

Simulation Part 2 + Guest Lecture

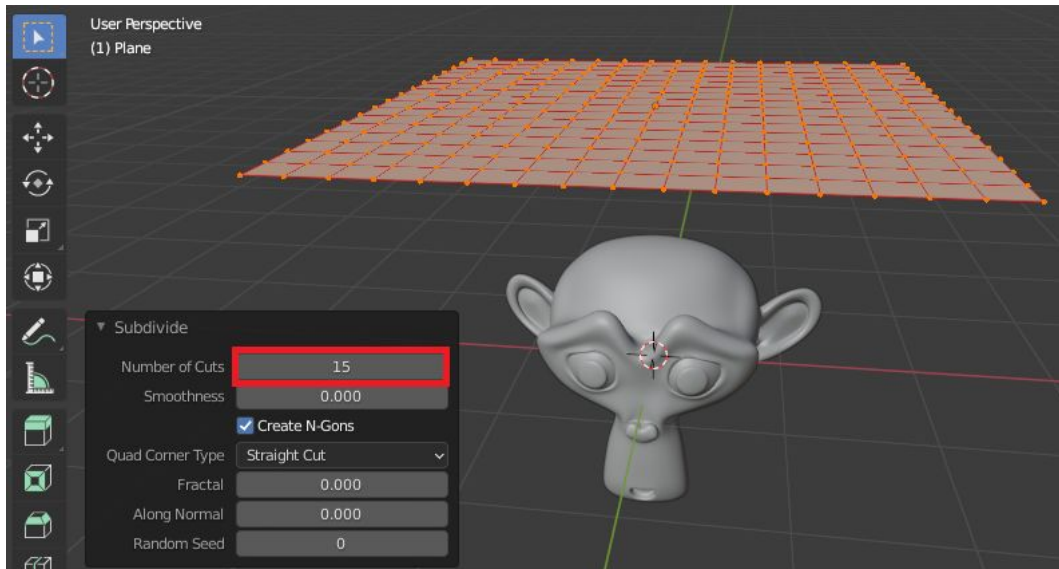
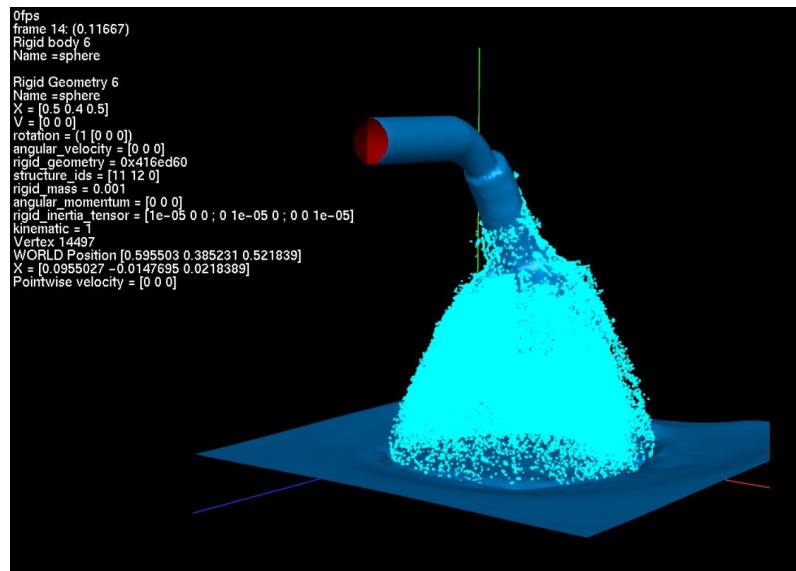
Lecture Outline

- Participating media simulation (advanced)
- Guest speaker!

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Simulation



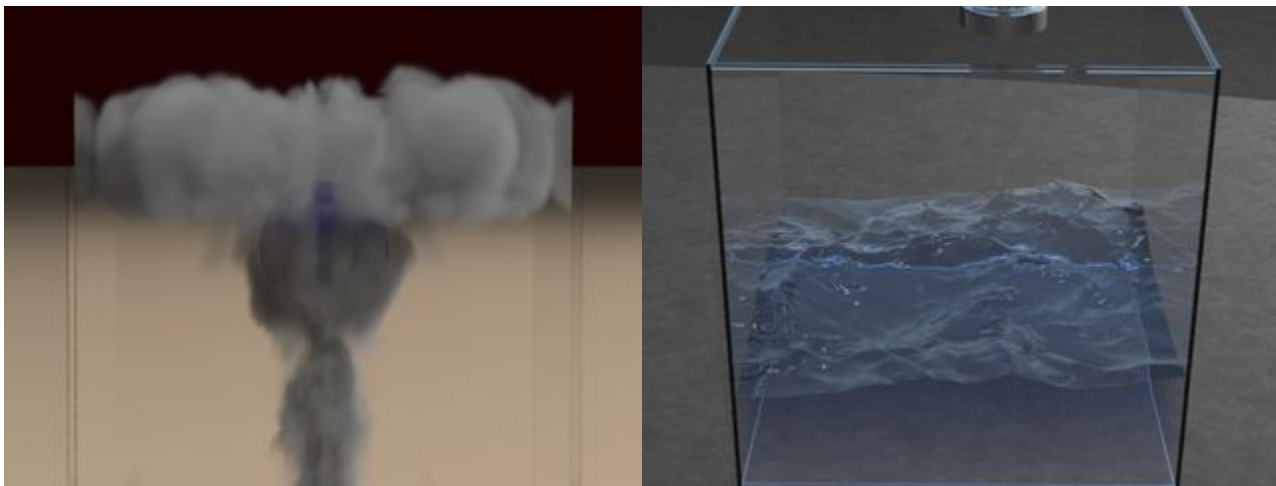
Volumetric Rendering

- How to model **participating media** (dust/fog/clouds/smoke,etc)?



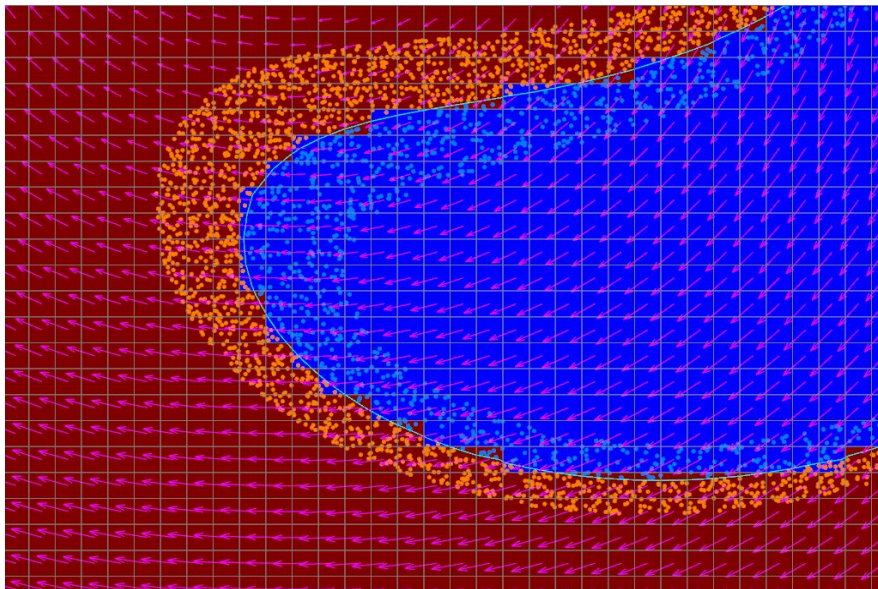
Volumetric Rendering

- How to model **participating media** (dust/fog/clouds/smoke,etc)?
- Two part process:
 - **1) Simulate the media** similar to how we simulate fluids
 - **2) Ray trace the media** similar to how we handle transmissions



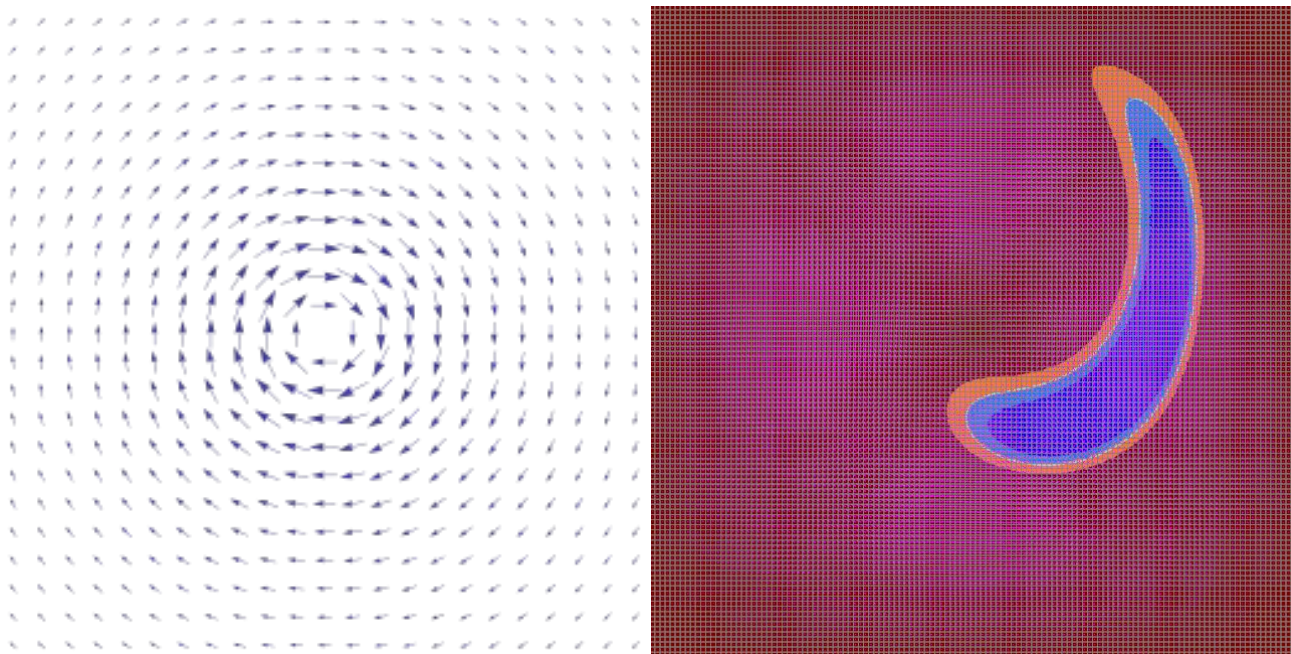
Recall: Fluid Simulation

- We track the **particles quantities** in space using a fluid domain
- In 2D we use a rectangular grid, in 3D we use a bounding volume
- 2D Example –
- Each grid cell stores velocity vectors along edges
- Essentially, the domain stores a velocity field
- These velocities are used to move the **particles quantities** in the cell from state to state



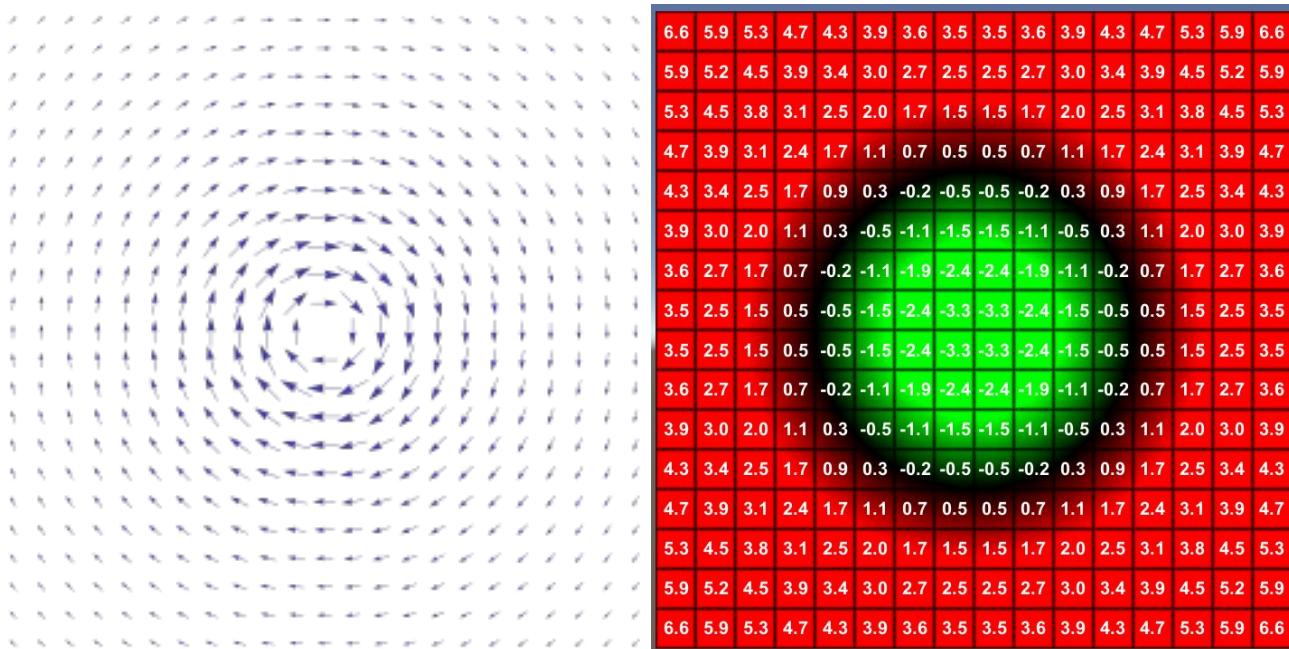
Fields in Calculus and Physics

- Storing quantities on each grid cell gives us a **field**, aka a lookup function that tells us what the quantity is at a point in space



