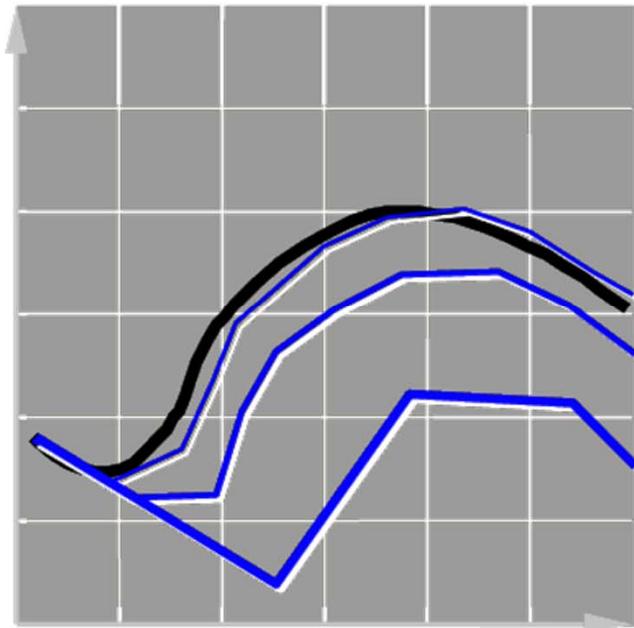


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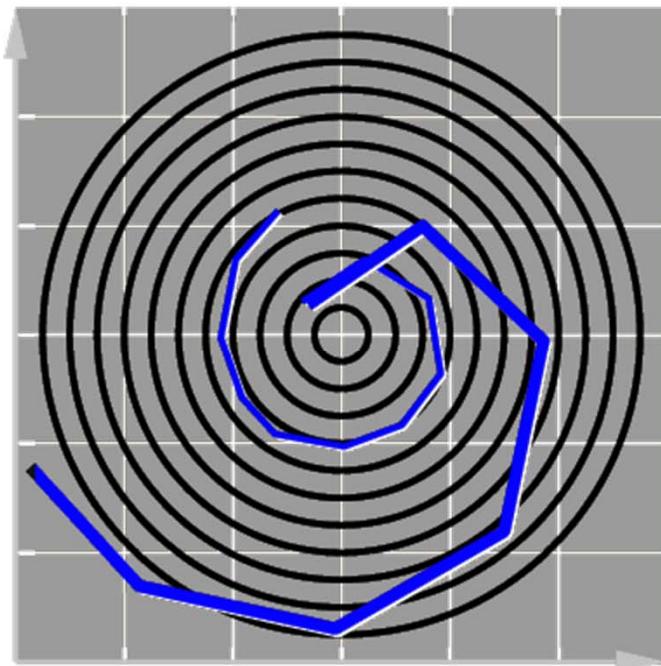
# INTEGRATION: EULER'S METHOD

$$x(t + \Delta t) = x(t) + f(x, t) \Delta t$$



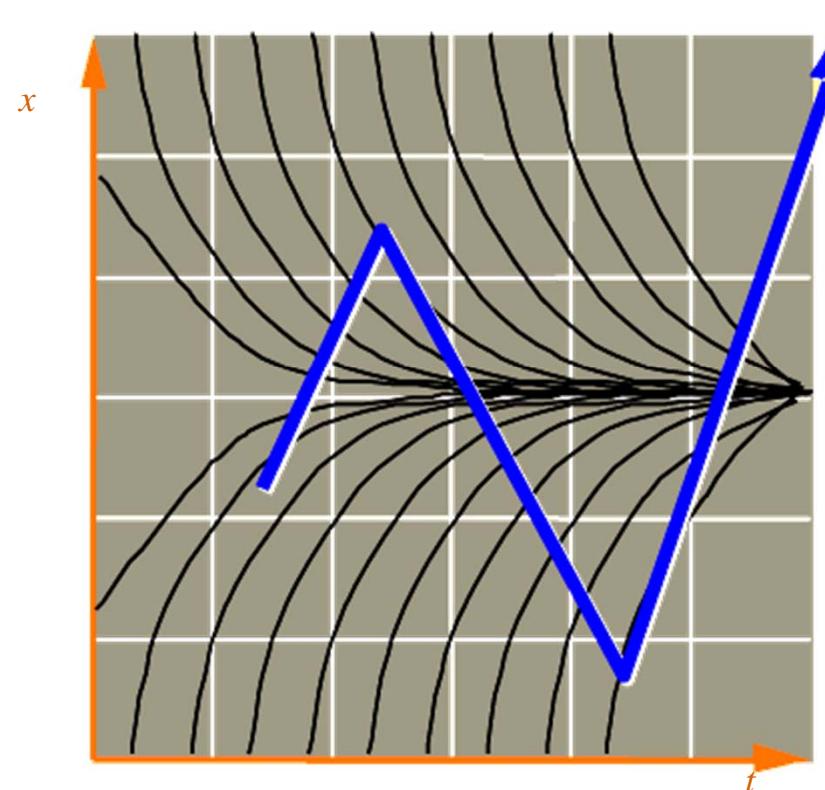
- **Simplest numerical solution method**
- **Discrete time steps**
- **Bigger steps, bigger errors.**

