





# Setup

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***@Helge: Pressed record?***

***@Class: Logged into iClicker cloud?***

# Logistics: Exam slot?

- *Final cross-play session*
- *Industry jury*
- *Awards*
- *Attendance mandatory*
  
- *Scheduled: Dec 18<sup>th</sup>, noon*
  
- *Better on Dec 17<sup>th</sup> 4-6 pm? -> vote on piazza, particularly if you can't make it*

# Logistics: M2 submission and A2 grading

- *On Friday*
- **30 students selected for face2face grading (on zoom)**
- Please check if you are selected and register for a slot
  - *First come first served*
  - <https://docs.google.com/spreadsheets/d/1hWEC0-Y2Xaz9oHybqjr4xZGnLMqCRW7JrZYzarcSerg/edit?usp=sharing>

# Logistics: Guest lecture

*By Ralf Karrenberg*

- *Nvidia*
- *Raytracing (RTX technology) and upscaling (DLSS)*
  - *How light simulation and AI/ML play together*

# Overview

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## ***1. Equation of Motion***

- Examples
- Ordinary Differentiable Equations (ODE)
- Solving ODEs

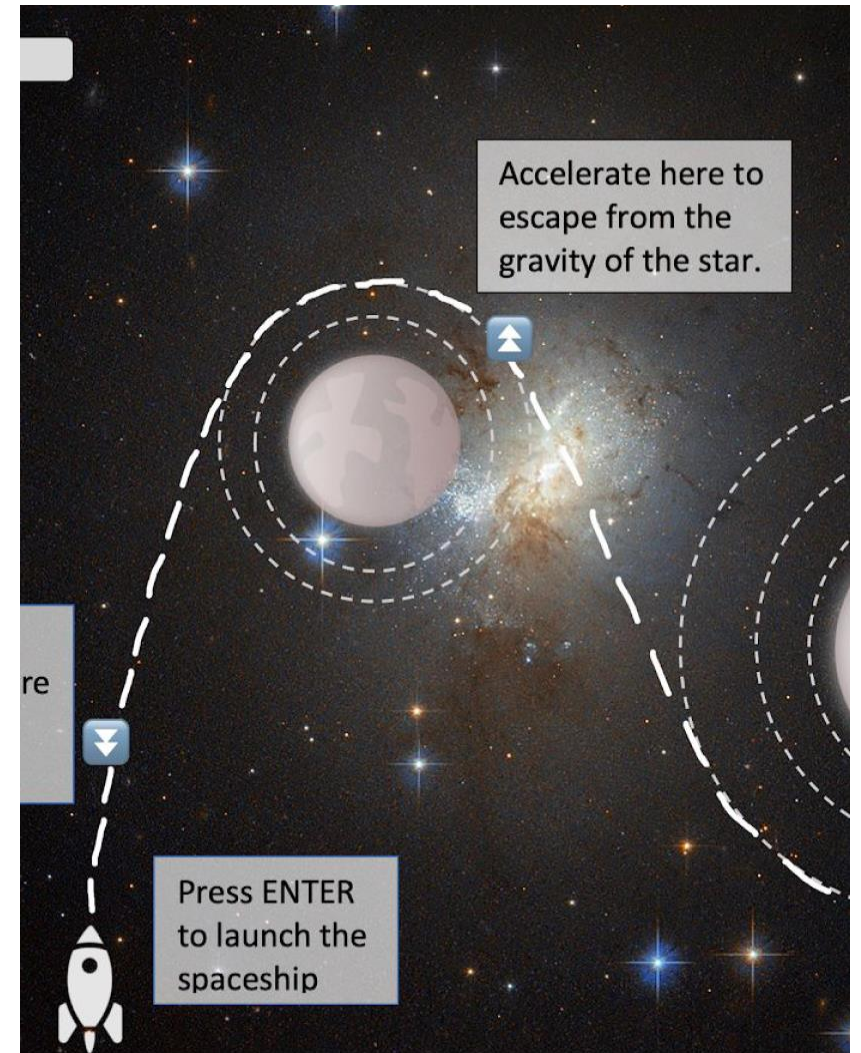
## ***2. Collision and Reaction Forces***



# Physics

## ***Learning goals:***

- ***Connect your theoretical math knowledge to applications***
- ***Properly simulate object motion and their interaction in your game***



# Recap: Basic Particle Simulation (first try)

How to compute the change in velocity?

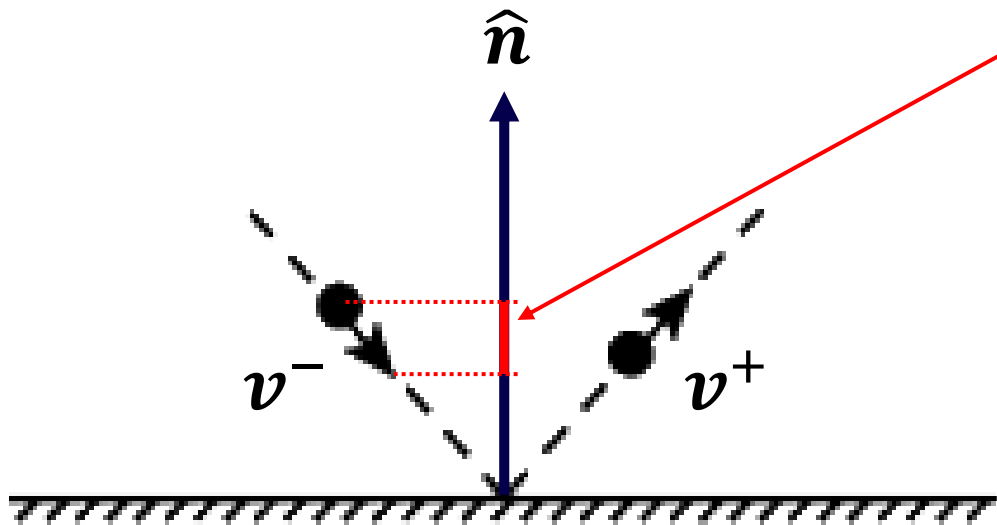
$$\begin{aligned}d_t &= t_{i+1} - t_i \\ \vec{v}_{i+1} &= \vec{v}_i + \Delta \mathbf{v} \\ \vec{p}_{i+1} &= \vec{p}(t_i) + \vec{v}_i d_t\end{aligned}$$





# Recap: Particle-Plane Collision

- *In direction of normal*



Velocity along normal  
( $v$  projected on normal  
by the dot product)

**Frictionless**

$$\Delta v = 2(v^- \cdot \hat{n})\hat{n}$$

Apply change  
along normal  
(magnitude  
times direction)

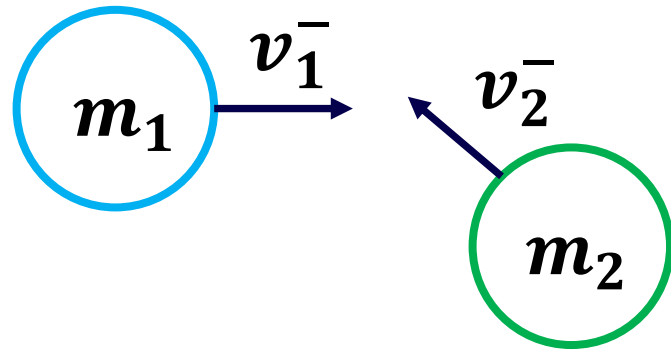
$$v^+ = v^- + \Delta v$$

**Loss of energy**

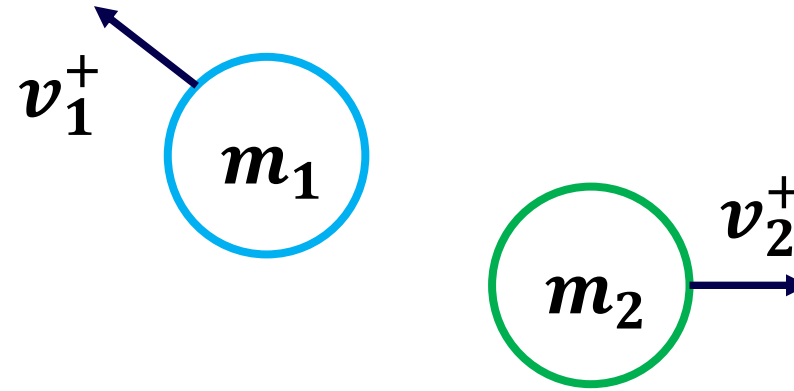
$$\Delta v = (1 + \epsilon)(v^- \cdot \hat{n})\hat{n}$$

# Particle-Particle Collisions (spherical objects)

Before collision



After



Response:

$$v_1^+ = v_1^- - \frac{2m_2}{m_1 + m_2} \frac{\langle v_1^- - v_2^- \rangle \cdot \langle p_1 - p_2 \rangle}{\|p_1 - p_2\|^2} \langle p_1 - p_2 \rangle$$

$$v_2^+ = v_2^- - \frac{2m_1}{m_1 + m_2} \frac{\langle v_2^- - v_1^- \rangle \cdot \langle p_2 - p_1 \rangle}{\|p_2 - p_1\|^2} \langle p_2 - p_1 \rangle$$

- This is in terms of velocity
- Today (and next lecture):  
derivation via impulse and forces

# From Velocities ( $\Delta v$ ) to Forces (F) and back

***Force relates to mass and acceleration***

$$\mathbf{F} = ma$$

***A change in velocity related to acceleration over time***

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

***In terms of forces***

$$\Delta \mathbf{v} = \Delta t \frac{F}{m}$$

# Recap: Basic Particle Simulation (first try)

How to compute the change in velocity?

$$\begin{aligned}d_t &= t_{i+1} - t_i \\ \vec{v}_{i+1} &= \vec{v}_i + \Delta \mathbf{v} \\ \vec{p}_{i+1} &= \vec{p}(t_i) + \vec{v}_i d_t\end{aligned}$$



# Forces are omnipresent

- **Gravity**

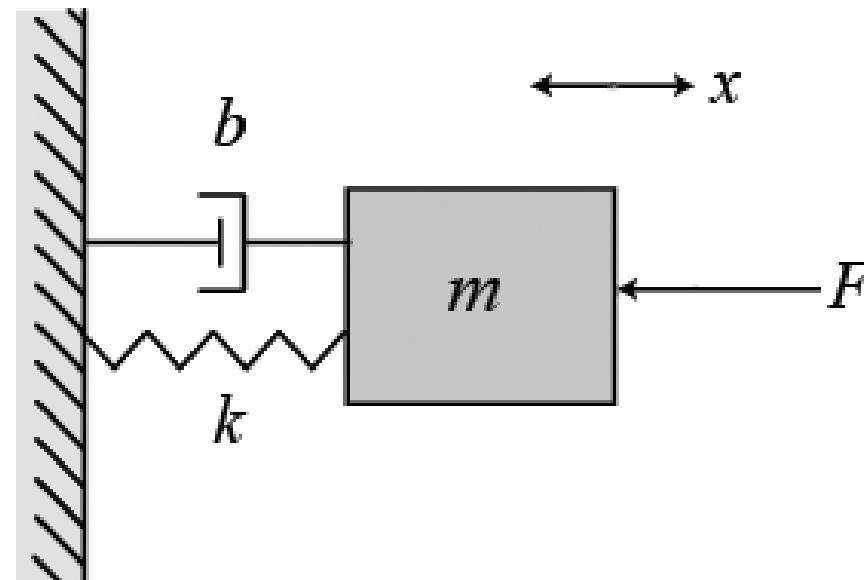
$$F = \begin{bmatrix} 0 \\ -mg \end{bmatrix}$$