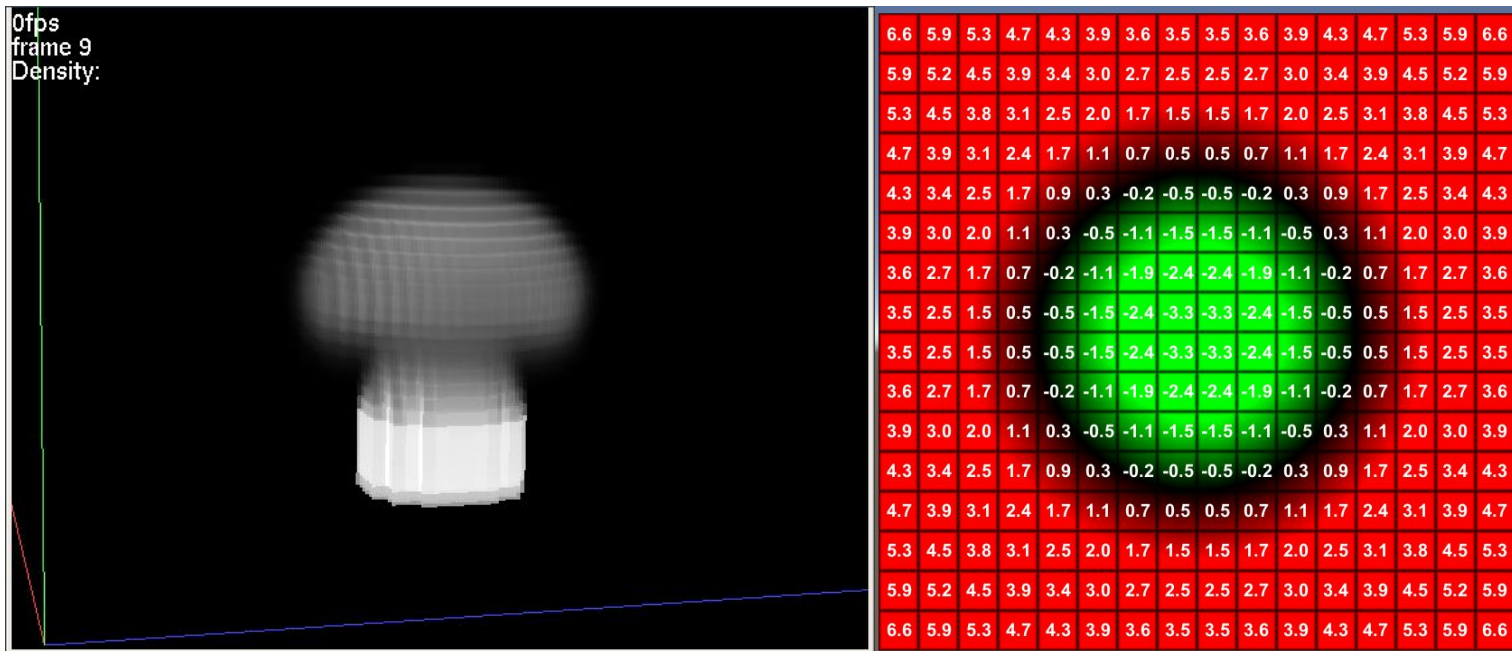
Fields in Calculus and Physics

- **Vector fields** store vectors at each grid cell (e.g. velocity fields)
- **Scalar fields** store scalars at each grid cell (e.g. distance fields)



Fields in Calculus and Physics

- Participating media like **smoke** and **fog** have **scalar density fields**
- Smoke also involves tracking a **scalar temperature field**

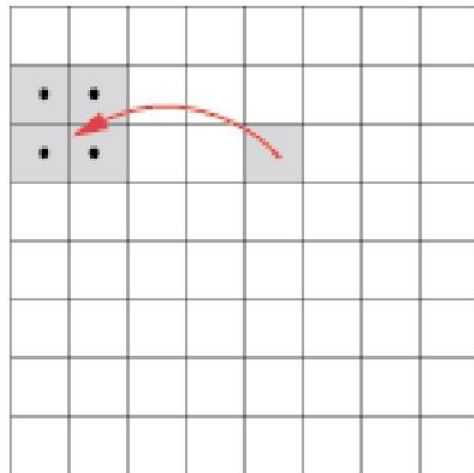


Fields in Calculus and Physics

- The **evolution of a field** over time **due to a velocity field** can be thought of as moving a particle in a cell due to the velocity
- Recall the equation of motion for a point given its initial position and velocity, and a time step size:

$$q(t + \Delta t) = q(t) + (\Delta t)v(t)$$

$$q_{k+1} = q_k + (\Delta t)v_k$$

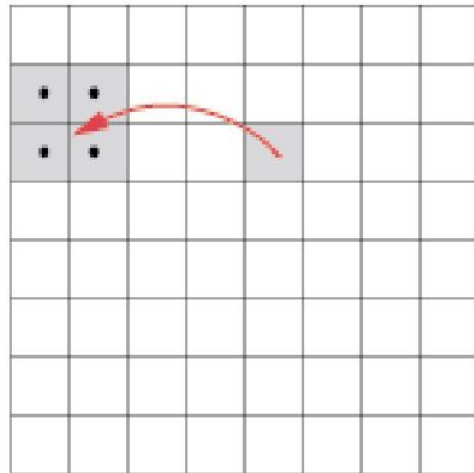


Fields in Calculus and Physics

- The **evolution of a field** over time **due to a velocity field** can be thought of as moving a particle in a cell due to the velocity
- Naive Approach: **Treat the grid cell as if it were a point** via its center, and **compute where it moves** to based on the velocity vector that was stored at the cell:

$$q_{k+1} = q_k + (\Delta t)v_k$$

- After computing where the grid cell moves to, **store its quantity in the new location**

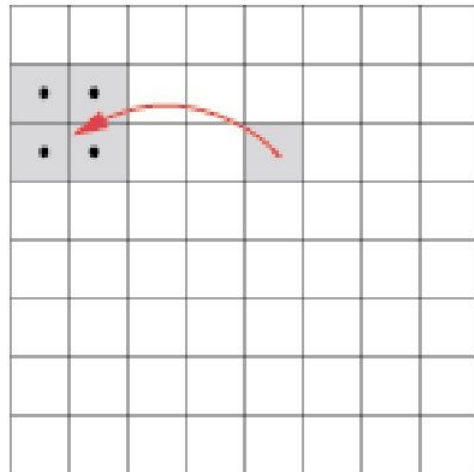


Fields in Calculus and Physics

- The **evolution of a field** over time **due to a velocity field** can be thought of as moving a particle in a cell due to the velocity
- Naive Approach:

$$q_{k+1} = q_k + (\Delta t)v_k$$

- Problems:
 - Uses **Explicit Euler**, which recall can be unstable (“blow up”) for big time steps
 - What if the new location of the cell isn’t exactly a grid cell (e.g. see diagram)?

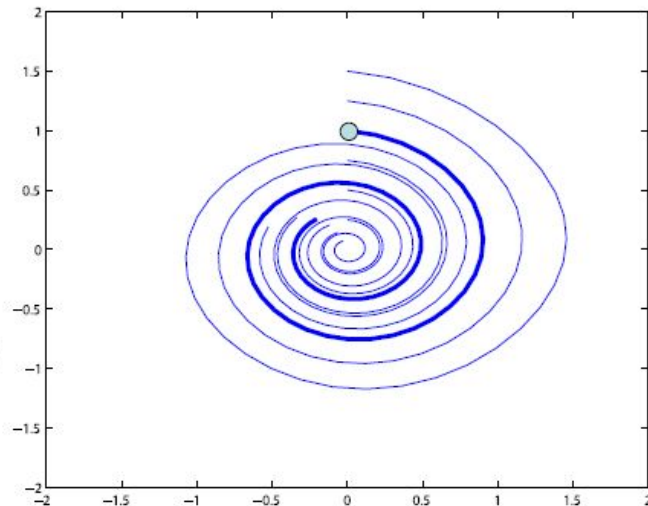
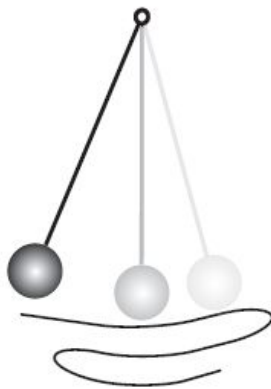


Alternatively: Implicit Euler

- Consider **Implicit Euler** (aka Backward Euler):

$$q_{k+1} = q_k + (\Delta t)v_{k+1}$$

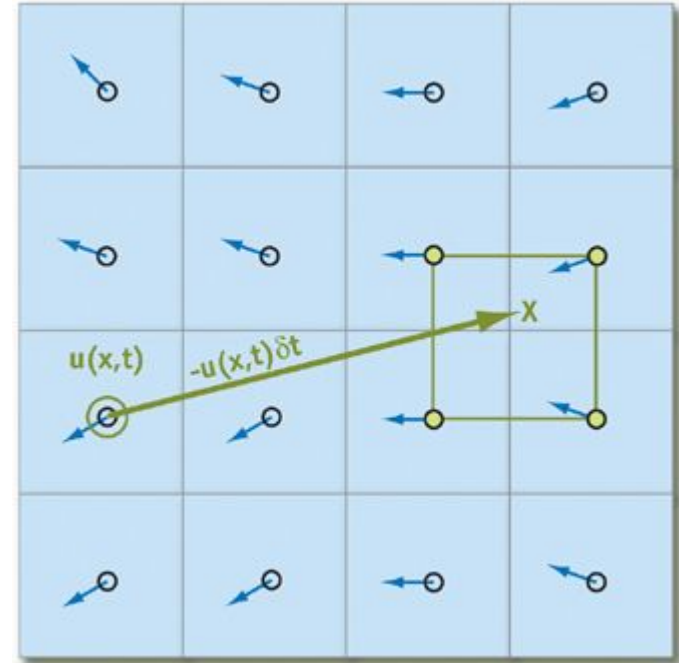
- Can do analysis to see this is stable for ALL time steps!



- What if we use Implicit Euler for our advection process?**

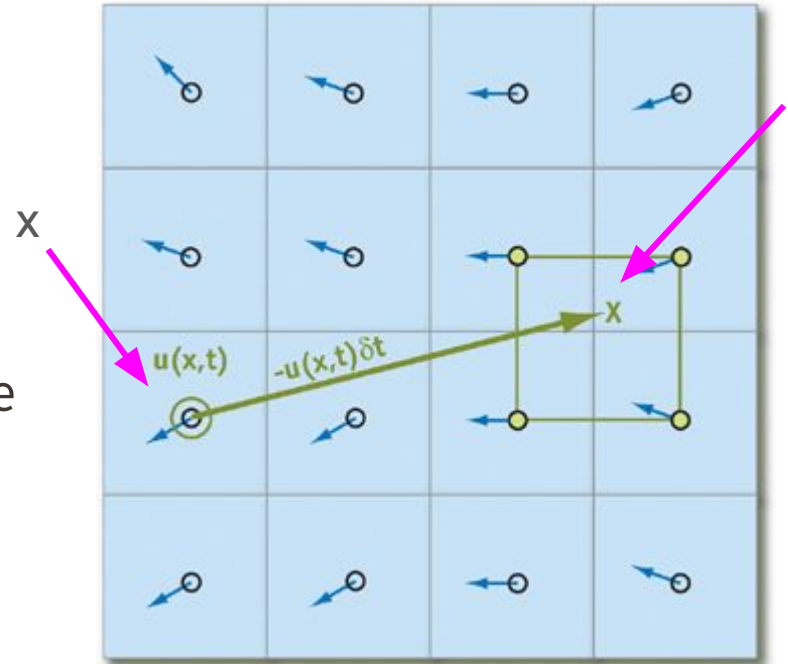
Implicit Euler for Advection

- Use the velocity stored at the grid cell to **trace it “back in time”** to its last position (hence “Backward” Euler)



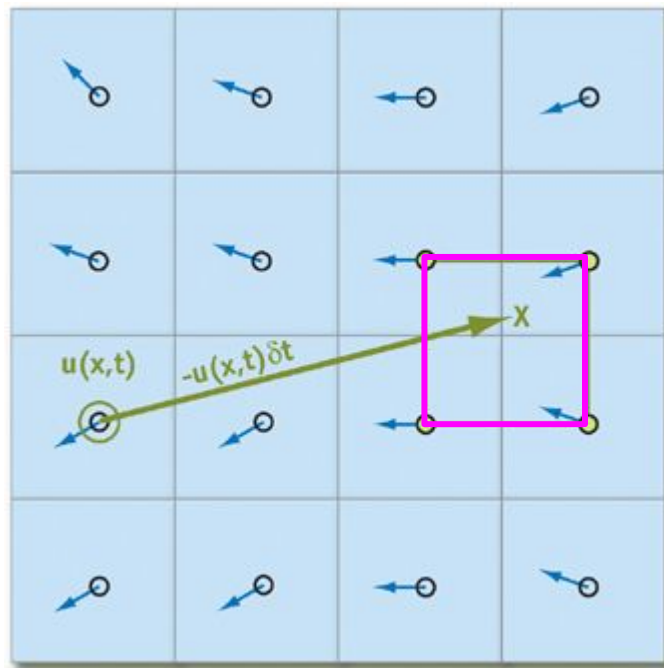
Implicit Euler for Advection

- Use the velocity stored at the grid cell to **trace it “back in time”** to its last position (hence “Backward” Euler)
- Implicit Euler Advection Process:
 - Trace grid cell center x back in time to get position X