# EULER PROBLEMS: INACCURACY



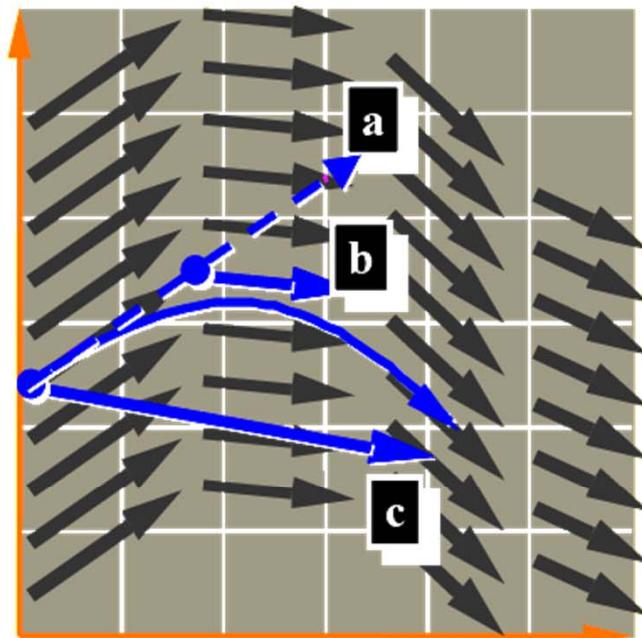
**Error turns  $x(t)$  from a circle into the spiral of your choice.**

# EULER PROBLEMS: INSTABILITY



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# THE MIDPOINT METHOD



a. Compute an Euler step

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

b. Evaluate  $f$  at the midpoint

$$f_{mid} = f\left(\frac{\mathbf{x} + \Delta \mathbf{x}}{2}, \frac{t + \Delta t}{2}\right)$$

c. Take a step using the midpoint value

$$\mathbf{x}(t + \Delta t) = \mathbf{x}(t) + f_{mid} \Delta t$$

---

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# EULER

A.k.a. Forward Euler

Easy to code (lazy)

Quick for each iteration

Unfortunately

- Unstable except for very small time steps
- Many more steps required

$$\mathbf{f} = \text{calculateForces}(\mathbf{x}, \mathbf{v}, t_0)$$

$$\mathbf{v} = \mathbf{v}_0 + \frac{\mathbf{f}}{m} \Delta t$$

$$\mathbf{x} = \mathbf{x}_0 + \mathbf{v} \Delta t$$

# MID-POINT METHOD

Two state updates per iteration

However a lot more stable than Euler for large time steps

- Energy conservative if acceleration constant [1]

In practice more efficient as we have to do less time steps

$$\mathbf{f}_1 = \text{calculateForces}(\mathbf{x}, \mathbf{v}, t_0)$$

$$\mathbf{v}_{midpt} = \mathbf{v}_0 + \frac{\mathbf{f}_1}{m} \frac{\Delta t}{2}$$

$$\mathbf{x}_{midpt} = \mathbf{x}_0 + \mathbf{v} \frac{\Delta t}{2}$$

$$\mathbf{f} = \text{calculateForces} (\mathbf{x}_{midpt}, \mathbf{v}_{midpt}, t_0 + \frac{\Delta t}{2})$$

$$\mathbf{v} = \mathbf{v}_0 + \frac{\mathbf{f}}{m} \Delta t$$

$$\mathbf{x} = \mathbf{x}_0 + \mathbf{v}_{midpt} \Delta t$$

[1] Integration in Blender: [http://www.blender.org/development/releases-logs/blender-246/particles/newtonian-physics/](http://www.blender.org/development/releases/logs/blender-246/particles/newtonian-physics/)

# RUNGE-KUTTA 4 (RK4)

Fourth order method. Slower than midpoint method

More stable:

- Energy conservative even with non-constant acceleration

$$\begin{aligned}k_1 &= h f(x_n, y_n) \\k_2 &= h f(x_n + h/2, y_n + k_1/2) \\k_3 &= h f(x_n + h/2, y_n + k_2/2) \\k_4 &= h f(x_n + h, y_n + k_3) \\y_{n+1} &= y_n + \frac{k_1}{6} + \frac{k_2}{3} + \frac{k_3}{3} + \frac{k_4}{6}\end{aligned}$$

