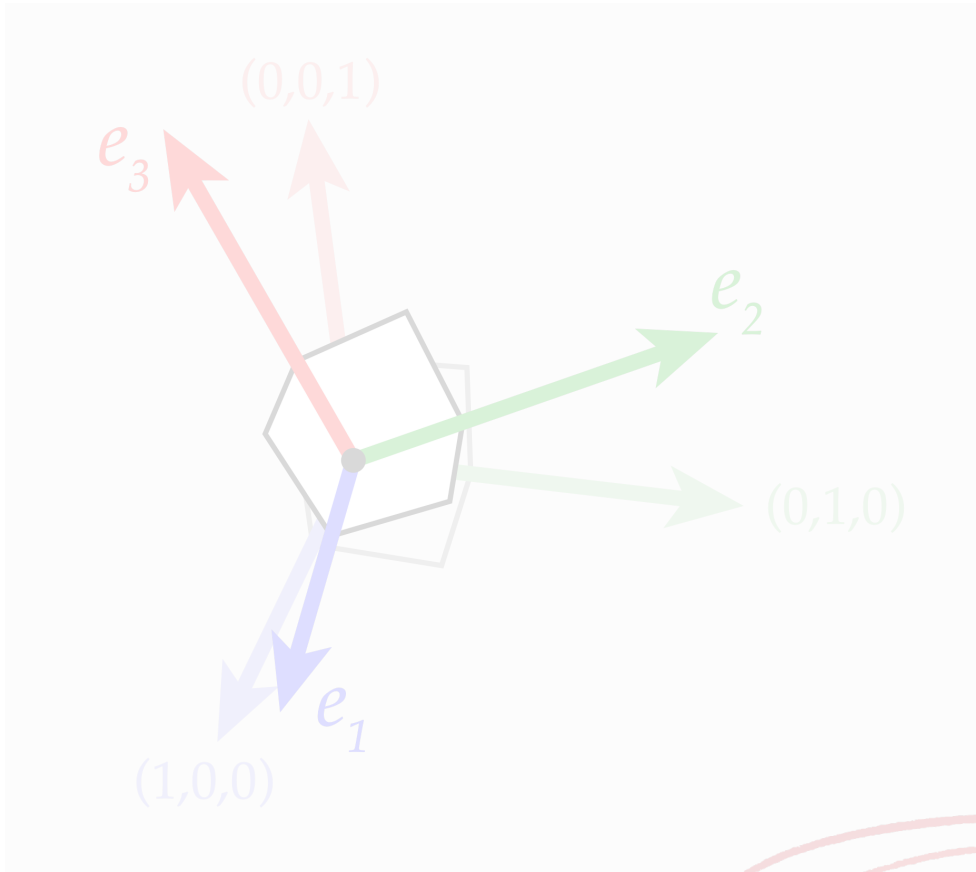


Final Review

Final Overview

- 80 minutes, 5 Problems worth 125 points in total
 - **Will be graded out of 100 points** (anything after that is extra credit)
 - First 4 problems (100pts) are based on lecture material found in these review slides
 - 5th problem (extra 25pts) may or may not come from these review slides :)
- Cheat sheet: one 3x3 inch note (about the size of a post it note) front and back
- **Please bring a pencil & pen to write your solutions**

3D Inverse Rotations



$$\begin{aligned}
 & \begin{matrix} R^T & R \\ \left[\begin{array}{c} \text{--- } e_1^T \text{ ---} \\ \text{--- } e_2^T \text{ ---} \\ \text{--- } e_3^T \text{ ---} \end{array} \right] & \left[\begin{array}{c|c|c} | & | & | \\ e_1 & e_2 & e_3 \\ | & | & | \end{array} \right] \end{matrix} \\
 = & \left[\begin{array}{ccc} \text{diagonal elements} & \text{orthogonality} & \text{orthogonality} \end{array} \right] = \begin{bmatrix} e_1^T e_1 & e_1^T e_2 & e_1^T e_3 \\ e_2^T e_1 & e_2^T e_2 & e_2^T e_3 \\ e_3^T e_1 & e_3^T e_2 & e_3^T e_3 \end{bmatrix}
 \end{aligned}$$

$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

If you need to review any slides more in depth, look here for which lecture it came from

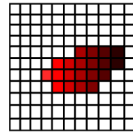
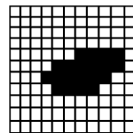
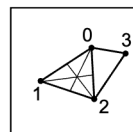
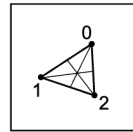
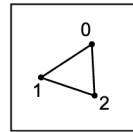
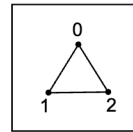
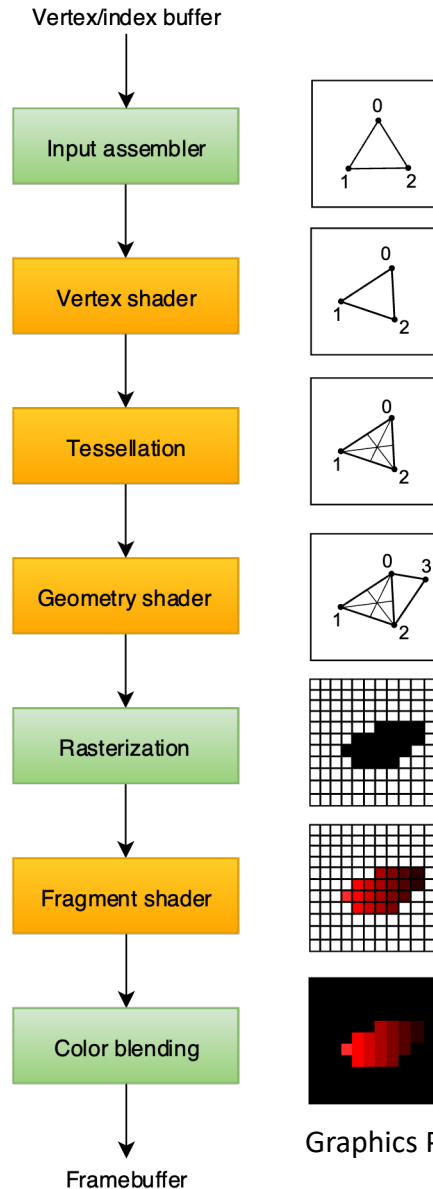
$$R^T R = I \Rightarrow R^T = R^{-1}$$

- **A1: Rasterization**
- A2: Geometry
- A3: Rendering
- A4: Animation

Pixel Pushing

- Shaders
 - Vertex Shader
 - Fragment Shader
- Texturing
 - Nearest Neighbor
 - Bilinear Filtering
 - Trilinear Filtering
- Perspective Transform
- Scene Graphs

The Graphics Pipeline



Graphics Pipeline Tutorial (2019) Vulkan

- Sometimes called the:
 - 3D Graphics Pipeline
 - Rasterization Pipeline
 - GPU Pipeline
- GPU was designed specifically to run this pipeline fast
- Entire pipeline was fixed-function.
 - You provide the **data**, a **vertex shader**, and a **fragment shader**, and the GPU does the rest.
 - **Fixed-function == fast!**
 - By limiting what an architecture can do, that makes the architecture really good at what it can do.
 - In graphics, we need to run the same operations over millions of datapoints.

Nearest Neighbor Sampling

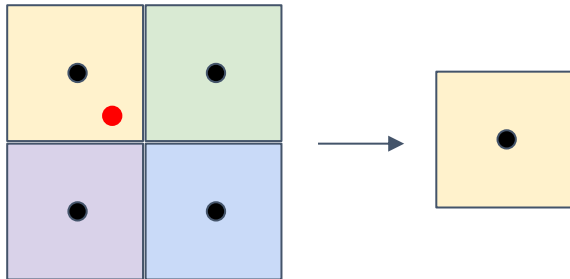
- **Idea:** Grab texel nearest to requested location in texture

$$x' \leftarrow \text{round}(x), \quad y' \leftarrow \text{round}(y)$$

- **Requires:**

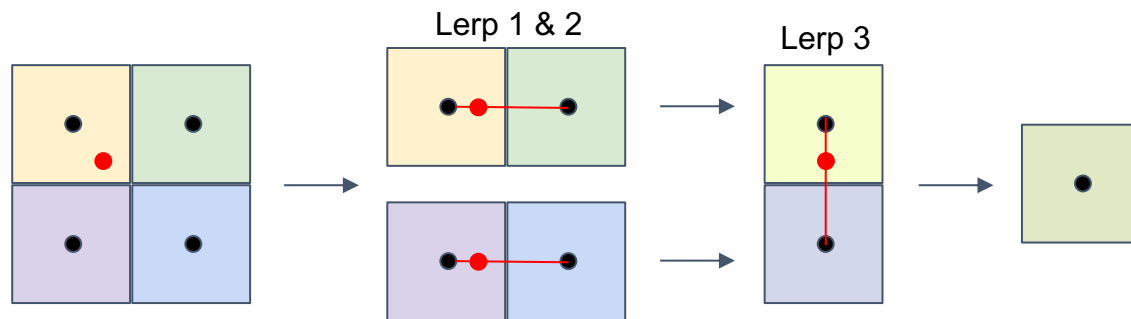
- 1 memory lookup
- 0 linear interpolations

$$t \leftarrow \text{tex.lookup}(x', y')$$



Bilinear Interpolation Sampling

- **Idea:** Grab nearest 4 texels and blend them together based on their inverse distance from the requested location
 - Blend two sets of pixels along one axis, then blend the remaining pixels
- **Requires:**
 - 4 memory lookup
 - 3 linear interpolations



$$x' \leftarrow \text{floor}(x), \quad y' \leftarrow \text{floor}(y)$$

$$\Delta x \leftarrow x - x'$$
$$\Delta y \leftarrow y - y'$$

$$t_{(x,y)} \leftarrow \text{tex.lookup}(x', y')$$

$$t_{(x+1,y)} \leftarrow \text{tex.lookup}(x' + 1, y')$$

$$t_{(x,y+1)} \leftarrow \text{tex.lookup}(x', y' + 1)$$

$$t_{(x+1,y+1)} \leftarrow \text{tex.lookup}(x', +1 y' + 1)$$

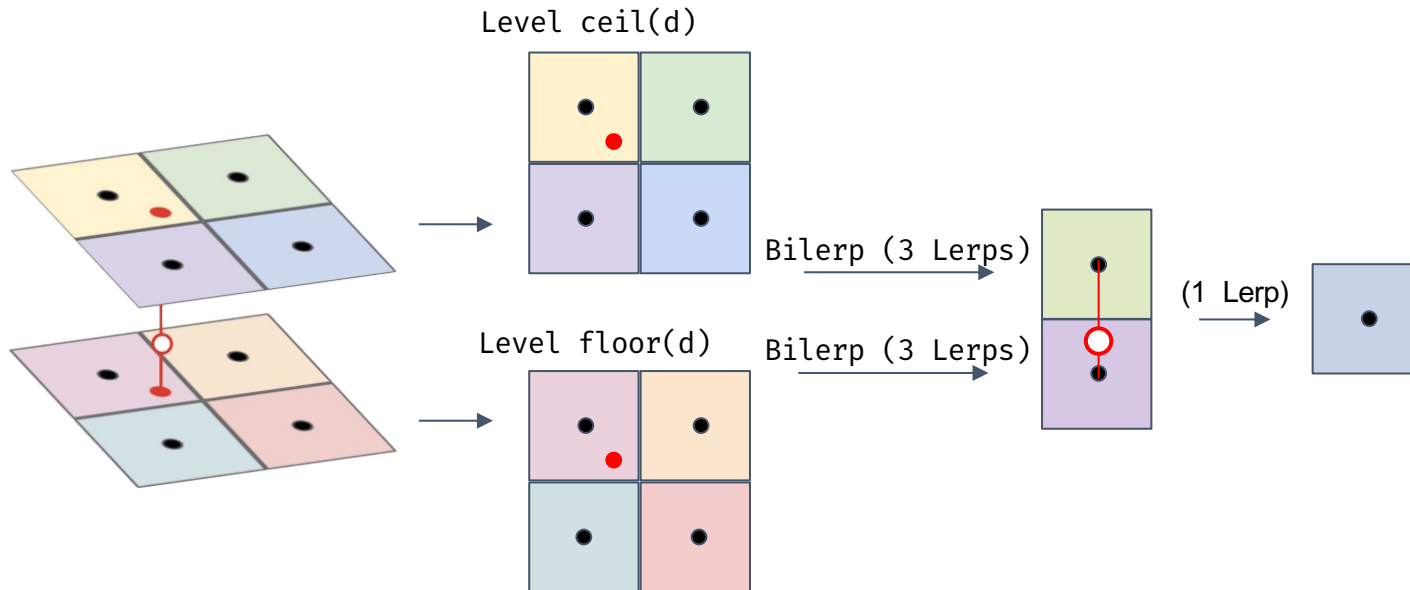
$$t_x \leftarrow (1 - \Delta x) * t_{(x,y)} + \Delta x * t_{(x+1,y)}$$

$$t_y \leftarrow (1 - \Delta x) * t_{(x,y+1)} + \Delta x * t_{(x+1,y+1)}$$

$$t \leftarrow (1 - \Delta y) * t_x + \Delta y * t_y$$

Trilinear Interpolation Sampling

- **Idea:** Perform bilinear interpolation on two layers of the mip-map that represents proper minification/magnification, blending the results together
- **Requires:**
 - 8 memory lookup
 - 7 linear interpolations



$$L_x^2 \leftarrow \frac{du^2}{dx} + \frac{dv^2}{dx}$$

$$L_y^2 \leftarrow \frac{du^2}{dy} + \frac{dv^2}{dy}$$

$$L \leftarrow \sqrt{\max(L_x^2, L_y^2)}$$

$$d \leftarrow \log_2 L$$

$$d' \leftarrow \text{floor}(d)$$

$$\Delta d \leftarrow d - d'$$

$$t_d \leftarrow \text{tex}[d']. \text{bilinear}(x, y)$$

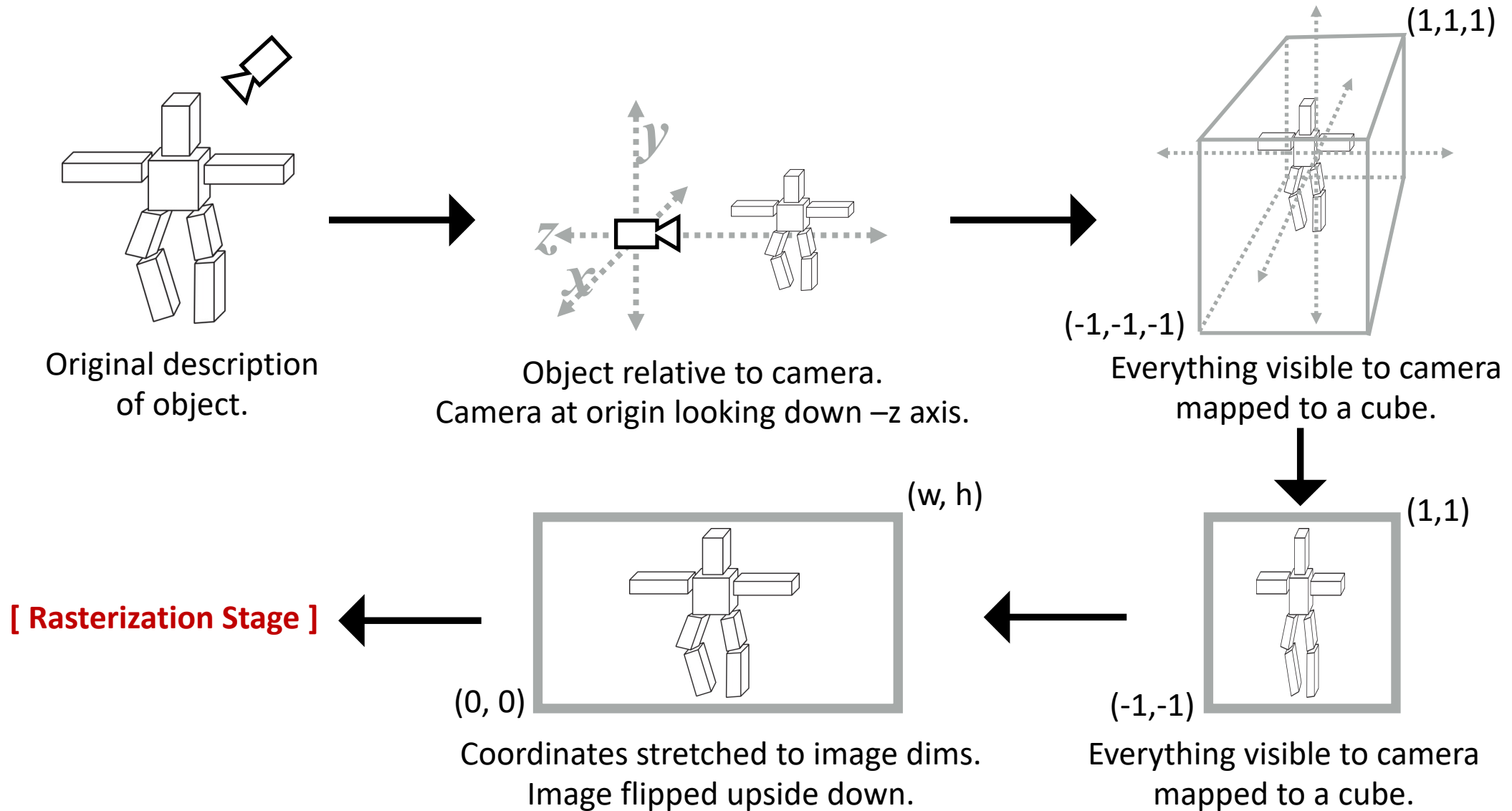
$$t_{d+1} \leftarrow \text{tex}[d' + 1]. \text{bilinear}(x, y)$$

$$t \leftarrow (1 - \Delta d) * t_d + \Delta d * t_{d+1}$$

Perspective Projection

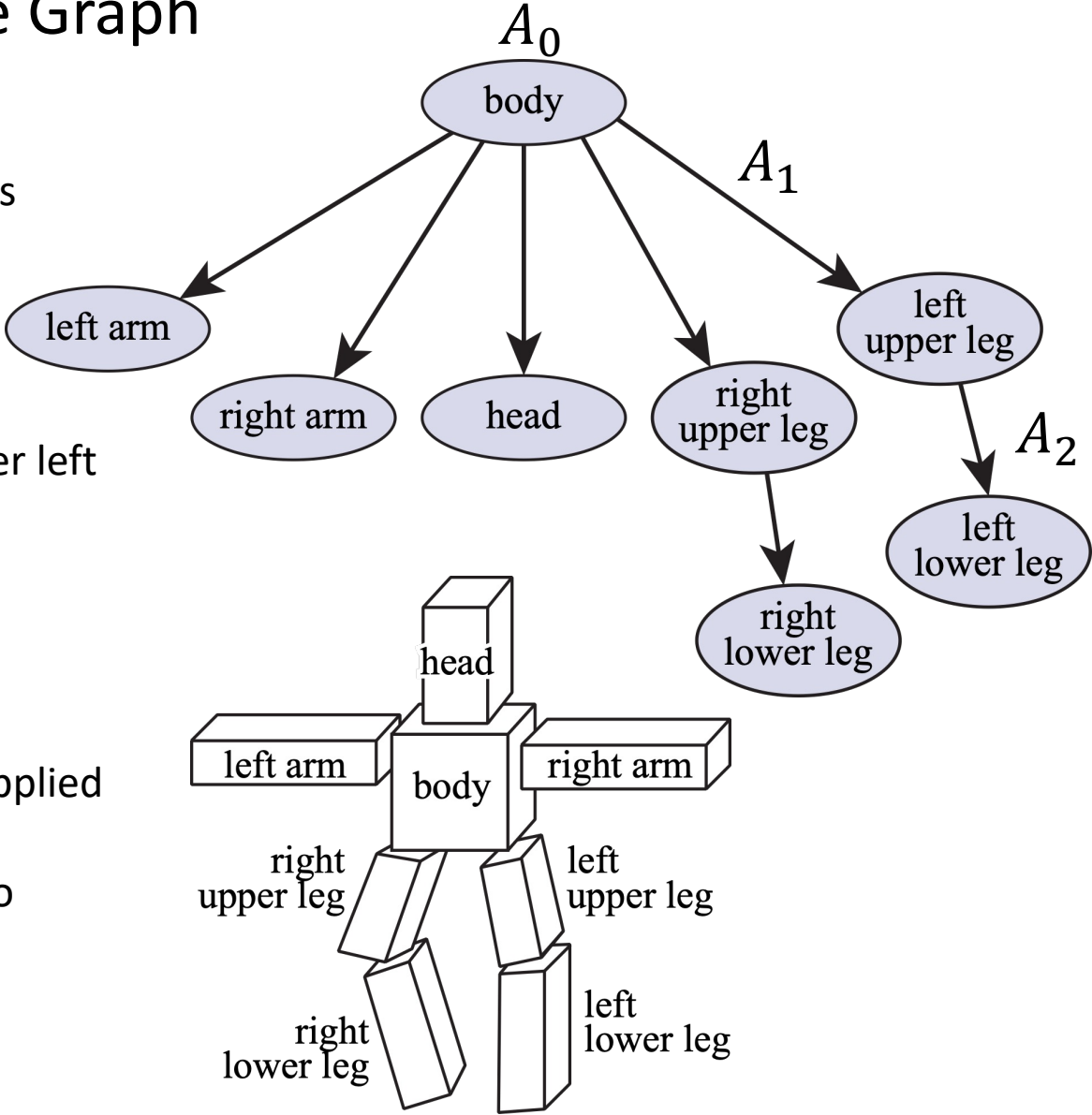


Perspective Projection



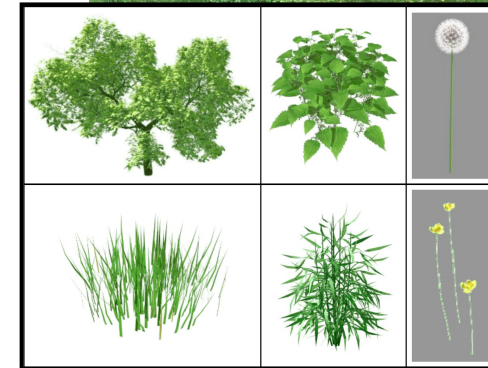
Scene Graph

- Suppose we want to build a skeleton out of cubes
- **Idea:** transform cubes in world space
 - Store transform of each cube
- **Problem:** If we rotate the left upper leg, the lower left leg won't track with it
 - **Better Idea:** store a hierarchy of transforms
 - Known as a **scene graph**
 - Each edge (+root) stores a linear transformation
 - Composition of transformations gets applied to nodes
 - Keep transformations on a stack to reduce redundant multiplication
- **Lower left leg transform:** $A_2A_1A_0$