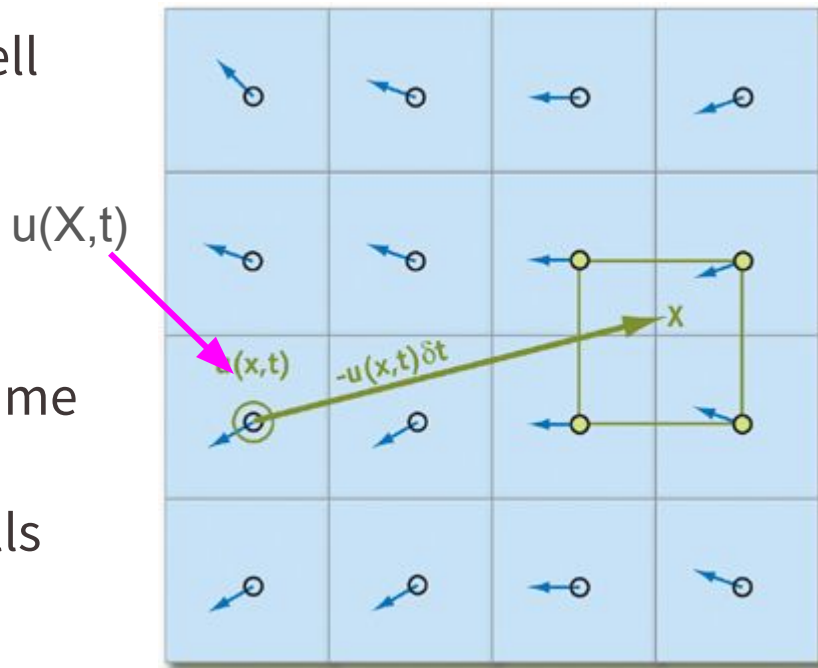
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- Use the velocity stored at the grid cell to **trace it “back in time”** to its last position (hence “Backward” Euler)
- Implicit Euler Advection Process:
 - Trace grid cell center x back in time to get position X
 - Interpolate surrounding grid cells around X to get quantity at X



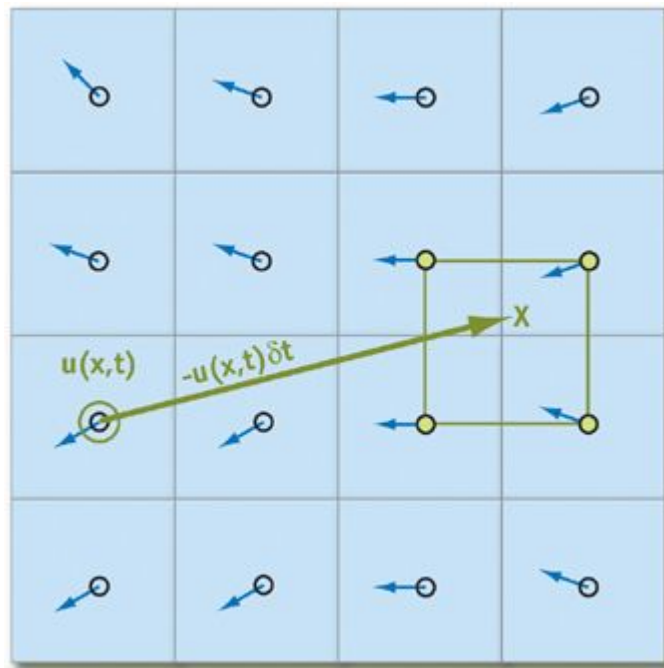
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Implicit Euler for Advection

- Implicit Euler Advection Process:
 - Trace grid cell center x back in time to get position X
 - Interpolate surrounding grid cells around X to get quantity at X
 - Store computed quantity at the grid cell for its new value
- This **only works with implicit** (not explicit) euler because you already know the past points and can then interpolate



Advecting Velocity with Velocity

- We can advect any field (distance, density, temperature, etc. fields) with the velocity field
- Why not also advect the velocity field with itself?
- Actually done in the **Navier-Stokes equations for incompressible flow** when updating the state of a fluid with velocity field u :

$$\frac{\partial u}{\partial t} = \boxed{-(u \cdot \nabla)u} - \frac{1}{\rho} \nabla p + \nu \nabla^2 u + F$$

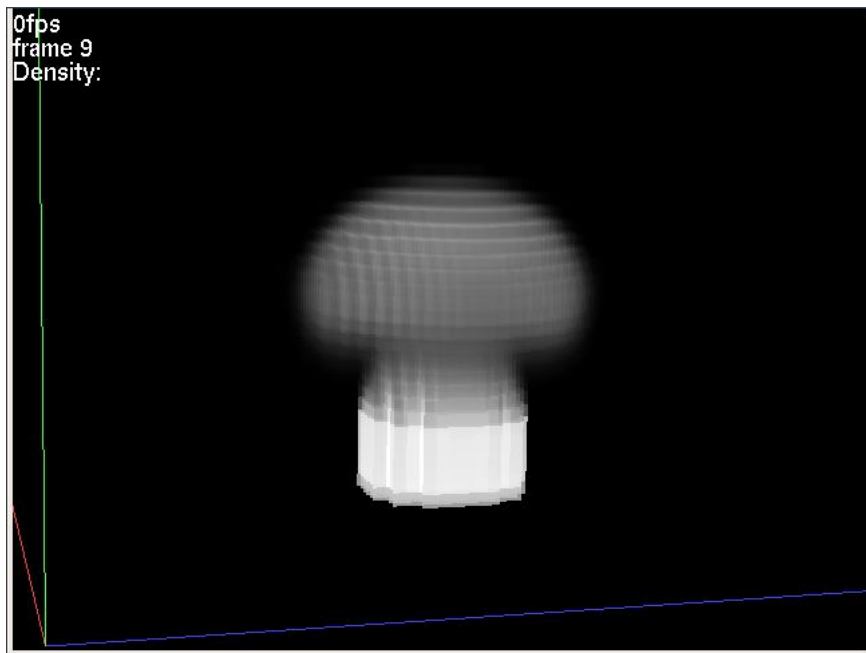
$$\nabla \cdot u = 0$$

The “Advection Operator”

Can read more on Navier-Stokes from [this Nvidia paper](#)

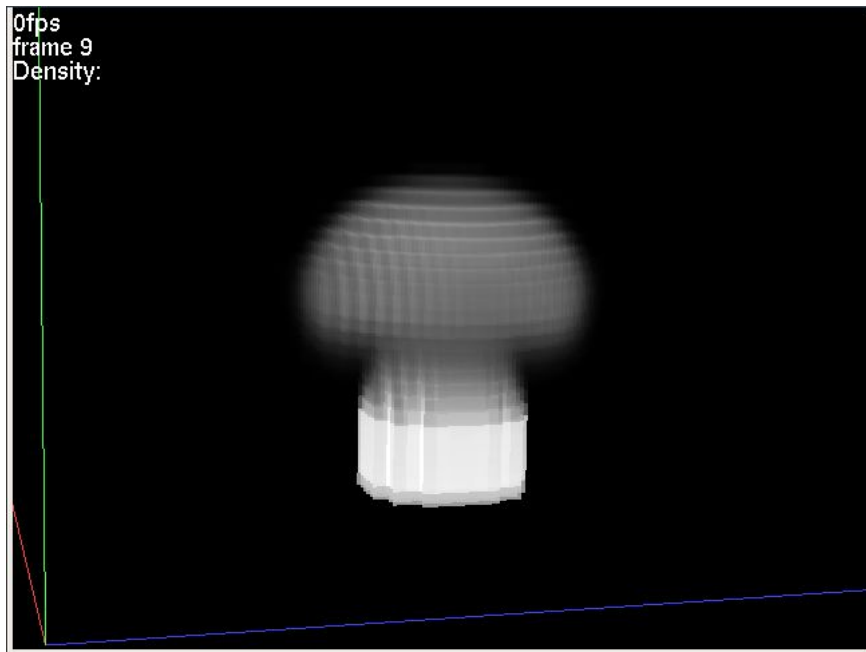
Ray Tracing Density Fields

- Participating media like **smoke** and **fog** have **scalar density fields**
- Step 1: Simulate the media and update its (density) fields



Ray Tracing Density Fields

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- Step 1: Simulate the media and update its (density) fields
- Step 2: Take into account the density field as we shoot rays through the domain



Absorption

- Step 2: Take into account the density field as we shoot rays through the domain
- As light travels through participating media, it can be **absorbed** and converted into non-visible energy, e.g. heat



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- Computer science parallel: as light moves a distance dx along a ray, a fraction (absorption coefficient σ_a) of its radiance is lost/absorbed:

$$dL(x, \omega) = -\sigma_a(x)L(x, \omega)dx$$

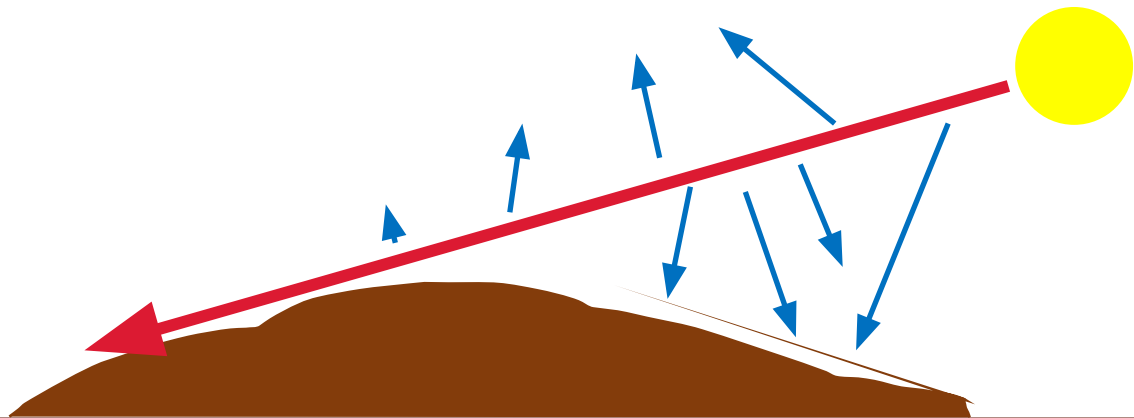
Based on Density Field



Out-Scattering

- As light travels through participating media, it can be **out-scattered** to different direction(s)
- Computer science parallel: as light moves a distance dx along a ray, a fraction (scattering coefficient σ_s) of its radiance is lost/scattered

$$dL(x, \omega) = -\sigma_s(x)L(x, \omega)dx$$



Attenuation

- Combine the absorption and scattering coefficients to get the **attenuation coefficient**:

$$c(x) = \sigma_a(x) + \sigma_s(x)$$

$$dL(x, \omega) = -c(x)L(x, \omega)dx$$

Attenuation

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- Integrate both sides... we get **Beer's Law**!

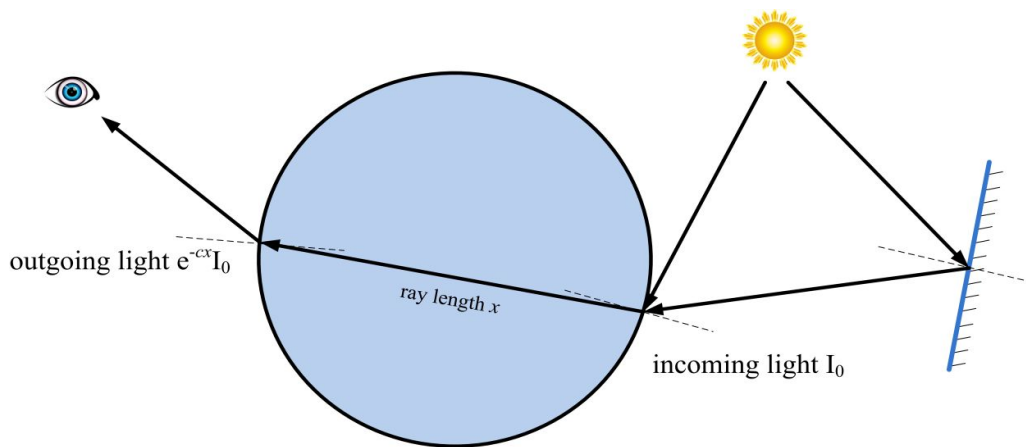
$$L_{atten} = Le^{-cx}$$

Attenuation

- Recall **Beer's Law** tells us how much light is lost as we go through a medium, e.g. going from air through a transparent material

$$L_{atten} = Le^{-cx}$$

- Light enters a medium along a ray and travels through a distance x
- The **falloff** (fraction of light lost) is $e^{(-cx)}$



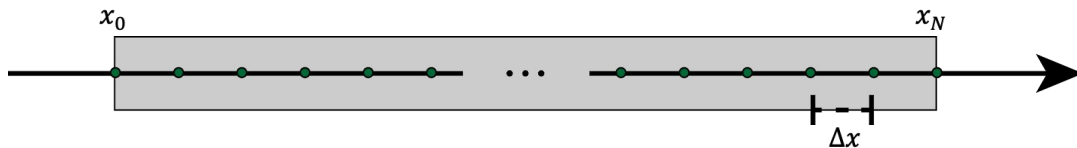
Heterogeneous Beer's Law

- For homogenous media, the attenuation coefficients are constant throughout (e.g. the glass from HW3)
- For participating media (smoke, fog, etc), our density field has changing quantities throughout our grid domain
- Must use **heterogeneous Beer's Law** to compute falloff for light along the ray at every tiny step as we ray trace:

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- Must use **heterogeneous Beer's Law** to compute falloff for light along the ray at every tiny step as we ray trace:

$$L e^{-c(\frac{x_0+x_1}{2})\Delta x} e^{-c(\frac{x_1+x_2}{2})\Delta x} \dots e^{-c(\frac{x_{N-1}+x_N}{2})\Delta x}$$



