

# **CS 247 – Scientific Visualization**

## **Lecture 14: Scalar Fields, Pt. 10;**

## **Volume Rendering, Pt. 1**

Markus Hadwiger, KAUST



# Reading Assignment #8 (until Mar 21)

Read (required):

- Real-Time Volume Graphics, Chapter 1  
*(Theoretical Background and Basic Approaches)*,  
from beginning to 1.4.4 (inclusive)
- Real-Time Volume Graphics, Chapter 4 (Transfer Functions)  
until Sec. 4.4 (inclusive)
- Look at:  
*Nelson Max, Optical Models for Direct Volume Rendering,*  
*IEEE Transactions on Visualization and Computer Graphics, 1995*  
<http://dx.doi.org/10.1109/2945.468400>



# wrapping up the previous part...



# Bi-Linear Interpolation: Critical Points

Compute gradient (critical points are where gradient is zero vector):

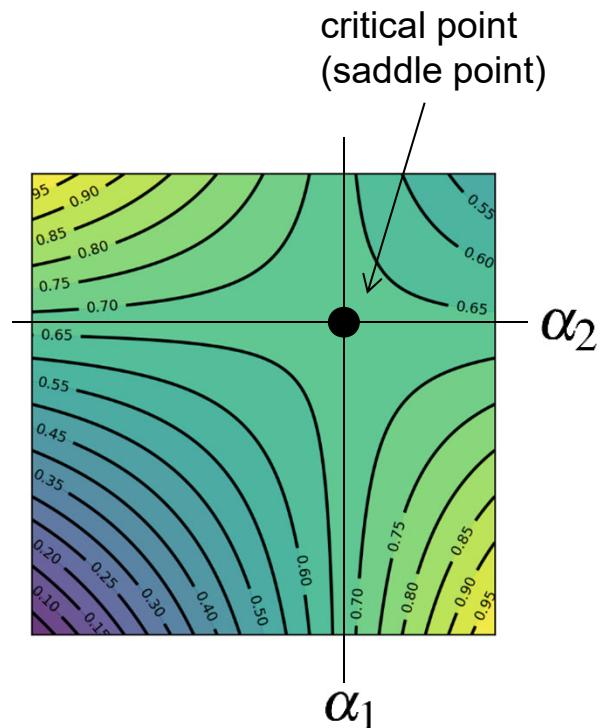
$$\frac{\partial f(\alpha_1, \alpha_2)}{\partial \alpha_1} = (v_{10} - v_{00}) + \alpha_2(v_{00} + v_{11} - v_{10} - v_{01})$$

$$\frac{\partial f(\alpha_1, \alpha_2)}{\partial \alpha_2} = (v_{01} - v_{00}) + \alpha_1(v_{00} + v_{11} - v_{10} - v_{01})$$

Where are lines of constant value / critical points?

$$\frac{\partial f(\alpha_1, \alpha_2)}{\partial \alpha_1} = 0 : \quad \alpha_2 = \frac{v_{00} - v_{10}}{v_{00} + v_{11} - v_{10} - v_{01}}$$

$$\frac{\partial f(\alpha_1, \alpha_2)}{\partial \alpha_2} = 0 : \quad \alpha_1 = \frac{v_{00} - v_{01}}{v_{00} + v_{11} - v_{10} - v_{01}}$$





# Bi-Linear Interpolation: Critical Points

Examine Hessian matrix at critical point (non-degenerate critical p.?, ...)

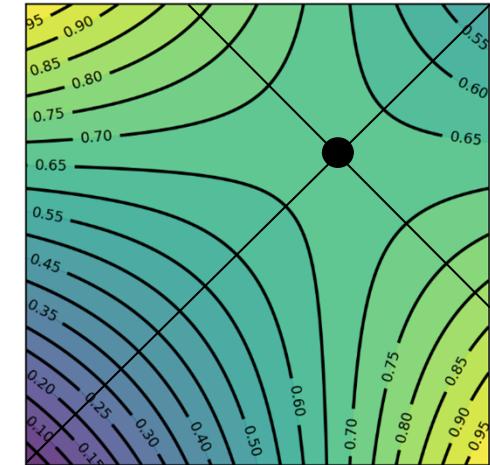
$$\begin{bmatrix} \frac{\partial^2 f}{\partial \alpha_1^2} & \frac{\partial^2 f}{\partial \alpha_1 \partial \alpha_2} \\ \frac{\partial^2 f}{\partial \alpha_2 \partial \alpha_1} & \frac{\partial^2 f}{\partial \alpha_2^2} \end{bmatrix} = \begin{bmatrix} 0 & a \\ a & 0 \end{bmatrix} \quad a = v_{00} + v_{11} - v_{10} - v_{01}$$