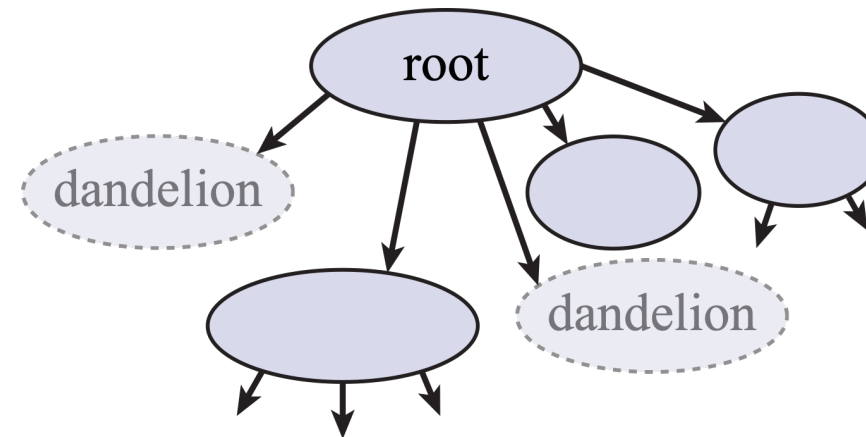
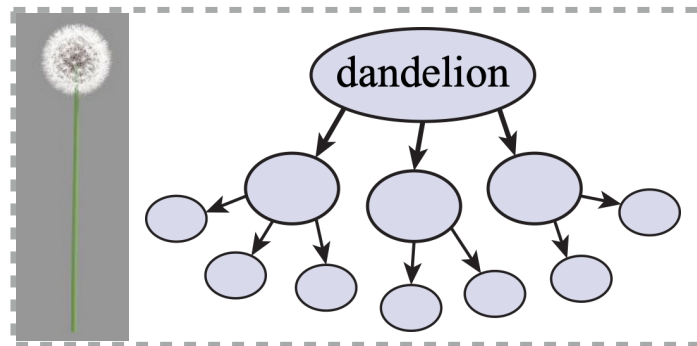


Instancing

- What if we want many copies of the same object in a scene?
 - Rather than have many copies of the geometry, scene graph, we can just put a “pointer” node in our scene graph
 - Saves a reference to a shared geometry
 - Specify a transform for each reference
 - **Careful:** Modifying the geometry will modify all references to it



Realistic modeling and rendering of plant ecosystems (1998) Deussen et al



- ~~A1: Rasterization~~

- **A2: Geometry**

- A3: Rendering

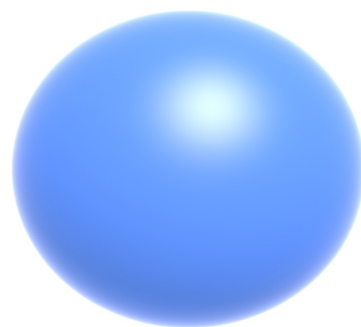
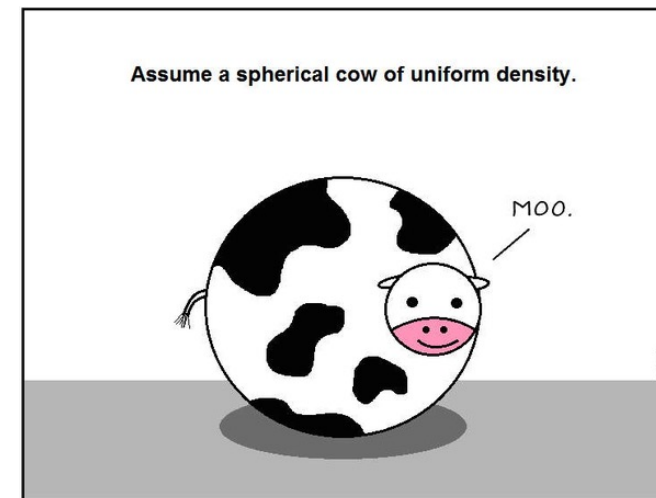
- A4: Animation

Meshes

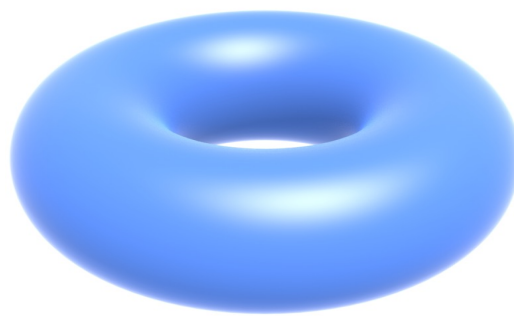
- Types of Geometric Representations
 - Algebraic Surfaces
 - CSG
 - Blobby
 - Level Set
 - Fractals
 - Point Cloud
 - Meshes
- Global Mesh Operations
 - Subdivision
 - Isotropic Remeshing
- Spatial Data Structures
 - BVH
 - KD-Tree
 - Uniform Grid
 - Quadtree/Octree

Algebraic Surfaces [Implicit]

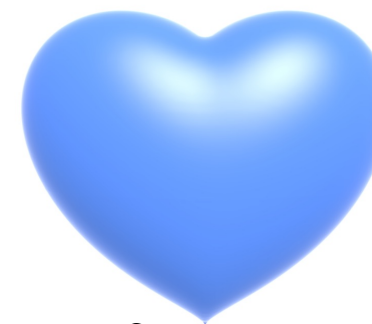
- Simple way to think of it: a surface built with algebra [math]
 - Generally thought of as a surface where points are some radius r away from another point/line/surface
- Easy to generate smooth/symmetric surfaces
 - Difficult to generate impurities/deformations



$$x^2 + y^2 + z^2 = 1$$



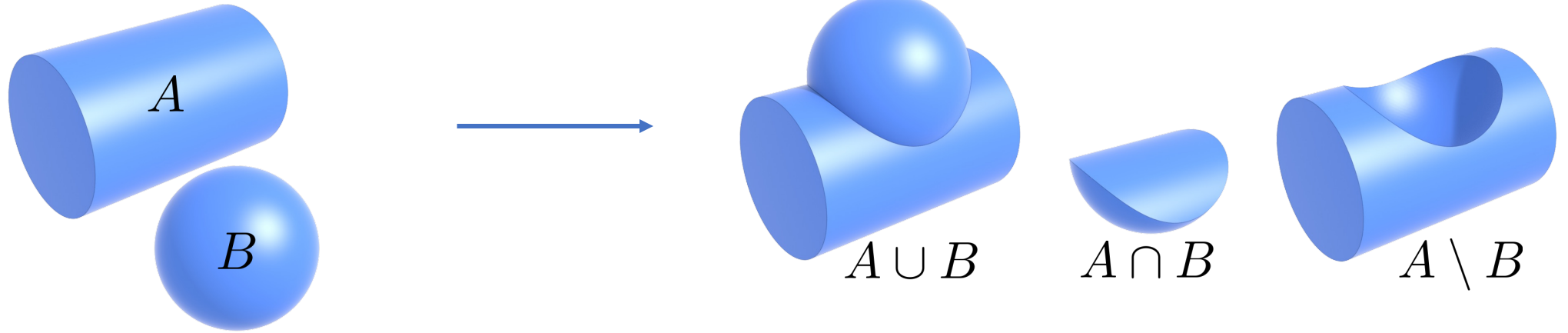
$$(R - \sqrt{x^2 + y^2})^2 + z^2 = r^2$$



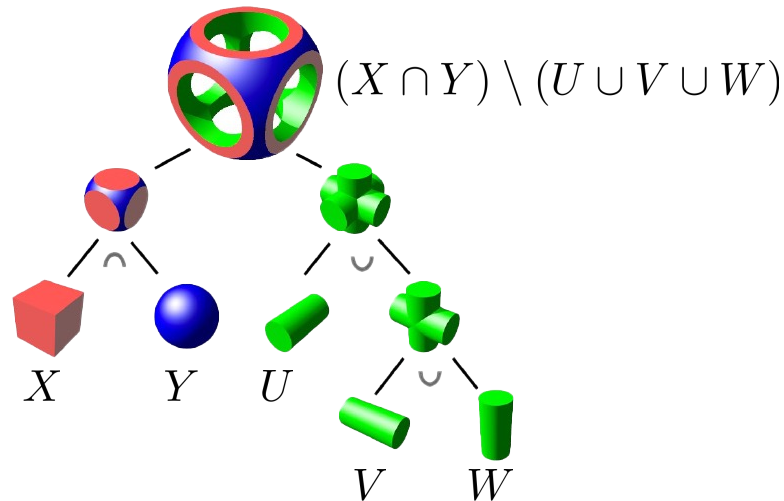
$$\left(x^2 + \frac{9y^2}{4} + z^2 - 1\right)^3 = x^2 z^3 + \frac{9y^2 z^3}{80}$$

Constructive Solid Geometry [Implicit]

- Build more complicated shapes via Boolean operations
 - Basic operations:

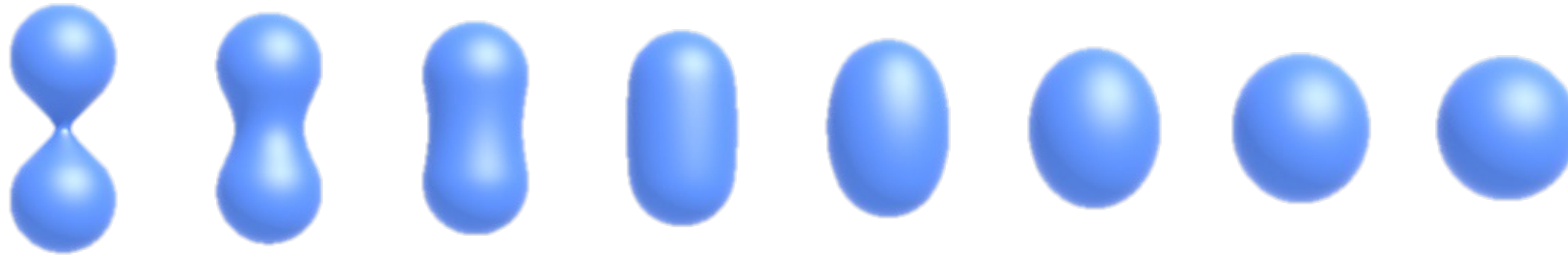


- Can be used to form complex shapes!

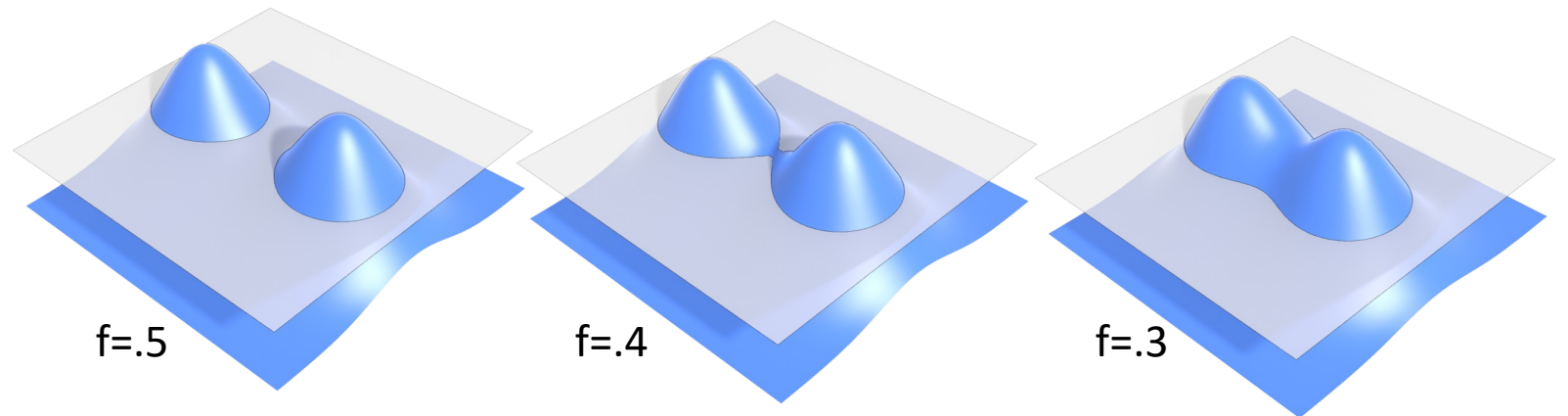


Bloppy Surfaces [Implicit]

- Instead of Booleans, gradually blend surfaces together:

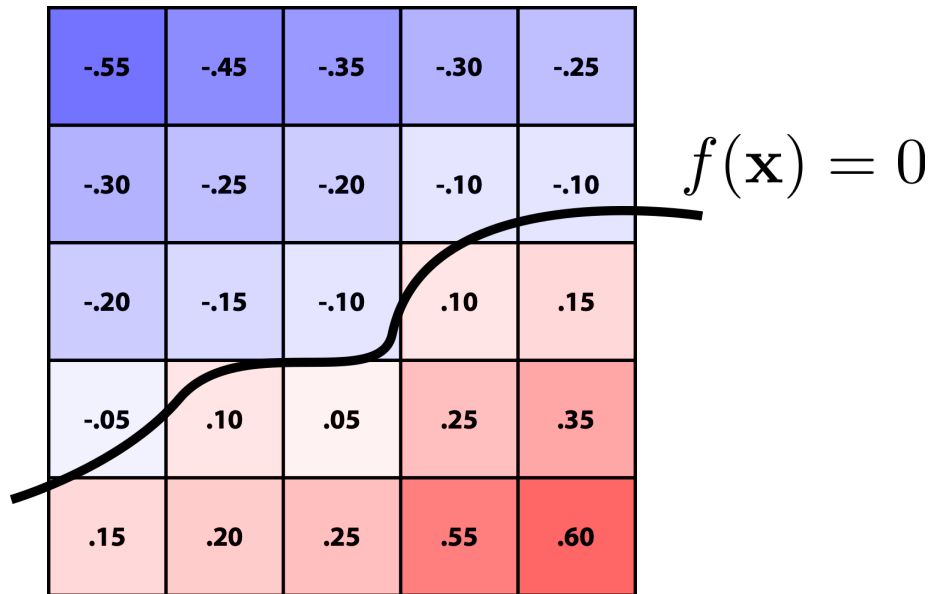


- Easier to understand in 2D: $\phi_p(x) := e^{-|x-p|^2}$ (Gaussian centered at p)
 $f := \phi_p + \phi_q$ (Sum of Gaussians centered at different points)



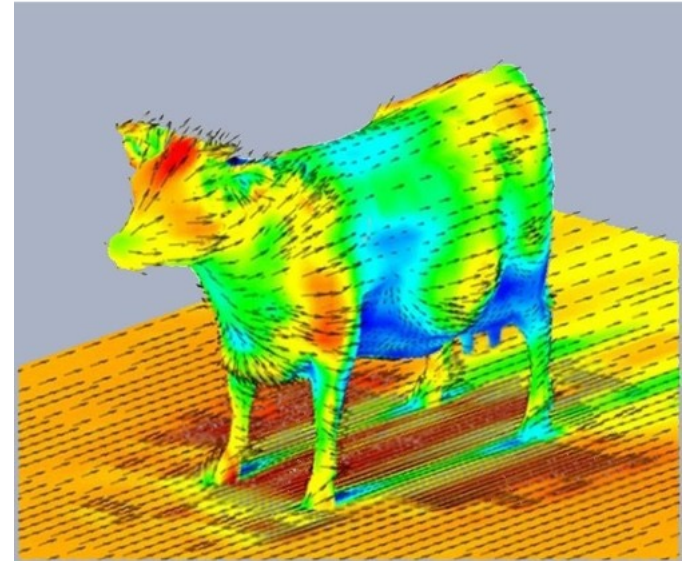
Level Set Methods [Implicit]

- Implicit surfaces have some nice features (e.g., merging/splitting)
 - But, hard to describe complex shapes in closed form
 - **Alternative:** store a grid of values approximating function



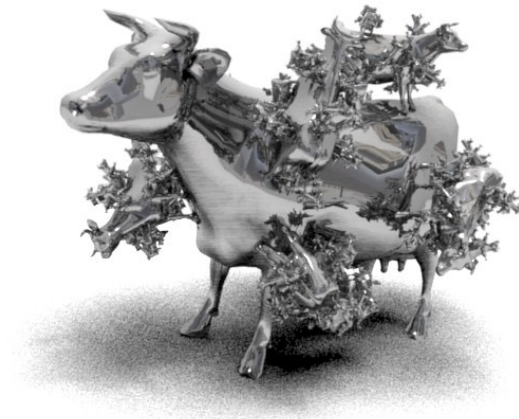
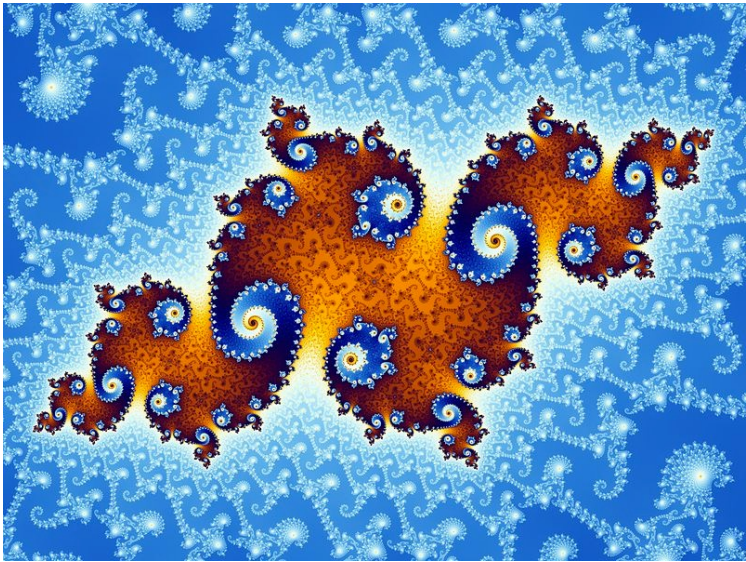
- Surface is found where interpolated values equal zero
- Provides much more explicit control over shape (like a texture)
- Unlike closed-form expressions, runs into problems of aliasing!

The aerodynamics of a cow:



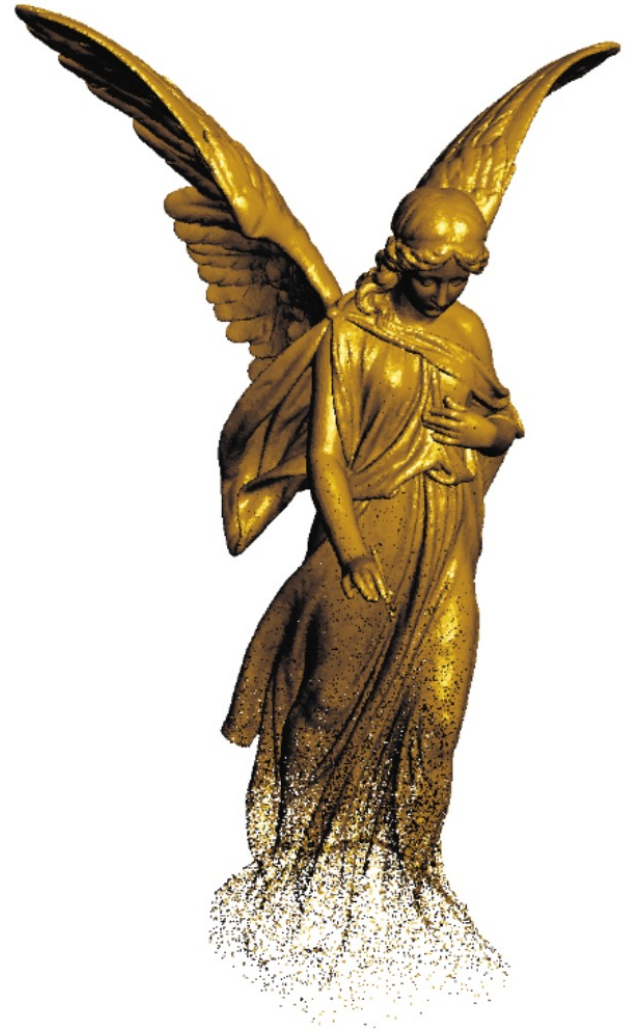
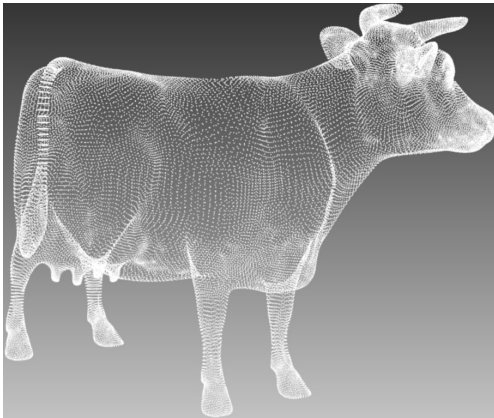
Fractals [Implicit]

- No precise definition; exhibit self-similarity, detail at all scales
- New “language” for describing natural phenomena
- Hard to control shape!