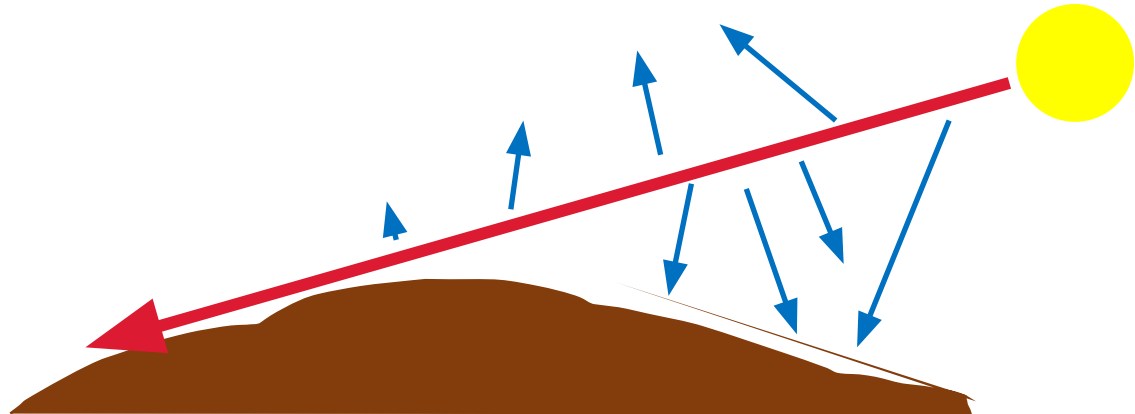
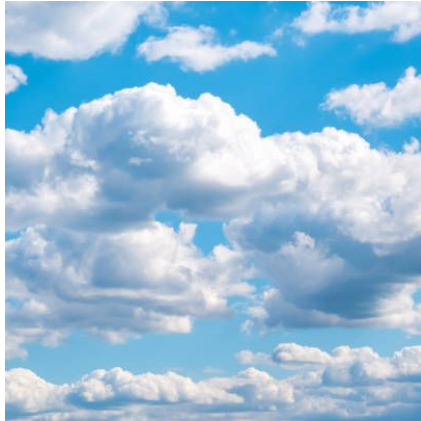
Attenuation of Shadow and Camera Rays

- Attenuation causes participating media like smoke to cast a shadow
- Light gets lost as it goes through the smoke density field, becoming darker
- Attenuation also obscures objects in smoke due to lost light



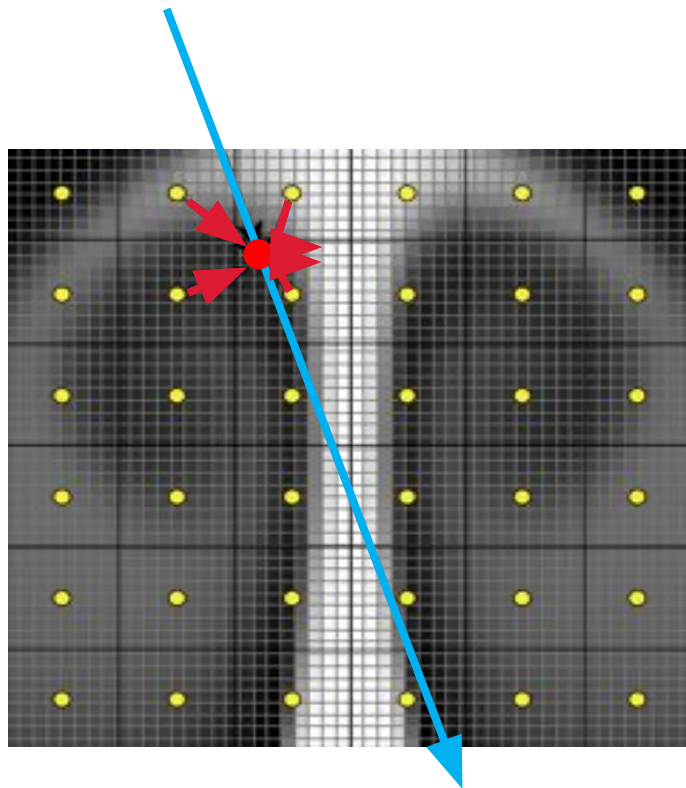
In-Scattering

- As light travels through participating media, it can be **out-scattered** to different direction(s)
- The out-scattered light can be **in-scattered** to our eyes/camera
- Example: the blue components of sunlight out-scattered by the atmosphere become in-scattered into our eye to make the sky blue



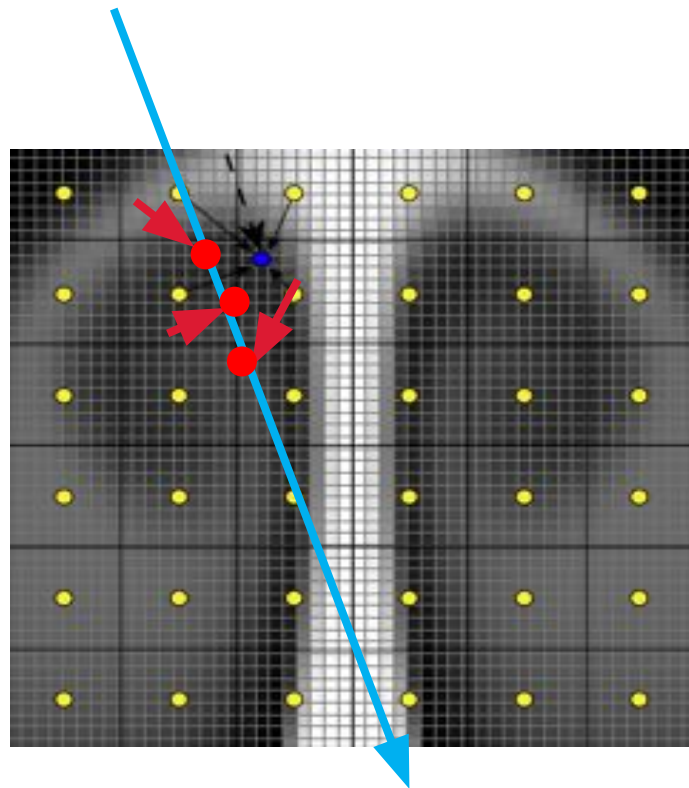
Volumetric Light Map

- Model in-scattering when ray tracing with a **volumetric light map**
- **Precompute** one **for each light**
- For each volumetric light map:
 - At each grid cell of our domain, cast a ray to the light
 - Compute how much light gets to that grid cell through the density field
 - Store that radiance at the cell



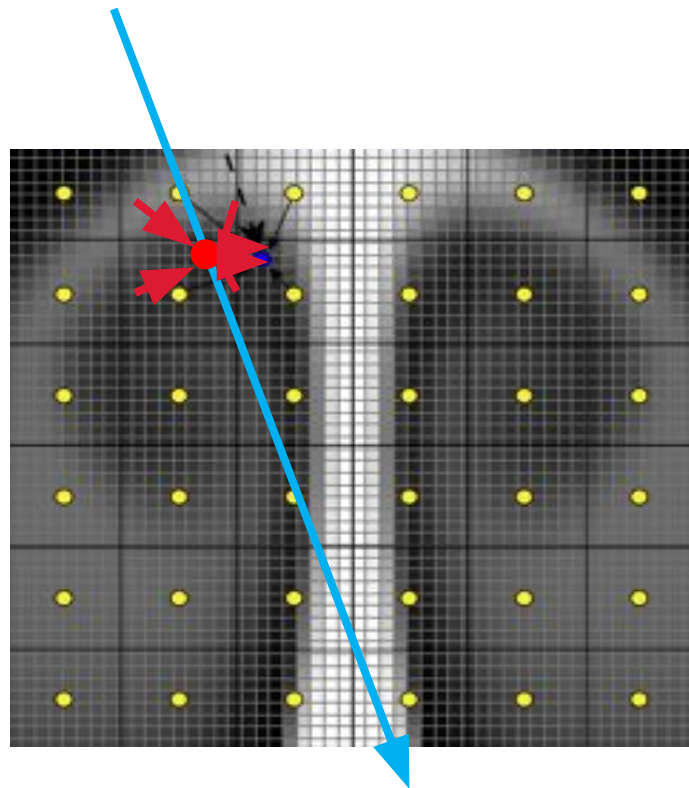
Volumetric Light Map

- As we ray trace, interpolate radiance values in nearby grid cells to see how much light is available for in-scattering



Volumetric Light Map

- As we ray trace, interpolate radiance values in nearby grid cells to see how much light is available for in-scattering
- Use a **phase function** that depends on the direction of our ray and the light to compute the probability of adding the interpolated light as in-scattered light



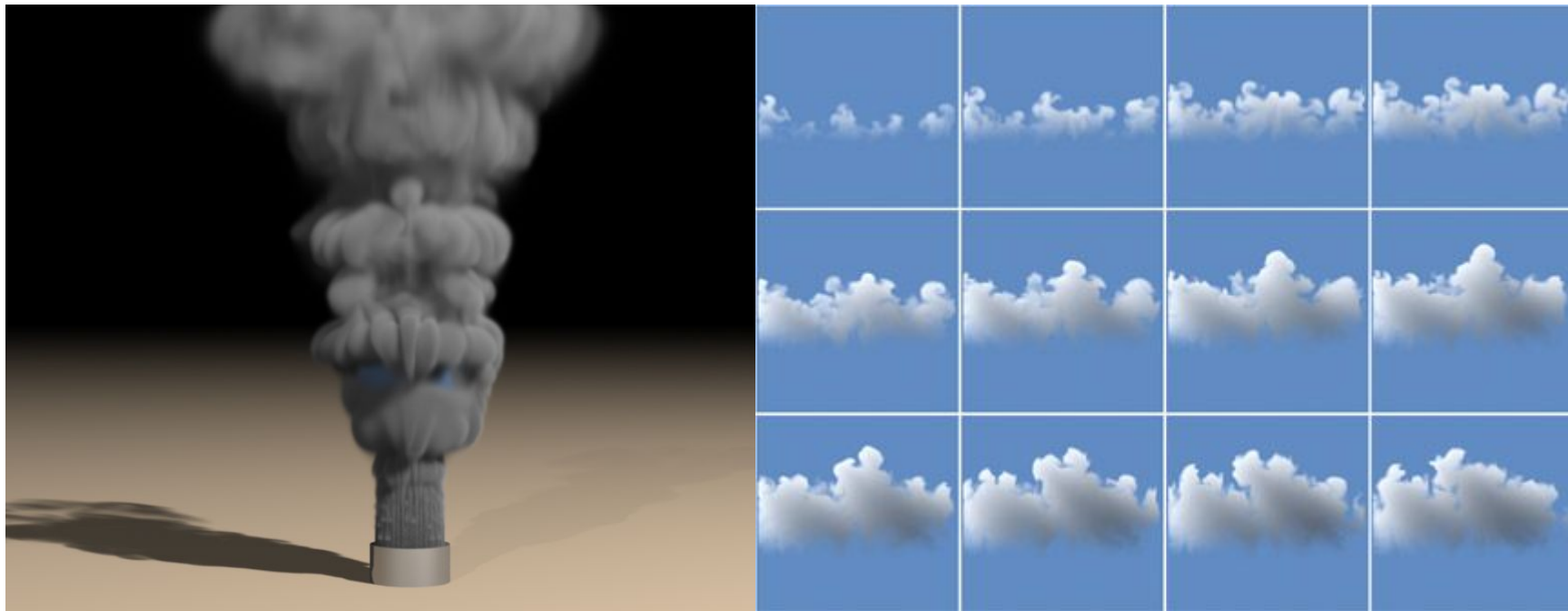
Phase Functions

- As we ray trace, interpolate radiance values in nearby grid cells to see how much light is available for in-scattering
- Use a **phase function** that depends on the direction of our ray and the light to compute the probability of adding the interpolated light as in-scattered light
- Example phase functions of angle between our ray and the light:

- Rayleigh (for atmosphere):
$$p(\theta) = \frac{3}{8}(1 + \cos^2 \theta)$$

- Henyey-Greenstein (more general):
$$p(\theta) = \frac{\frac{1}{4\pi}(1 - g^2)}{(1 + g^2 - 2g \cos \theta)^{1.5}}$$

Volumetric Rendering



Lecture Outline

- Participating media simulation (advanced)
- Guest speaker!

GUEST LECTURE

Scientific visualization.

Turning simulation data into something you can see.

Matt Larsen · Luminary

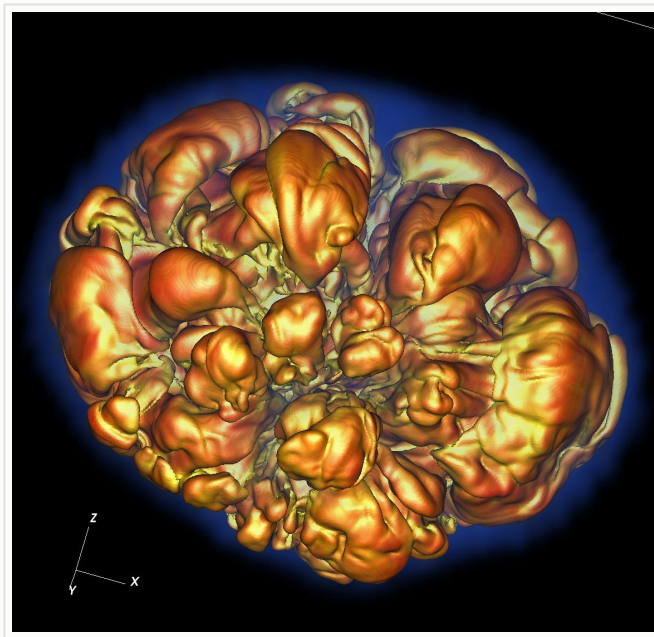
Introduction to Computer Graphics

01

What scientific visualization is,
and who needs it.

Simulation produces numbers. People need pictures.

- An interdisciplinary corner of computer graphics, aimed at 3D physical phenomena.
- Input is a discretized field over a mesh — not triangles handed to you by an artist.
 - Scalars: temperature, pressure, density
 - Vectors: velocity, momentum, magnetic field
- Considered a branch of computer science that is a subset of computer graphics

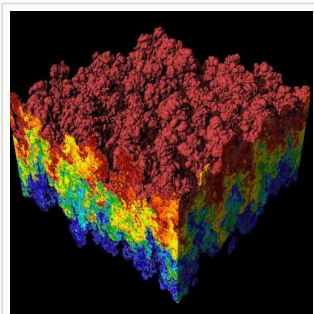


Isosurface, temperature field, supernova simulation

Three reasons anyone opens a visualization tool.