$h$  = time step

# INTEGRATION

See Physically Based Modeling Siggraph Course Notes 2001 by Baraff, Witkin, Kass

- <http://www.pixar.com/companyinfo/research/pbm2001/>
- See "Differential Equation Basics" Lecture 2 by Andrew Witkin

Other techniques: backward Euler, semi-implicit Euler, Verlet integration, Heun's method, Leapfrog integration

We'll come back to this later

# REQUIRED READING

**Must Read:** Baraff, Witkin and Kass "Physically based Animation Course notes C. Particle Systems" – Siggraph 2001

- <http://www.pixar.com/companyinfo/research/pbm2001/>

**Also have a brief look at:** "Particle Simulation and Rendering Using Data Parallel Computation" - Karl Sims, Siggraph 1990

- <http://www.karlsims.com/papers/ParticlesSiggraph90.pdf>
- Youtube Video: <http://www.youtube.com/watch?v=hwDvna0q3rA>

# ADDITIONAL REFERENCES

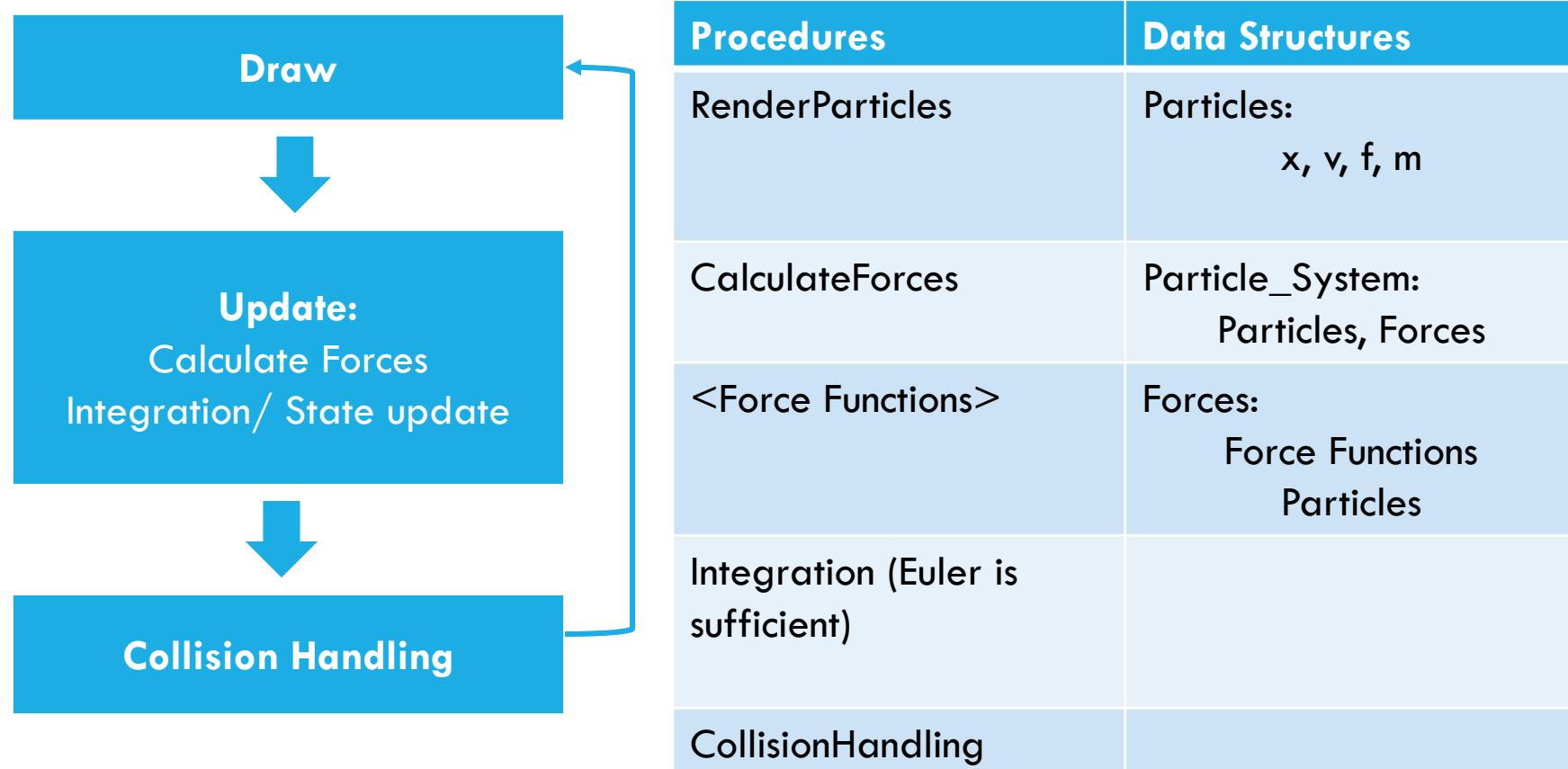
Mueller, James, Theurey, Stam “Real-time Physics” – Siggraph 2008