Point Cloud [Explicit]

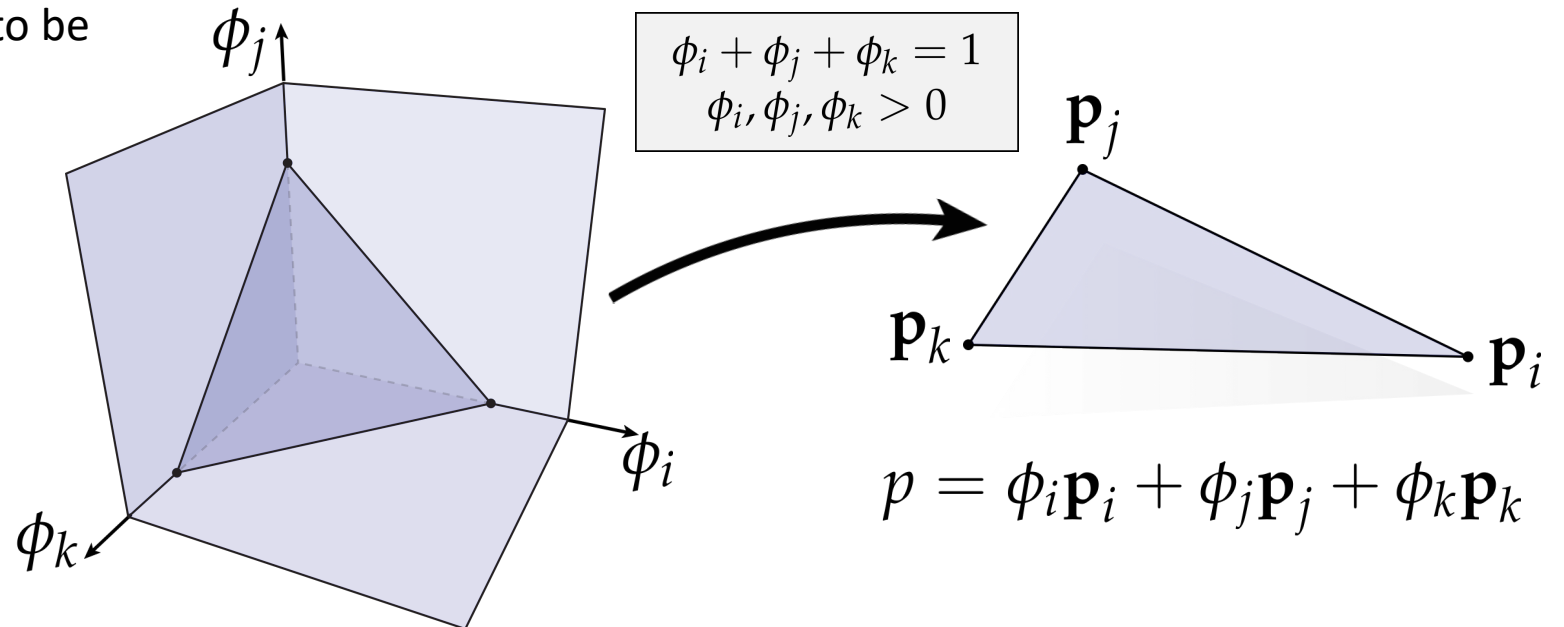
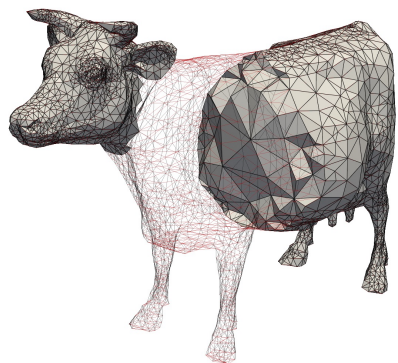
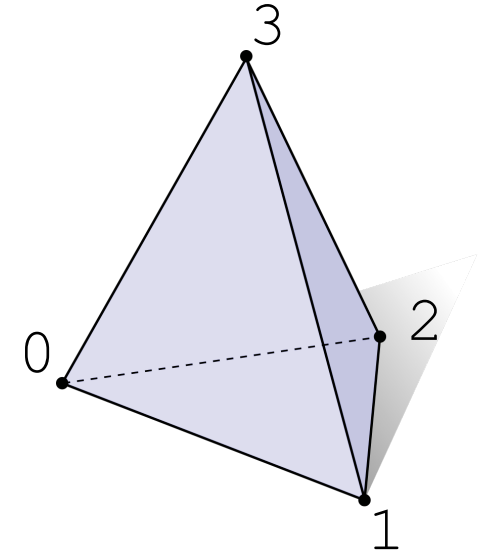
- Easiest representation: list of points (x, y, z)
 - Often augmented with normal
- Easily represent any kind of geometry
- Easy to draw dense cloud ($\gg 1$ point/pixel)
- Easy for simulation
- Large lookup time
- Large memory overhead
 - Hard to interpolate undersampled regions
 - Hard to do processing / simulation /
 - Result is just as good as the scan



Triangle Mesh [Explicit]

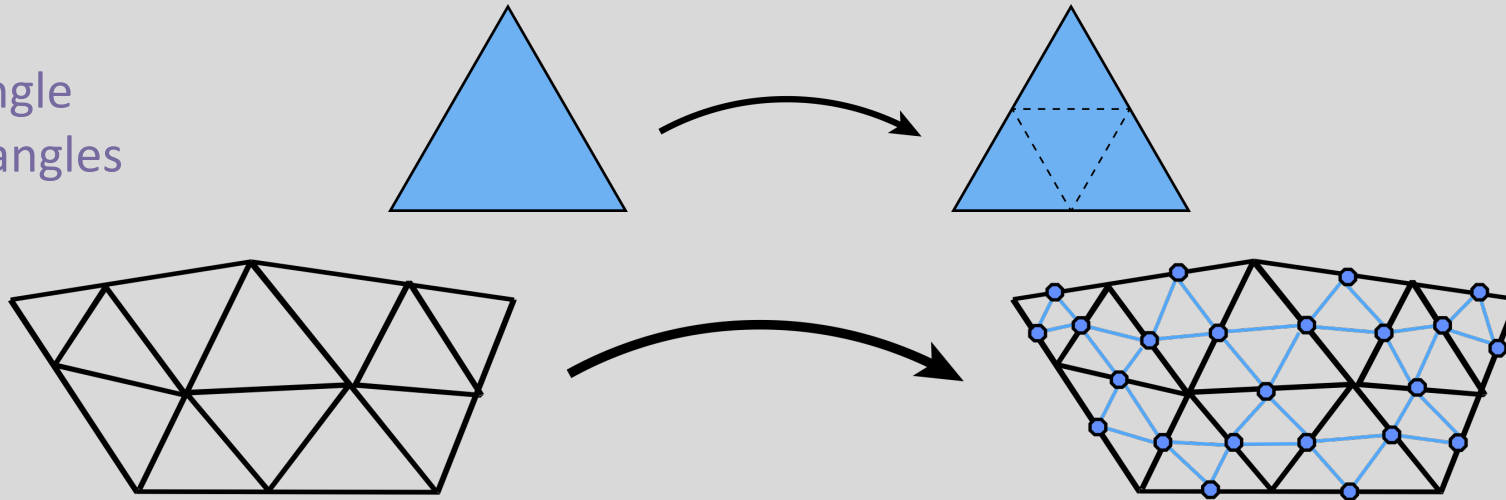
- Large memory overhead
 - Store vertices as triples of coordinates (x,y,z)
 - Store triangles as triples of indices (i,j,k)
- Easy interpolation with good approximation
 - Use barycentric interpolation to define points inside triangles
- Polygonal Mesh: shapes do not need to be triangles
 - Ex: quads

	[VERTICES]			[TRIANGLES]		
	x	y	z	i	j	k
0:	-1	-1	-1	0	2	1
1:	1	-1	1	0	3	2
2:	1	1	-1	3	0	1
3:	-1	1	1	3	1	2

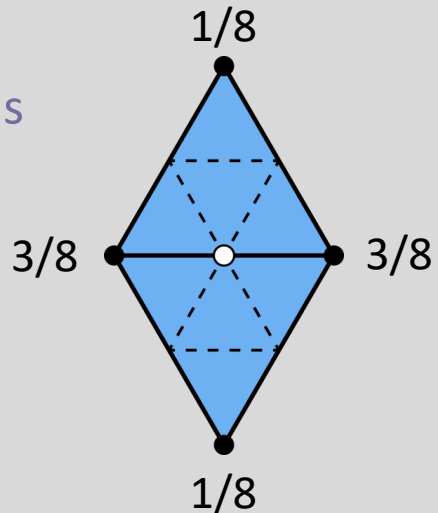


Loop Subdivision

Step 1:
Split triangle
into 4 triangles

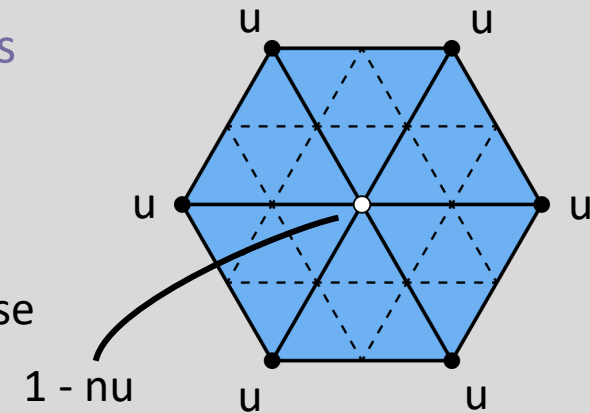


Step 2:
Assign new coords



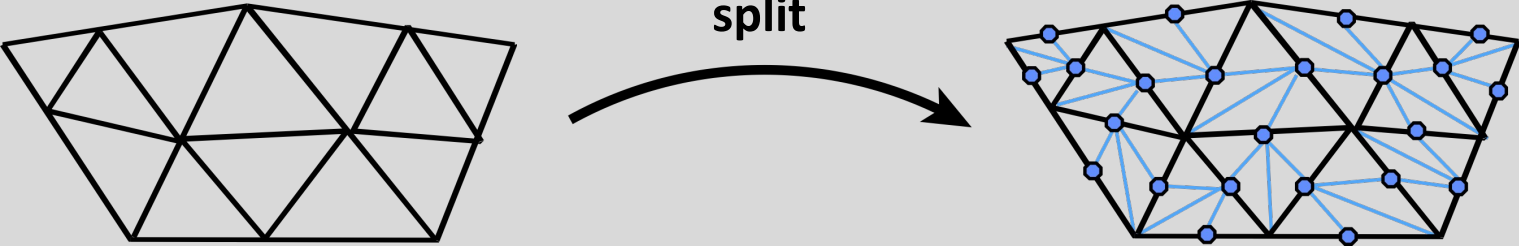
Step 3:
Assign old coords

n - vertex degree
 u - $3/16$ if $n=3$
 $3/(8n)$ otherwise

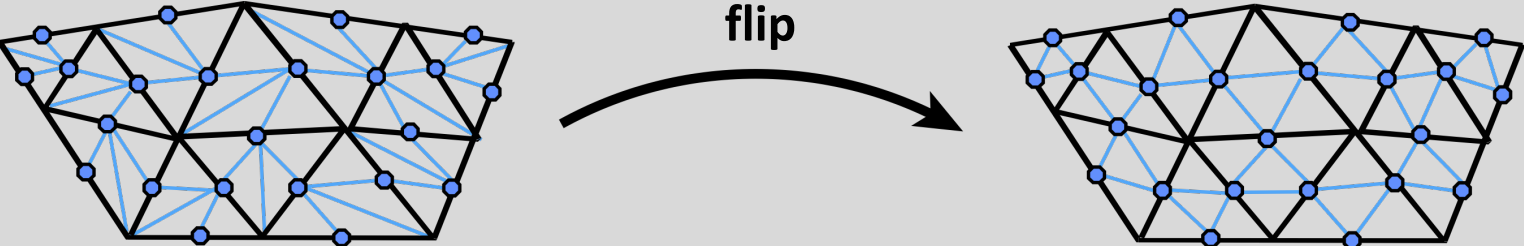


Loop Subdivision Using Local Ops

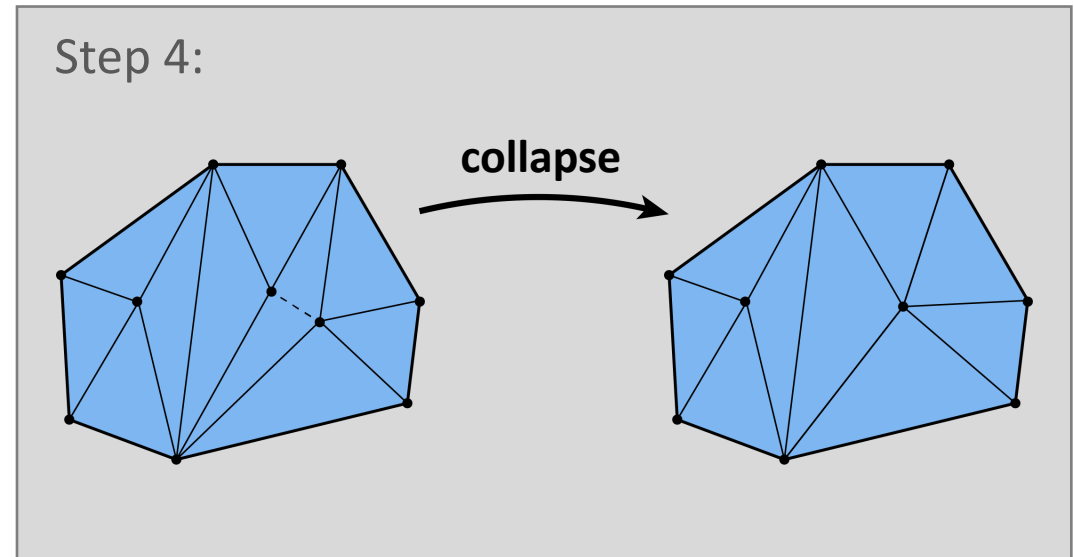
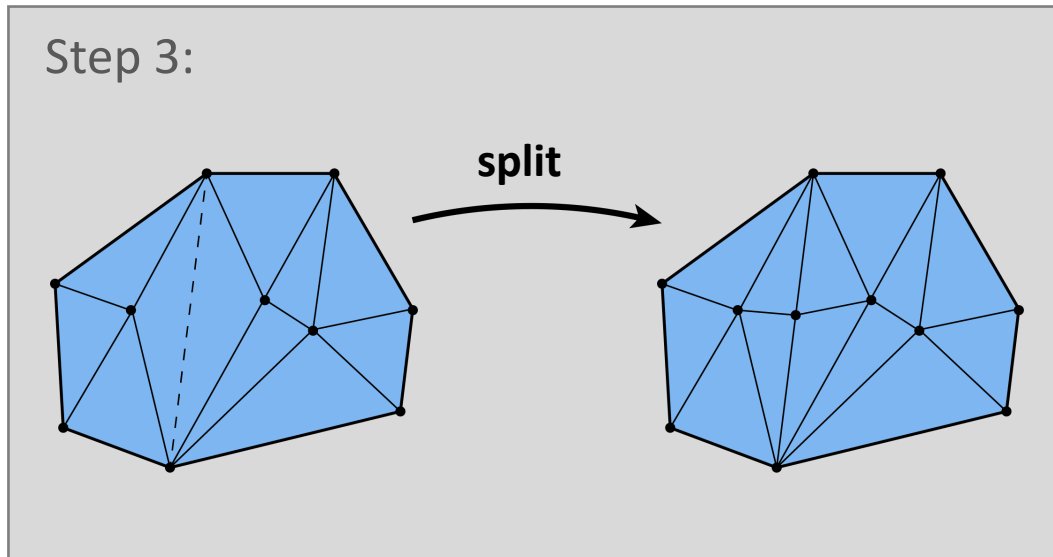
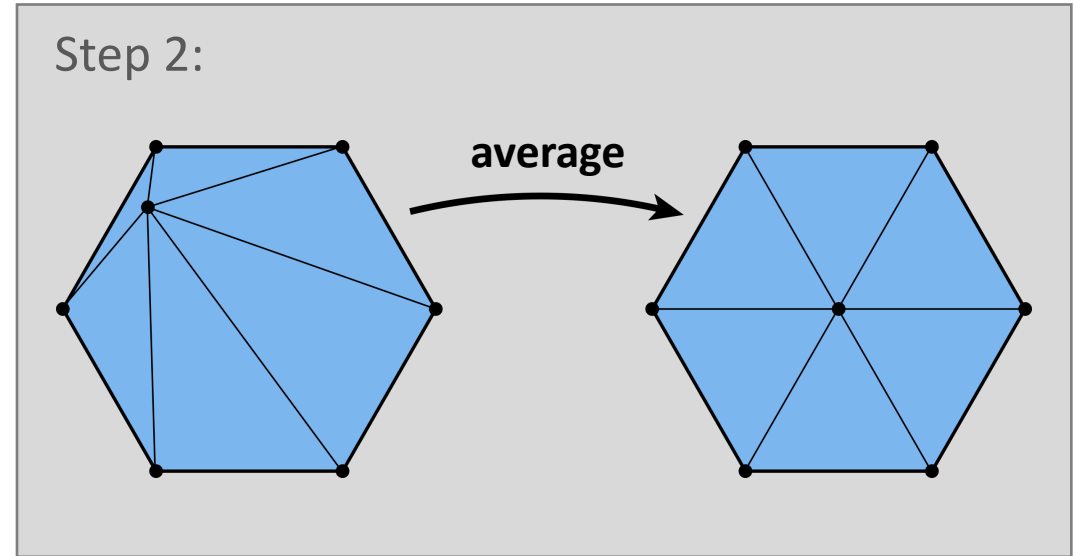
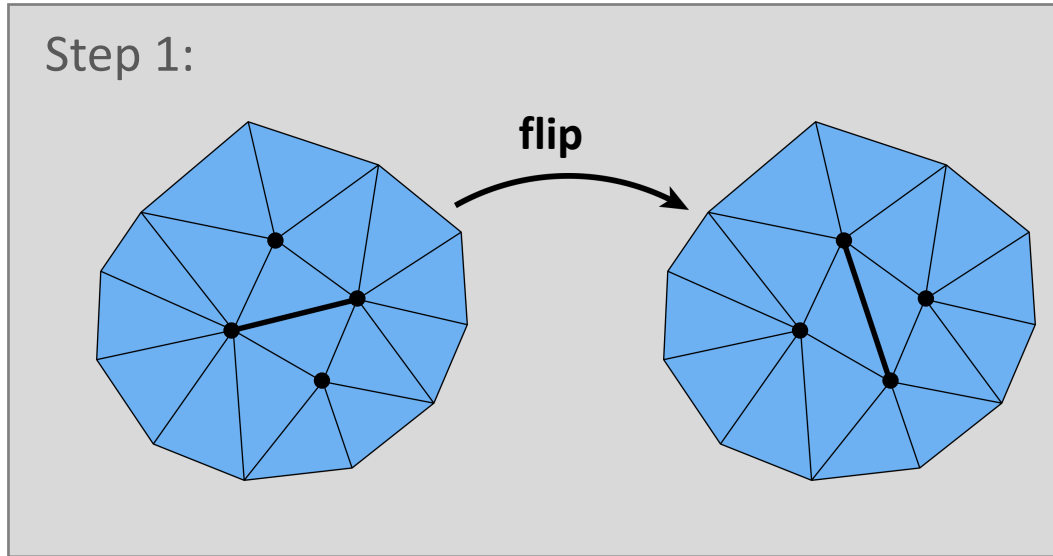
Step 1:
Split all edges in any order