Debugging

Something in the run is wrong. The picture tells you where, and usually faster than the log does.



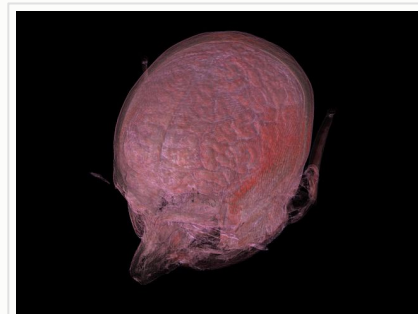
Analysis

The run is fine and now you need a number, a trend, a mechanism you can defend.



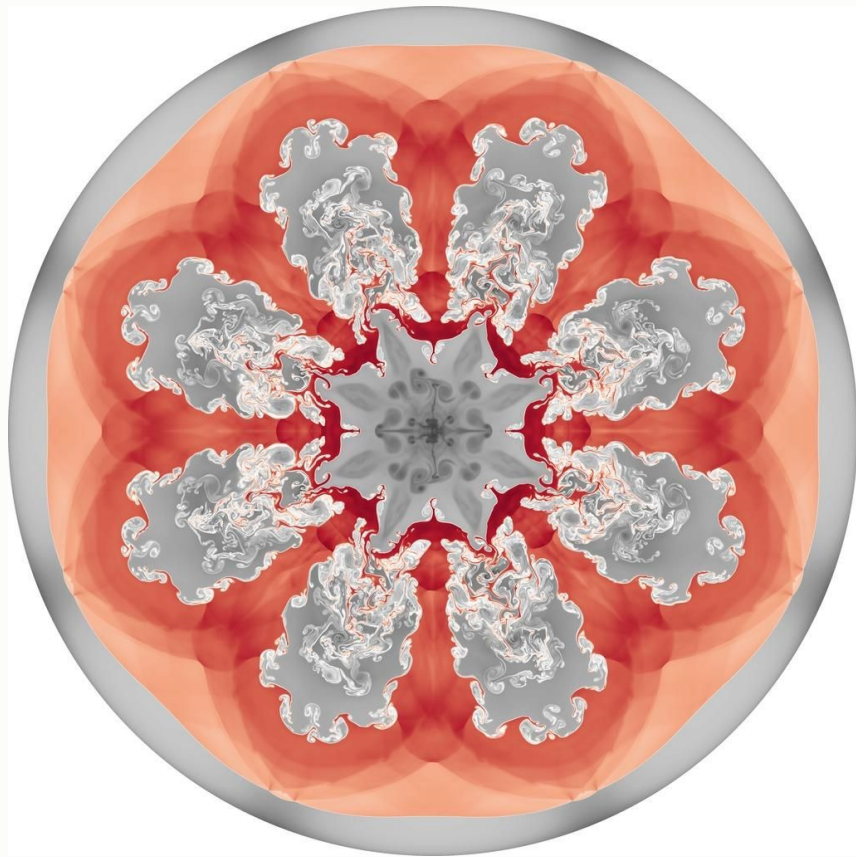
Communication

A reviewer, a customer, or a program manager has to believe the result.



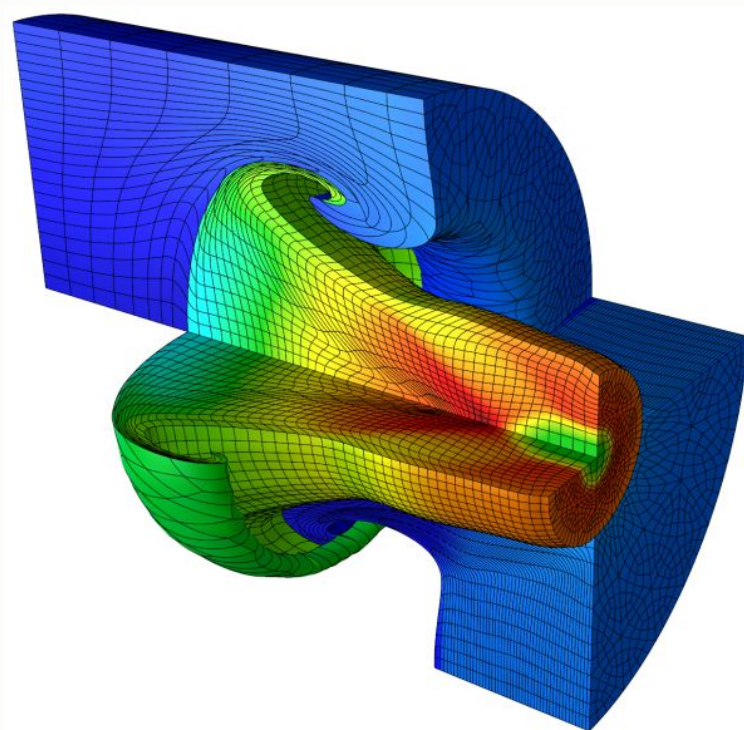
Who actually does this?

- National labs (DOE)
 - NNSA: LLNL, LANL, SNL
 - Office of Science: LBL, ANL,...
- Industry
 - Any sort of product development
- Academia
 - Research



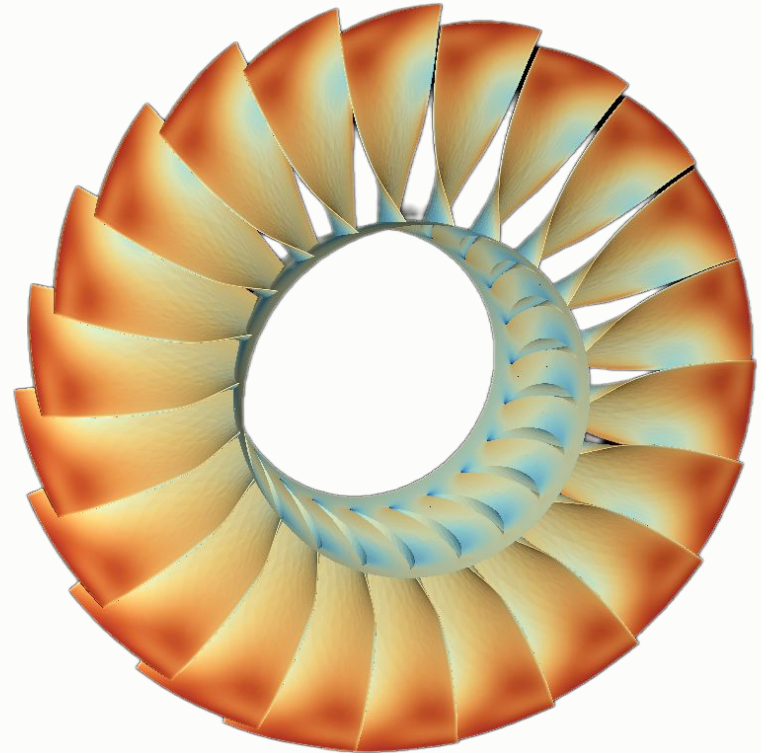
Almost every physical science has a simulation code.

- Hydrodynamics (many flavors), CFD, N-body
- Seismic, radiation transport, finite element
- Particle accelerators, climate, geology
- Astrophysics, materials science, molecular dynamics, ...



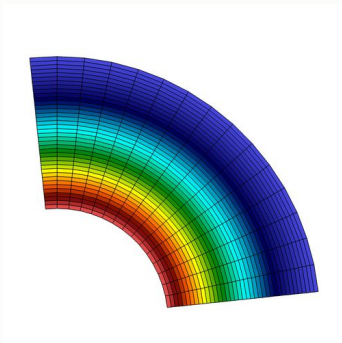
Even CFD alone has many applications

- Aerospace
- Automotive
- Turbomachinery
- Defense
- Dishwashers
- Pizza ovens



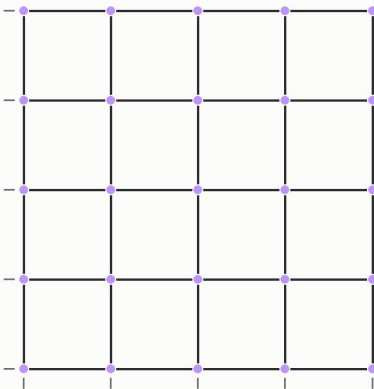
The mesh is the data structure: regular grids

- Uniform — spacing is constant; store an origin and a delta.
- Rectilinear — per-axis coordinate arrays; vertices are the cross product.
 - $X = \{0, 1, 2, 3\}$, $Y = \{2, 3, 5, 6\}$
 - Cheap to store, trivial to index, and extremely common
- Curvilinear — unstructured coordinates.

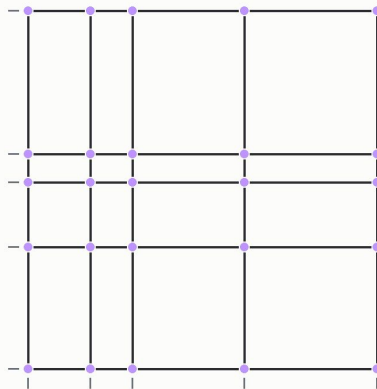


CURVILINEAR

UNIFORM

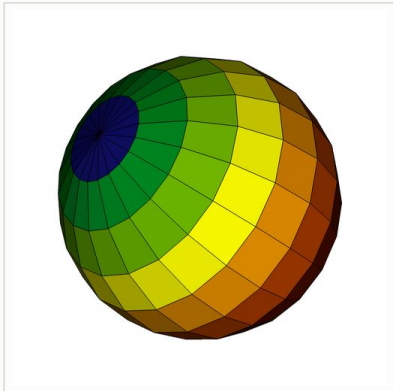


RECTILINEAR

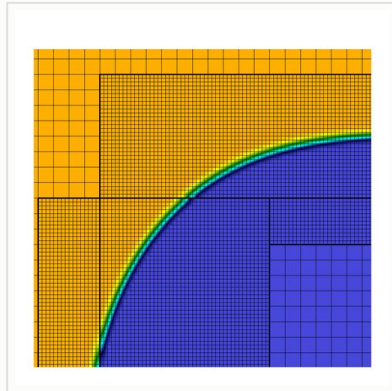


same vertex count — only the spacing rule differs

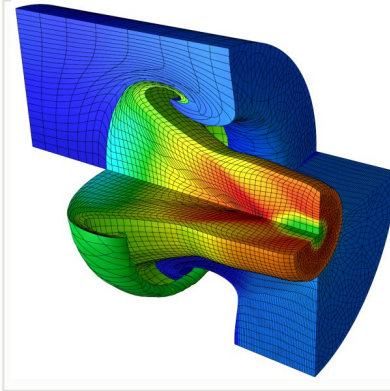
More advanced mesh flavors



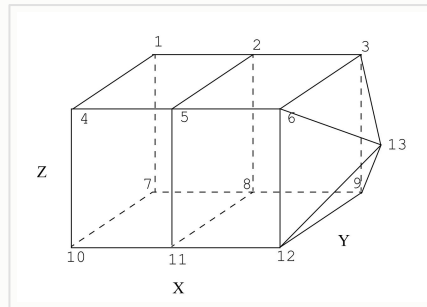
UNSTRUCTURED / POLYHEDRAL



ADAPTIVE MESH REFINEMENT



High Order Mesh

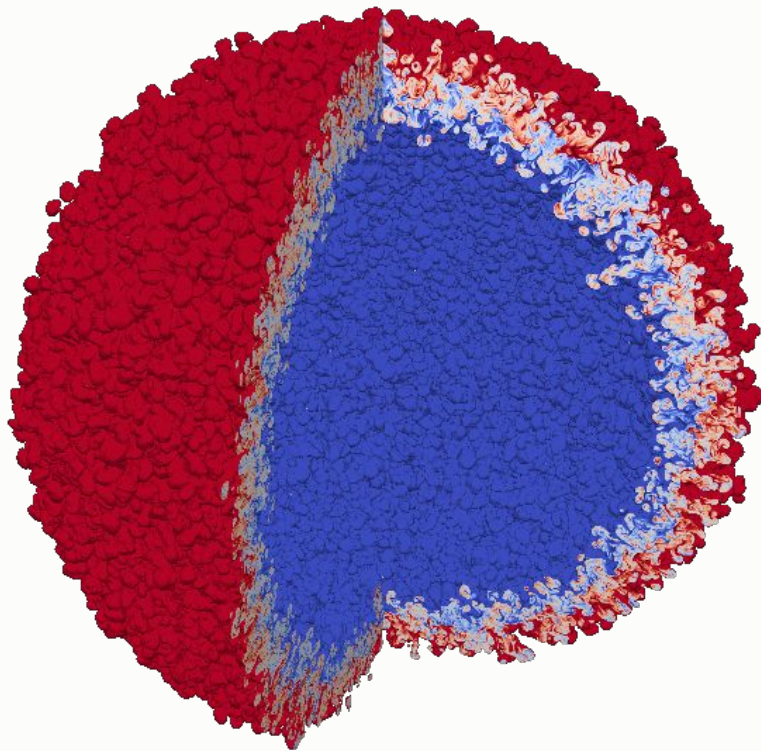


CELL CONNECTIVITY

- Explicit connectivity: a point list plus a cell list. Flexible, and far more expensive per cell.
- High order — cells carry curved basis functions, so a "linear" renderer quietly gets it wrong.

How large is the data?