Eigenvalues and eigenvectors (Hessian is symmetric: always real)

$$\lambda_1 = -a \text{ and } \lambda_2 = a$$

$$v_1 = \begin{bmatrix} -1 \\ 1 \end{bmatrix}, v_2 = \begin{bmatrix} 1 \\ 1 \end{bmatrix}$$

(here also: principal curvature magnitudes and directions  
of this function's graph == surface embedded in 3D)





# Bi-Linear Interpolation: Critical Points

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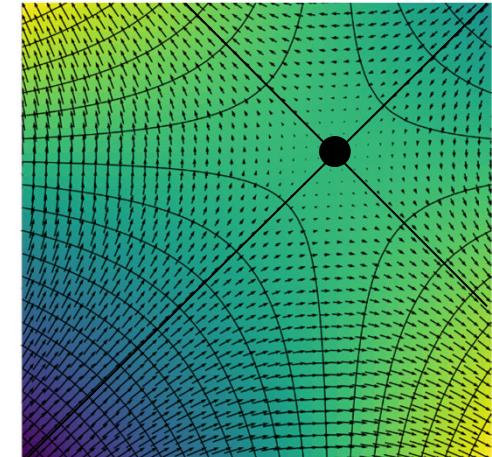
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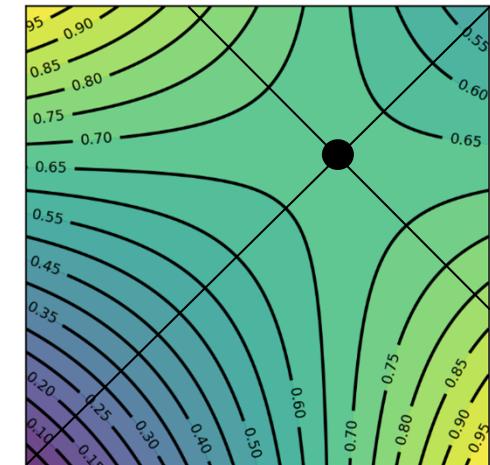
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$$v_1 = \begin{bmatrix} -1 \\ 1 \end{bmatrix}, v_2 = \begin{bmatrix} 1 \\ 1 \end{bmatrix}$$

degenerate means determinant = 0 (at least one eigenvalue = 0);  
bi-linear is simple:  $a = 0$  means degenerated to  
linear anyway: no critical point at all! (except constant function)  
(but with more than one cell: can have max or min at vertices)