- **Viscous damping**

$$F = -bv$$

- **Spring & dampers**

$$F = -kx - bv$$



# Gravity direction?

***Assuming a flat earth:***

$$F = \begin{bmatrix} 0 \\ -mg \end{bmatrix}$$

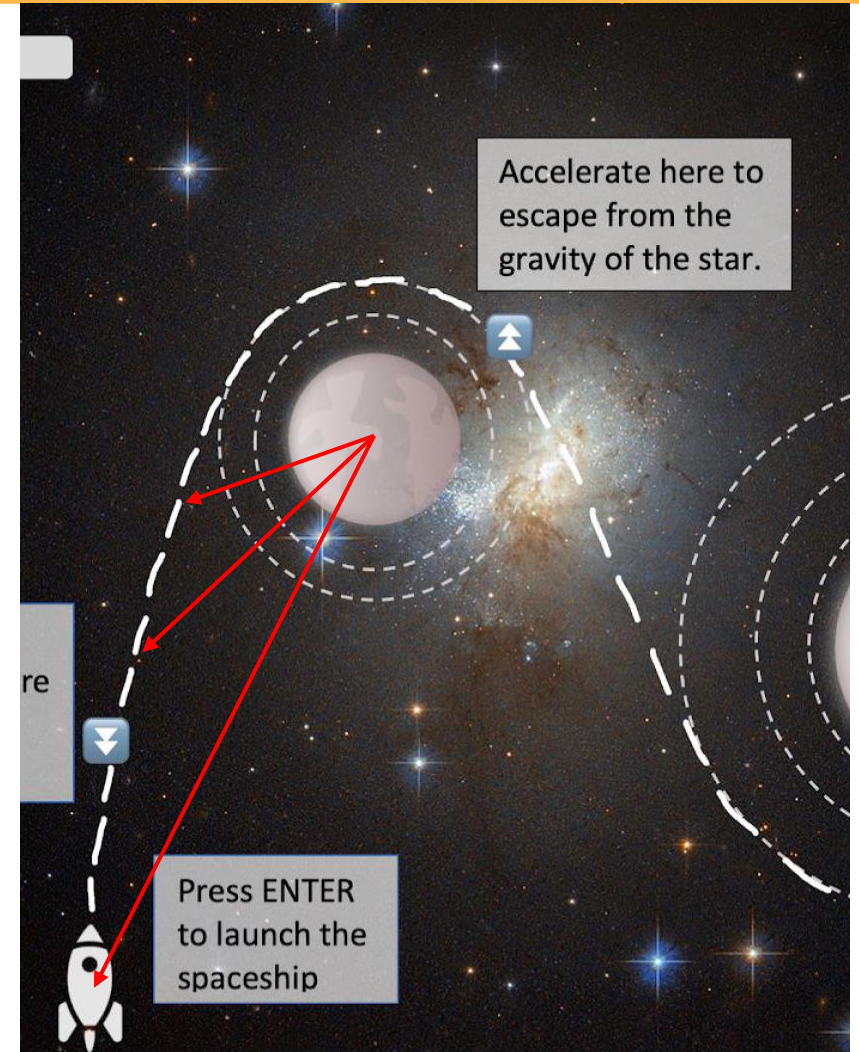
***Assuming a spherical earth:***

$$F = -mg \begin{bmatrix} a \\ b \end{bmatrix}$$

How to compute the vector (a,b) and g ?

Newton's law of universal gravitation

$$F = G \frac{m_1 m_2}{r^2}$$





# Multiple forces?

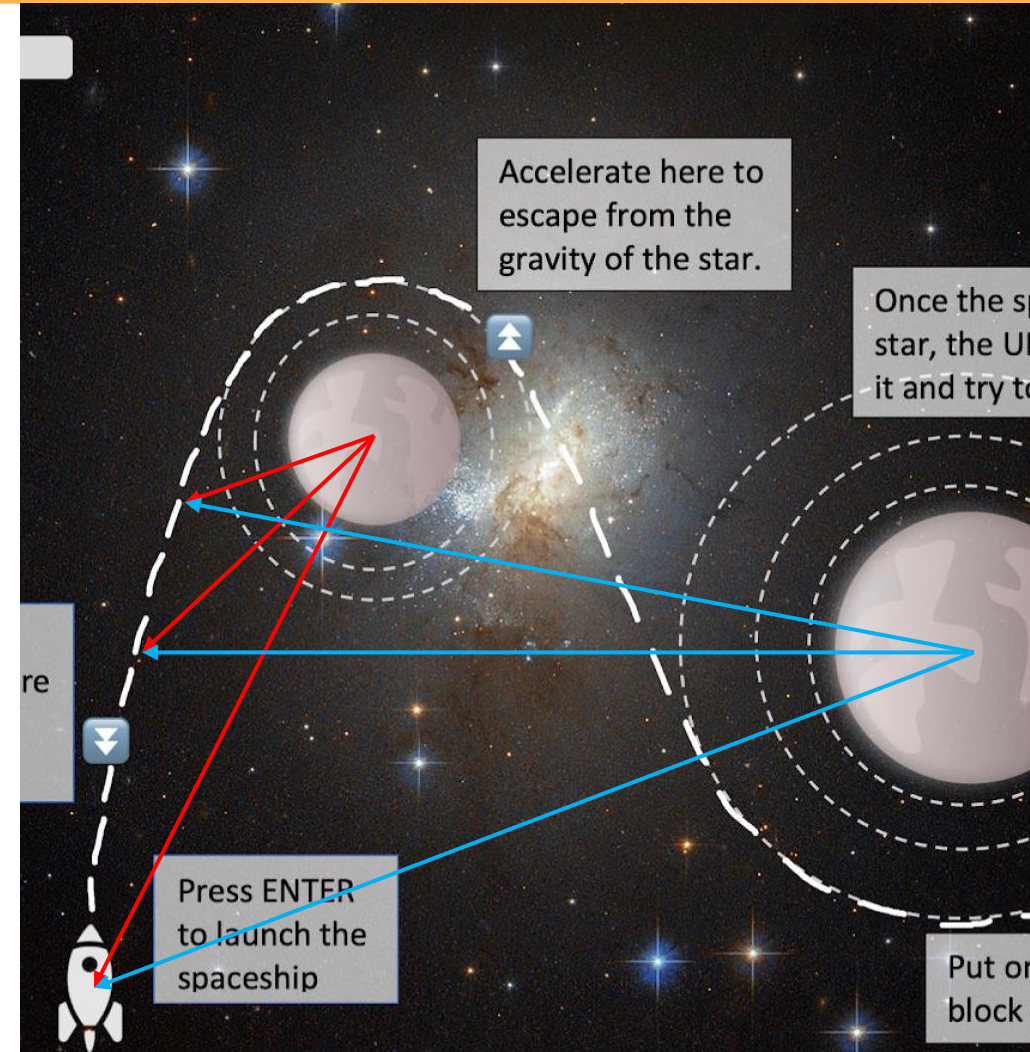
***Forces add up (and cancel):***

$$F = -mg_1 \begin{bmatrix} a_1 \\ b_1 \end{bmatrix} - mg_2 \begin{bmatrix} a_2 \\ b_2 \end{bmatrix}$$

- ***This holds for all types of forces!***
- ***Notation you might see:***

$$F = \sum_i F_i = \sum F_i = \sum F$$

$$\vec{F} = F$$





# Your game idea does not need forces?

## *Are you sure?*

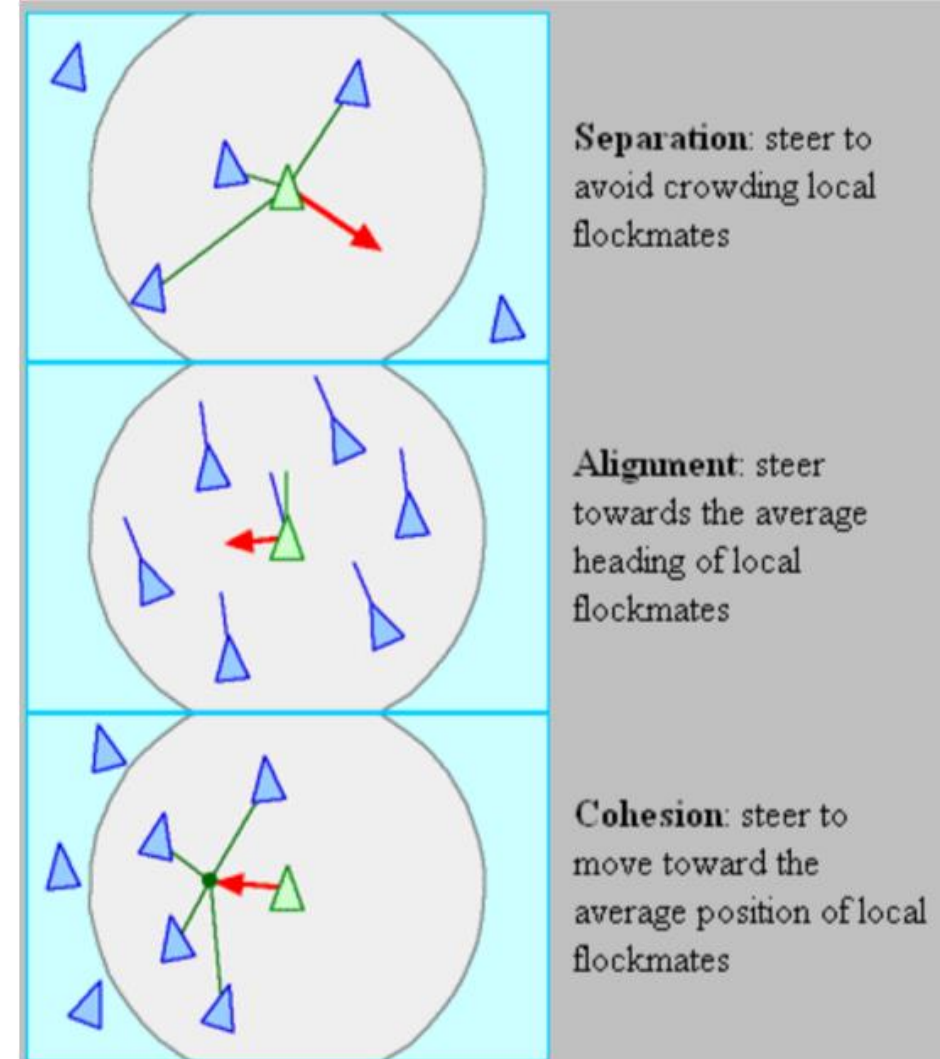
- *Particle effects*
- *Fake forces*
- *Proxy forces*
- Simulate crowd behaviour



*Take it as a chance to connect dry math with a practical application!*

# Proxy Forces (= fake forces)

- Behavior forces: [“Boids”, Craig Reynolds, SIGGRAPH 1987]
- flocking birds, schooling fish, etc.
- Attract to goal location (like gravity)
  - *E.g., waypoint determined by shortest path search*
- Repulsion if close
- Align orientation to neighbors
- Center to neighbors
- Forces add up!



# Simulation Basics

## Simulation loop...

### 1. *Equations of Motion*

- sum forces & torques
- solve for accelerations:  $\vec{F} = ma$

### 2. *Numerical integration*

- update positions, velocities

### 3. *Collision detection*

### 4. *Collision resolution*

# What we did so far: **Forward Euler**

Forces only  $\vec{F} = ma$

$$d_t = t_{i+1} - t_i$$

$$\vec{v}_{i+1} = \vec{v}_i + (\vec{F}(t_i)/m)d_t$$

$$\vec{p}_{i+1} = \vec{p}(t_i) + \vec{v}_{i+1}d_t$$

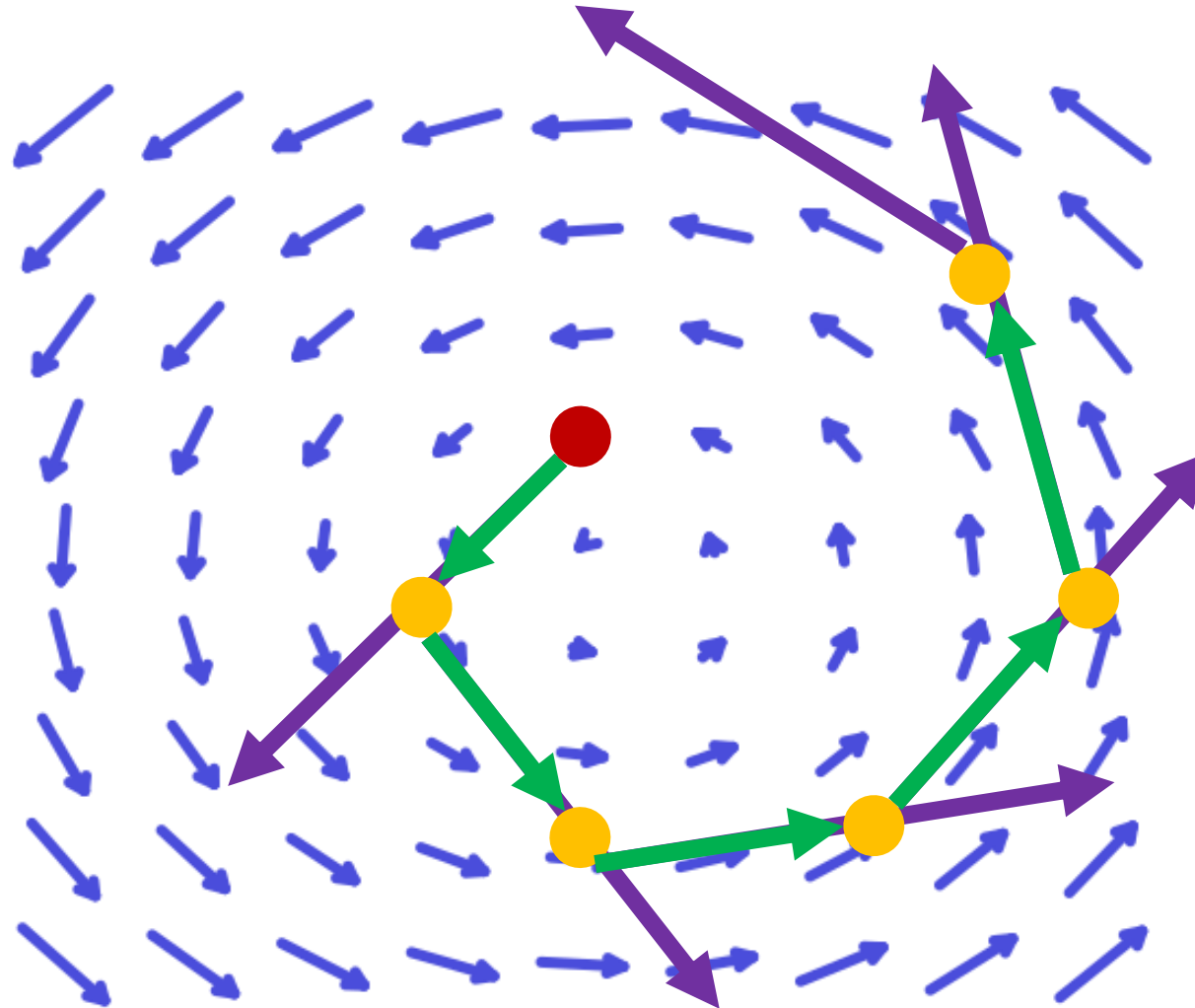
acceleration =  $\frac{\partial v}{\partial t}$

get values at time  $t_{i+1}$  from values at time  $t_i$

Issues? Alternatives?