- Day-to-day workloads: 1–64 nodes. This is most of the actual science.
- Hero runs: the whole machine, scheduled months ahead, run once.
- Either way the data is distributed, so the visualization is too — MPI, one rank per piece.
 - Every algorithm that follows has to work without seeing the whole mesh
- Data size is challenging
- Data partitioning is not great for visualization



The Top 500

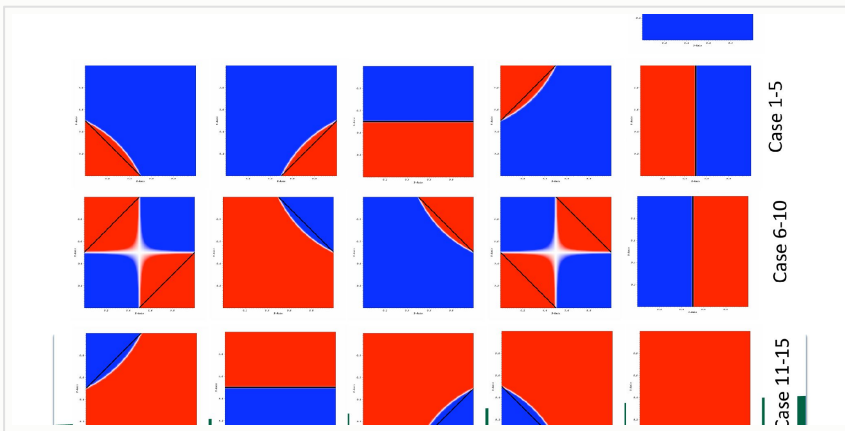
Rank	System	Cores	Rmax (PFlop/s)	Rpeak (PFlop/s)	Power (kW)
1	LineShine - LingKun, LX2 304C 1.55GHz, LingQi, Kylin OS, Shenzhen Cloud Computing Center Co., Ltd. National Supercomputing Centre in Shenzhen (NSCS) China	13,789,440	2,198.40	2,735.82	42,220
2	El Capitan - HPE Cray EX255a, AMD 4th Gen EPYC 24C 1.8GHz, AMD Instinct MI300A, Slingshot-11, TOSS, HPE DOE/NNSA/LLNL United States	11,340,000	1,809.00	2,821.10	29,685
3	Frontier - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE Cray OS, HPE DOE/SC/Oak Ridge National Laboratory United States	9,066,176	1,353.00	2,055.72	24,607
4	Aurora - HPE Cray EX - Intel Exascale Compute Blade, Xeon CPU Max 9470 52C 2.4GHz, Intel Data Center GPU Max, Slingshot-11, Intel DOE/SC/Argonne National Laboratory United States	9,264,128	1,012.00	1,980.01	38,698
5	JUPITER Booster - BullSequana XH3000, GH Superchip 72C 3GHz, NVIDIA GH200 Superchip, Quad-Rail NVIDIA InfiniBand NDR200, RedHat Enterprise Linux, Bull EuroHPC/FZJ Germany	4,801,344	1,000.00	1,226.28	15,794

02

A short tour of the
algorithm zoo.

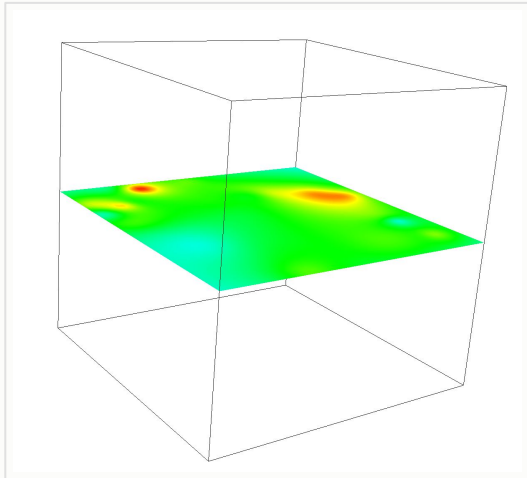
Isosurfacing: draw where the field equals a value.

- Pick an isovalue. Find the surface where $F =$ that value.
- Per cell, the sign pattern at the corners determines the topology.
 - 2D: 16 cases. 3D: 256, reduced to 15 by symmetry
- Precompute every case into a lookup table, then it is one table read per cell.
- Marching cubes, 1987 — still the workhorse.

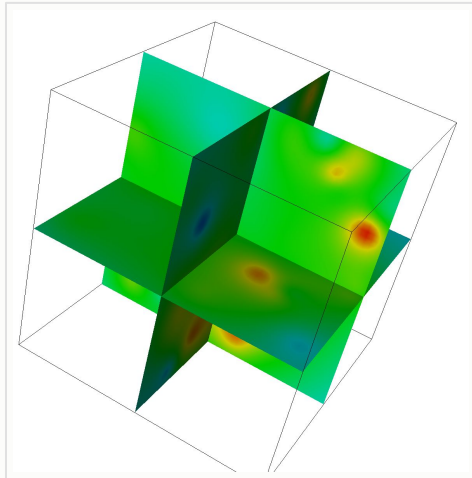


The 16 two-dimensional cases

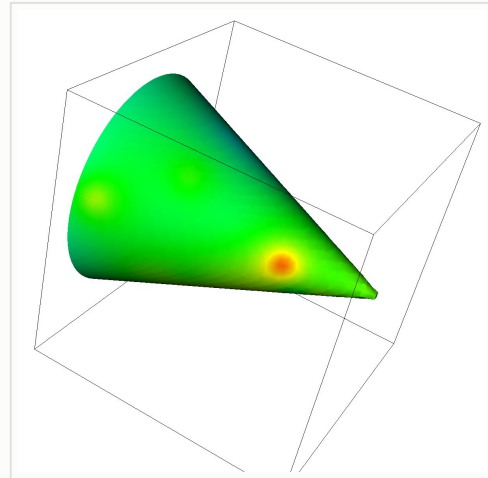
Slicing: trade a dimension for clarity.



axis-aligned plane



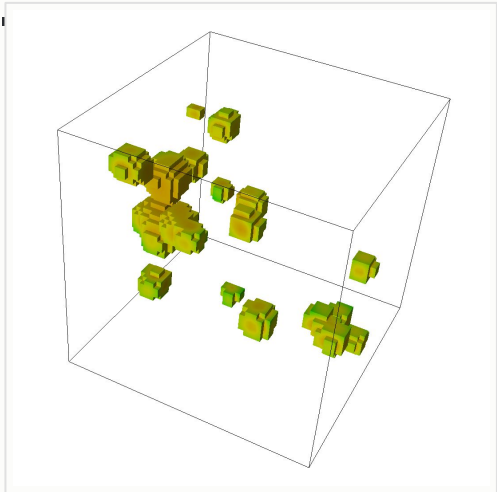
three planes at once



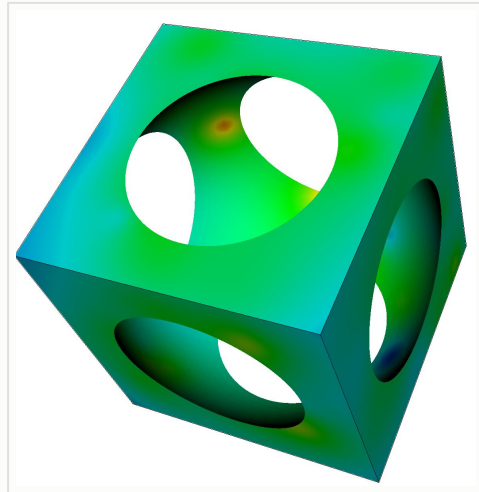
slice by a non-planar surface

Implemented with a signed distance function: evaluate it at every point, then contour it at zero. Which means slicing is isosurfacing wearing a different hat.

Thresholding and clipping: throw away what you do not need.



threshold — keep cells inside a value range

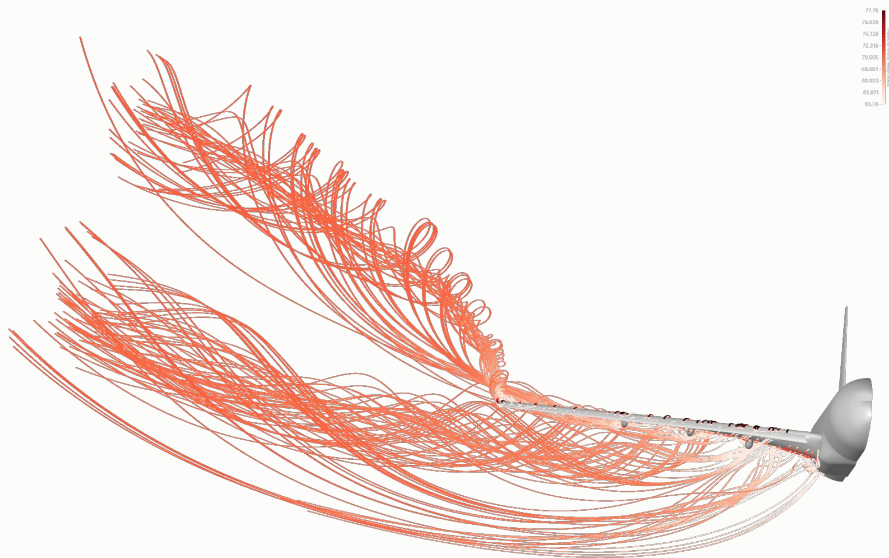


clip — cut by a geometric region

Threshold is a query on values; clip is a query on space. Both shrink the problem before the expensive stage.

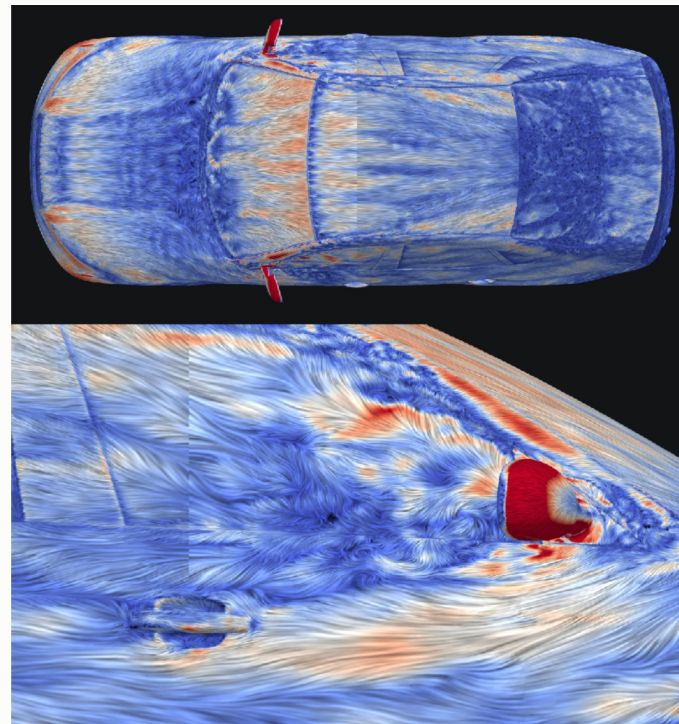
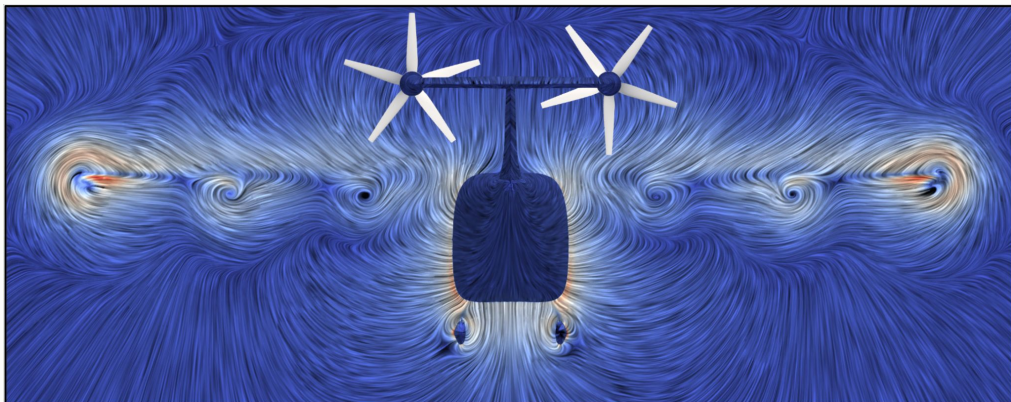
Streamlines: follow the velocity field.

- Integrate a massless particle through the vector field.
- Euler is cheap and wrong; RK4 is the default
- Steady field $\rightarrow$ streamline. Time-varying field $\rightarrow$ pathline.
- Seed placement is the whole game: bad seeds, useless picture.
- Sweep a seed curve instead of a point and you get a stream surface.



Line integral convolution.

- Smear a noise texture along the local flow direction.
- Shows direction everywhere on a surface at once — no seeds to place.
- Cheap enough to run as a fragment shader, but that depends on image resolution

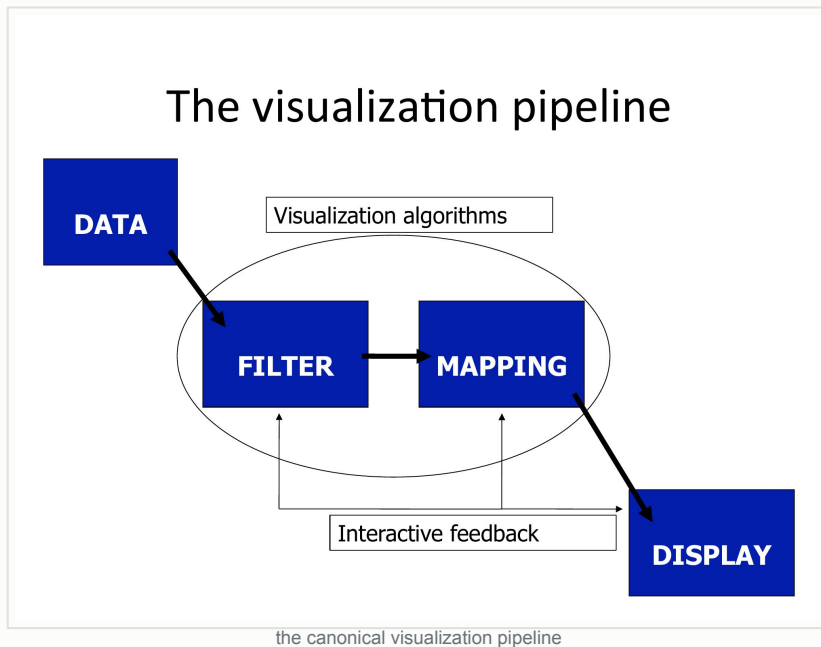


03

How visualization systems
are put together.