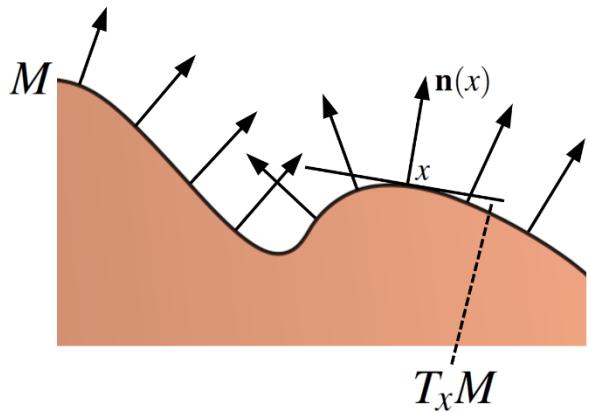


# Interlude: Curvature and Shape Operator

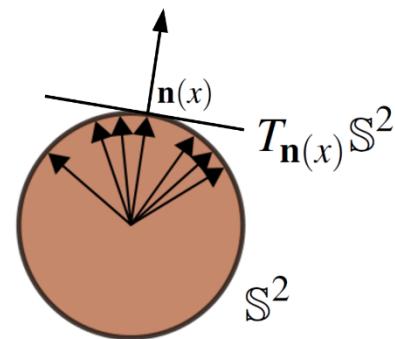
Gauss map

$$\mathbf{n}: M \rightarrow \mathbb{S}^2$$

$$x \mapsto \mathbf{n}(x)$$



Principal curvature magnitudes and directions are eigenvalues and eigenvectors of shape operator  $\mathbf{S}$



Differential of Gauss map

$$d\mathbf{n}: TM \rightarrow T\mathbb{S}^2$$

$$\mathbf{v} \mapsto d\mathbf{n}(\mathbf{v})$$

$$(d\mathbf{n})_x: T_x M \rightarrow T_{\mathbf{n}(x)} \mathbb{S}^2$$

$$\mathbf{v} \mapsto d\mathbf{n}(\mathbf{v})$$

Shape operator (Weingarten map)

$$\mathbf{S}: TM \rightarrow TM$$

$$T_{\mathbf{n}(x)} \mathbb{S}^2 \cong T_x M$$

$$\mathbf{S}_x: T_x M \rightarrow T_x M$$

$$\mathbf{v} \mapsto \mathbf{S}_x(\mathbf{v}) = d\mathbf{n}(\mathbf{v})$$

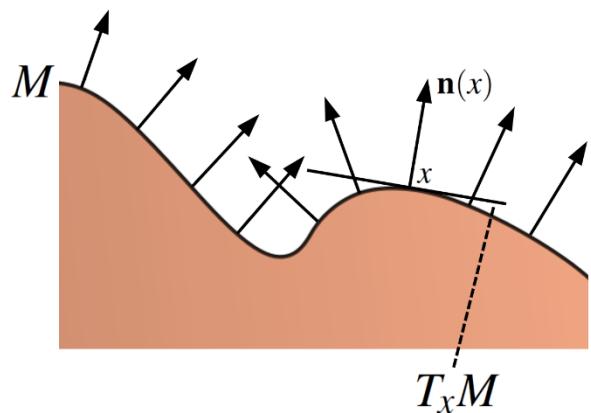


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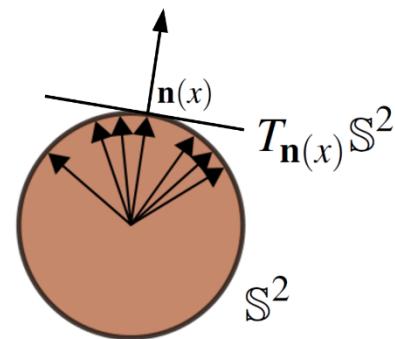
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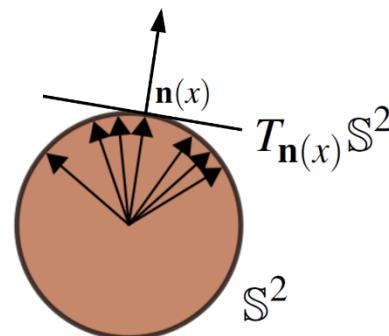
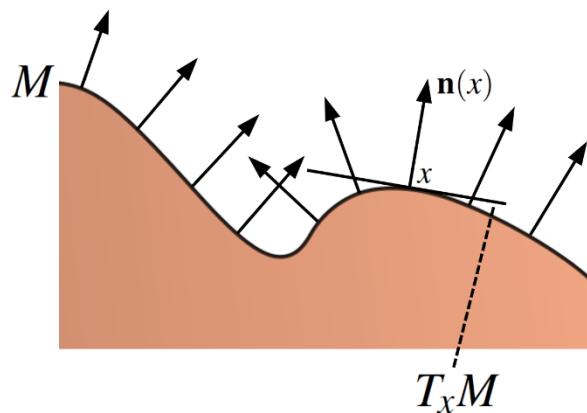