How can we discretize this?

# Issue: extrapolation

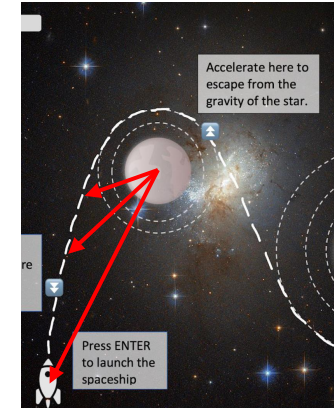


# Which forces depend on t?

- **Gravity**

$$F = \begin{bmatrix} 0 \\ -mg \end{bmatrix}$$

$$F = -mg \begin{bmatrix} a \\ b \end{bmatrix}$$

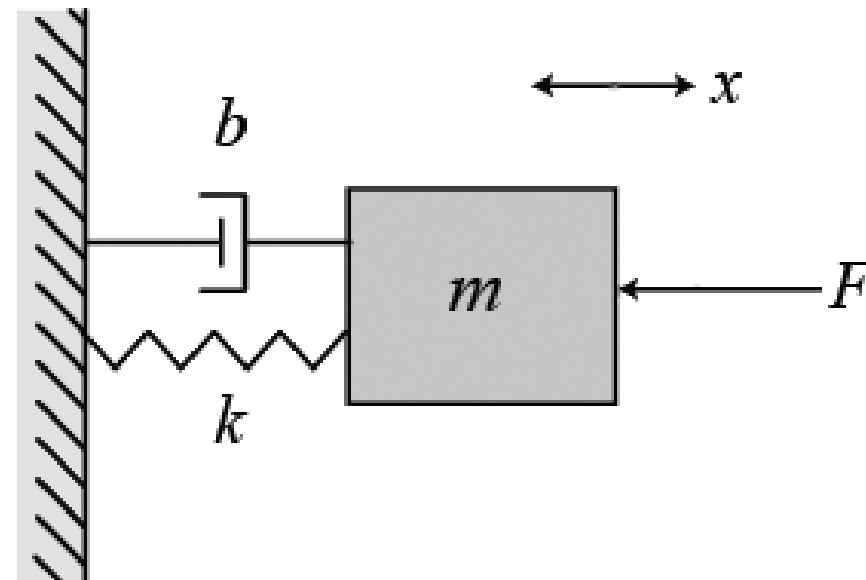


- **Viscous damping**

$$F = -bv$$

- **Spring & dampers**

$$F = -kx - bv$$



# Basic Particle Simulation: Small Problem...

$$\begin{aligned}d_t &= t_{i+1} - t_i \\ \vec{v}_{i+1} &= \vec{v}_i + (\vec{F}(t_{???})/m)d_t \\ \vec{p}_{i+1} &= \vec{p}(t_i) + \vec{v}_{i+1}d_t\end{aligned}$$

**Equations of motion describe state (equilibrium)**

- **Involves quantities and their derivatives**
  - **-> we need to solve differential equations**



# Lets start from scratch

***Given:***

$$\vec{F} = m \frac{\partial^2 x}{\partial t^2}$$

***Wait!***

**There is no position  $x$  in this equation?!  
Only contains acceleration  $a$ !**

**How to solve such differential equation?**

***Desired: the position  $x$  at time  $t$***

$x$

# Newtonian Physics as First-Order Diff. Eq. (DE)

## Second-order DE

$$\vec{F} = m \frac{\partial^2 x}{\partial t^2} \quad \leftarrow \begin{array}{l} \text{acceleration} \\ = \frac{\partial v}{\partial t} \end{array}$$

Now we have an x!

## First-order DE

$$\frac{\partial}{\partial t} \begin{bmatrix} \vec{x} \\ \vec{v} \end{bmatrix} = \begin{bmatrix} \vec{v} \\ \vec{F}/m \end{bmatrix} \quad \leftarrow \begin{array}{l} \text{velocity} \\ = \frac{\partial x}{\partial t} \end{array}$$

Higher-order DEs can be turned into a first-order DE with additional variables and equations!

# Newtonian Physics as First-Order DE

- Motion of **one** particle

## Second-order DE

$$\vec{F} = m \frac{\partial^2 \vec{x}}{\partial t^2}$$

## First-order DE

$$\frac{\partial}{\partial t} \begin{bmatrix} \vec{x} \\ \vec{v} \end{bmatrix} = \begin{bmatrix} \vec{v} \\ \Sigma \vec{F} / m \end{bmatrix}$$

- Motion of **many** particles

$$\frac{\partial}{\partial t} \begin{bmatrix} \vec{x}_1 \\ \vec{v}_1 \\ \vec{x}_2 \\ \vec{v}_2 \\ \vdots \\ \vec{x}_n \\ \vec{v}_n \end{bmatrix} = \begin{bmatrix} \vec{v}_1 \\ \vec{F}_1 / m_1 \\ \vec{v}_2 \\ \vec{F}_2 / m_2 \\ \vdots \\ \vec{v}_n \\ \vec{F}_n / m_n \end{bmatrix}$$

# Overview

## ***Different DE solvers***

- ***Forward Euler***  
*(take current accel. to update vel., current vel. to update pos.)*
- ***Midpoint Method & Trapezoid Method***  
*(mix current and approximations of future vel. & acc. Estimates)*
- ***Backwards Euler***  
*(solve for future pos., vel., and accel. jointly)*
  - *May require an iterative solver*

# Recap: Forward Euler

Forces only  $\vec{F} = ma$

$$d_t = t_{i+1} - t_i$$

acceleration =  $\frac{\partial v}{\partial t}$

$$\vec{v}_{i+1} = \vec{v}_i + (\vec{F}(t_i)/m)d_t$$

$$\vec{p}_{i+1} = \vec{p}(t_i) + \vec{v}_{i+1}d_t$$

get values at time  $t_{i+1}$  from values at time  $t_i$

Issues? Alternatives?



# Idea: Backwards Euler

$$\begin{aligned}d_t &= t_{i+1} - t_i \\ \vec{v}_{i+1} &= \vec{v}_i + (\vec{F}(t_{i+1})/m)d_t \\ \vec{p}_{i+1} &= \vec{p}(t_i) + \vec{v}_{i+1}d_t\end{aligned}$$

- Viscous damping

$$F = -bv$$

- Spring & dampers

$$F = -kx - bv$$

get values at time  $t_{i+1}$  from states at time  $t_i$  and forces at  $t_{i+1}$

Issues?



# Differential Equations

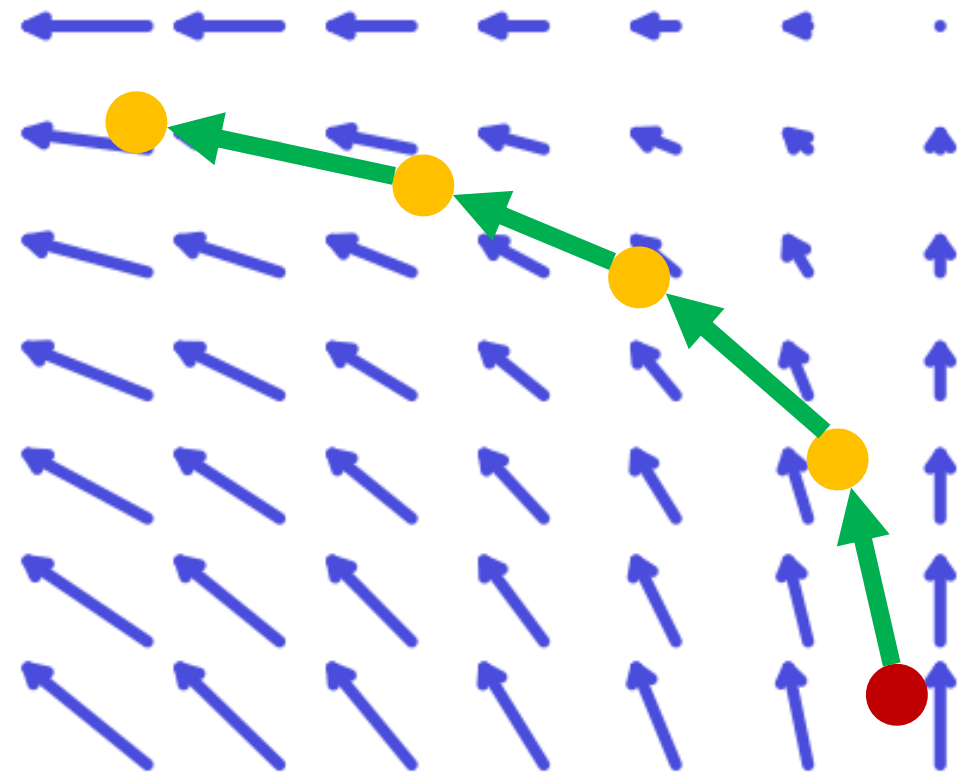
$$\frac{\partial}{\partial t} \vec{X}(t) = f(\vec{X}(t), t)$$