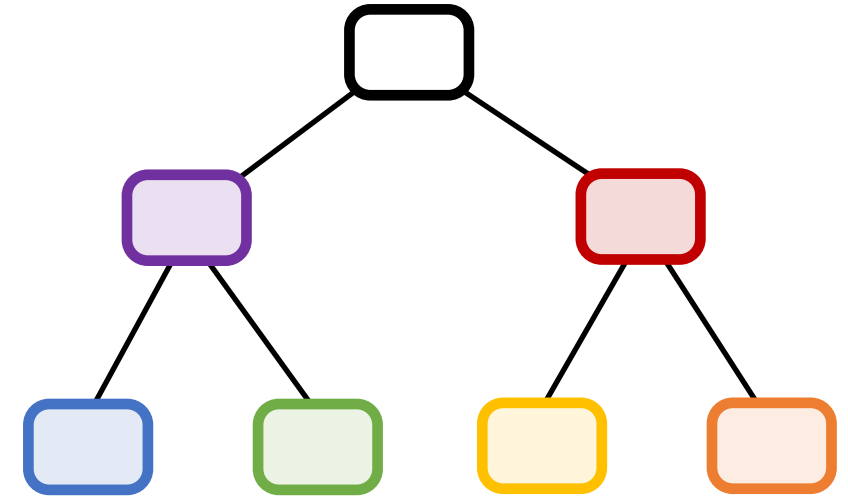
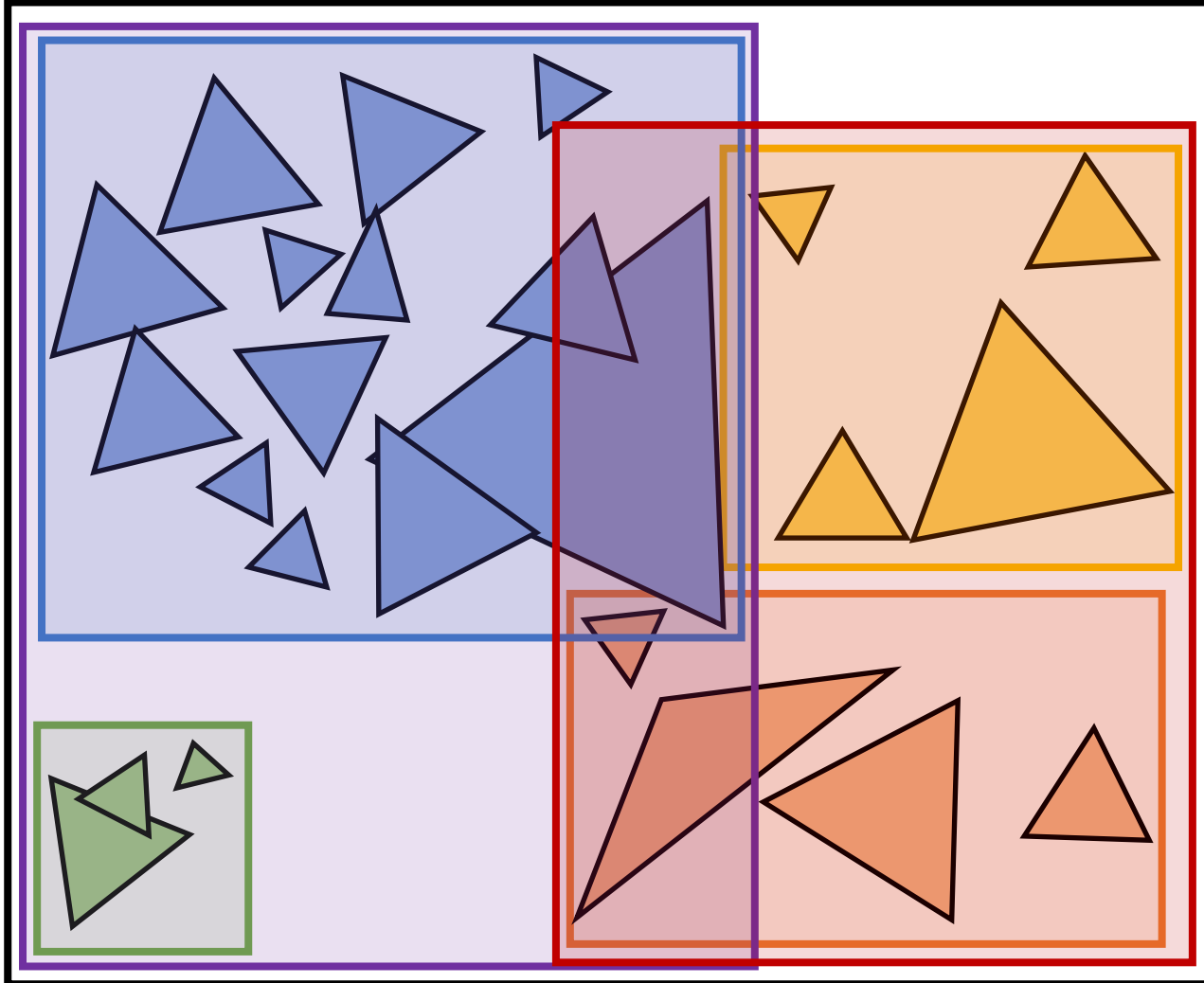
Step 2:
Flip new edges until they touch two new vertices



Isotropic Remeshing

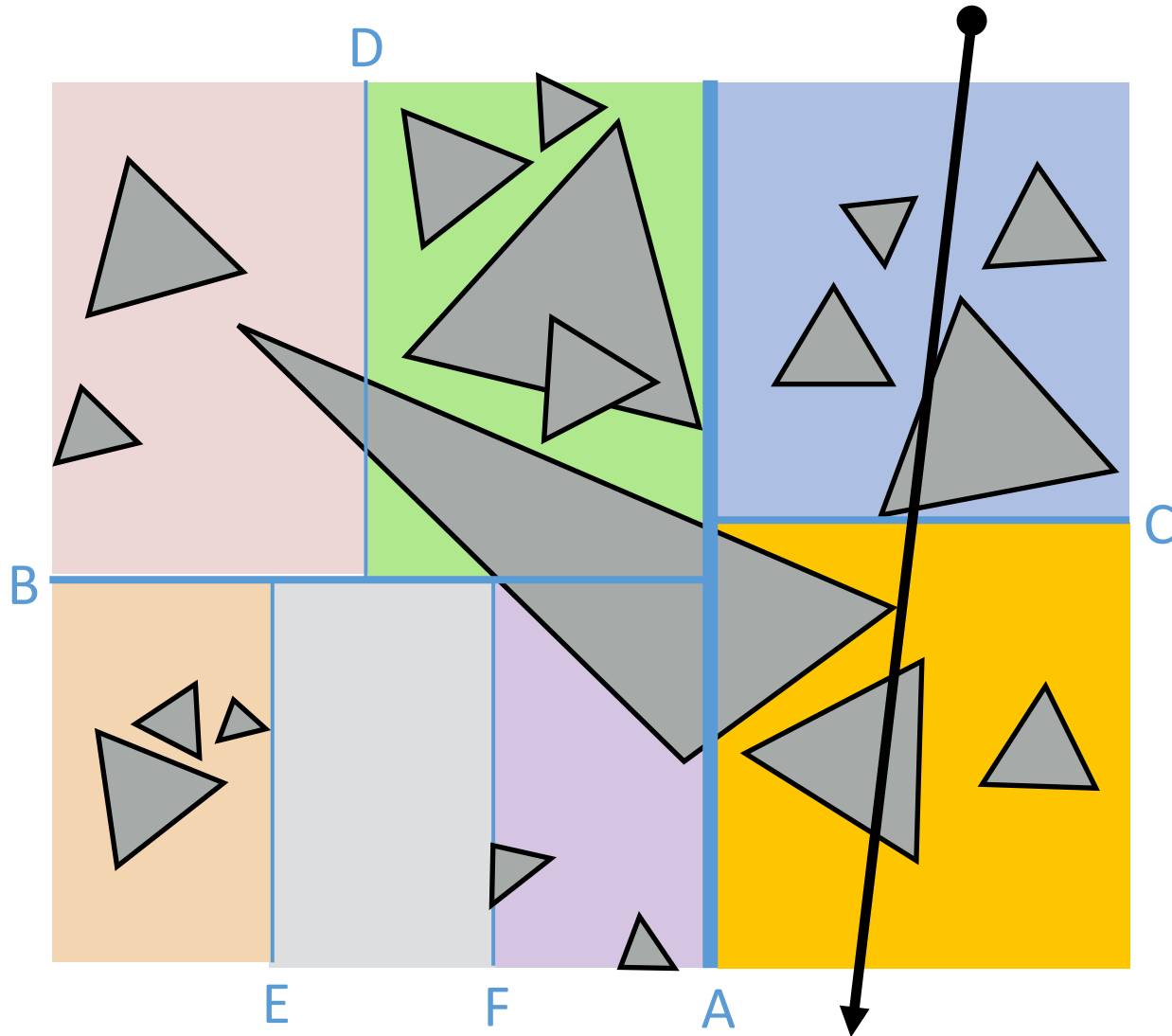


BVH Example

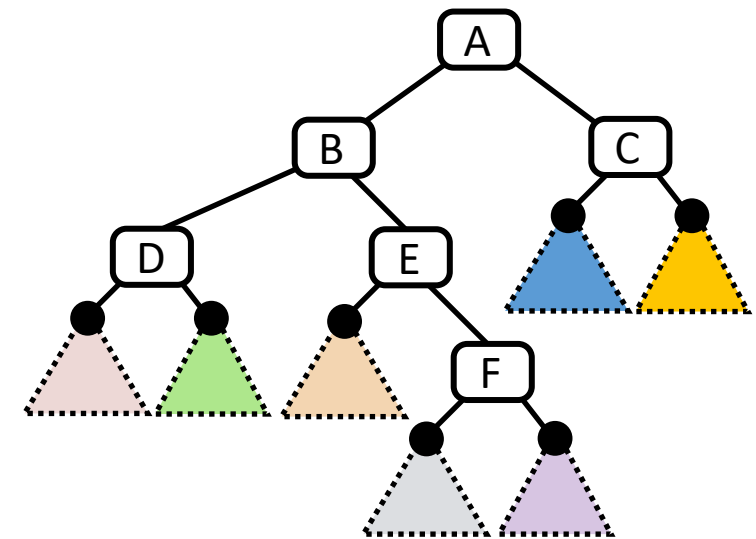


Bounding boxes will sometimes intersect!

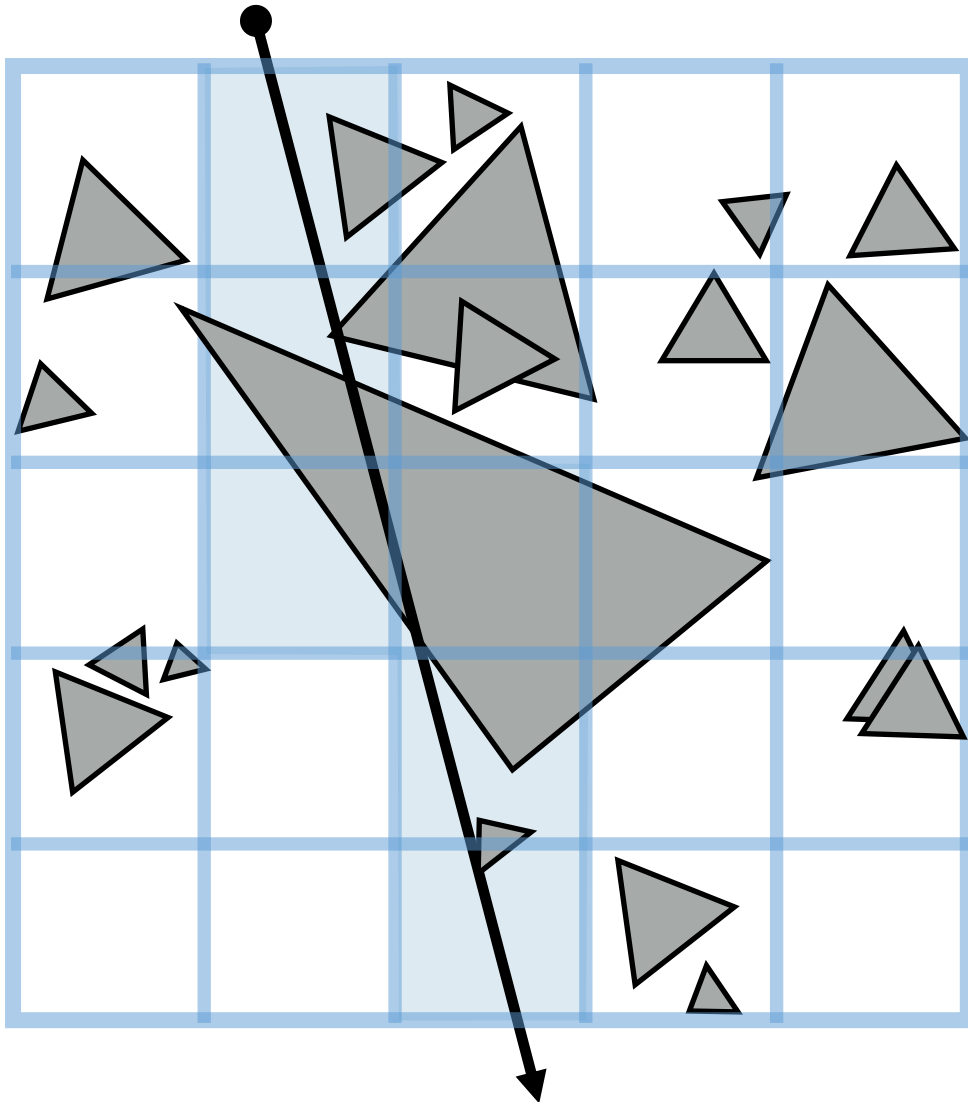
K-D Trees



- Recursively partition space via axis-aligned partitioning planes
 - Interior nodes correspond to spatial splits
 - Node traversal proceeds in front-to-back order
 - Unlike BVH, can terminate search after first hit is found
 - Still $O(\log(N))$ performance

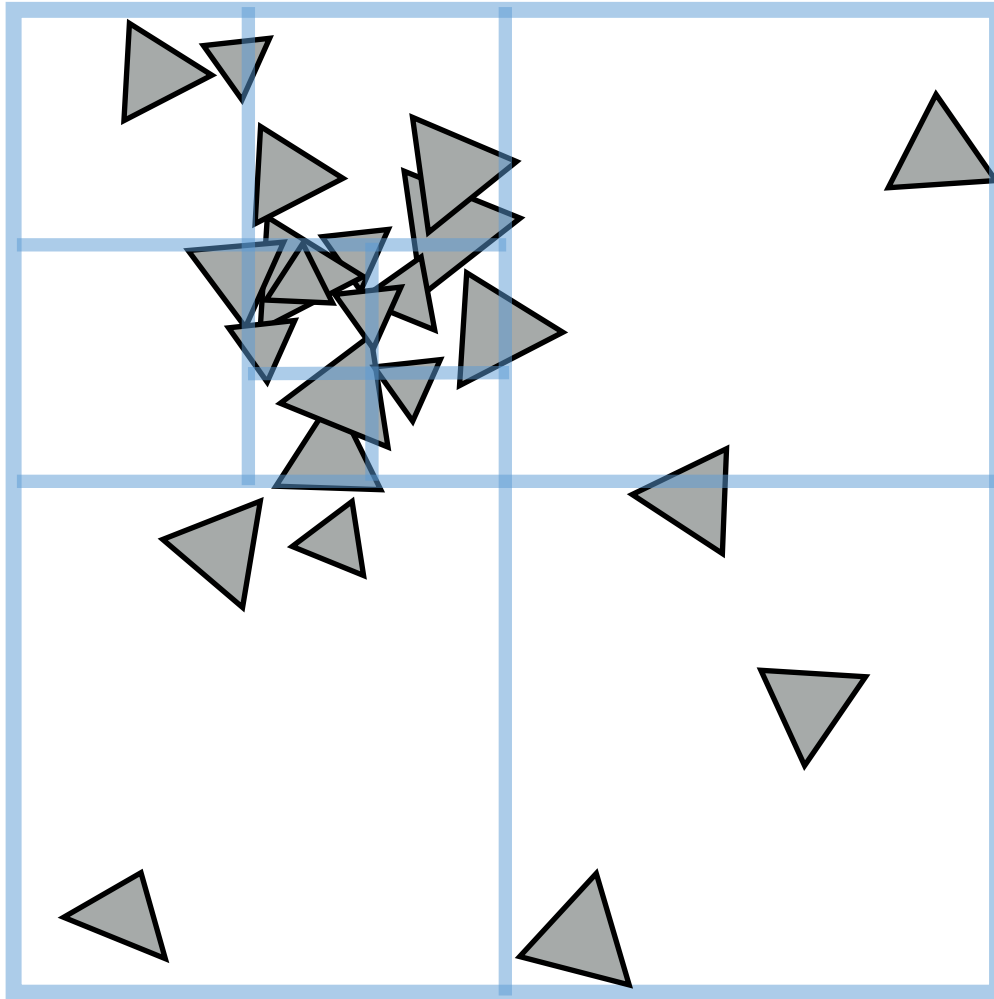


Uniform Grid



- Partition space into equal sized volumes (volume-elements or “voxels”)
- Each grid cell contains primitives that overlap voxel. (very cheap to construct acceleration structure)
- Walk ray through volume in order
 - Very efficient implementation possible (think: 3D line rasterization)
 - Only consider intersection with primitives in voxels the ray intersects
- What is a good number of voxels?
 - Should be proportional to total number of primitives N
 - Number of cells traversed is proportional to $O(\sqrt[3]{N})$
 - A line going through a cube is a cubed root
 - Still not as good as $O(\log(N))$

Quad-Tree/Octree



- Like uniform grid, easy to build
- Has greater ability to adapt to location of scene geometry than uniform grid
 - Still not as good adaptability as K-D tree
- **Quad-tree:** nodes have 4 children
 - Partitions 2D space
- **Octree:** nodes have 8 children
 - Partitions 3D space

- ~~A1: Rasterization~~

- ~~A2: Geometry~~

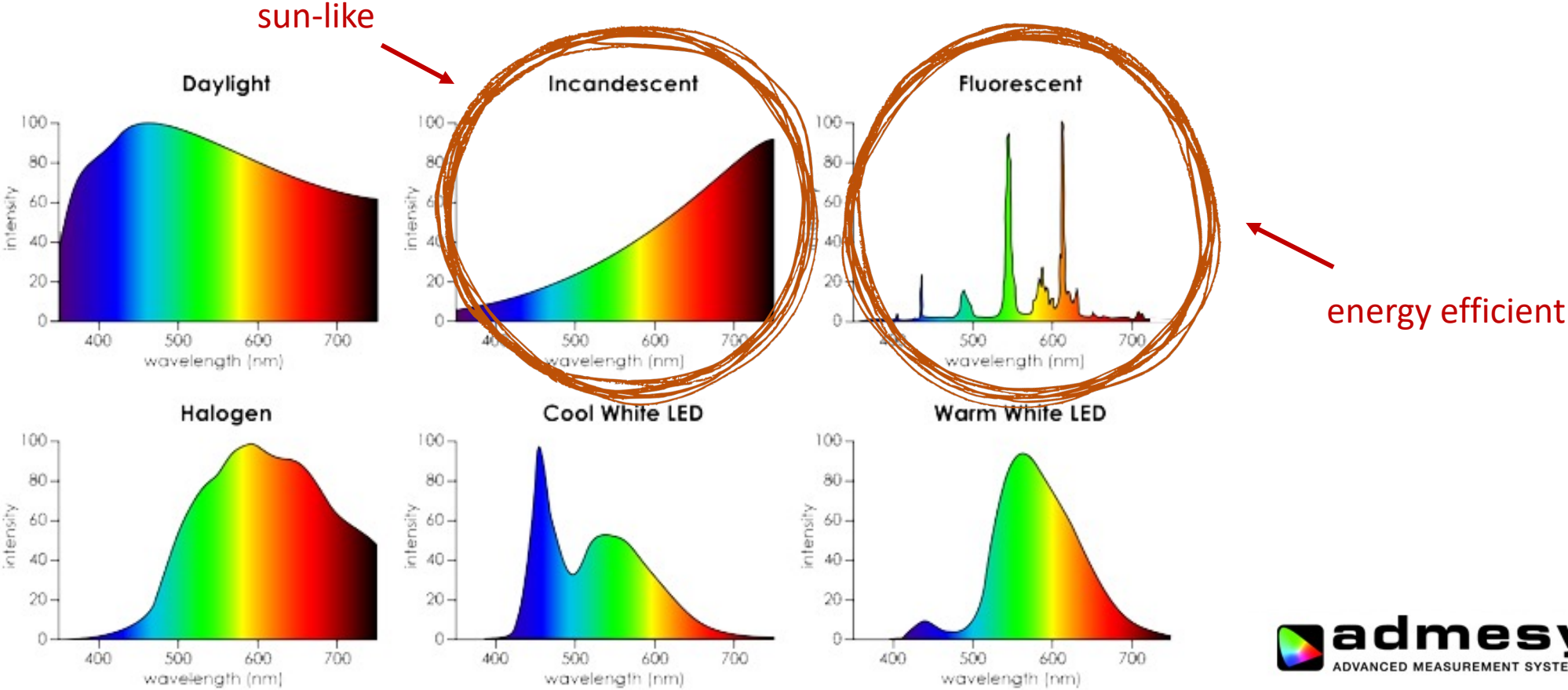
- A3: Rendering

- A4: Animation

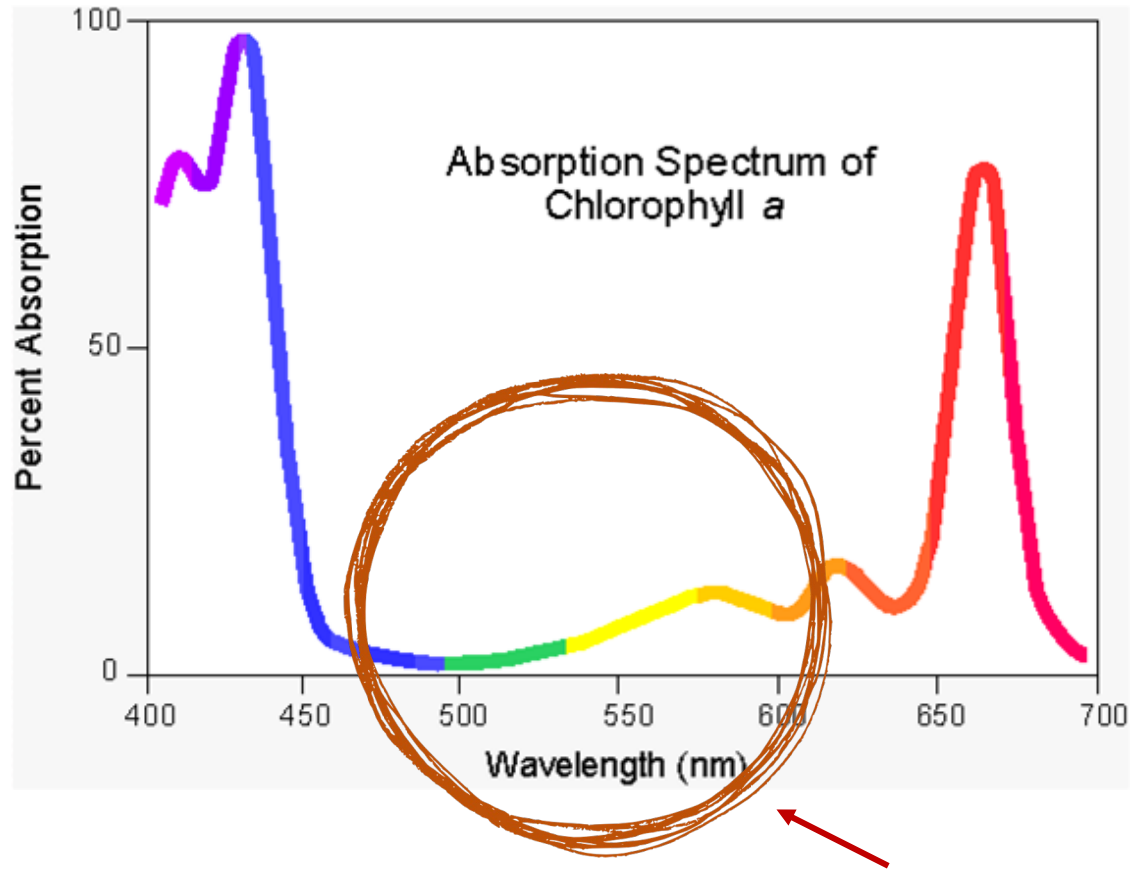
Color & Radiometry

- Absorption vs Emission
- Eyes vs Cameras
 - Pupil
 - Lens
 - Rods
 - Cones
- Radiance
 - Radiant Energy
 - Radiant Energy Density
 - Radiant Flux
 - Irradiance
- Lambert's Law