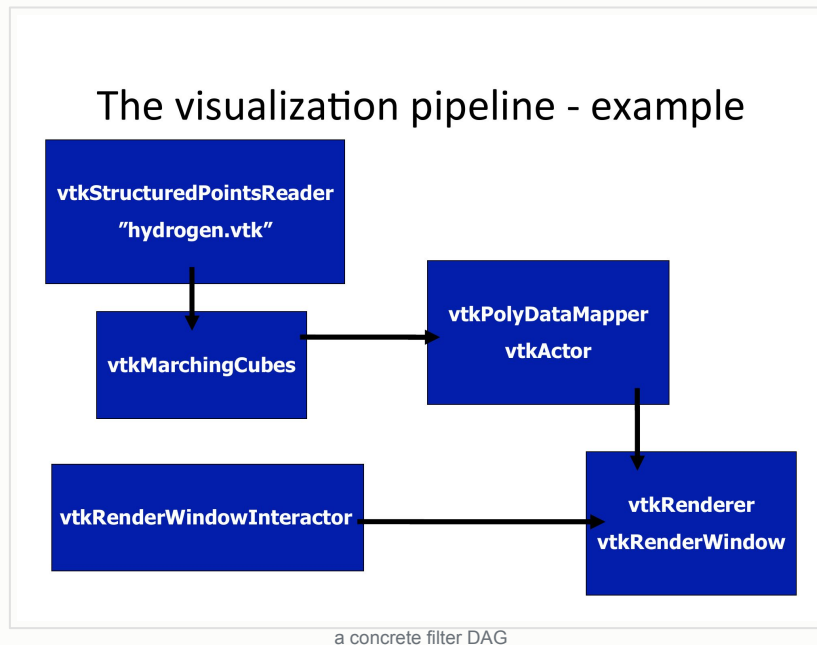
Sources, filters, sinks.

- Source — produces data: a file reader, or a synthetic generator.
- Filter — takes data in, gives data out: slice, threshold, contour.
- Sink — consumes and does not return: a renderer, a writer.
- Execution is demand-driven: the sink pulls, an update pass walks upstream, then data flows down.



It is a graph, not a line.

- Filters fan out and rejoin — a DAG, not a chain.
 - One read feeding a contour, a slice, and an outline is three branches on one source.
 - Buys you caching and lazy re-execution; costs you memory.
- Reference counting keeps intermediate results from piling up

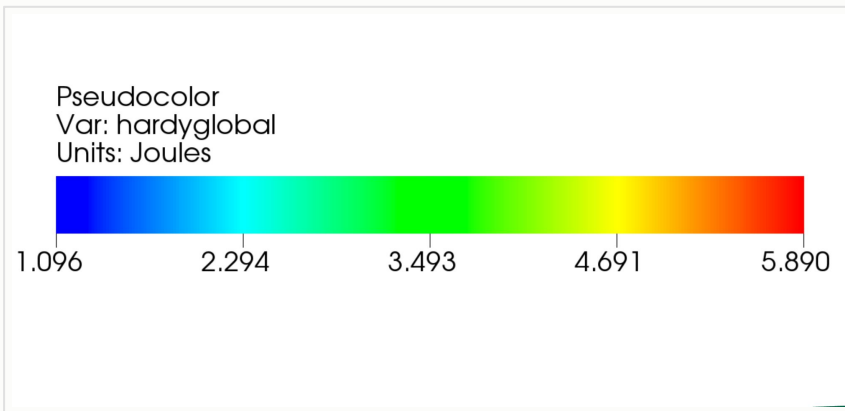


04

Color Maps

A color map is a function from scalar to color.

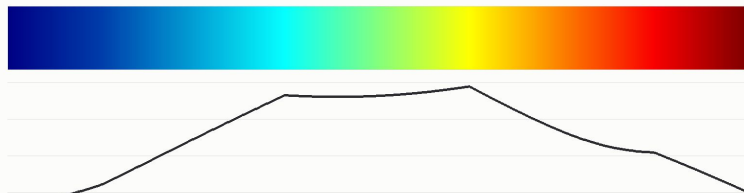
- Pick a range, map every value into it, draw a legend.
- The legend is not optional — without it the image is an illustration, not a measurement.
- Clamp or not at the ends? That decision changes what the reader concludes.



scalar field with legend

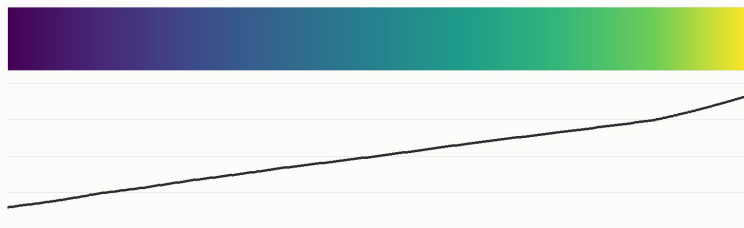
Rainbow is the default, and the default is wrong.

RAINBOW / JET



lightness L^* along the ramp

PERCEPTUALLY LINEAR



lightness L^* along the ramp

- Jet reverses perceptual lightness 114 times across 255 steps. A linear ramp reverses 6.
- So it invents edges where the data is smooth, and hides real gradients in the green.

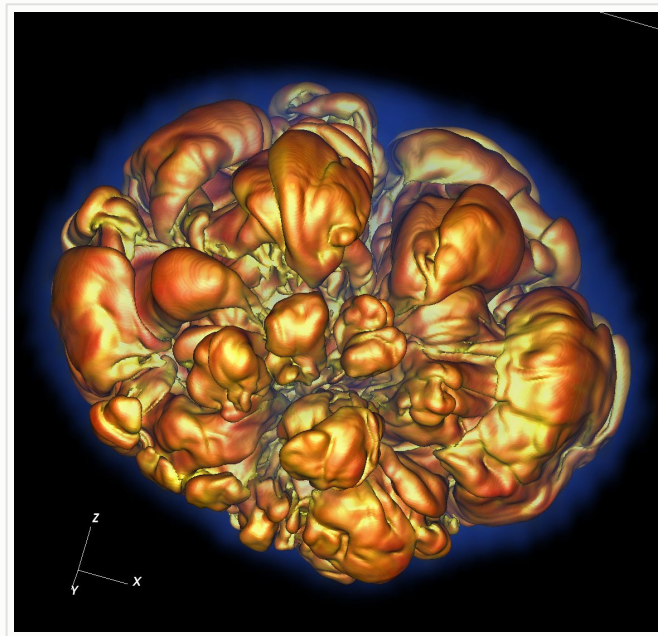
Borland & Taylor, "Rainbow Color Map (Still) Considered Harmful", IEEE CG&A 27(2), 2007

05

Rendering: surfaces,
and then volumes.

Two ways to turn a field into pixels.

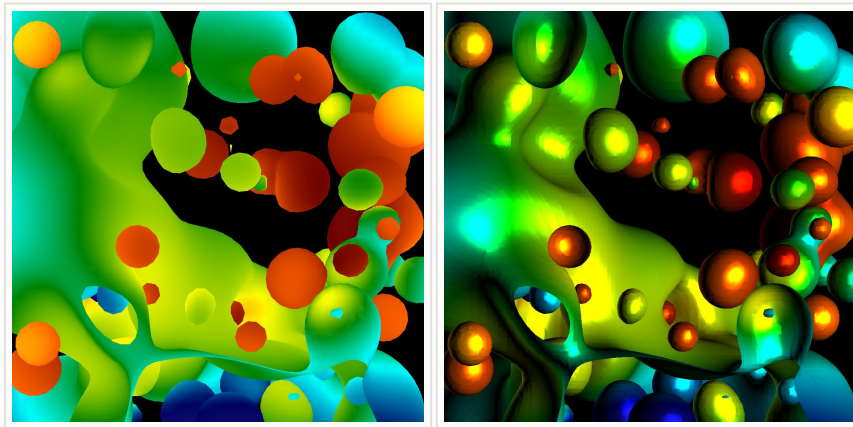
- Surface rendering — extract geometry first (external faces), then render it. This is ordinary graphics, and the GPU already likes it.
- Volume rendering — never build geometry. Integrate along rays through the field itself.
- Surfaces answer "where is the boundary". Volumes answer "what is inside".



both at once: surface plus volume

Surface shading is the part you already know.

- Triangles come out of marching cubes with a normal per vertex.
- From there it is the lighting model from your graphics course.
- LIC drops in as a fragment shader over the extracted surface.



normals and reflection on extracted geometry

Volume rendering starts with an X-ray.

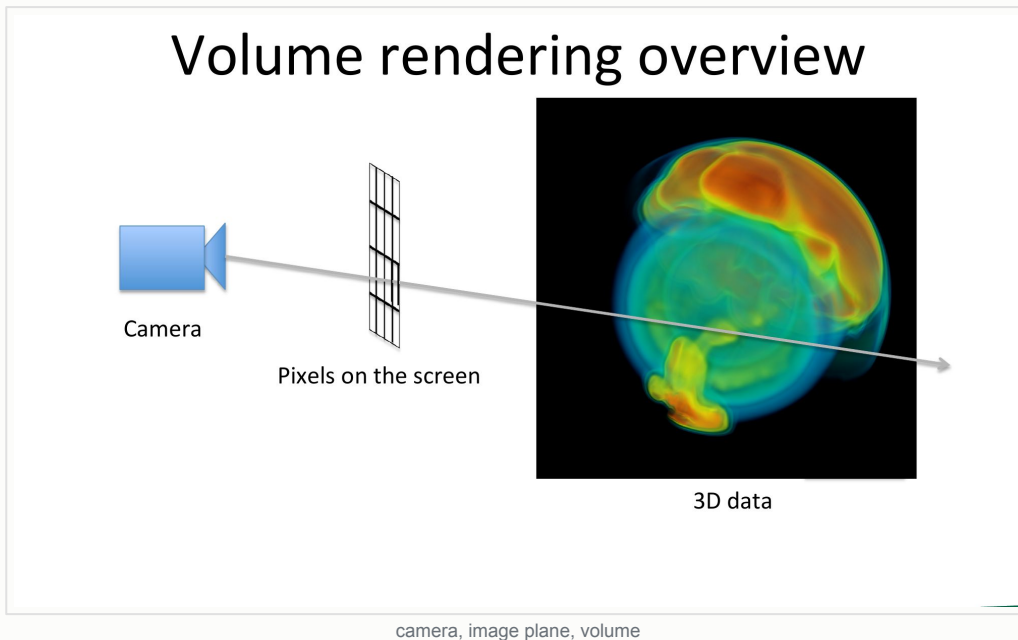
- An X-ray is a line integral through a density field, printed on film.
- No surface was extracted. Every point along the ray contributed.
- That is the whole idea — now do it with a transfer function and a camera you control.



Röntgen-era radiograph

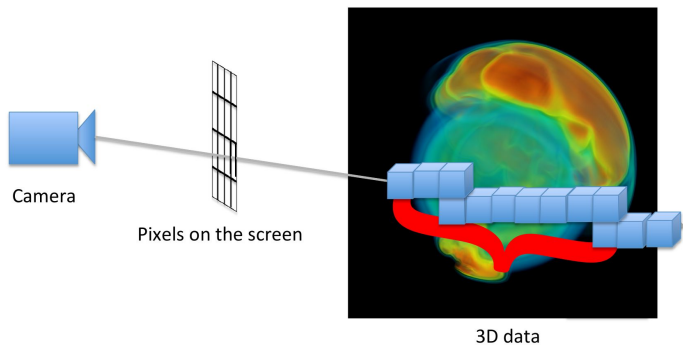
Ray casting, end to end.

- For every pixel on the screen:
 - find the ray for that pixel
 - intersect the volume with the ray
 - compute a color from the intersection
 - assign that color to the pixel
- Steps 1 and 4 are easy. Steps 2 and 3 are the lecture.



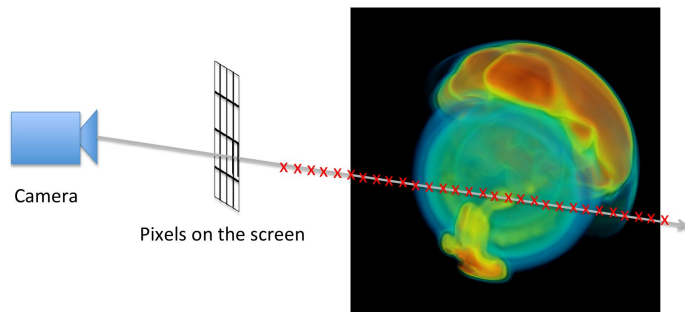
Intersect, then sample along the ray.

Intersect Volume With Ray



the ray crosses a run of cells

Ray-Volume Intersection: sampling

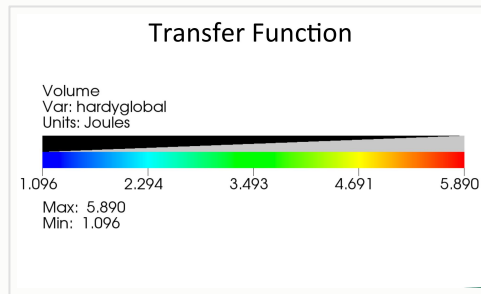


sample at a fixed step

Sampling turns an integral into a sum. Step size is the quality-versus-cost dial, and picking it badly is the most common way a volume rendering lies to you.

The transfer function assigns color and opacity.