Given that  $\vec{X}_0 = \vec{X}(t_0)$

Compute  $\vec{X}(t)$  for  $t > t_0$

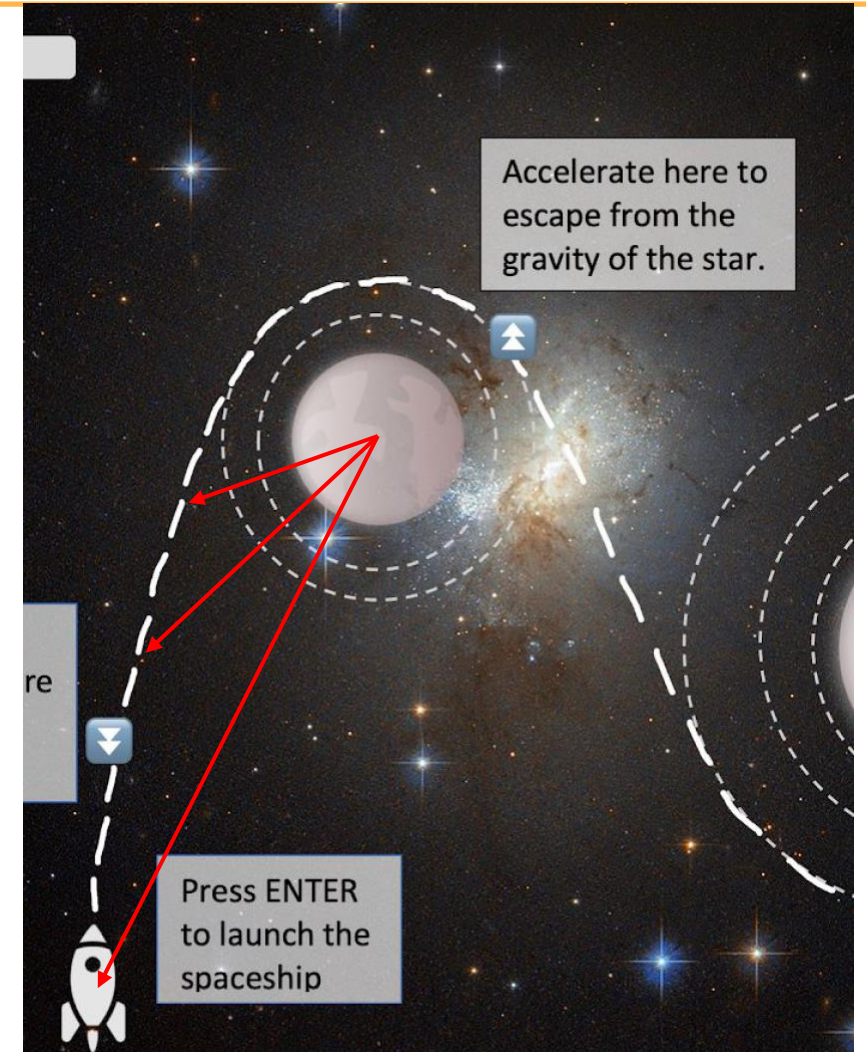
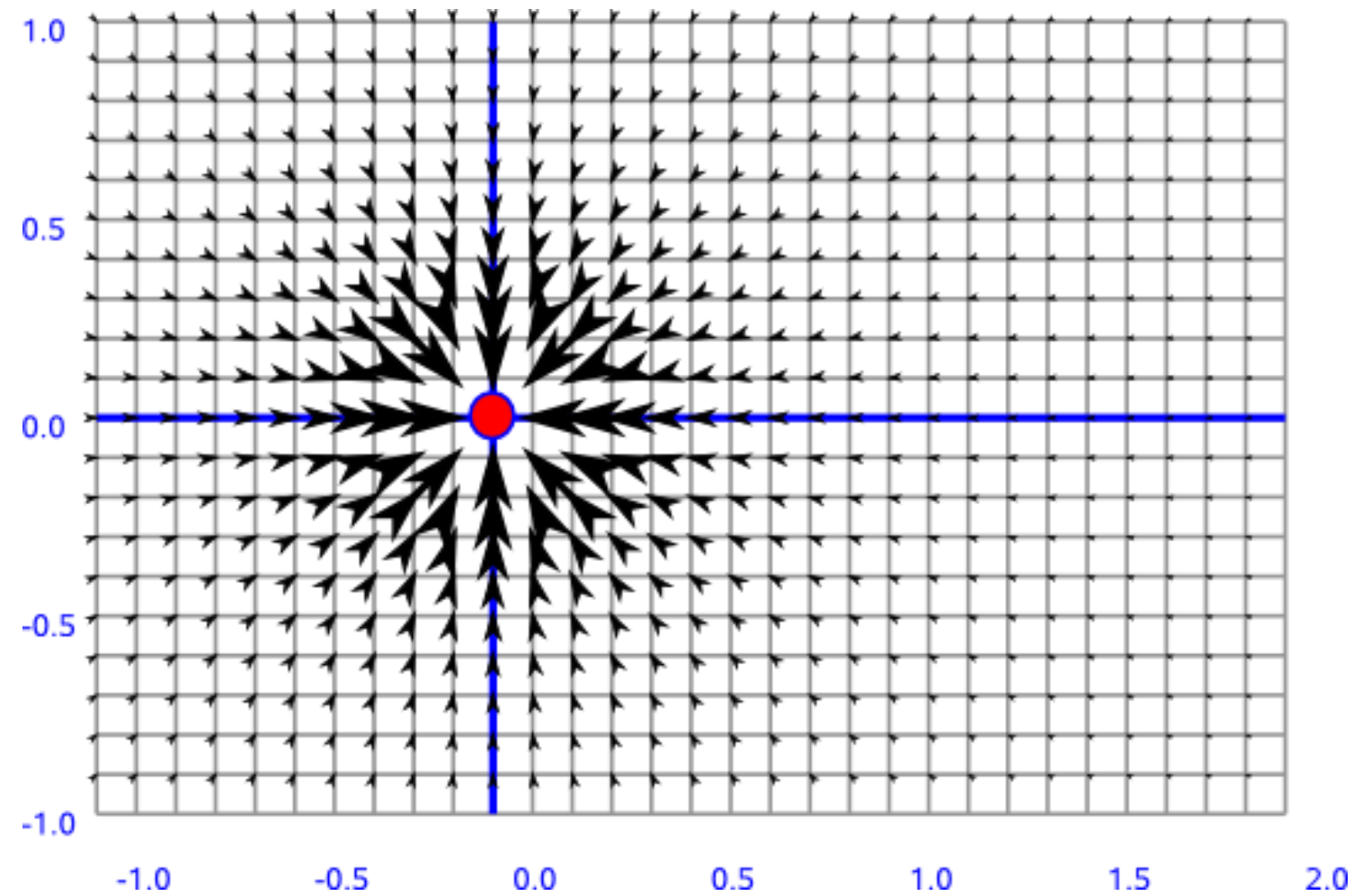
$$\Delta \vec{X}(t) = f(\vec{X}(t), t) \Delta t$$

- **Simulation:**
  - *path through state-space*
  - *driven by vector field*

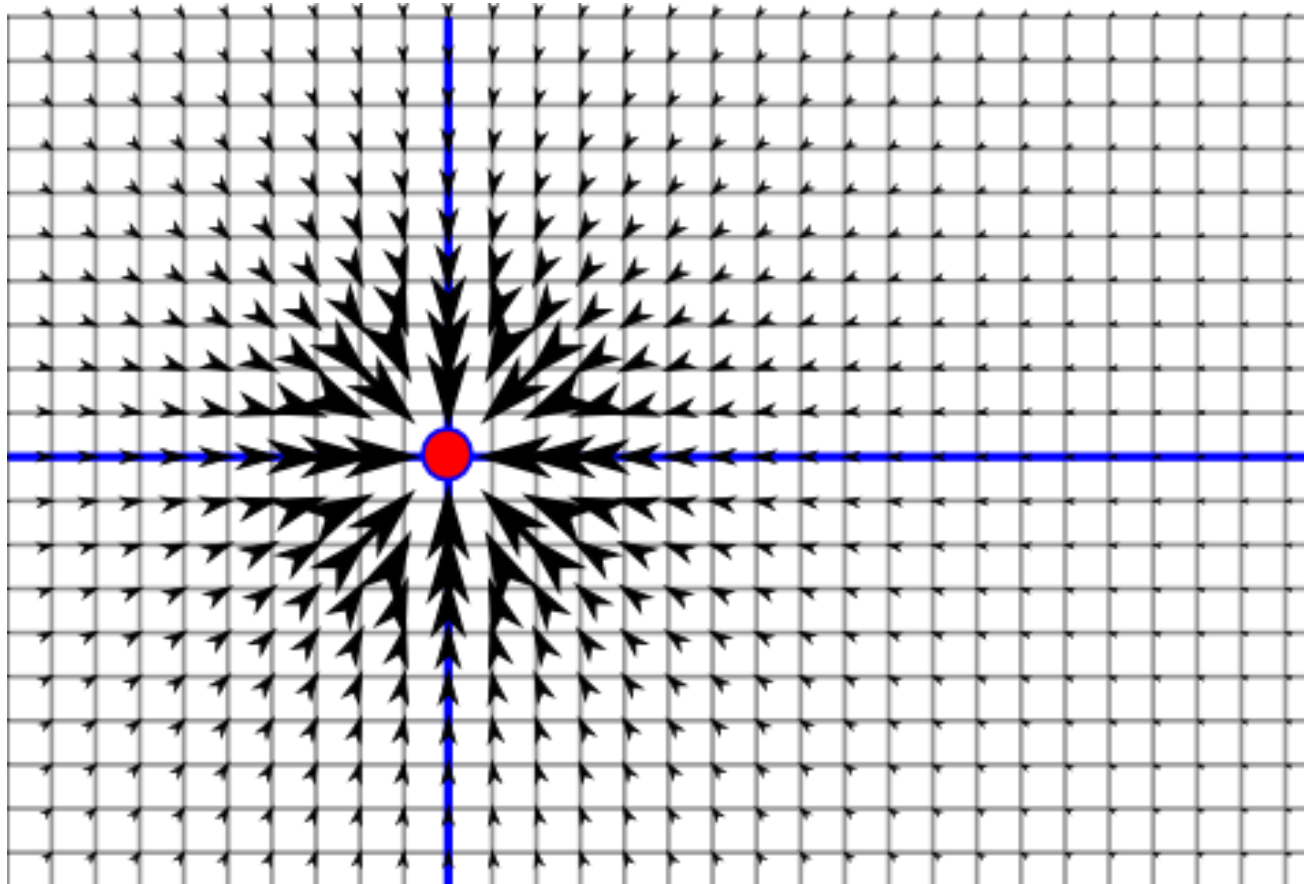




# Gravitational field



# Water Vortex (assignment?)



# DE Numerical Integration: Explicit (Forward) Euler

$$\frac{\partial}{\partial t} \vec{X}(t) = f(\vec{X}(t), t)$$

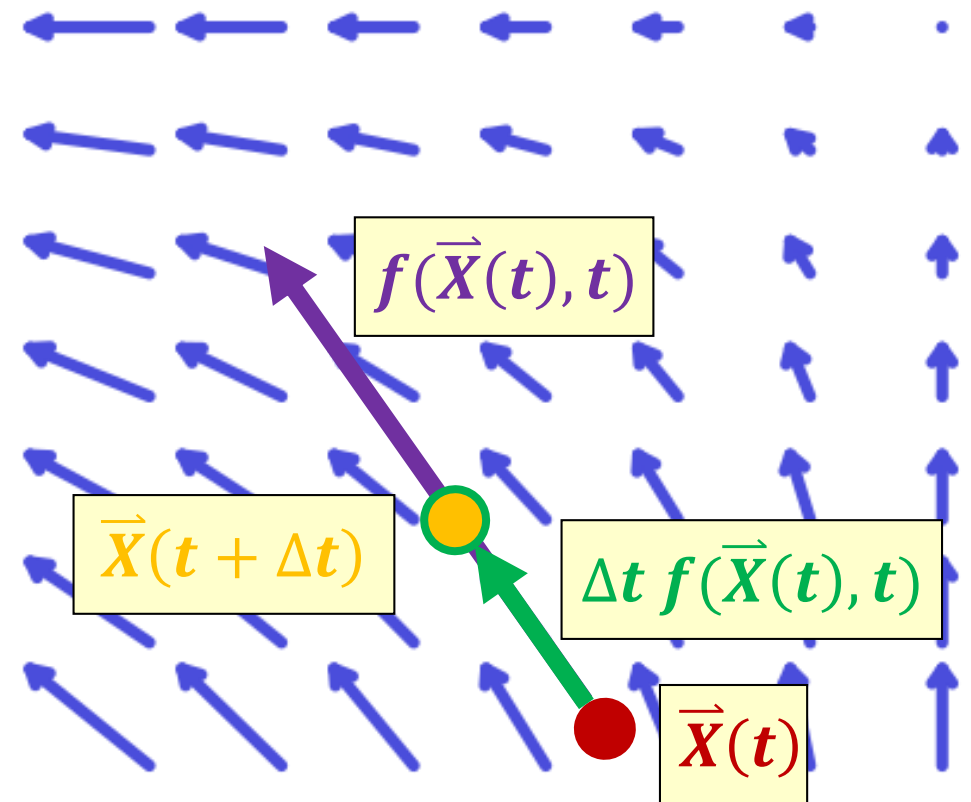
**Given that**  $\vec{X}_0 = \vec{X}(t_0)$