Emission Spectrum Examples



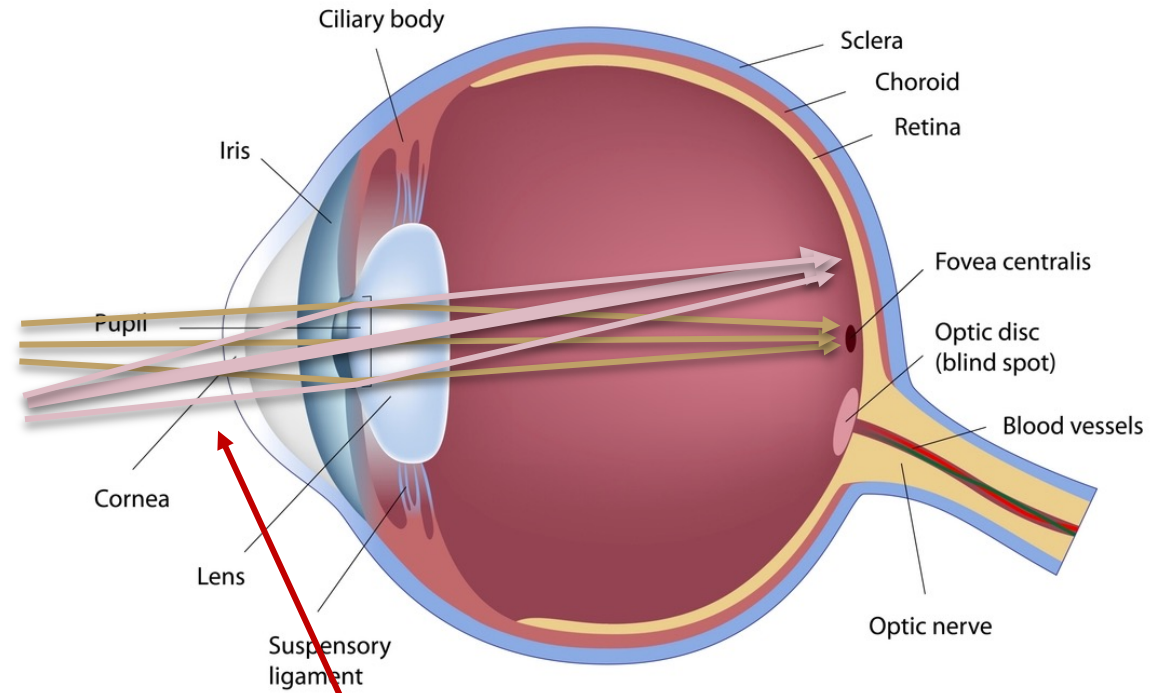
Absorption Spectrum Examples



plants are green because they do not absorb green light

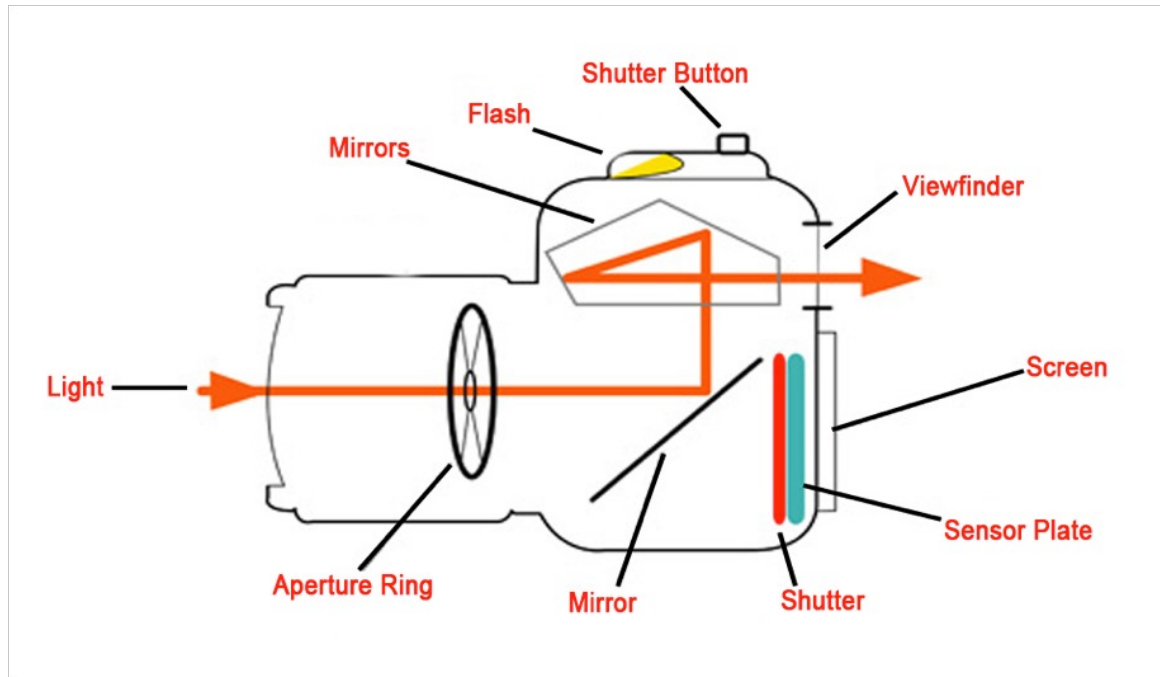
'Eye' See What You Mean

- Eyes are biological cameras
 - Light passes through the pupil [black dot in the eye]
 - Iris controls how much light enters eye [colored ring around pupil]
 - Eyes are sensitive to too much light
 - Iris protects the eyes
 - Lens behind the eye converges light rays to back of the eye
 - Ciliary muscles around the lens allow the lens to be bent to change focus on nearby/far objects
- 130+ million retina cells at the back of the eye
 - Cells pick up light and convert it to electrical signal
 - Electric signal passes through optic nerve to reach the brain



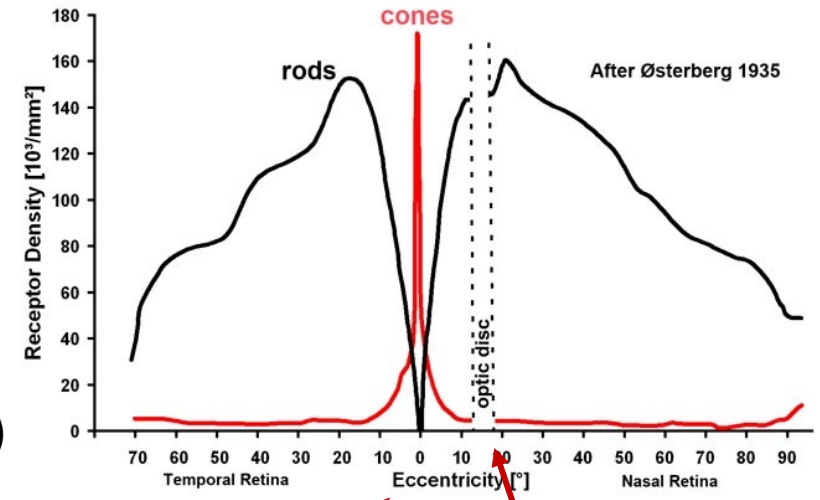
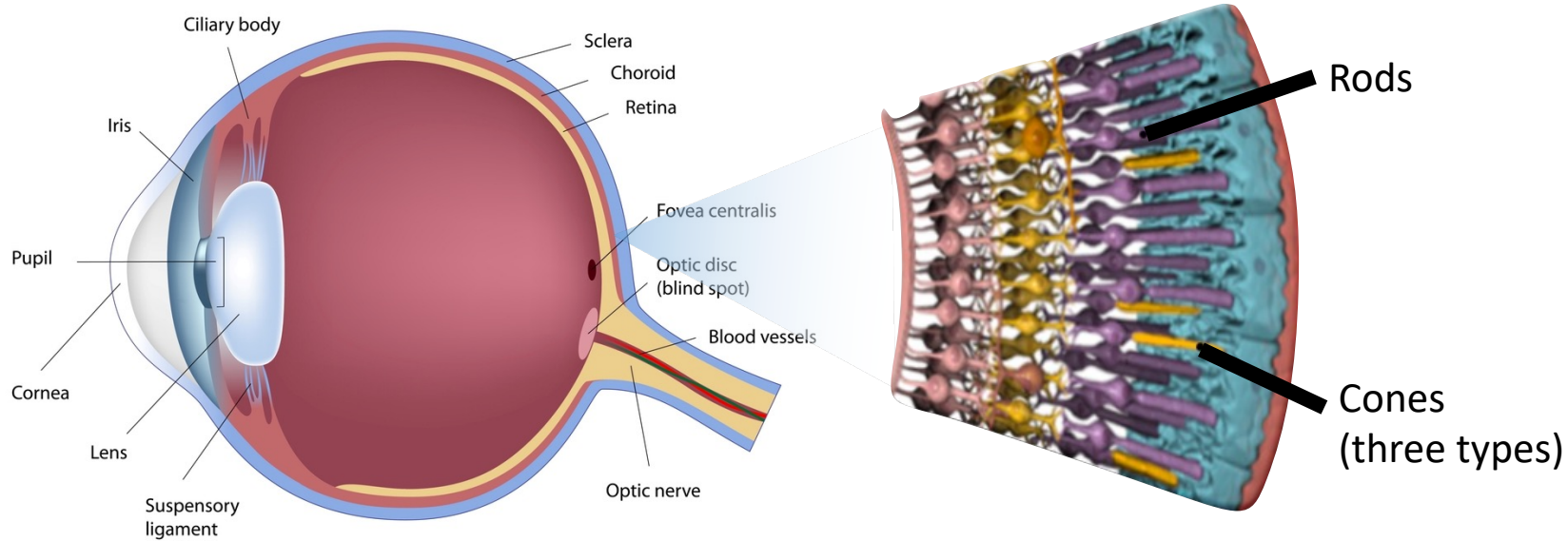
*Image appears backwards!
Don't worry, brain flips it right-side up*

The Biological Camera



- **Pupil** is the **camera opening**
 - Allows light through
- **Iris** is the **aperture ring**
 - Controls aperture
- **Lens** is the...well, **lens**
 - Can change focus
- **Retina** is the **sensor**
 - Converts light into electrical signal
- **Brain** is the **CPU**
 - Performs additional compute to correct raw image signal

Rods & Cones



- Cones are primary receptors near fovea used under high-light viewing conditions
 - Approx. 6-7 million cones in the human eye
 - Capture color
- Rods are primary receptors far from fovea used under low-light viewing conditions
 - Approx. 120 million rods in human eye
 - Capture intensity

Best vision at center of cones!

Human blind spot

Spectral Response of Cones

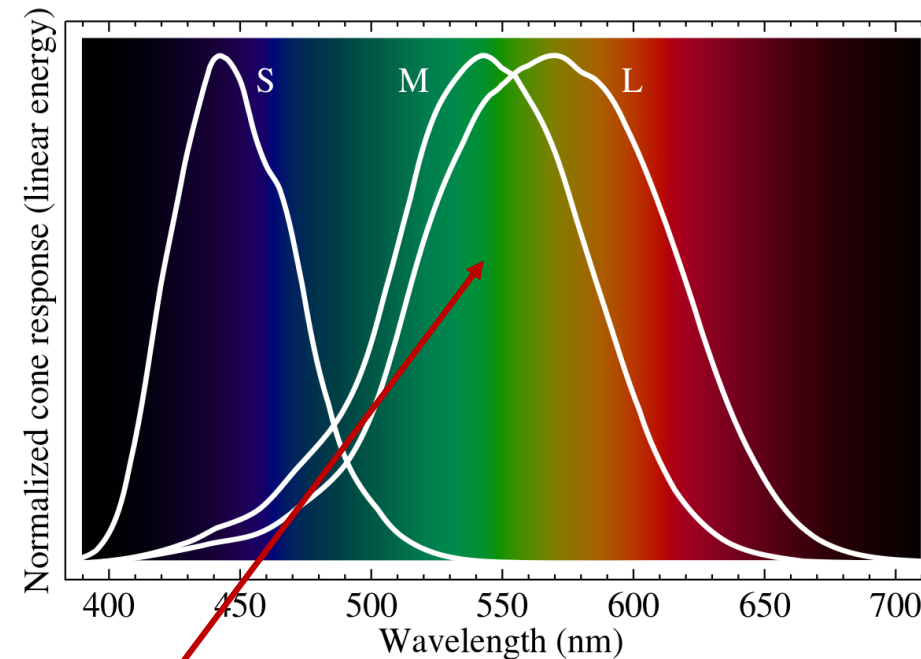
- Long, Medium, and Small cones pick up Long, Medium, and Small wavelengths respectively
- Each cone picks up a range of colors given by their response functions
 - Not much different than absorption spectrum
- Each cone integrates the emission & response to produce a single signal to transmit to the brain

$$S = \int_{\lambda} \Phi(\lambda) S(\lambda) d\lambda$$

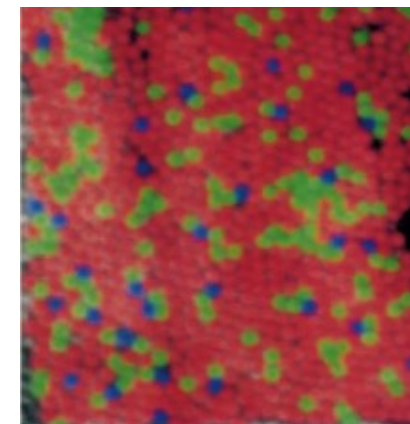
$$M = \int_{\lambda} \Phi(\lambda) M(\lambda) d\lambda$$

$$L = \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda$$

- Uneven distribution of cone types in eye
 - ~64% L cones, ~ 32% M cones ~4% S cones



A lot of green picked up!



Radiant Recap

Radiant Energy
(total number of hits)
Joules (J)

Radiant Energy Density
(hits per unit area)
Joules per sq meter (J/m^2)

Radiant Flux
(total hits per second)
Watts (W)

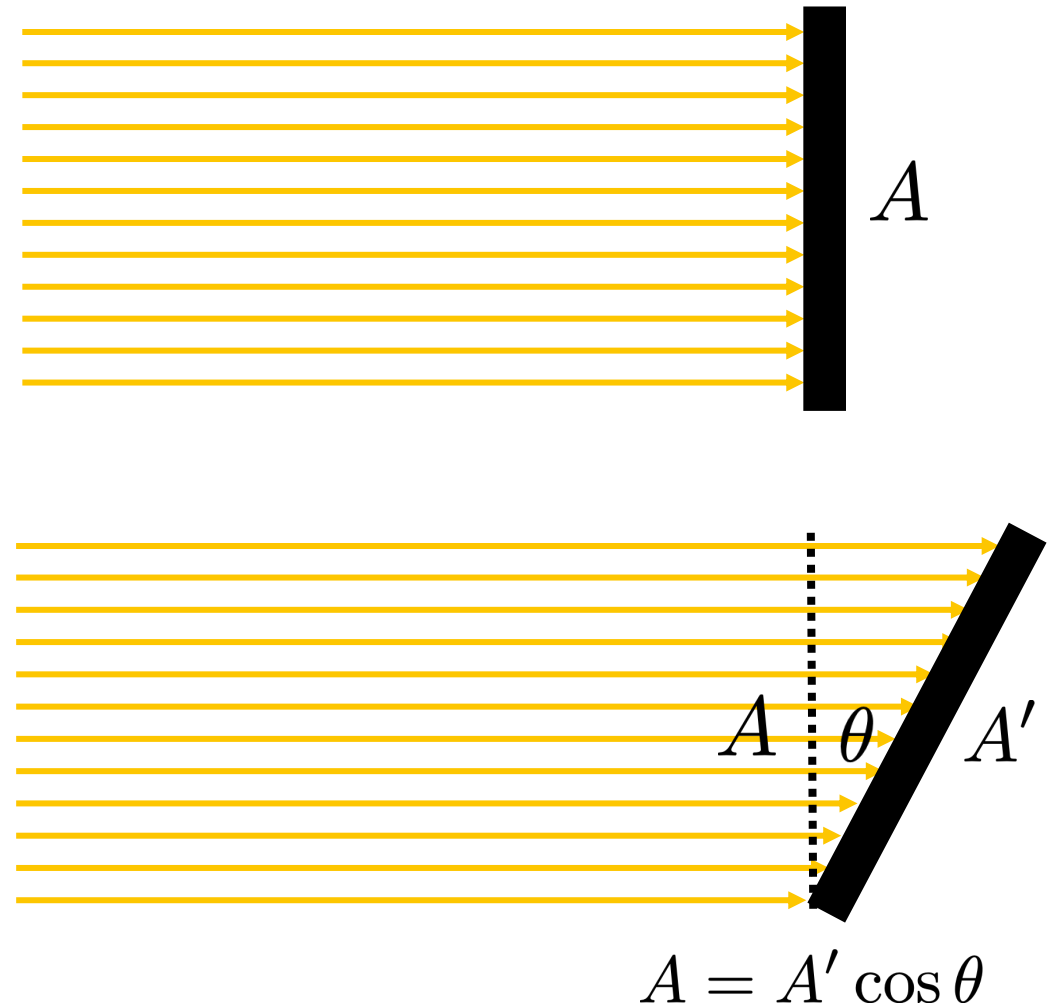
Radiant Flux Density
a.k.a. Irradiance
(hits per second per unit area)
Watts per sq meter (W/m^2)

Lambert's Law

- Irradiance (E) at surface is proportional to the flux (Φ) and the cosine of angle (θ) between light direction and surface normal:

$$E = \frac{\Phi}{A'} = \frac{\Phi \cos \theta}{A}$$

- Consider rotating a plane away from light rays
 - Plane will darken until it is perpendicular to light rays, then it will be completely black



The Rendering Equation

- The Rendering Equation
- Rendering Methods
 - Forwards Path-Tracing
 - Backwards Path-Tracing
 - Bi-Directional Path-Tracing
 - Metropolis Light Transport
- Variance Reduction
 - Sampling Rate
 - Ray Depth
- BRDFs
 - Lambertian
 - Mirror
 - Glass

The Rendering Equation

$$L_o(\mathbf{p}, \omega_o) = L_e(\mathbf{p}, \omega_o) + \int_{\mathcal{H}^2} f_r(\mathbf{p}, \omega_i \rightarrow \omega_o) L_i(\mathbf{p}, \omega_i) \cos \theta \, d\omega_i$$

$L_o(\mathbf{p}, \omega_o)$ outgoing radiance at point \mathbf{p} in outgoing direction ω_o