# Interlude: Curvature and Shape Operator

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$$\mathbf{v} \mapsto d\mathbf{n}(\mathbf{v})$$

Shape operator (Weingarten map)

$$\mathbf{S}: TM \rightarrow TM$$

$$\mathbf{S}_x: T_x M \rightarrow T_x M$$

$$\mathbf{v} \mapsto \mathbf{S}_x(\mathbf{v}) = -\nabla_{\mathbf{v}} \mathbf{n}$$

Principal curvature magnitudes and directions are eigenvalues and eigenvectors of shape operator  $\mathbf{S}$

$$T_{\mathbf{n}(x)} \mathbb{S}^2 \cong T_x M$$

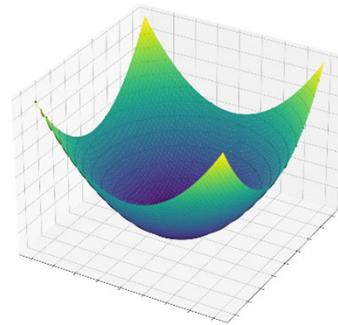
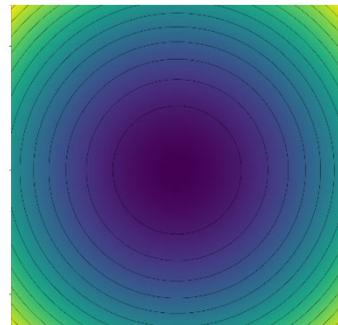


# General Case (2D Scalar Fields)

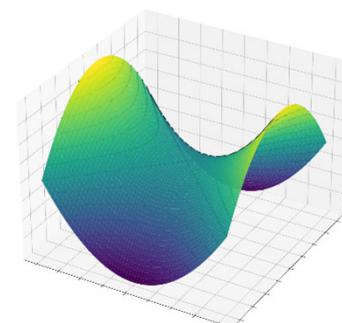
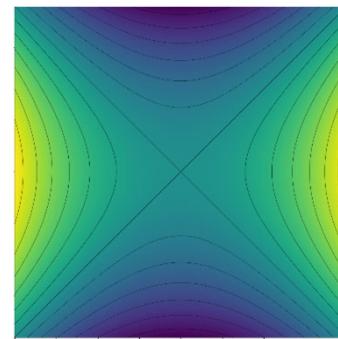
In 2D scalar fields, only *three types* of (isolated, non-degenerate) critical points

*Index* of critical point: dimension of eigenspace with negative-definite Hessian

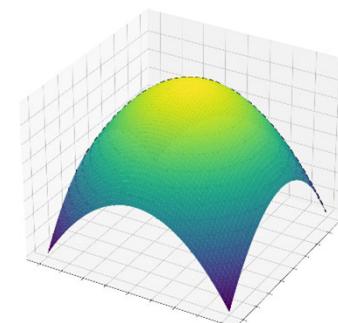
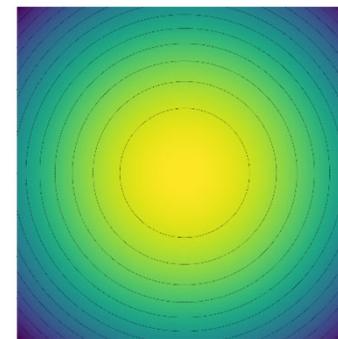
minimum  
(index 0)



saddle point  
(index 1)



maximum  
(index 2)