**Compute**  $\vec{X}(t)$  **for**  $t > t_0$

$$\Delta t = t_i - t_{i-1}$$

$$\Delta \vec{X}(t_{i-1}) = \Delta t f(\vec{X}(t_{i-1}), t_{i-1})$$

$$\vec{X}_i = \vec{X}_{i-1} + \Delta t f(\vec{X}_{i-1}, t_{i-1})$$

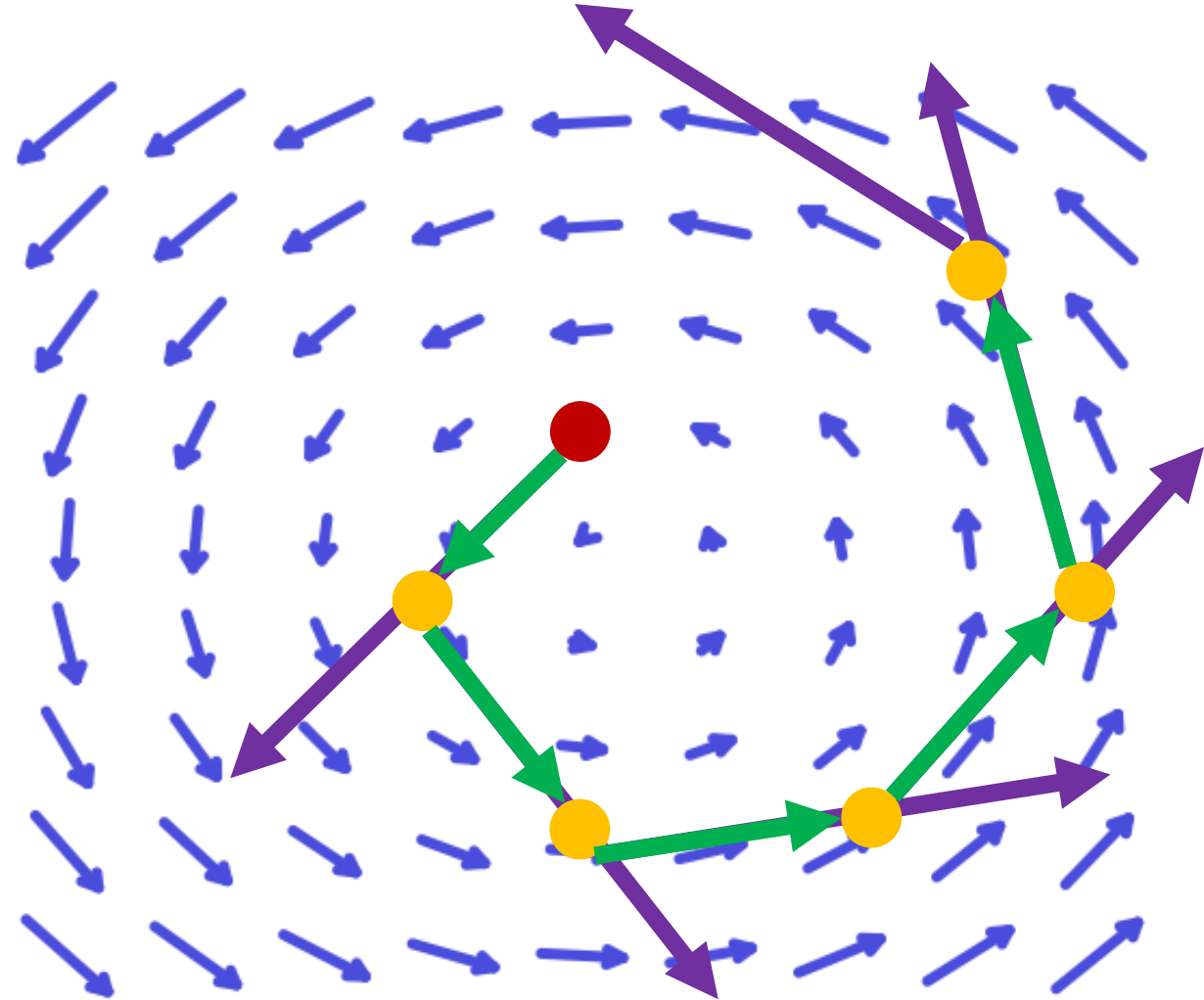


# Explicit Euler Problems

- Solution **spirals** out
  - *Even with **small time steps***
  - *Although smaller time steps are still **better***

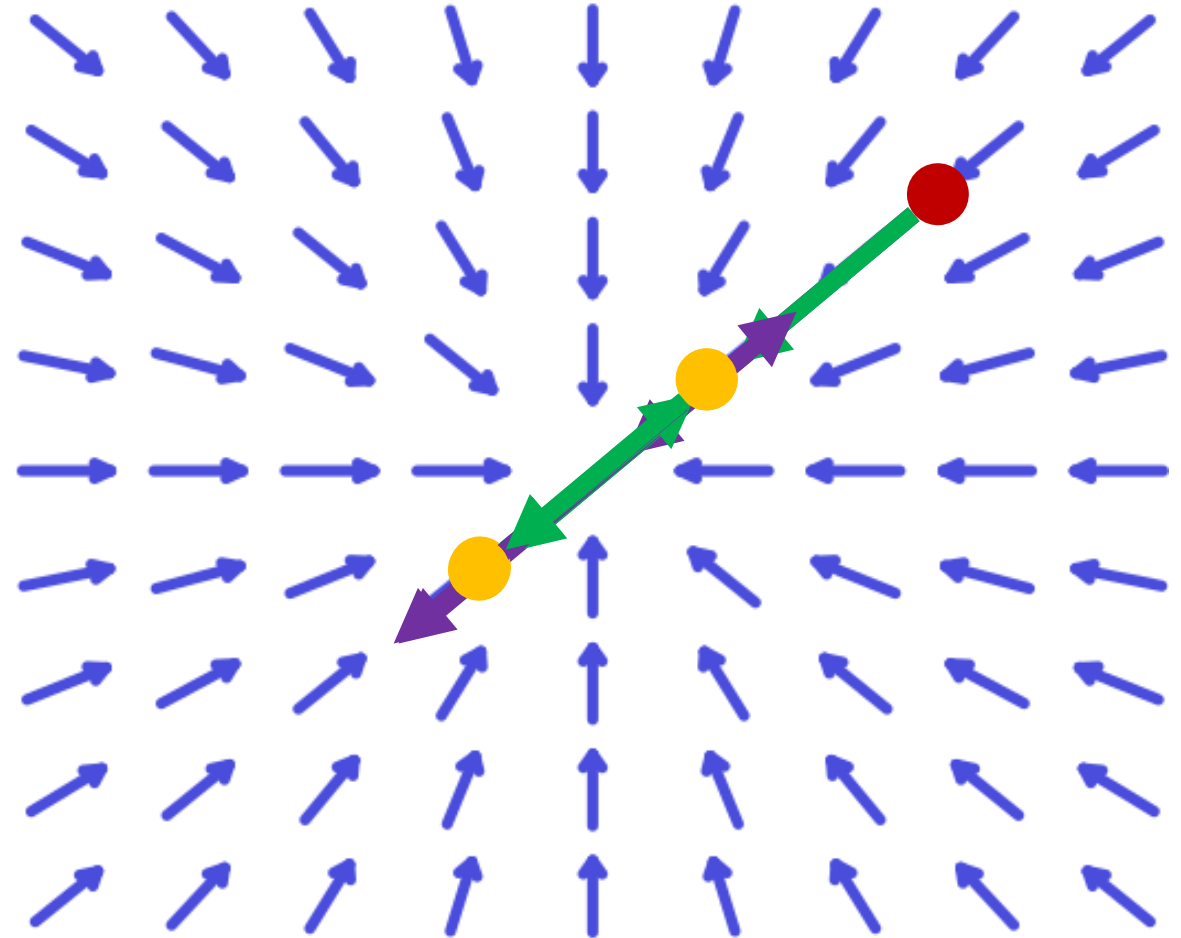
## ***Definition: Explicit***

- ***Closed-form/analytic solution***
- **no iterative solve required**



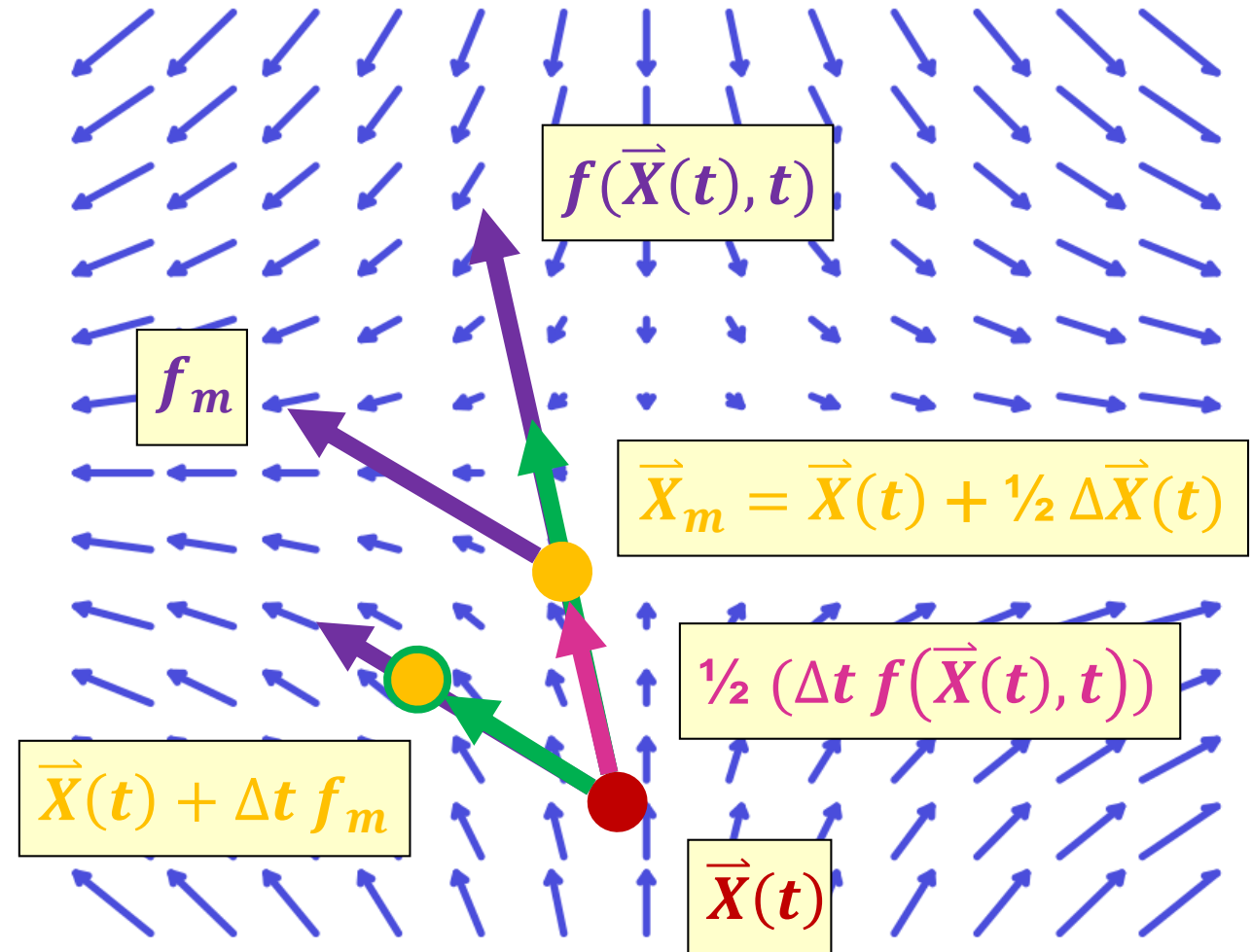
# Explicit Euler Problems

- Can lead to **instabilities**



# Midpoint Method

1.  $\frac{1}{2}$  Euler step
2. evaluate  $f_m$  at  $\vec{X}_m$
3. full step using  $f_m$