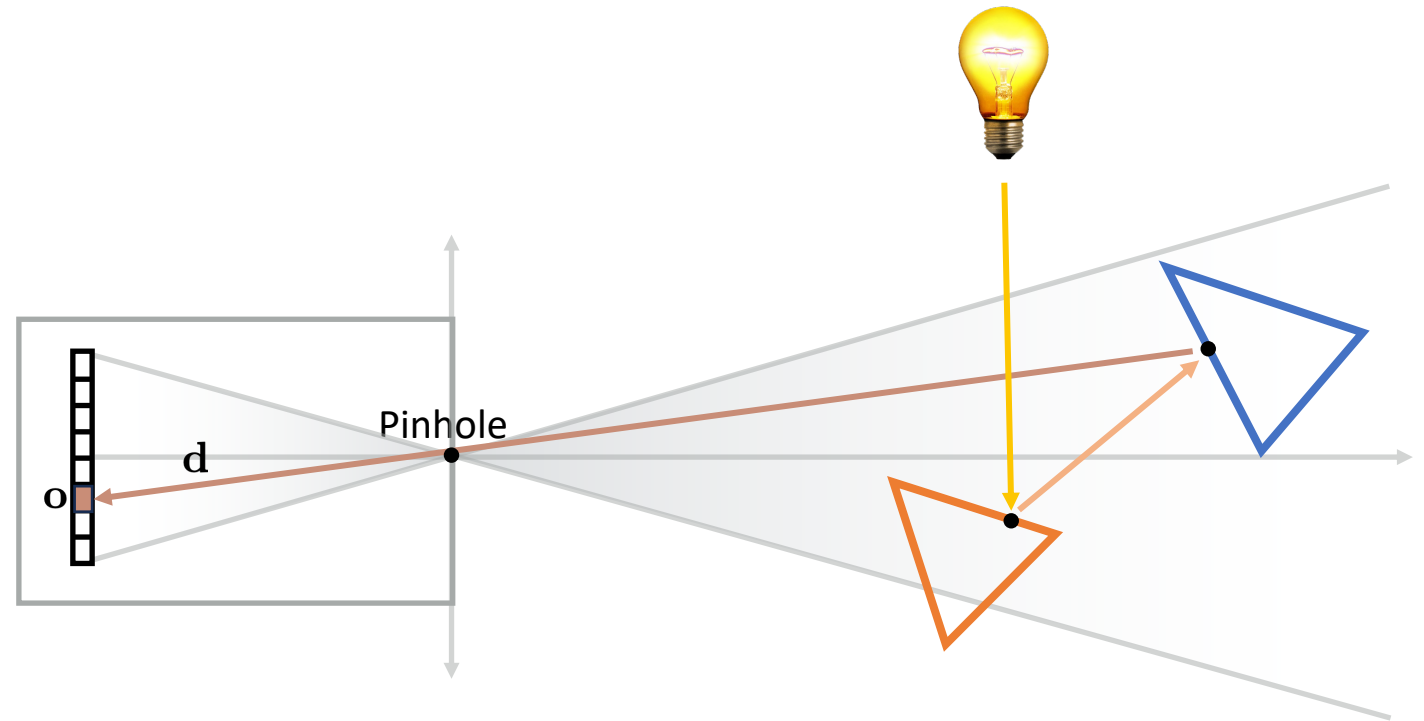
$L_e(\mathbf{p}, \omega_o)$ emitted radiance at point \mathbf{p} in outgoing direction ω_o

$f_r(\mathbf{p}, \omega_i \rightarrow \omega_o)$ scattering function at point \mathbf{p} from incoming direction ω_i to outgoing direction ω_o

$L_i(\mathbf{p}, \omega_i)$ incoming radiance to point \mathbf{p} from direction ω_i

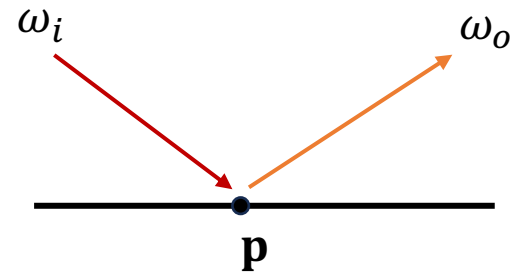
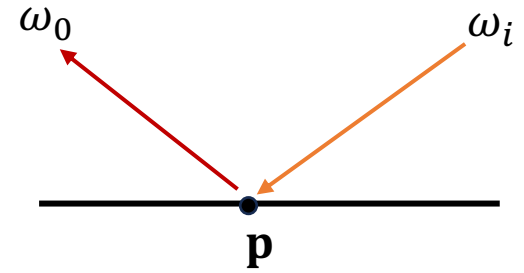
Example Of A Simple Renderer

- Yellow light ray generated from light source
- Ray hits orange specular surface
 - Emits a ray in reflected direction
 - Mixes yellow and orange color
- Ray hits blue specular surface
 - Emits a ray in reflected direction
 - Mixes blue and yellow and orange
- Ray passes through pinhole camera
 - Light recorded on photoelectric cell
 - Incident pixel will be brown in final image



Hemholtz Reciprocity

- Reversing the order of incoming and outgoing light does not affect the BRDF evaluation
 - $f_r(\mathbf{p}, \omega_i \rightarrow \omega_o) = f_r(\mathbf{p}, \omega_o \rightarrow \omega_i)$
- Critical to reverse pathtracing algorithms
 - Allows us to trace rays backwards and still get the same BRDF affect

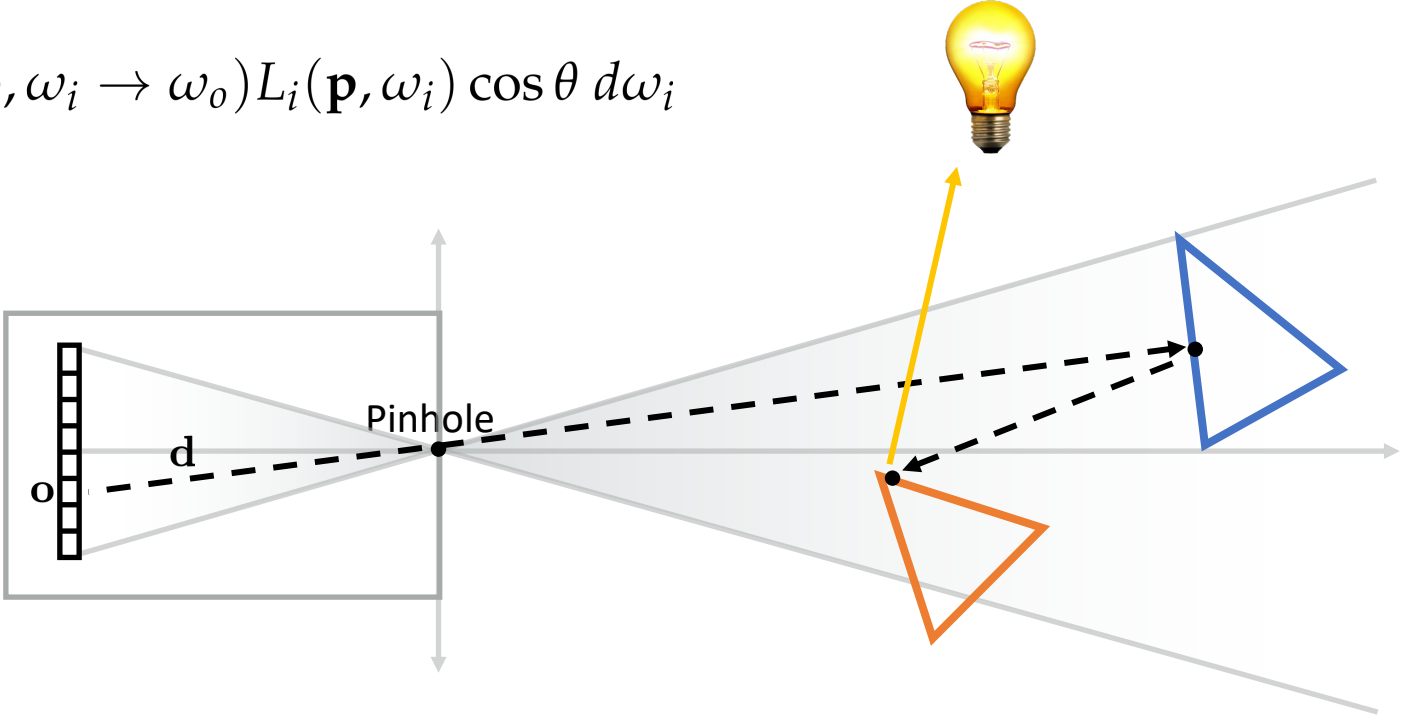


Example Of A Simple Backwards Renderer

[ray depth 2]

$$L_o(\mathbf{p}, \omega_o) = L_e(\mathbf{p}, \omega_o) + \int_{\mathcal{H}^2} f_r(\mathbf{p}, \omega_i \rightarrow \omega_o) L_i(\mathbf{p}, \omega_i) \cos \theta d\omega_i$$

- Intersect △ , no emission
- Intersect △ , no emission
- Ray terminate, emission ■

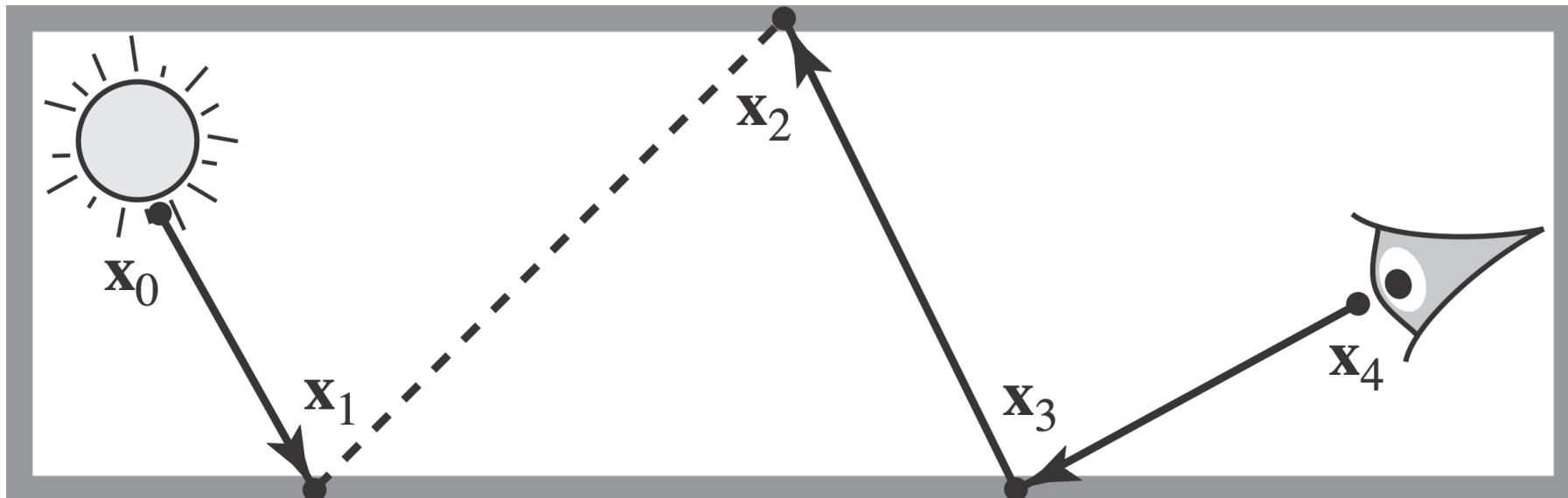


$$L(\text{pixel}) = L_e(\text{ray}_1) + f_r(\text{obj}_1)[L_e(\text{ray}_2) + f_r(\text{obj}_2)[L_e(\text{ray}_3)]]$$

$$L(\text{pixel}) = \square + f_r(\triangle)[\square + f_r(\triangle)[\text{yellow}]]$$

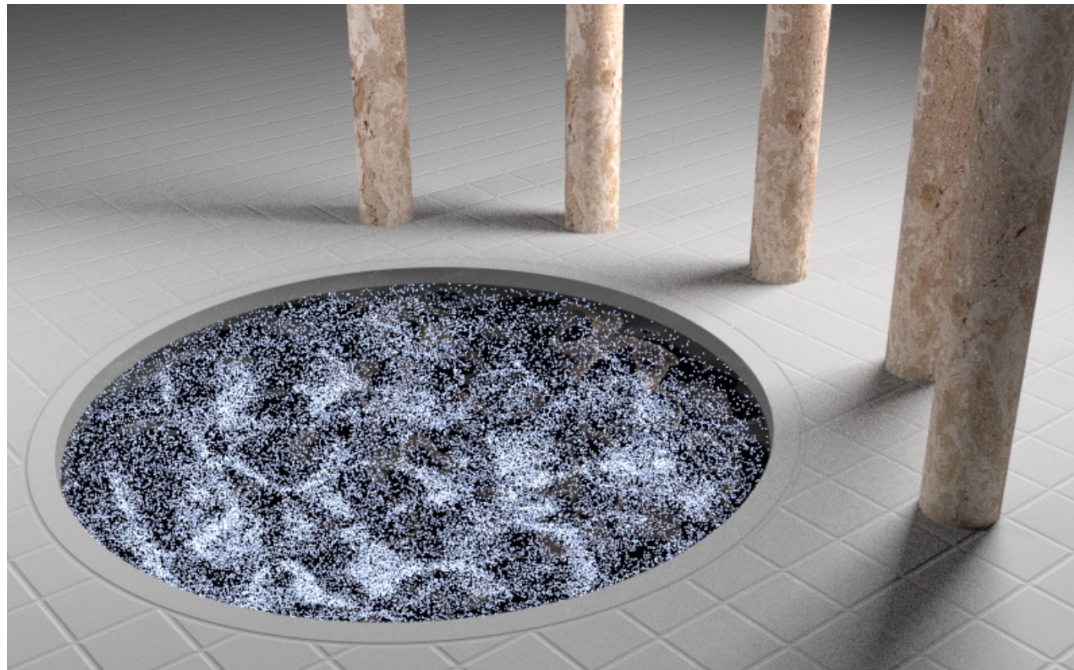
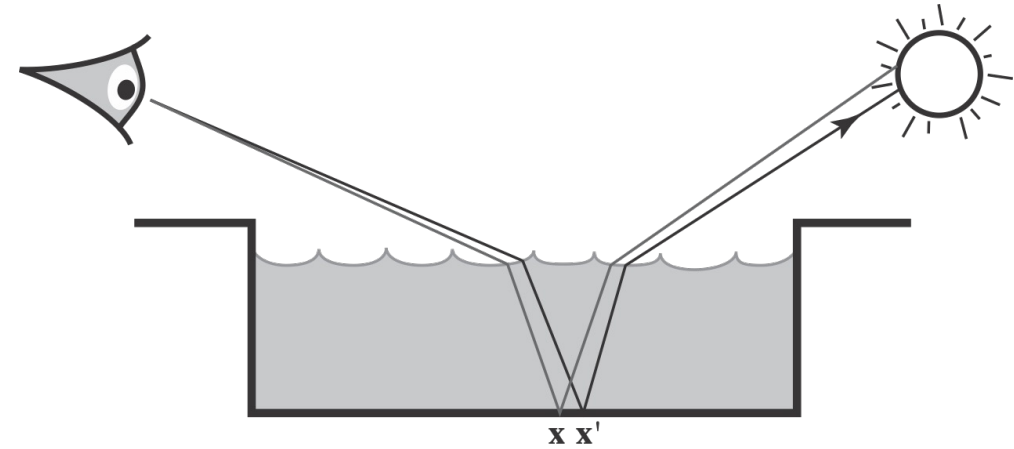
Bidirectional Path Tracing

- If path tracing is so great, why not do it **twice**?
 - Main idea of bidirectional!
- Trace a ray from the camera into the scene
- Trace a ray from the light into the scene
 - Connect the rays at the end
- Unbiased algorithm
 - No longer trying to connect rays through non-volume sources
- Can set different lengths per ray
 - Example: Forward $m = 2$, Backward $m = 1$

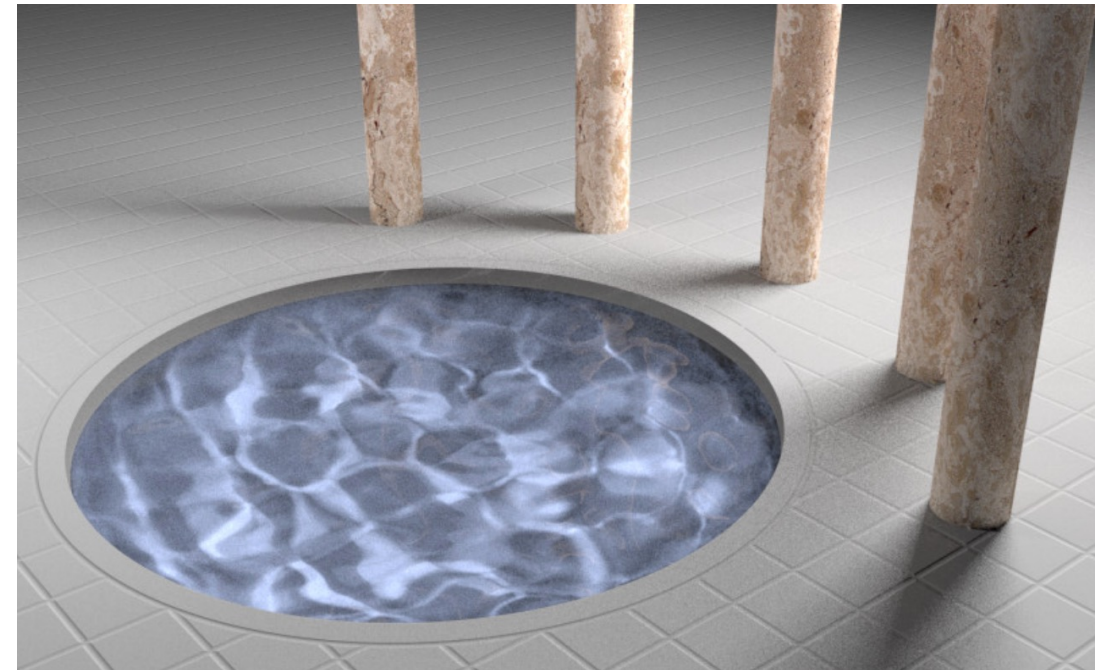


Metropolis Light Transport

- **Similar idea:** mutate good paths
- Water causes paths to refract a lot
 - Small mutations allows renderer to find contributions faster
- Path Tracing and MLT rendered in the same time



[Path Tracing]



[Metropolis Light Transport]

Number Of Ray Samples

- **Number of Rays**
 - How many rays we trace into the scene
 - Measured as samples (rays) per pixel [spp]
- Increasing the number of rays increases the quality of the image
 - Anti-aliasing
 - Reduces black spots from terminating emission occlusion



[1 spp]



[16 spp]

Number Of Ray Bounces

- **Number of Ray Bounces**
 - How many times a ray bounces before it terminates
 - Measured as ray bounce or depth
- Increasing the number of ray bounces increases the quality of the image
 - Better color blending around images
 - More details reflected in specular images



[2 depth]



[8 depth]

Lambertian Material

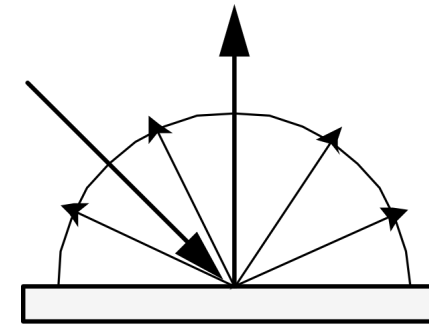
- Also known as diffuse
- Light is equally likely to be reflected in each output direction
 - BRDF is a constant, relying on albedo (ρ)

$$f_r = \frac{\rho}{\pi}$$

- BRDF can be pulled out of the integral

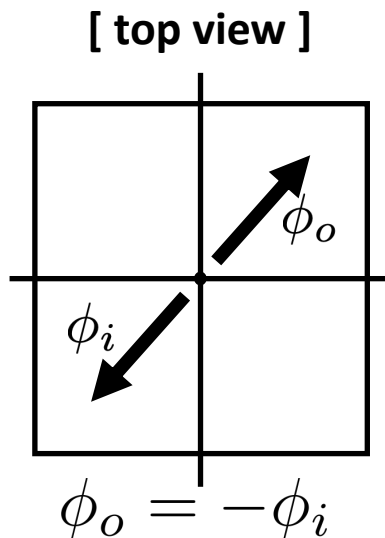
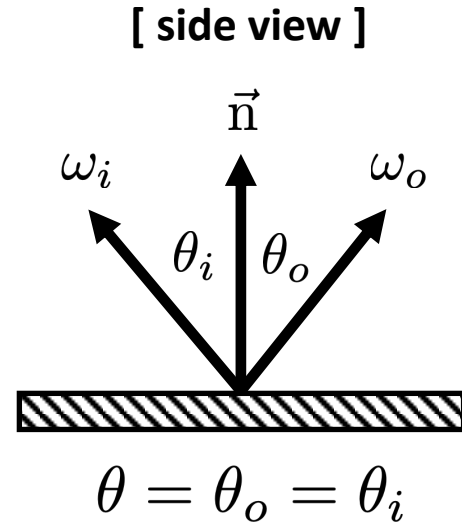
$$\begin{aligned} L_o(\omega_o) &= \int_{H^2} f_r L_i(\omega_i) \cos \theta_i d\omega_i \\ &= f_r \int_{H^2} L_i(\omega_i) \cos \theta_i d\omega_i \\ &= f_r E \end{aligned}$$

- Easy! Pick any outgoing ray w_o



Minions (2015) Illumination Entertainment

Reflective Material



- Reflectance equation described as:

$$\omega_o = -\omega_i + 2(\omega_i \cdot \vec{n})\vec{n}$$

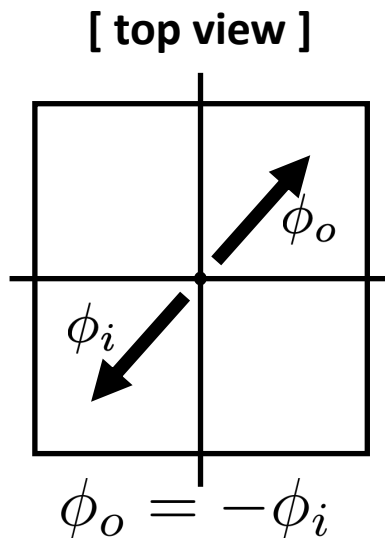
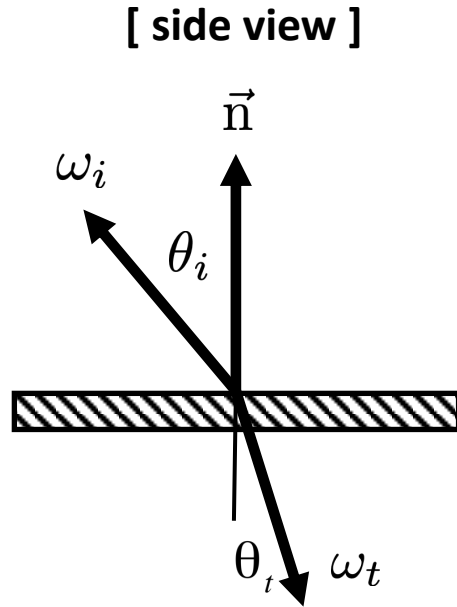
- Why is the ray ω_i pointing away from the surface?
 - Just syntax. Incoming and outgoing rays share same origin point \mathbf{p}

- BRDF represented by dirac delta (δ) function:

$$f_r(\theta_i, \phi_i; \theta_o, \phi_o) = \frac{\delta(\cos \theta_i - \cos \theta_o)}{\cos \theta_i} \delta(\phi_i - \phi_o \pm \pi)$$

- 1 when ray is perfect reflection, 0 everywhere else
- All radiance gets reflected, nothing absorbed
- In practice, no hope of finding reflected direction via random sampling
 - Simply pick the reflected direction!