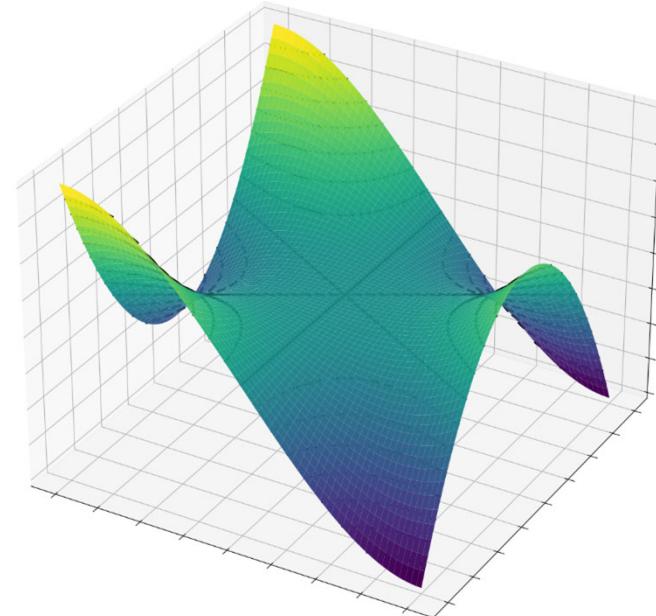
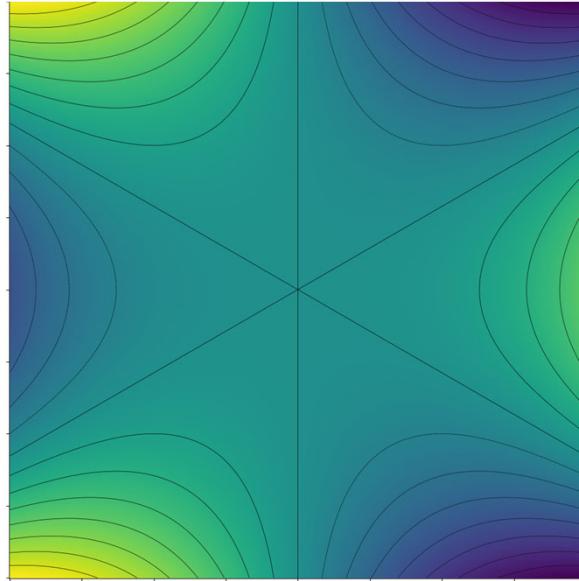
# Interesting Degenerate Critical Points?

Hessian matrix is singular (determinant = 0)

- Cannot say what happens: need higher-order derivatives, ...

Interesting example: monkey saddle  $z = x^3 - 3xy^2$  ('third-order saddle')

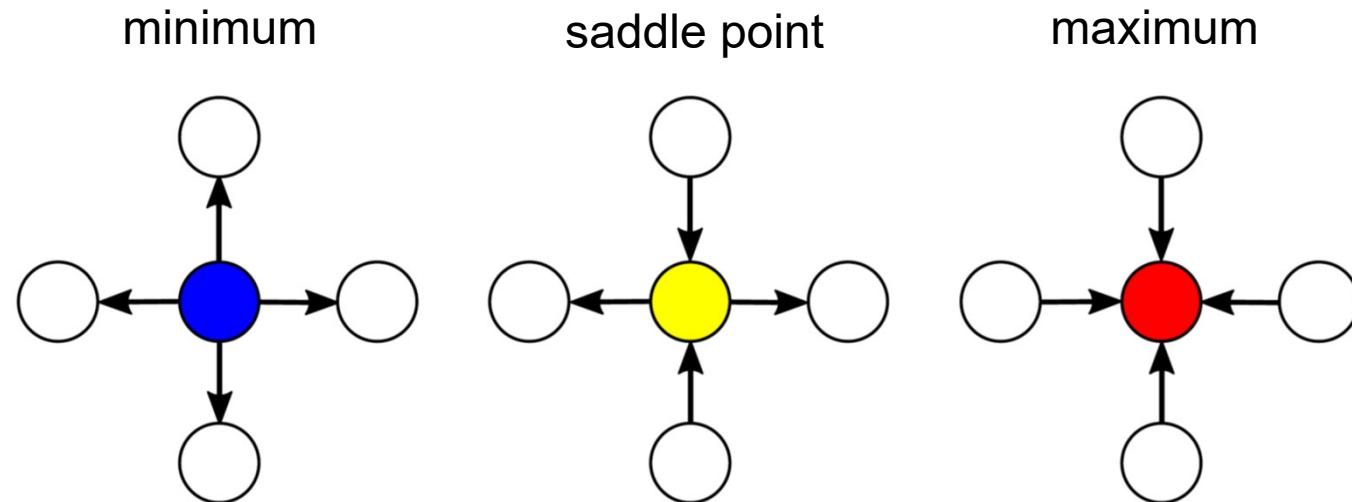
- Point (0,0) in center: Hessian = 0; Gaussian curvature = 0 (umbilical point)