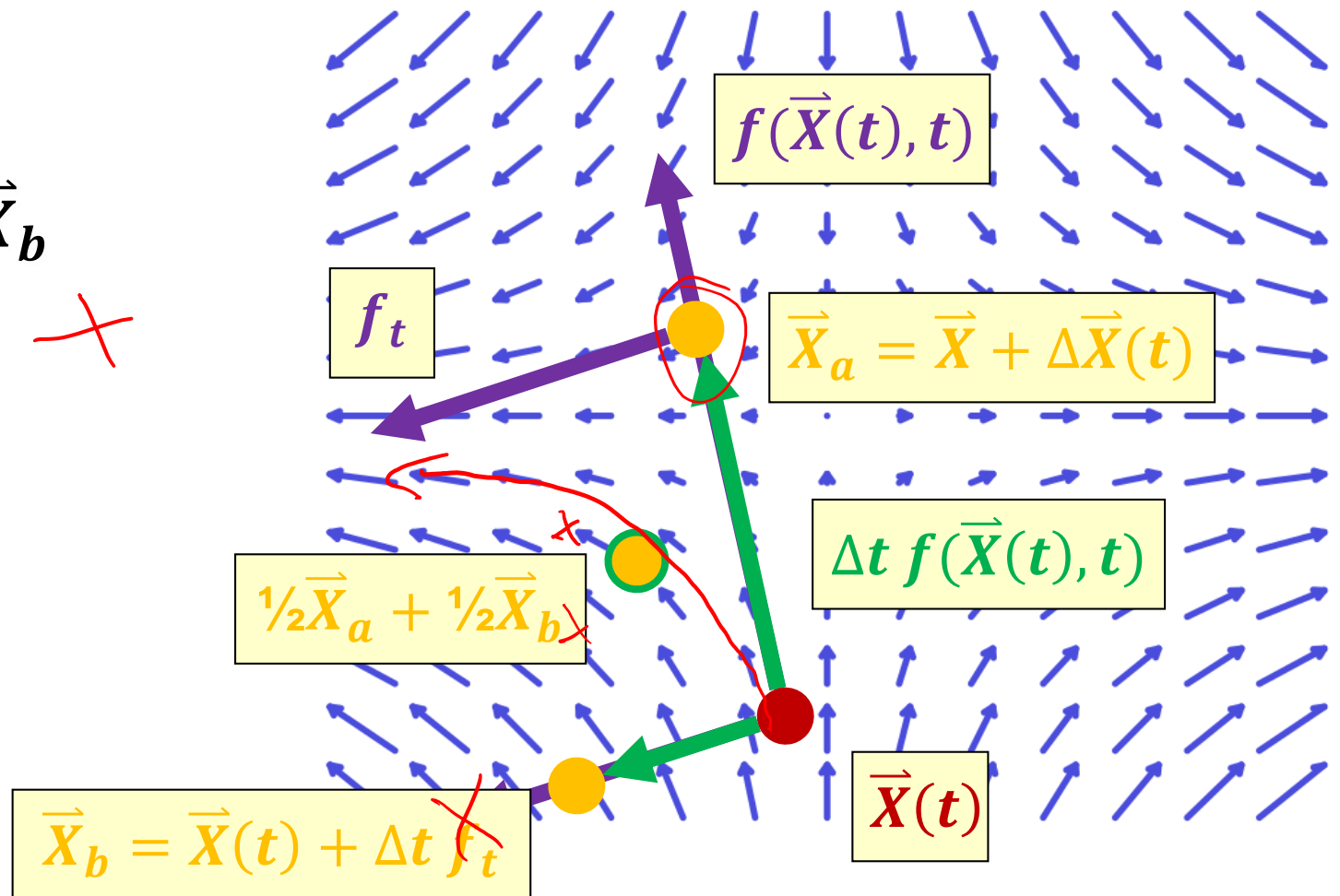




# Trapezoid Method

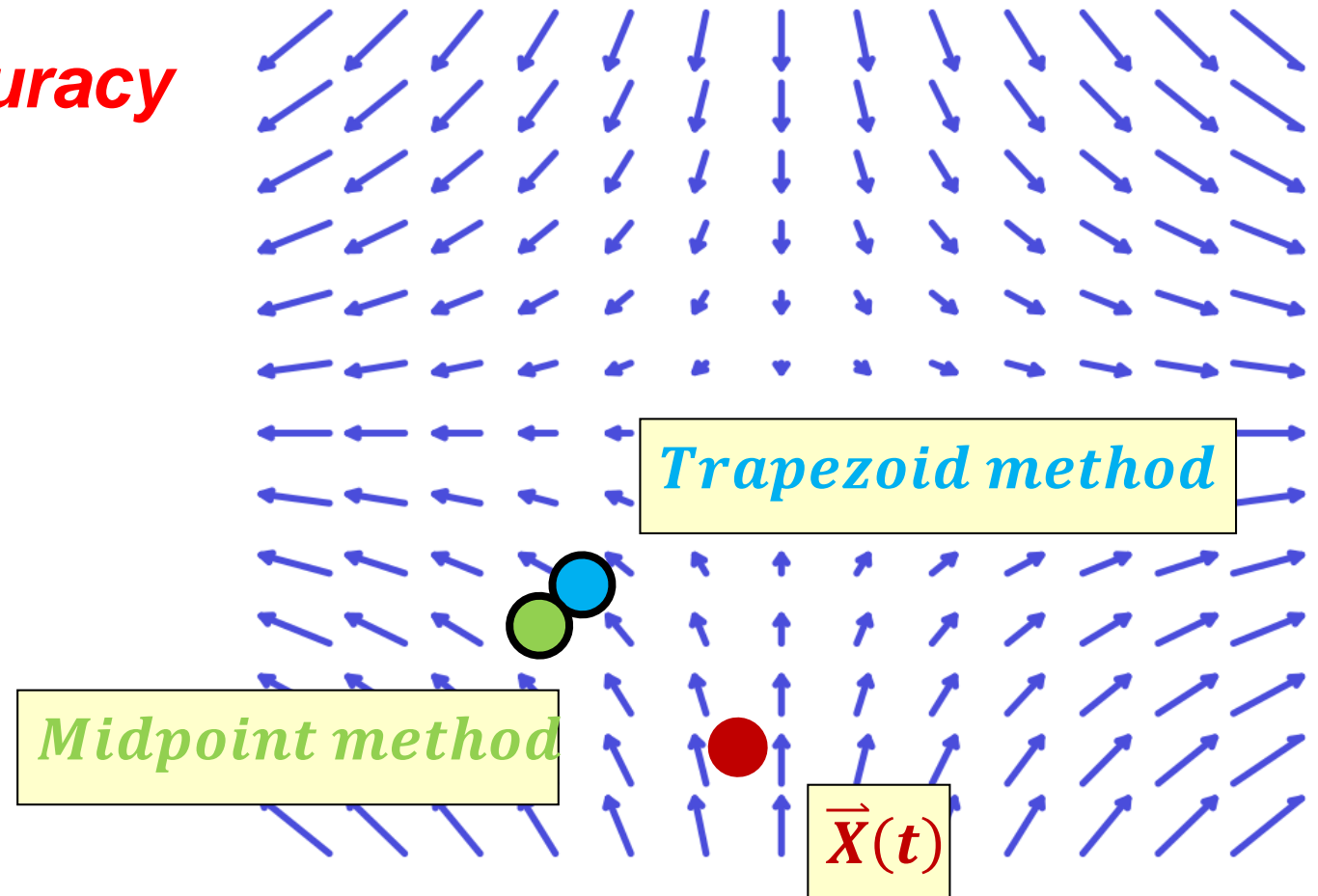
1. full Euler step get  $\vec{X}_a$
2. evaluate  $f_t$  at  $\vec{X}_a$
3. full step using  $f_t$  get  $\vec{X}_b$
4. average  $\vec{X}_a$  and  $\vec{X}_b$

~~+~~



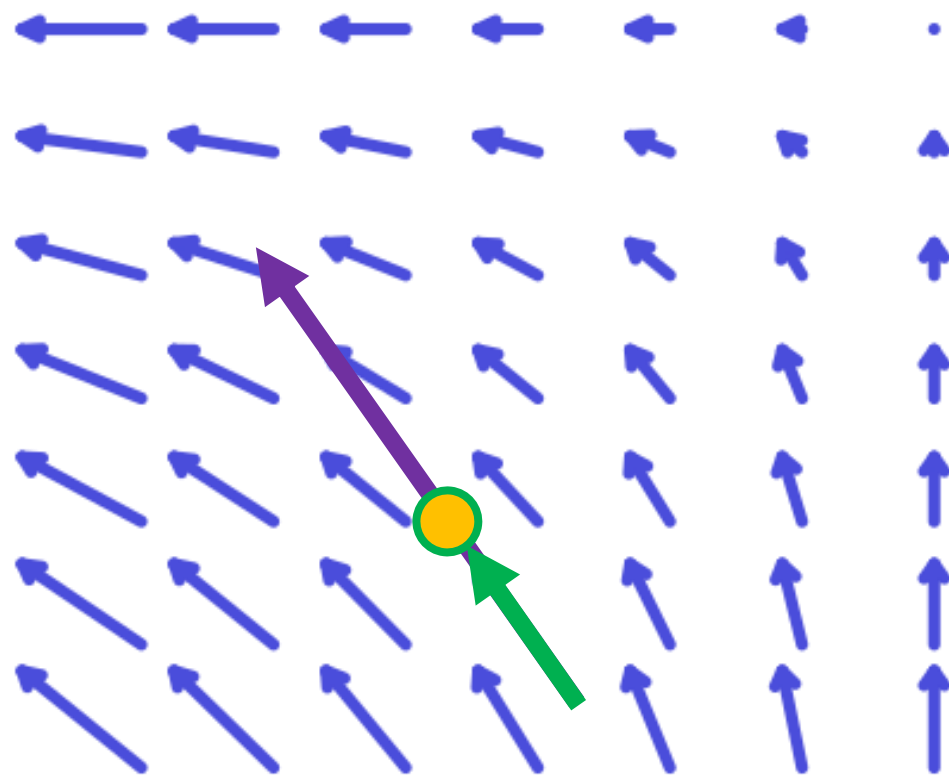
# Midpoint & Trapezoid Method

- Not exactly the same
  - *But same order of accuracy*





# Explicit Euler: Code



```
void takeStep(ParticleSystem* ps, float h)
{
    velocities = ps->getStateVelocities()
    positions = ps->getStatePositions()
    forces = ps->getForces(positions, velocities)
    masses = ps->getMasses()
    accelerations = forces / masses
    newPositions = positions + h*velocities
    newVelocities = velocities + h*accelerations
    ps->setStatePositions(newPositions)
    ps->setStateVelocities(newVelocities)
}
```

# Midpoint Method: Code

```
void takeStep(ParticleSystem* ps, float h)
```

```
{
```

```
    velocities = ps->getStateVelocities()
```

```
    positions = ps->getStatePositions()
```

```
    forces = ps->getForces(positions, velocities)
```

```
    masses = ps->getMasses()
```

```
    accelerations = forces / masses
```

```
    midPositions = positions + 0.5*h*velocities
```

```
    midVelocities = velocities + 0.5*h*accelerations
```

```
    midForces = ps->getForces(midPositions, midVelocities)
```

```
    midAccelerations = midForces / masses
```

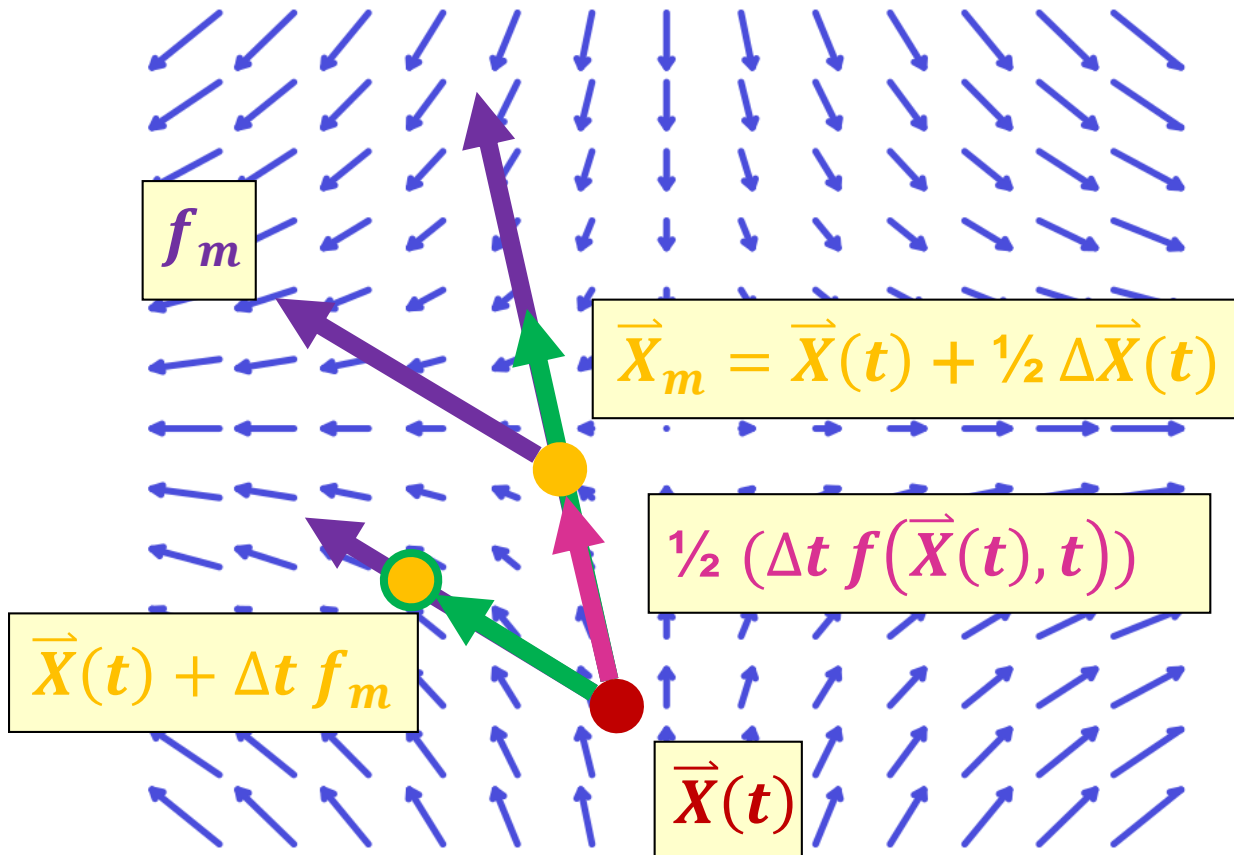
```
    newPositions = positions + h*midVelocities
```

```
    newVelocities = velocities + h*midAccelerations
```

```
    ps->setStatePositions(newPositions)
```

```
    ps->setStateVelocities(newVelocities)
```

```
}
```