- Pseudocoloring needs a color per value.
Volume rendering also needs an opacity per value.
- Opacity is what decides which material you can see through.
- It is the primary interaction in every volume renderer, and it is fiddly by nature.



color and alpha over the scalar range

Applying a transfer function

Sample	Scalar Value	R	G	B	A
0	5.8	255	0	0	1.0
1	4.7	255	255	0	0.75
2	5.8	255	0	0	1.0
3	3.5	0	255	0	0.5
4	1.1	0	0	255	0

sampled values resolved to RGBA

Composite the samples into one color.

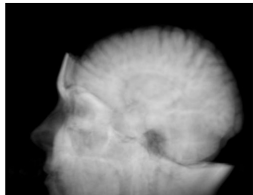
- Walk the samples front to back, accumulating color weighted by remaining transparency.
- Opacity is defined per unit distance, so it must be corrected when the step size changes.
 - Halve the step and you double the number of contributions
- Once accumulated opacity is near one, stop — early ray termination.



an opacity profile along one ray

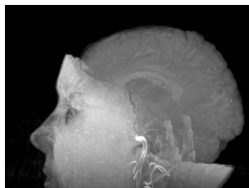
Compositing is one choice among several.

Ray functions: compositing



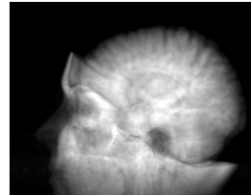
COMPOSITE

Ray functions: maximum



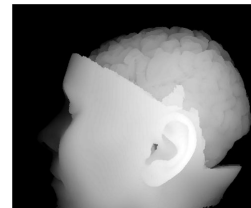
MAXIMUM

Ray functions: average value



AVERAGE

Ray functions: distance to value



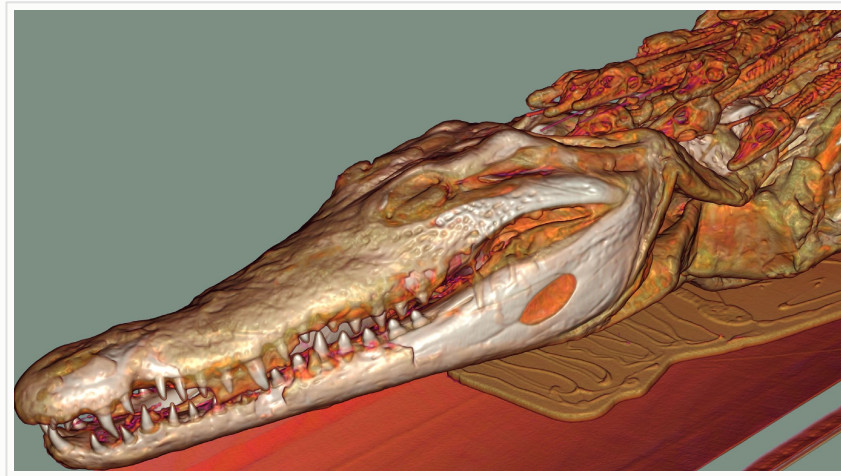
DISTANCE TO VALUE

Same data, same rays, different reduction. Maximum intensity projection is standard practice in medical imaging.

Images from the VTK book

Lighting a volume: there is no surface to shade.

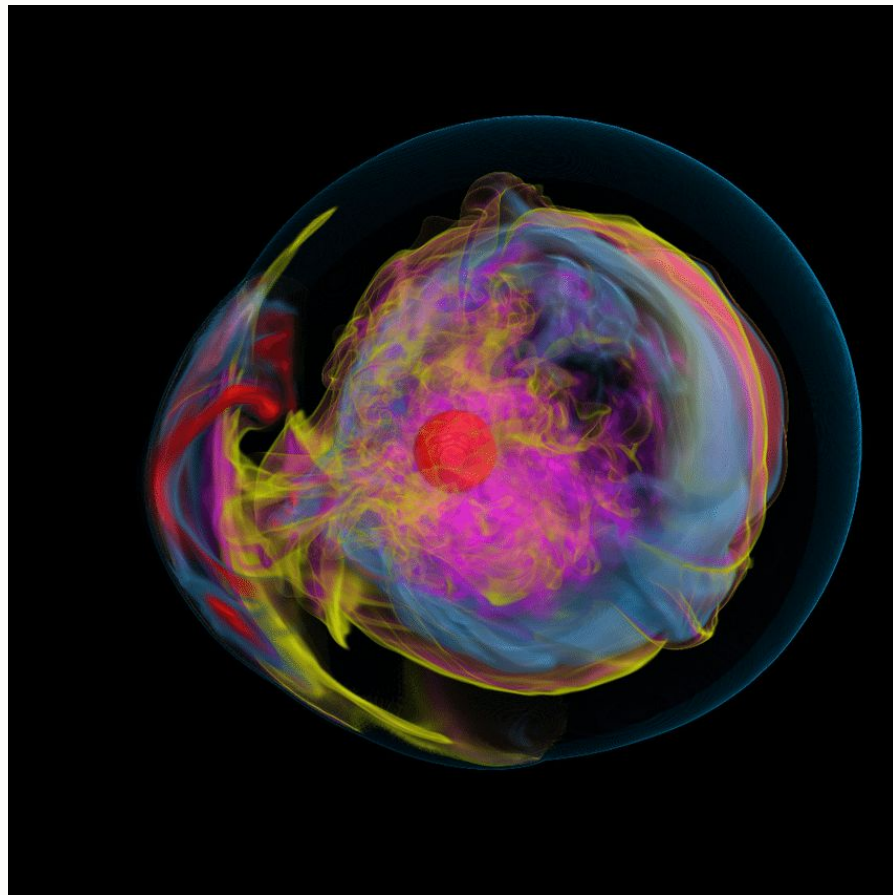
- Shading needs a normal. A volume has no surface to take one from.
- Use the gradient of the scalar field as the normal.
 - Central differences on the six neighbours
 - Gradient magnitude conveniently indicates how surface-like a point is
- Then run the same lighting equation as before.



gradient-based normals

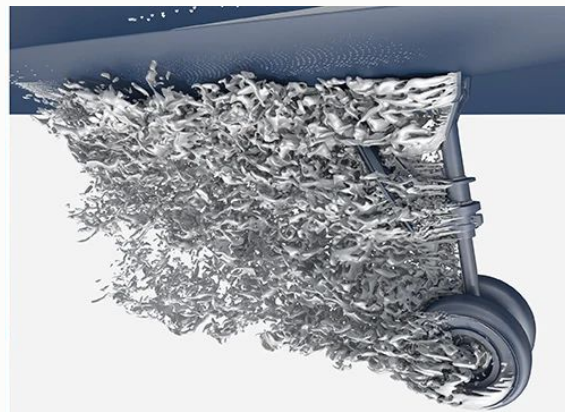
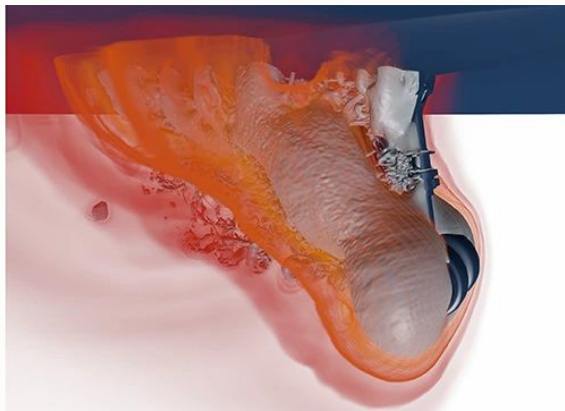
Making it fast.

- Most of a volume is empty, and sampling empty space costs the same as sampling data.
- Build a hierarchy over the field, store per-node value ranges, and skip whole subtrees the transfer function maps to zero. Octrees, BVH, kd-trees
- Adaptive sampling: large steps in the boring regions, small steps near features.
- Early ray termination pairs with all of it.



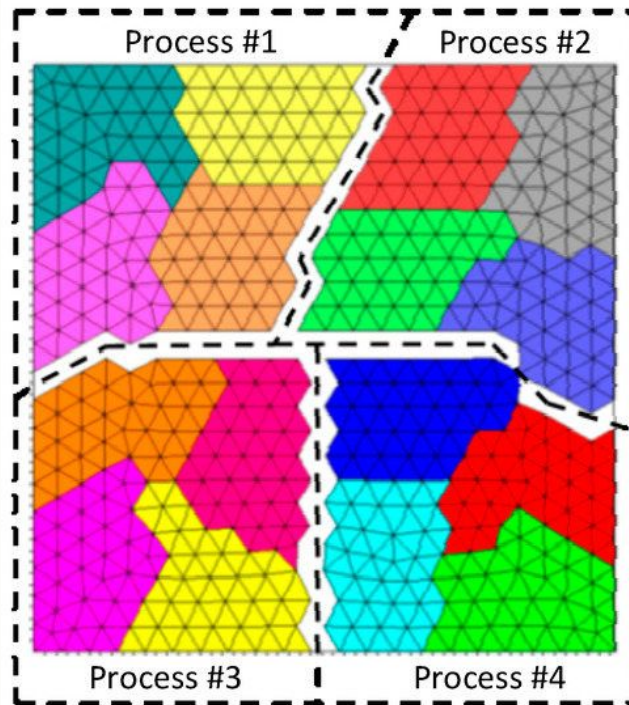
Isosurfaces without the isosurface.

- You do not have to extract triangles to see an isosurface.
- March along the ray watching for the sign change in F – isovalue, then refine the crossing.
- No mesh generated, no memory spent, and the surface is exact at pixel resolution.
- The normal comes from the gradient — same trick as volume shading.



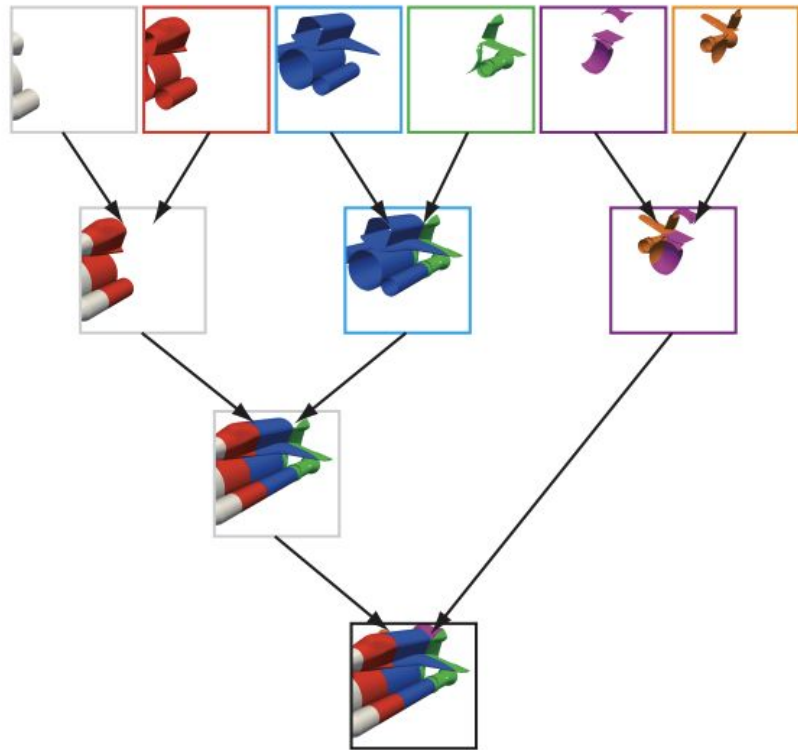
One image, many ranks: parallel compositing.

- Each rank owns a piece of the mesh, so each renders a partial image with depth or accumulated opacity.
- Those partials have to be merged in the correct order to make one picture.
- Three options
 - Sort first (primitives)
 - Sort middle (primitives)
 - Sort last (fragments)



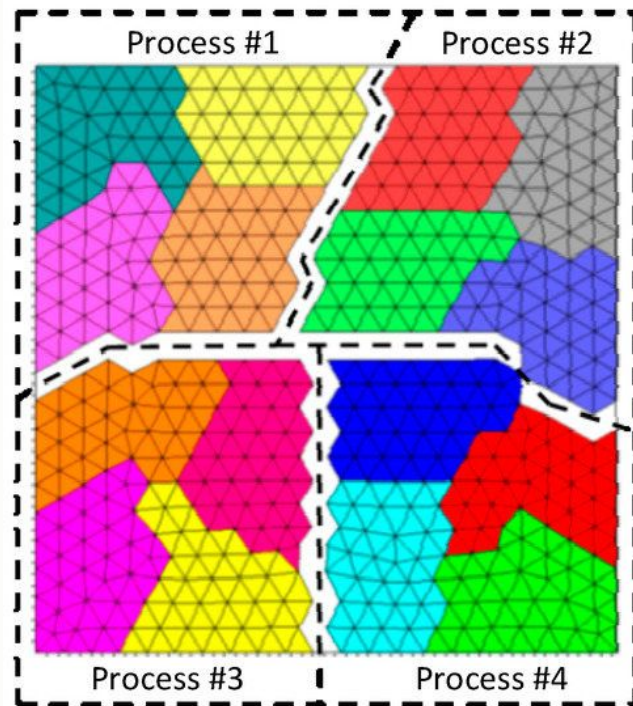
Sort last compositing

- Multiple strategies
 - Direct send
 - Binary swap
 - Radix-k
- Cost scales with pixels and ranks, not with cells — which is why it survives at full machine scale.



What about ray tracing?

- Distributed memory ray tracing is complicated
- Strategies
 - Scene duplication and render by tiles (not HPC)
 - Ray passing (complicated)
 - Ray Queue Cycling (simple)



It is graphics, with the burden of being right.

- A mesh and a field, not an artist's triangles.
- A handful of filters, composed into a graph.
- Color and opacity as measurement, not decoration.
- Rays through data instead of geometry — then make it fast.