# Discrete Classification of Critical Points



Combinatorial classification (looking at and comparing neighbors)  
instead of looking at derivatives  
(i.e., derivatives of the smooth function that is not known)

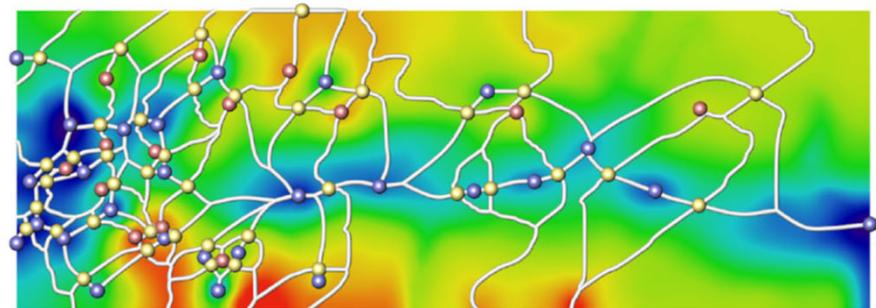
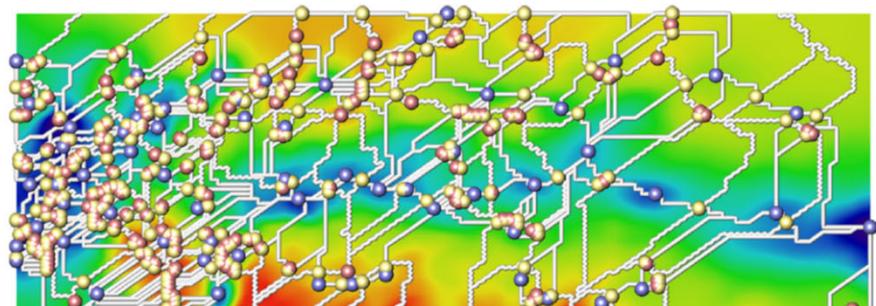
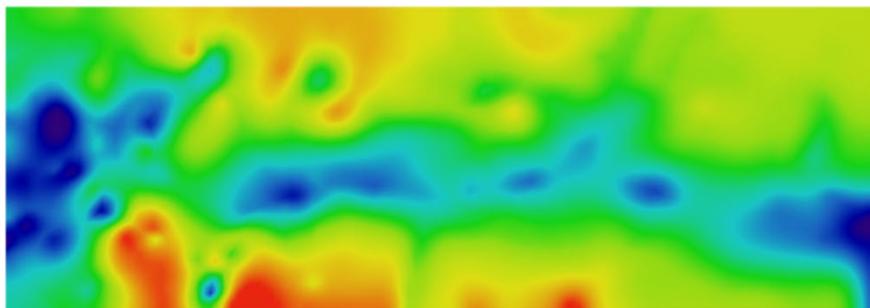
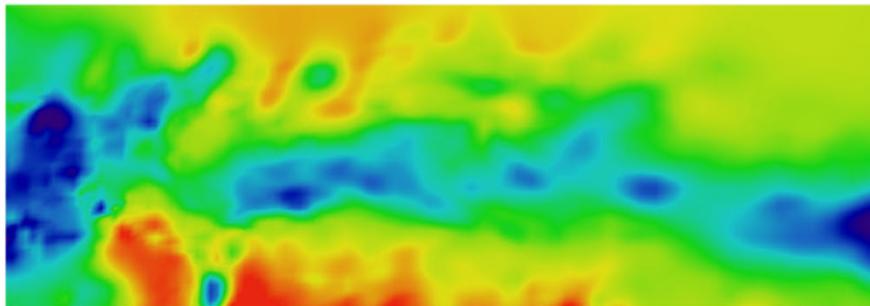


...toward scalar field topology, discrete Morse theory, Morse-Smale complex, ...