# Implicit (Backward) Euler:

- Use forces at destination

Solve system of equations

$$\frac{\partial}{\partial t} \begin{bmatrix} \vec{x} \\ \vec{v} \end{bmatrix} = \begin{bmatrix} \vec{v} \\ \Sigma \vec{F} / m \end{bmatrix}$$

$$\begin{aligned} x_{n+1} &= x_n + h v_{n+1} \\ v_{n+1} &= v_n + h \left( \frac{F_{n+1}}{m} \right) \end{aligned}$$

- Types of forces:

- **Gravity**

$$F = \begin{bmatrix} 0 \\ -mg \end{bmatrix}$$

- **Viscous damping**

$$F = -bv$$

- **Spring & dampers**

$$F = -kx - bv$$

# Implicit (Backward) Euler:

- Use forces at destination + **derivative** at the **destination**

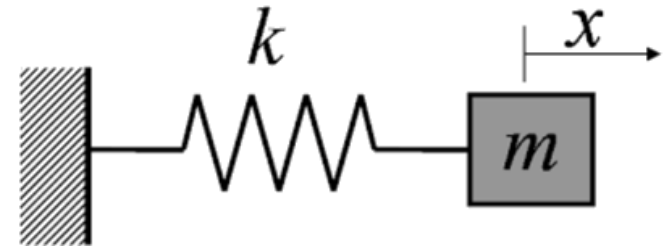
Solve system of equations

$$\frac{\partial}{\partial t} \begin{bmatrix} \vec{x} \\ \vec{v} \end{bmatrix} = \begin{bmatrix} \vec{v} \\ \Sigma \vec{F} / m \end{bmatrix}$$

$$\begin{aligned} x_{n+1} &= x_n + h v_{n+1} \\ v_{n+1} &= v_n + h \left( \frac{F_{n+1}}{m} \right) \end{aligned}$$

Example: Spring Force

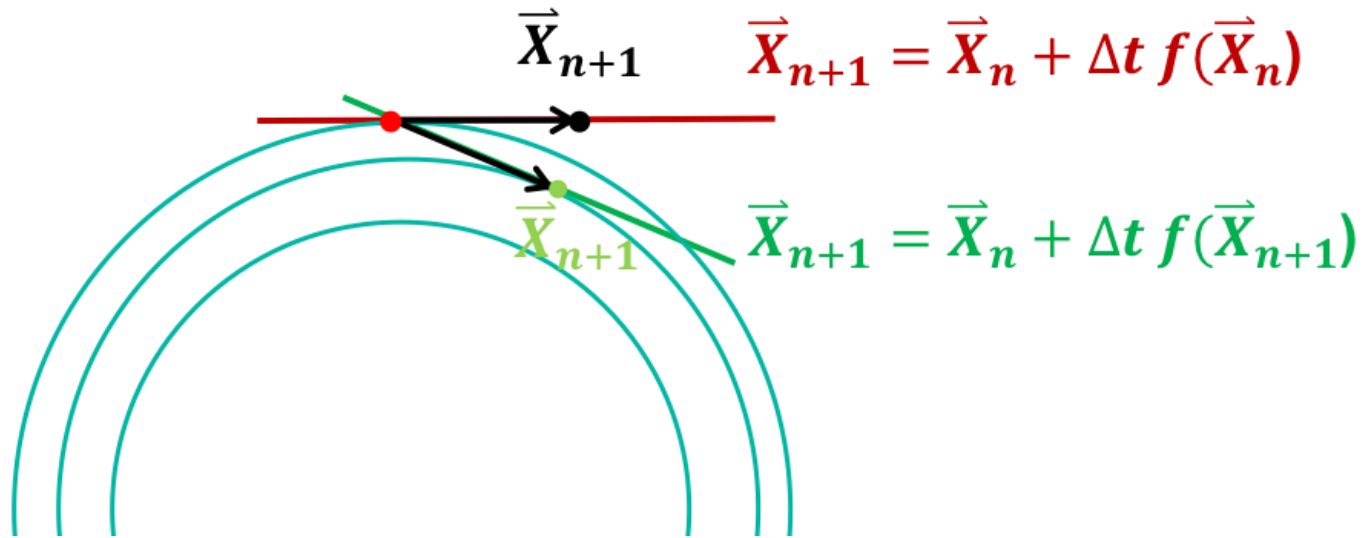
$$F = -kx$$



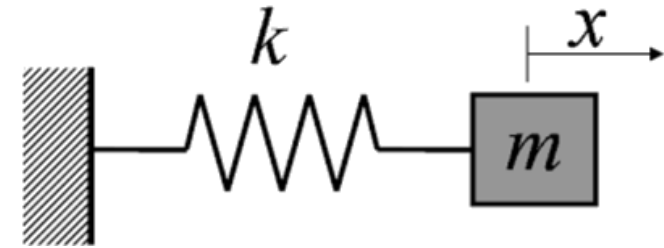
$$\begin{aligned} x_{n+1} &= x_n + h v_{n+1} \\ v_{n+1} &= v_n + h \left( \frac{-k x_{n+1}}{m} \right) \end{aligned}$$

*Analytic or iterative solve?*

# Forward vs Backward



Could one apply the Trapezoid Method?



## Forward Euler

$$\begin{aligned}
 x_{n+1} &= x_n + h v_n \\
 v_{n+1} &= v_n + h \left( \frac{-k x_n}{m} \right)
 \end{aligned}$$

## Backward Euler

$$\begin{aligned}
 x_{n+1} &= x_n + h v_{n+1} \\
 v_{n+1} &= v_n + h \left( \frac{-k x_{n+1}}{m} \right)
 \end{aligned}$$

# Particles:

## Newtonian Physics as First-Order DE

- Motion of **many** particles?

$$\frac{\partial}{\partial t} \begin{bmatrix} \overrightarrow{x_1} \\ \overrightarrow{v_1} \\ \overrightarrow{x_2} \\ \overrightarrow{v_2} \\ \vdots \\ \overrightarrow{x_n} \\ \overrightarrow{v_n} \end{bmatrix} = \begin{bmatrix} \overrightarrow{v_1} \\ \overrightarrow{F_1}/m_1 \\ \overrightarrow{v_2} \\ \overrightarrow{F_2}/m_2 \\ \vdots \\ \overrightarrow{v_n} \\ \overrightarrow{F_n}/m_n \end{bmatrix}$$

- Interaction of particles?

# Multiple-particle collision

- ***naïve implementation is likely unstable***
  - *Objects pushing inside each other*
- ***Further reading:***
  - <https://box2d.org/publications/>
    - *In particular*  
[https://box2d.org/files/ErinCatto\\_ModelingAndSolvingConstraints\\_GD\\_C2009.pdf](https://box2d.org/files/ErinCatto_ModelingAndSolvingConstraints_GD_C2009.pdf)

# Simulation Basics

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## Simulation loop...

- 1. Equations of Motion***
- 2. Numerical integration***
- 3. Collision detection***
- 4. Collision resolution***



# Collisions

- Collision **detection**
  - *Broad phase: AABBs, bounding spheres*
  - *Narrow phase: detailed checks*
- Collision **response**
  - *Collision impulses*
  - *Constraint forces: resting, sliding, hinges, ....*

# Basic Particle Simulation (first try)

Forces only  $\vec{F} = ma$

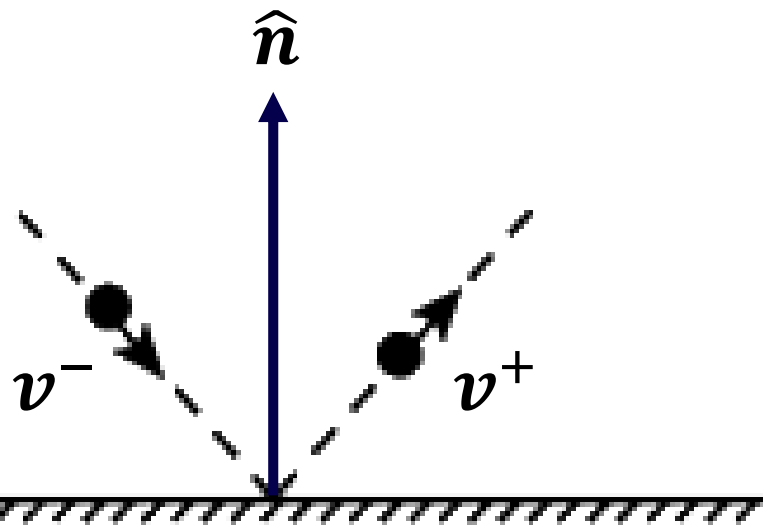
$$d_t = t_{i+1} - t_i$$
$$\vec{v}_{i+1} = \vec{v}(t_i) + (\vec{F}(t_i)/m)d_t$$
$$\vec{p}_{i+1} = \vec{p}(t_i) + \vec{v}(t_{i+1})d_t$$



# Particle-Plane Collisions

- Apply an **'impulse'** of magnitude  $j$ 
  - Inversely proportional to mass of particle
- **In direction of normal**

**Impulse in physics:** Integral of  $F$  over time  
**In games:** an instantaneous step change (not physically possible), i.e., the force applied over one time step of the simulation



$$j = (1 + \epsilon)(\mathbf{v}^- \cdot \hat{\mathbf{n}})m$$

$$\vec{j} = j \hat{\mathbf{n}}$$

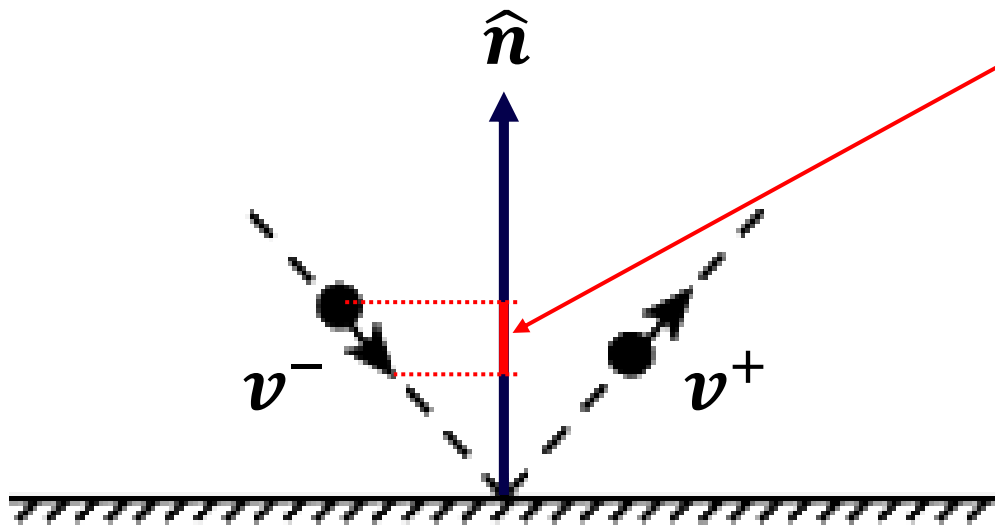
$$\mathbf{v}^+ = \frac{\vec{j}}{m} + \mathbf{v}^-$$

**What is the effect of  $\epsilon$  ?**

# Recap: Particle-Plane Collisions (in terms of vel.)



- **Change in direction of normal**



Velocity along normal  
( $v$  projected on normal  
by the dot product)

**Frictionless**

$$\Delta v = 2(v^- \cdot \hat{n})\hat{n}$$

Apply change  
along normal  
(magnitude  
times direction)