- <http://www.matthiasmueller.info/realtimephysics/index.html>



- Ian Millington – “Game Physics Engine Development”
- Kenny Erleben - “Physics based animation”
- David H.Eberley - “Game Physics Engine Development”

# PHYSICS PIPELINE FOR PARTICLE SYSTEM



# INTEGRATORS

[HTTP://WWW.BLENDER.ORG/DEVELOPMENT/RELEASE-LOGS/BLENDER-246/PARTICLES/NEWTONIAN-PHYSICS/](http://www.blender.org/development/release-logs/blender-246/particles/Newtonian-Physics/)

Integrators are a set of mathematical methods available to calculate the movement of particles. The following guidelines will help to choose a proper integrator, according to the behaviour aimed at by the animator.

- **Euler:** Also known as *Forward Euler*. Simplest integrator. Very fast but also very unstable. If no dampening is used, particles get more and more energy over time. For example, bouncing particles will bounce higher and higher each time. Should not be confused with Backward Euler (not implemented) which has the opposite feature, energies decrease over time, even with no dampening. Use this integrator for short simulations or simulations with a lot of dampening where speedy calculations is more important than accuracy.
- **Midpoint:** Also known as *2nd order Runge-Kutta*. Slower than **Euler** but much more stable. If the acceleration is constant (no drag for example), it is energy conservative (also known as symplectic). It should be noted that in example of the bouncing particles, the particles might bounce higher than they started once in a while, but this is not a trend. This integrator is a generally good integrator for use in most **cases**.
- **RK4:** Short for *4th order Runge-Kutta*. Similar to **Midpoint** but slower and in most cases more accurate. It is energy conservative even if the acceleration is not constant. Only needed in complex simulations where **Midpoint** is found not to be accurate enough.



# ASSIGNMENT 1: PARTICLE SYSTEM

Demo due: Monday 25th January, 2016 | Cumulative Report and Video deadline: Sunday 28rd February 2016 @ 23:59  
20% penalty per day late

# ASSIGNMENT 1: PARTICLE SYSTEMS

Read Particle Systems notes by Baraff et al (see references)

Implement a particle system (roughly based on Siggraph 2001 course notes by Baraff, Witkin and Kass)

**Compulsory requirements:**

1. Animate at-least 1000 particles
2. Include at least two forces
3. Implement Particle-Plane Collision Handling
4. Implement evolution\* / recycling\*\* OR ensure particles stay in the scene
5. For rendering, you should use **OpenGL**, DirectX or XNA

**Optional Requirements:**

- Implement a meaningful demo that recreates real-world or aesthetic effect(s)
  - e.g. implement effects based on Karl Sims paper
- Implement an alternative to forward-Euler integration

\* Evolution: particles appearance parameters other than physics state changes over time

\*\* Recycling: particles “die” and are destroyed and regenerated

# MARKING AND DELIVERABLES

**This assignment is worth 10% of the module**

- Compulsory Requirements (Quantitative marking): ~50%
- Style / complexity / optional components (Qualitative marking): ~50%

**You must do a 5 minute demo in the lab next week (at your own machine)**

- Demonstrate the features of your implementation
- Talk about compulsory requirements / optional features implemented
- Mention any underlying technical improvements, personal design decisions beyond the basic spec provided in notes

**You must also submit the following in the cumulative submission**

- A report (max 1 page): brief description of project, in particular anything not within the compulsory components.
- A link to a youtube video (make this un-listed if you wish). Can be combined with later labs.

# REQUIRED READING

**Must Read:** Baraff, Witkin and Kass "Physically based Animation Course notes C. Particle Systems" – Siggraph 2001

- <http://www.pixar.com/companyinfo/research/pbm2001/>

**Also have a brief look at:** "Particle Simulation and Rendering Using Data Parallel Computation" - Karl Sims, Siggraph 1990

- <http://www.karlsims.com/papers/ParticlesSiggraph90.pdf>
- Youtube Video: <http://www.youtube.com/watch?v=hwDvna0q3rA>