Refractive Material



- Refractive equation described as:

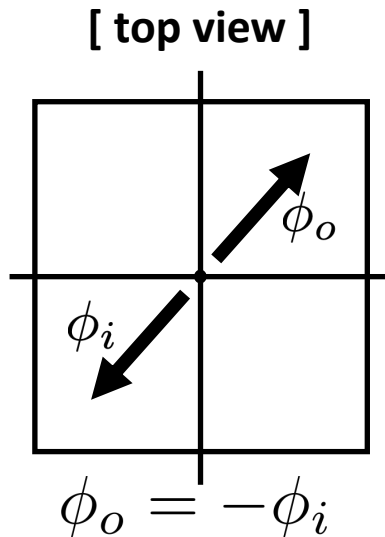
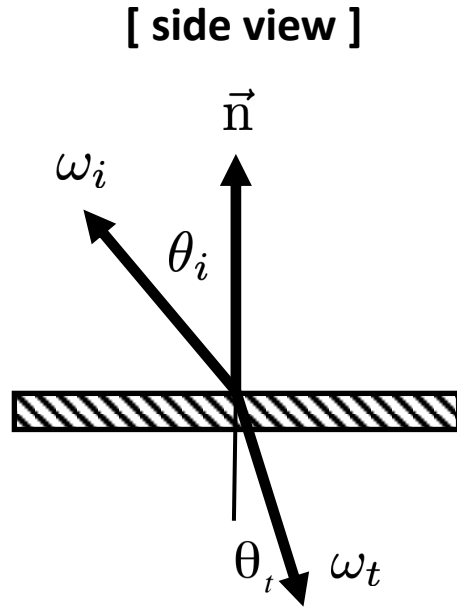
$$\eta_i \sin \theta_i = \eta_t \sin \theta_t$$

- Also known as Snell's Law
- η_i and η_t describe the index of refraction of the incoming and outgoing mediums
 - Example: η_i is air, η_t is water

Medium	η
Vacuum	1.0
Air (sea level)	1.00029
Water (20°C)	1.333
Glass	1.5-1.6
Diamond	2.42

- η is the ratio of the speed of light in a vacuum to that in a second medium of greater density
 - The larger the η , the denser the material

Refractive Material



- Refractive equation described as:

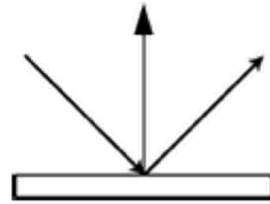
$$\eta_i \sin \theta_i = \eta_t \sin \theta_t$$

- Also known as Snell's Law

- Can rewrite the equation as:

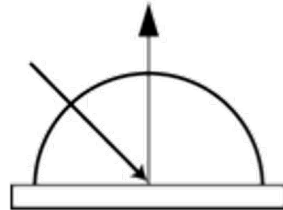
$$\begin{aligned} \cos \theta_t &= \sqrt{1 - \sin^2 \theta_t} \\ &= \sqrt{1 - \left(\frac{\eta_i}{\eta_t}\right)^2 \sin^2 \theta_i} \\ &= \sqrt{1 - \left(\frac{\eta_i}{\eta_t}\right)^2 (1 - \cos^2 \theta_i)} \end{aligned}$$

Types of Reflectance Functions



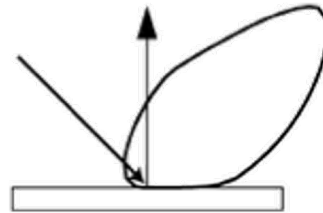
Ideal Specular

- Perfect mirror



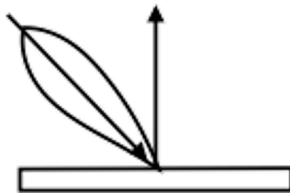
Ideal Diffuse

- Uniform in all directions



Glossy Specular

- Majority of light in reflected direction



Retroreflective

- Reflects light back towards source

- ~~A1: Rasterization~~

- ~~A2: Geometry~~

- ~~A3: Rendering~~

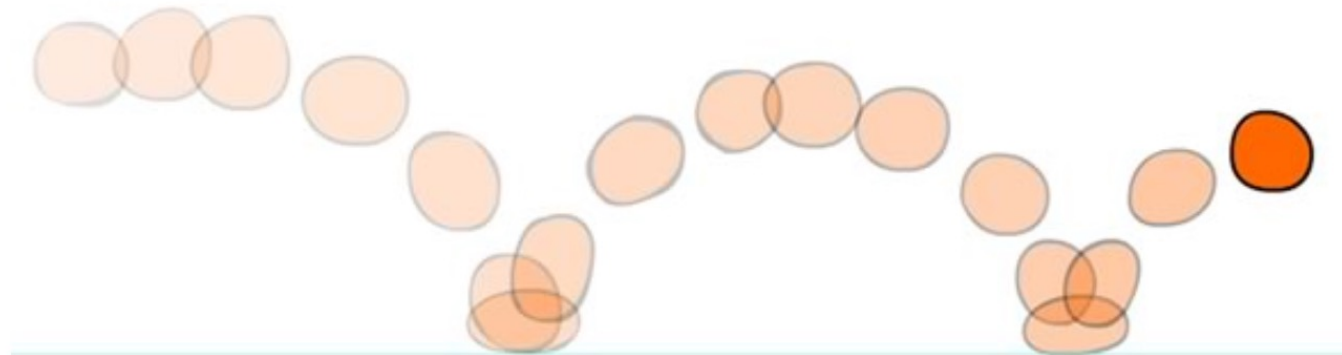
- A4: Animation

Principles Of Animation

- 12 Principles
 - Easing
 - Arcs
 - Timing
- Motion Graphs
 - Displacement
 - Velocity
 - Acceleration
- Splines
 - Natural Splines
 - Hermite/Bezier Curves
 - B-Splines

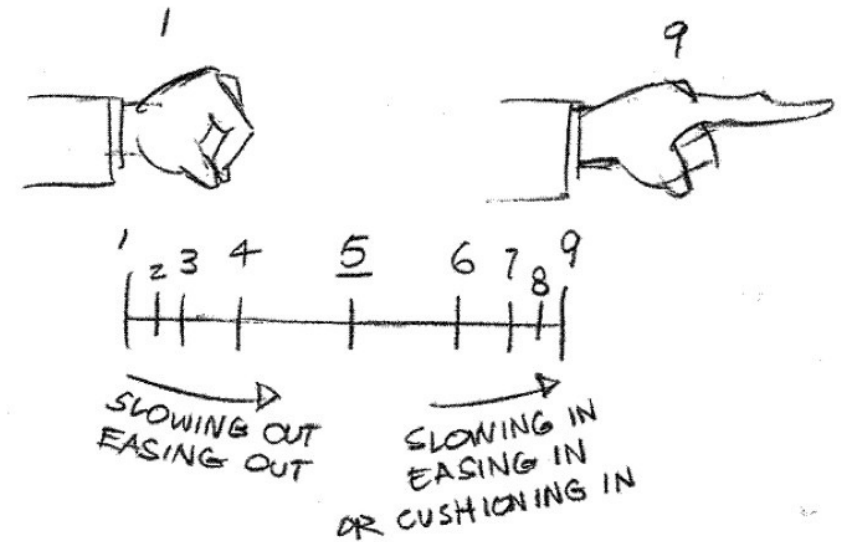
Onion Skinning

- **Onion-Skinning** is a tool that lets you see **previous** and **future frames** at a lower opacity
 - Helps when you have two keyframes and want to add an in-between frame
 - Based off translucency of cel paper
- Can also help visualize the **spatial trajectory** and **motion** of objects
 - Good debugging tool to make sure trajectories are arc like and maintain proportions



Easing

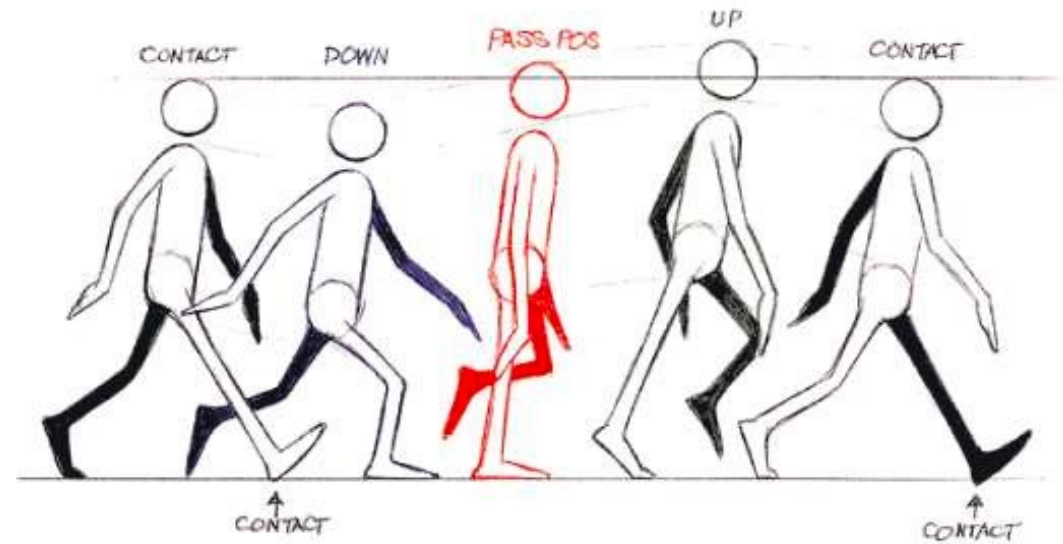
- **Easing** is a strategy where objects **accelerate** into and out of their motion
 - Derived from physics
 - Objects with **inertia** have to feel a force in order to ease their way into a new momentum
- Visualized in a 1D chart with tick marks with equal time separation but varying spatial separation
 - The closer the tick marks, the smaller the spatial separation, and the slower the motion.
- Draw a frame in the middle of frames 1 and 9 (call it 5), then a frame between 1 and 5 (call it 4), then 1 and 4 (call it 3), and then 1 and 3 (call it 2)
 - Referred to as **subdivision**
 - Easy strategy to guarantee appropriate easing



Illusion of Life, 1999

Straight Ahead vs. Pose To Pose

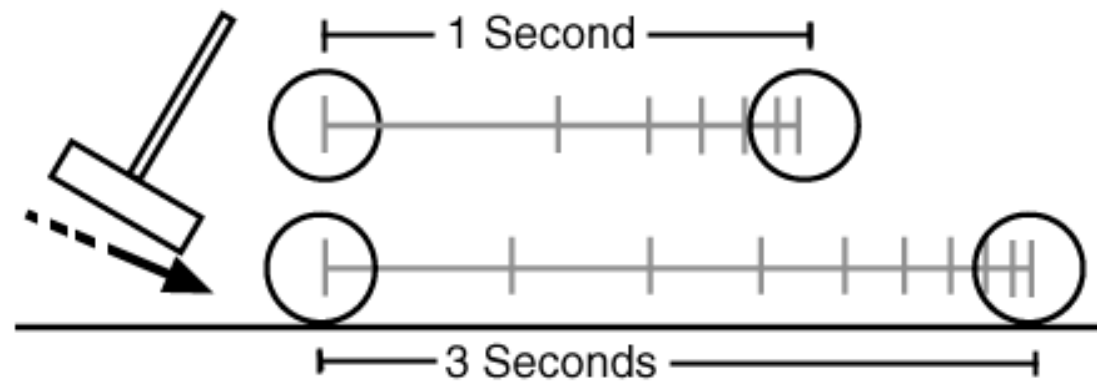
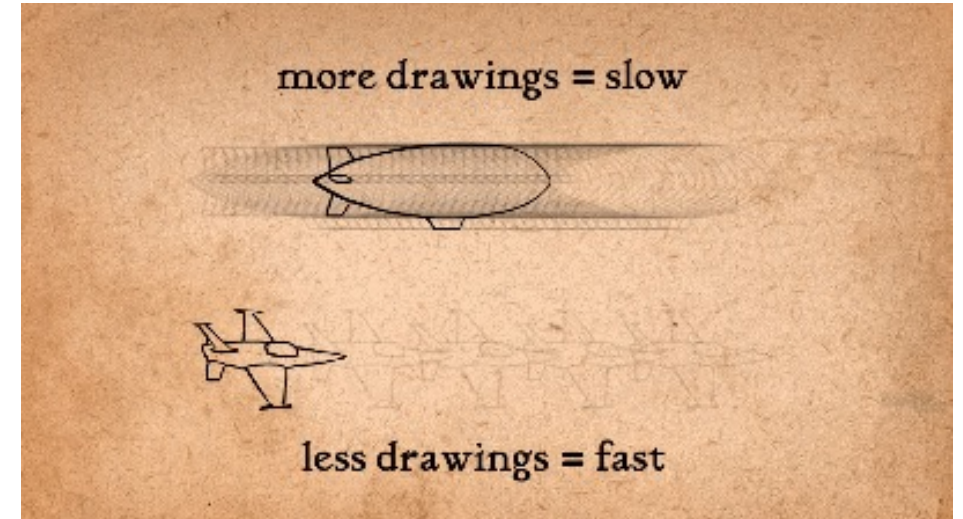
- Straight Ahead is the process of drawing in every frame **sequentially**
 - Easier to create more realistic movements this way, but harder to keep proportions constant
 - Characters end up being less dynamic and less exaggerated
- Pose to Pose is the process of drawing in **key frames first**, and then going back to draw in-betweens
 - Allows for more controlled and dynamic posing
 - Adopted more in animation settings where computers are able to help out with the in-between stages
- With Pose to Pose, senior artists draw keyframes, junior artists draw in-betweens



The Animator's Survival Kit (2001) Richard Williams

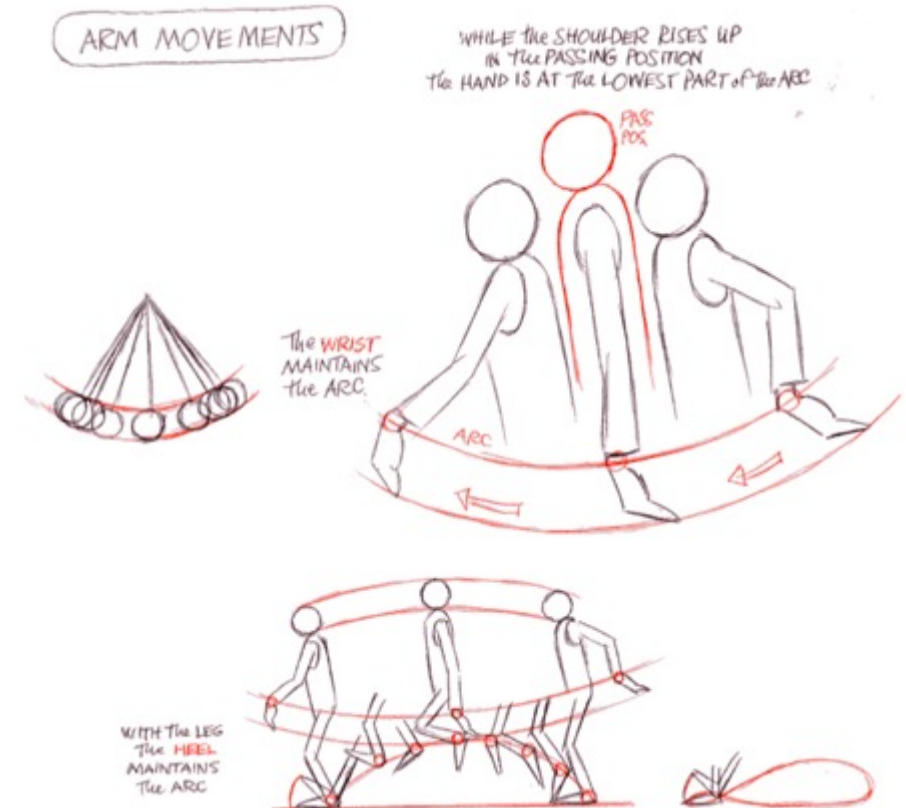
Timing

- Timing is how the motions play out, and at what **time intervals**
 - Used to determine how fast an object should be moving
 - How many frames should be used for the motion?
 - The more frames, the slower
- **Temporal linear interpolation:** velocity never changes
- **Temporal non-linear interpolation:** velocity changes



Arc Motions

- Arc Motions guarantee that **spatial trajectories are arc-like**
 - Helps to build fluidity in the motion
- Joints rotate instead of translating
 - Allows for arc-like movements
- Walk cycles are a combination of many arc movements



Natural Splines

- Can build a spline out of piecewise cubic polynomials p_i
 - Each polynomial extends from range $t = [0,1]$
 - Polynomials should connect on boundary

- Keyframes agree at endpoints [C0 continuity]:

$$p_i(t_i) = f_i, \quad p_i(t_{i+1}) = f_{i+1}, \quad \forall i = 0, \dots, n - 1$$

- Tangents agree at endpoints [C1 continuity]:

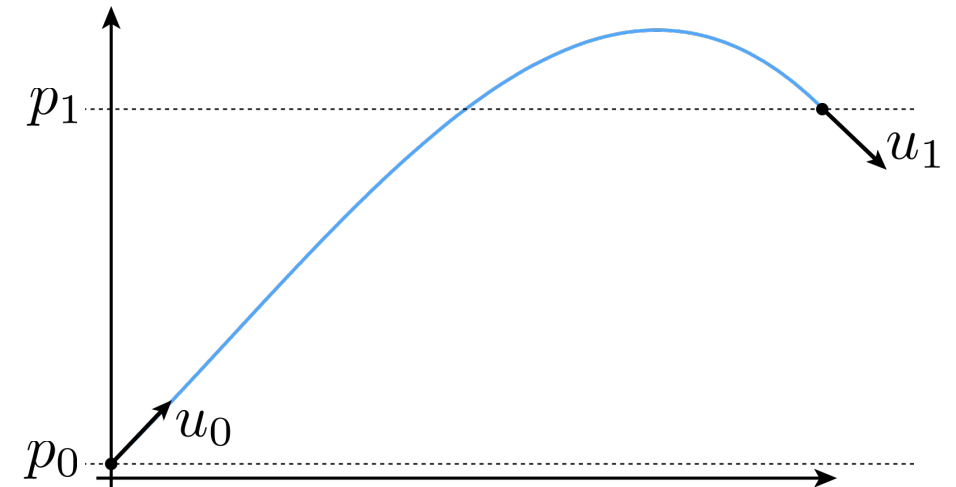
$$p'_i(t_{i+1}) = p'_{i+1}(t_{i+1}), \quad \forall i = 0, \dots, n - 2$$