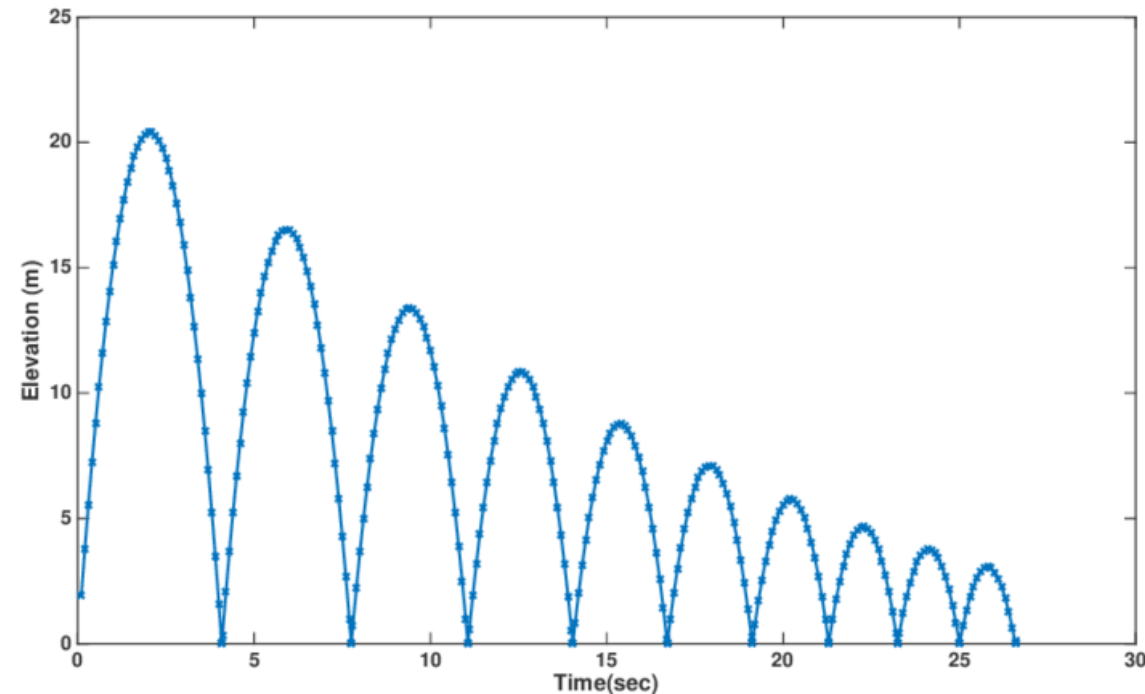
$$v^+ = v^- + \Delta v$$

**Loss of energy**

$$\Delta v = (1 + \epsilon)(v^- \cdot \hat{n})\hat{n}$$

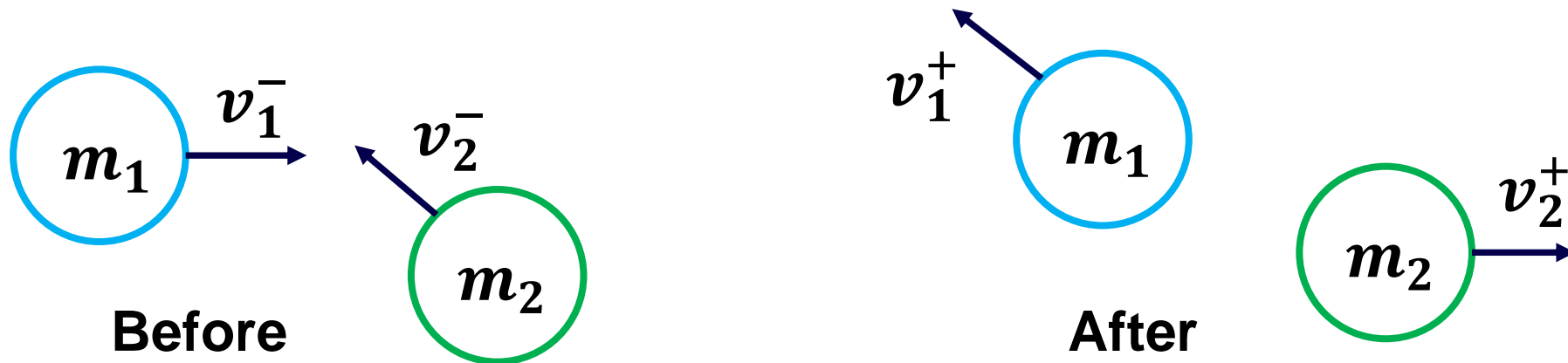
# Why use 'Impulse'?

- *Integrates with the physics solver*
- *How to integrate damping?*



# Particle-Particle Collisions (radius=0)

- Particle-particle **frictionless elastic impulse response**



- Momentum is **preserved**

$$m_1 v_1^- + m_2 v_2^- = m_1 v_1^+ + m_2 v_2^+$$

- Kinetic energy is **preserved**

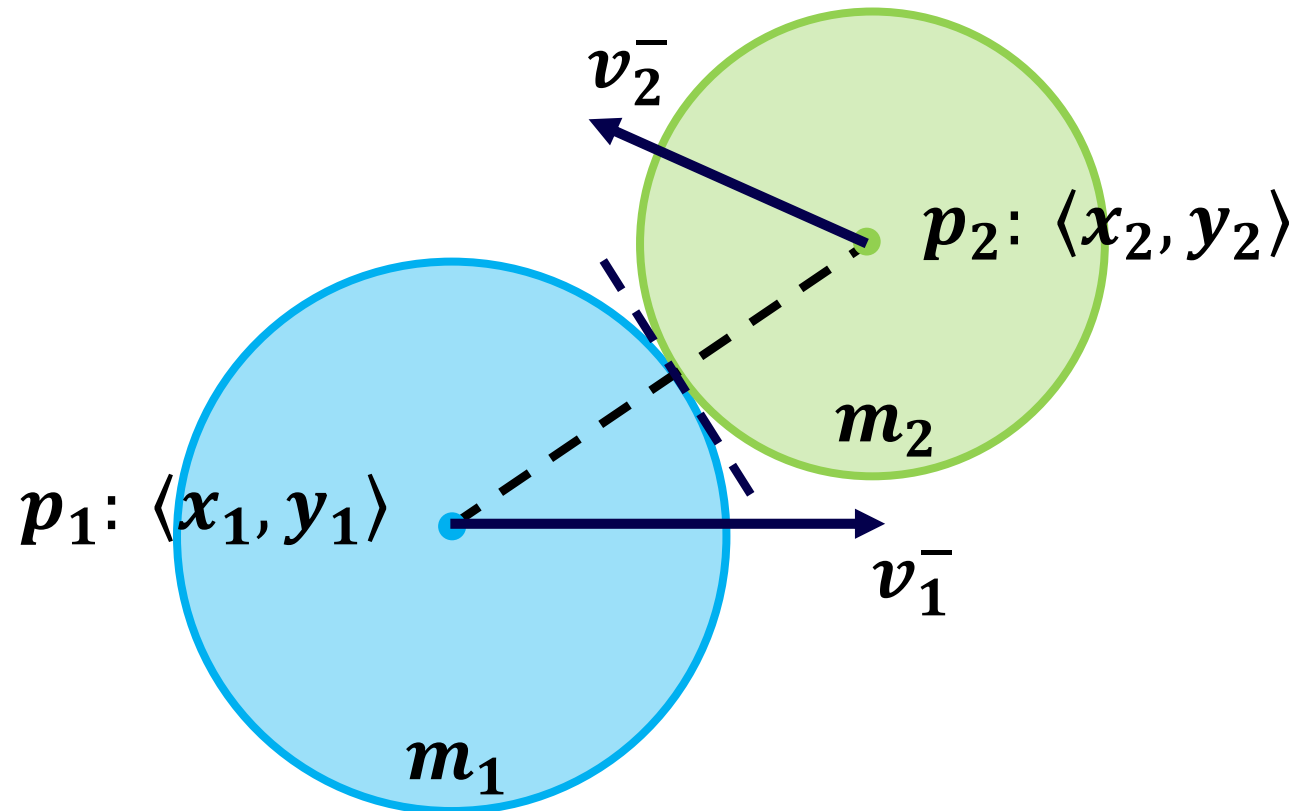
$$\frac{1}{2} m_1 v_1^{-2} + \frac{1}{2} m_2 v_2^{-2} = \frac{1}{2} m_1 v_1^{+2} + \frac{1}{2} m_2 v_2^{+2}$$

- Velocity is **preserved in tangential direction**

$$t \cdot v_1^- = t \cdot v_1^+, \quad t \cdot v_2^- = t \cdot v_2^+$$

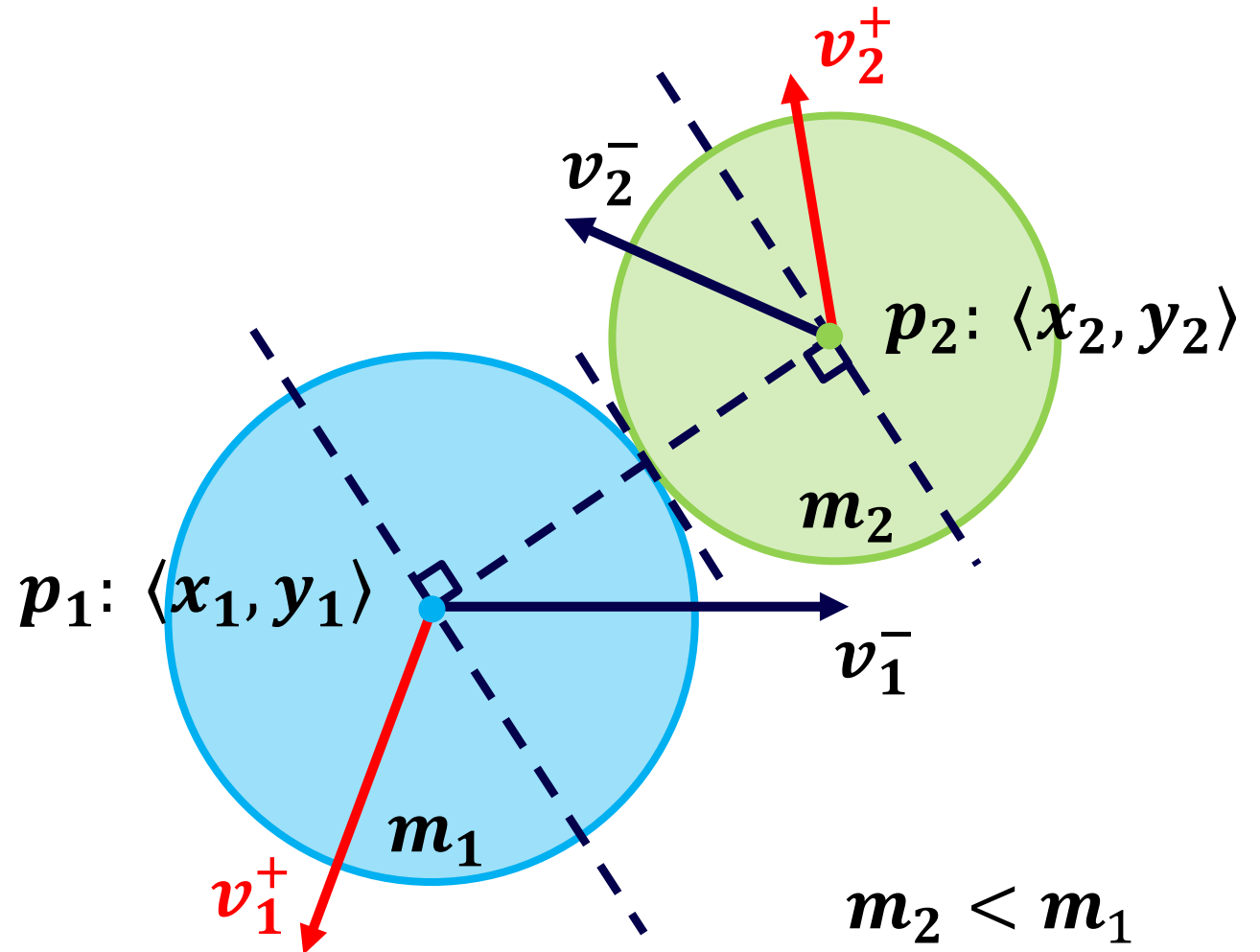
# Particle-Particle Collisions (radius >0)

- What we know...
  - *Particle centers*
  - *Initial velocities*
  - *Particle Masses*
- What we can calculate...
  - *Contact normal*
  - *Contact tangent*



# Particle-Particle Collisions (radius >0)

- Impulse **direction** reflected across **tangent**
- Impulse **magnitude** proportional to **mass of other particle**





# Particle-Particle Collisions (radius >0)

- **More formally...**

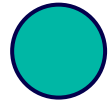
$$\mathbf{v}_1^+ = \mathbf{v}_1^- - \frac{2m_2}{m_1 + m_2} \frac{\langle \mathbf{v}_1^- - \mathbf{v}_2^- \rangle \cdot \langle \mathbf{p}_1 - \mathbf{p}_2 \rangle}{\|\mathbf{p}_1 - \mathbf{p}_2\|^2} \langle \mathbf{p}_1 - \mathbf{p}_2 \rangle$$

$$\mathbf{v}_2^+ = \mathbf{v}_2^- - \frac{2m_1}{m_1 + m_2} \frac{\langle \mathbf{v}_2^- - \mathbf{v}_1^- \rangle \cdot \langle \mathbf{p}_2 - \mathbf{p}_1 \rangle}{\|\mathbf{p}_2 - \mathbf{p}_1\|^2} \langle \mathbf{p}_2 - \mathbf{p}_1 \rangle$$

- This is in terms of velocity, what would the corresponding impulse be?

# Rigid Body Dynamics (rotational motion of objects?)

- From particles to rigid bodies...



**Particle**

$$state = \begin{cases} \vec{x} \text{ position} \\ \vec{v} \text{ velocity} \end{cases}$$

$\mathbb{R}^4$  in 2D

$\mathbb{R}^6$  in 3D



**Rigid body**

$$state = \begin{cases} \vec{x} \text{ position} \\ \vec{v} \text{ velocity} \\ R \text{ rotation matrix } 3 \times 3 \\ \vec{\omega} \text{ angular velocity} \end{cases}$$

$\mathbb{R}^{12}$  in 3D