- Curvature agrees at endpoints [C2 continuity]:

$$p''_i(t_{i+1}) = p''_{i+1}(t_{i+1}), \quad \forall i = 0, \dots, n - 2$$

- Total equations:
 - $2n + (n-1) + (n-1) = 4n - 2$
- Total DOFs:
 - $2n + n + n = 4n$
- Set curvature at endpoints to 0 and solve

$$p'_0(t_0) = 0, \quad p''_0(t_{i+1}) = 0$$



Hermite/Bézier Splines

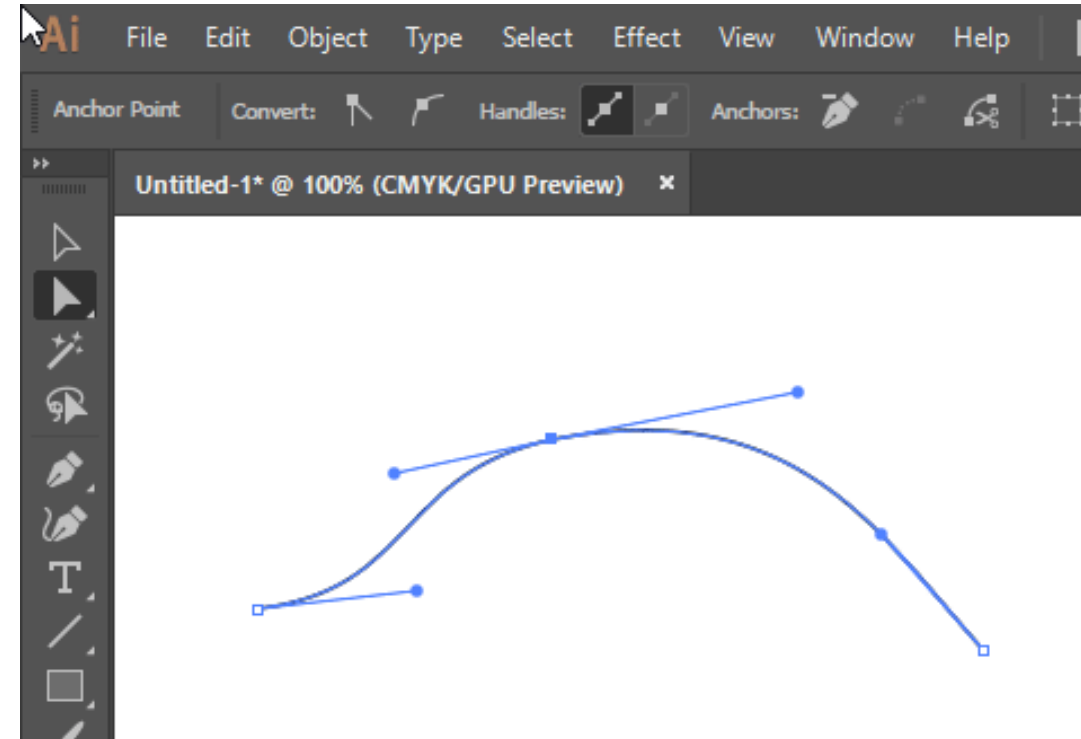
- Each cubic “piece” specified by endpoints and tangents
 - Keyframes set at endpoints:

$$p_i(t_i) = f_i, \quad p_i(t_{i+1}) = f_{i+1}, \quad \forall i = 0, \dots, n - 1$$

- Tangents set at endpoint:

$$p'_i(t_i) = u_i, \quad p'_i(t_{i+1}) = u_{i+1}, \quad \forall i = 0, \dots, n - 1$$

- Natural splines specify just keyframes
 - Bézier splines specify keyframes and tangents
 - Can get continuity if tangents are set equal
- Total equations:
 - $2n + 2n = 4n$
- Commonly used in vector art programs
 - Illustrator
 - Inkscape
 - SVGs



B-Splines

- Compute a weighted average of nearby keyframes when interpolating

- B-spline basis defined recursively, with base condition:


$$B_{i,1}(t) := \begin{cases} 1, & \text{if } t_i \leq t < t_{i+1} \\ 0, & \text{otherwise} \end{cases}$$

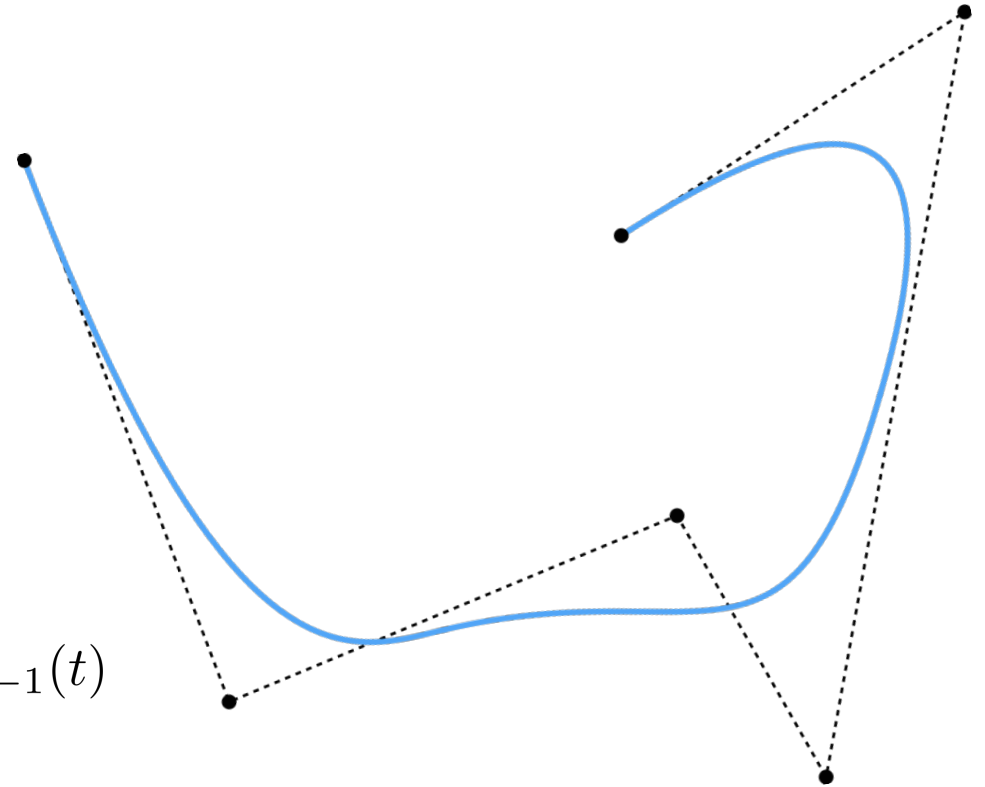
- And inductive condition:

$$B_{i,k}(t) := \frac{t-t_i}{t_{i+k-1}-t_i} B_{i,k-1}(t) + \frac{t_{i+k}-t}{t_{i+k}-t_{i+1}} B_{i+1,k-1}(t)$$

- B-spline is a linear combination of bases:

$$f(t) := \sum_i a_i B_{i,d}$$

degree 



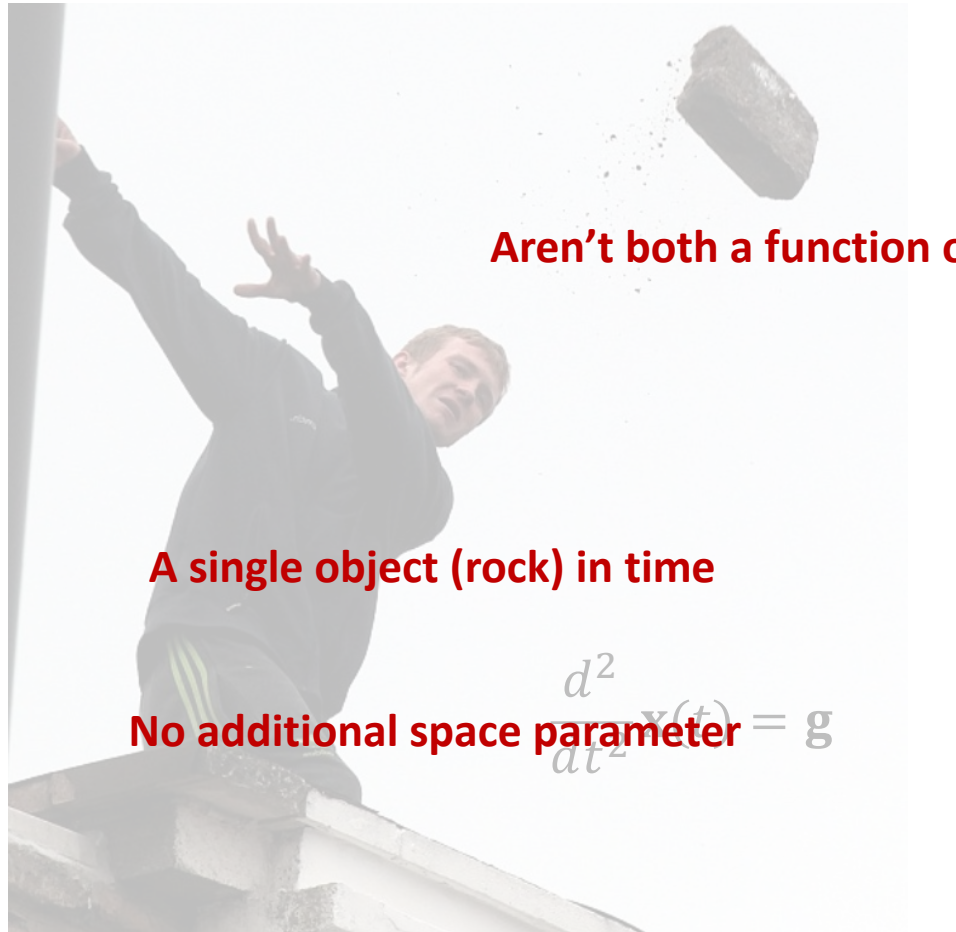
Splines Review

	[Interpolation]	[Continuity]	[Locality]
Linear	✓	✗	✓
Natural	✓	✓	✗
Hermite	✓	✗	✓
Bezier	✓	✗	✓
Catmull-Rom	✓	✗	✓
B-Spline	✗	✓	✓

Simulations

- ODE vs PDE
- Time Integration
 - Forwards Euler
 - Symplectic Euler
- Lagrangian
 - 2nd Derivative
- Boundary Conditions
 - Dirichlet
 - Neumann

ODEs vs. PDEs



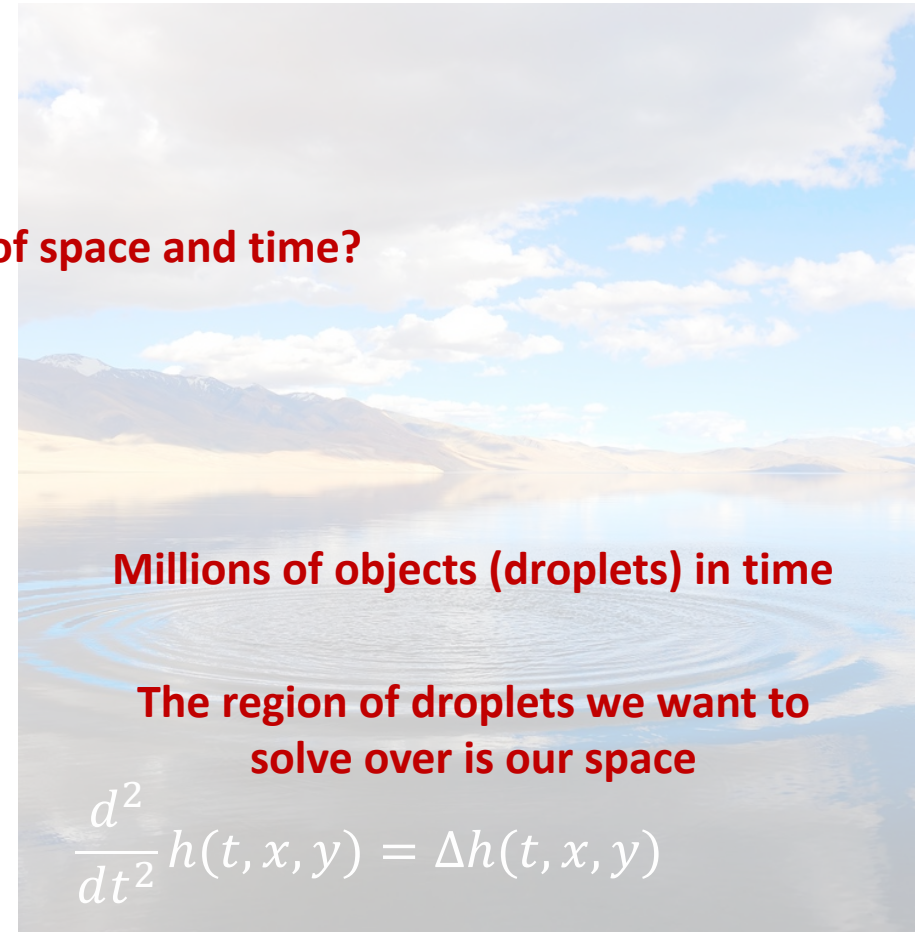
Aren't both a function of space and time?

A single object (rock) in time

No additional space parameter

$$\frac{d^2}{dt^2} \mathbf{x}(t) = \mathbf{g}$$

[ODE] yeeting a rock



Millions of objects (droplets) in time

The region of droplets we want to solve over is our space

$$\frac{d^2}{dt^2} h(t, x, y) = \Delta h(t, x, y)$$

[PDE] yeeted rock lands in pond

Explicit Euler Methods

[Forward]

$$v_{k+1} = v_k + \tau * a(q_k)$$

$$q_{k+1} = q_k + \tau * v_k$$

[Symplectic]

$$v_{k+1} = v_k + \tau * a(q_k)$$

$$q_{k+1} = q_k + \tau * v_{k+1}$$

[Verlet]

$$v_{k+1} = v_{k+0.5} + \frac{\tau}{2} * a(q_k)$$

$$q_{k+1} = q_k + \tau * v_{k+1}$$

$$v_{k+1.5} = v_{k+1} + \frac{\tau}{2} * a(q_k)$$

[RK2]

$$v'_{k+1} = \tau * a(q_k)$$

$$v''_{k+1} = \tau * a\left(q_k + \frac{v'_{k+1}}{2}\right)$$

$$v_{k+1} = v_k + v''_{k+1}$$

$$q_{k+1} = q_k + \tau * v_{k+1}$$

[RK4]

$$v'_{k+1} = \tau * a(q_k)$$

$$v''_{k+1} = \tau * a\left(q_k + \frac{v'_{k+1}}{2}\right)$$

$$v'''_{k+1} = \tau * a\left(q_k + \frac{v''_{k+1}}{2}\right)$$

$$v''''_{k+1} = \tau * a\left(q_k + v'''_{k+1}\right)$$

$$q_{k+1} = q_k + \frac{1}{6} (v'_{k+1} + 2v''_{k+1} + 2v'''_{k+1} + v''''_{k+1})$$

The Laplacian Operator

- All of our model equations used the Laplace operator
 - Laplace Equation $\Delta u = 0$
 - Heat Equation $\dot{u} = \Delta u$
 - Wave Equation $\ddot{u} = \Delta u$
- Unbelievably important object showing up everywhere across physics, geometry, signal processing, and more
- What does the Laplacian mean?
 - **Differential operator:** eats a function, spits out its 2nd derivative
 - What does that mean for a function: $u: \mathbb{R}^n \rightarrow \mathbb{R}$?
 - Divergence of gradient

$$\Delta u = \nabla \cdot \nabla u$$

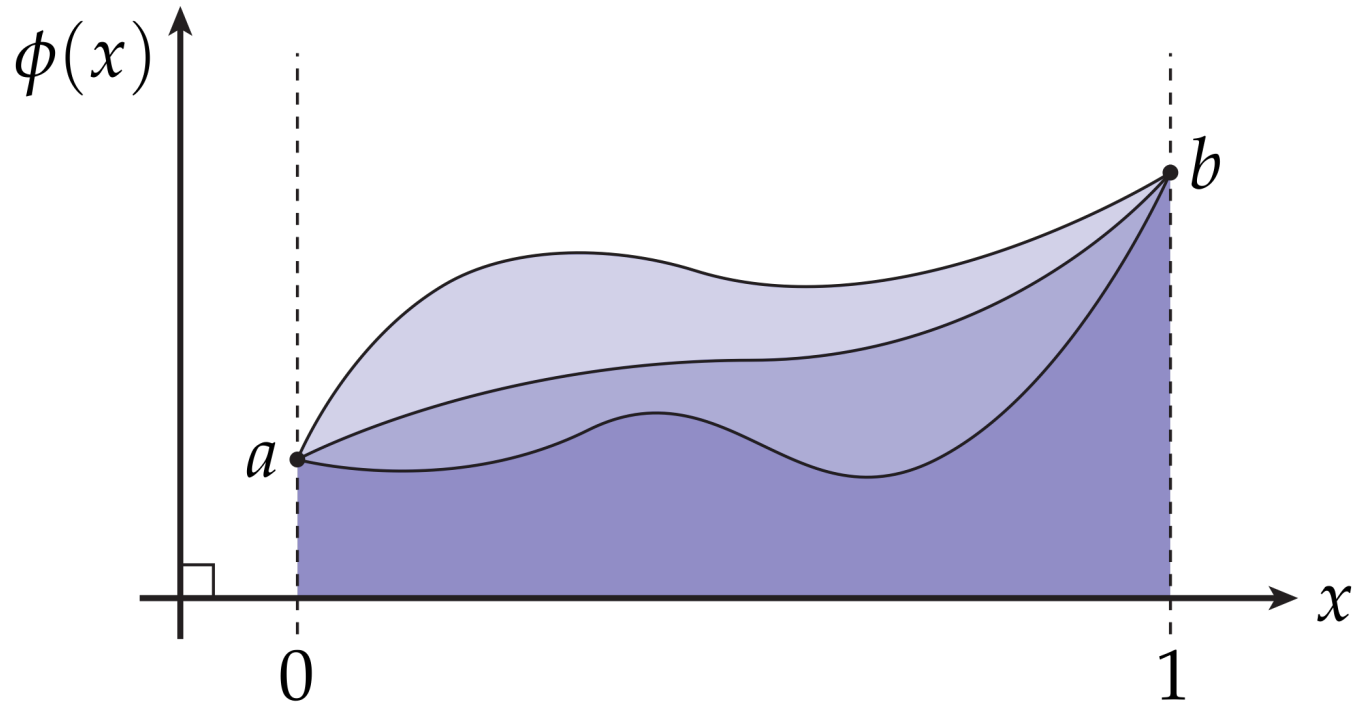
- Sum of second derivatives

$$\Delta u = \frac{\partial u^2}{\partial x_1^2} + \dots + \frac{\partial u^2}{\partial x_n^2}$$

- Deviation from local average
- ...

Dirichlet Boundary Conditions

Dirichlet: boundary data always set to fixed values

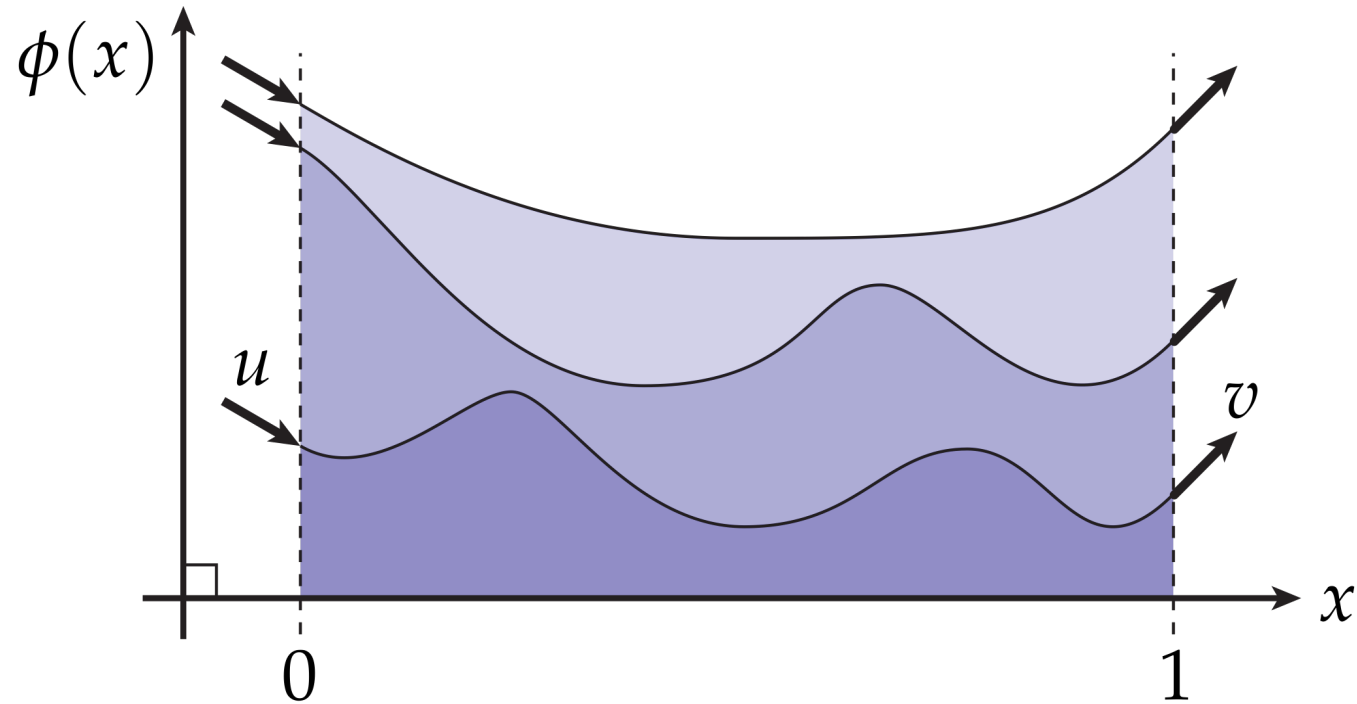


Example: $\phi(0) = a, \phi(1) = b$

Many possible functions interpolate values in between

Neumann Boundary Conditions

Neumann: specify derivatives across boundary



Example: $\phi'(0) = u$, $\phi'(1) = v$

Again, many possible functions

Good Luck!