# Example: Scalar Field Simplification

Topology-based smoothing of 2D scalar fields, Weinkauf et al., 2010





# Example: Differential Topology

## Morse theory

- Morse function: scalar function where all critical points are non-degenerate and have different critical value

Topological invariant: Euler characteristic  $\chi(M)$  of manifold  $M$

(for 2-manifold mesh:  $\chi(M) = V - E + F$  )

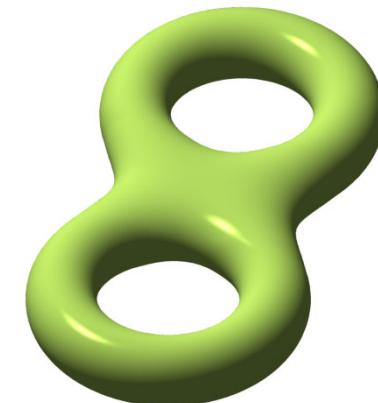
$$\chi = 2 - 2g \quad (\text{orientable})$$



genus  $g = 0$   
Euler characteristic  $\chi = 2$



genus  $g = 1$   
Euler characteristic  $\chi = 0$



genus  $g = 2$   
Euler characteristic  $\chi = -2$



# Example: Differential Topology

## Morse theory

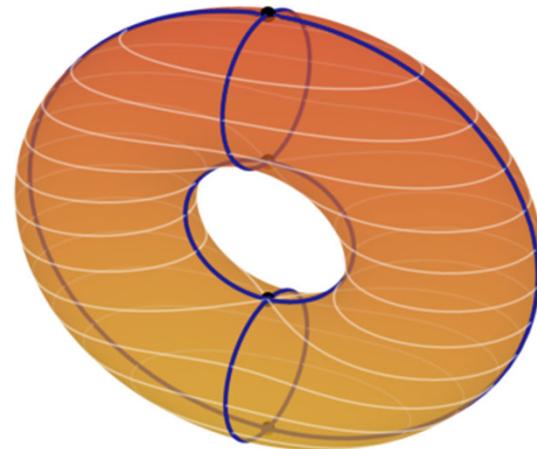
- Morse function: scalar function where all critical points are non-degenerate and have different critical value

Topological invariant: Euler characteristic  $\chi(M)$  of manifold  $M$

$$\chi(M) = \sum_{i=0}^n (-1)^i m_i$$

$m_i$ : number of critical points with index  $i$

$n$ : dimensionality of  $M$



$$\text{genus } g(M) = 1$$

$$\text{Euler characteristic } \chi(M) = 0 \quad (= 1 - 2 + 1)$$

scalar function on torus is height function  $f(x,y,z) = z$ :

1 min, 1 max, 2 saddles

critical points are where

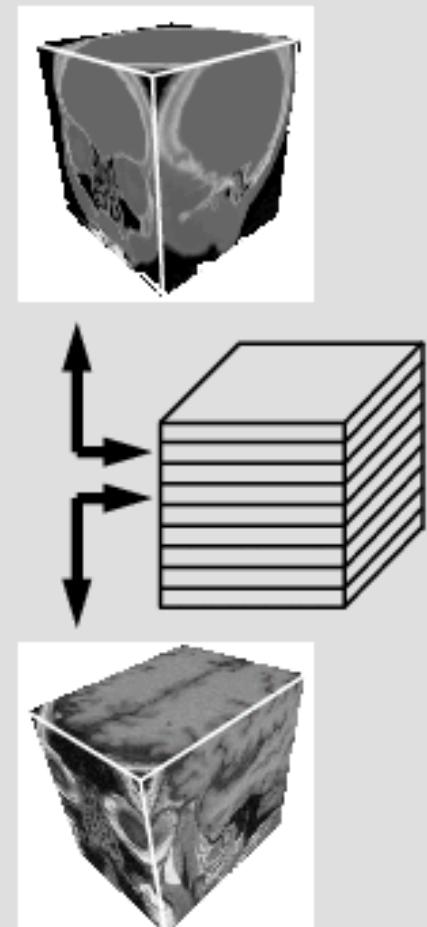
$$df(x,y,z) = 0$$

(tangent plane horizontal)

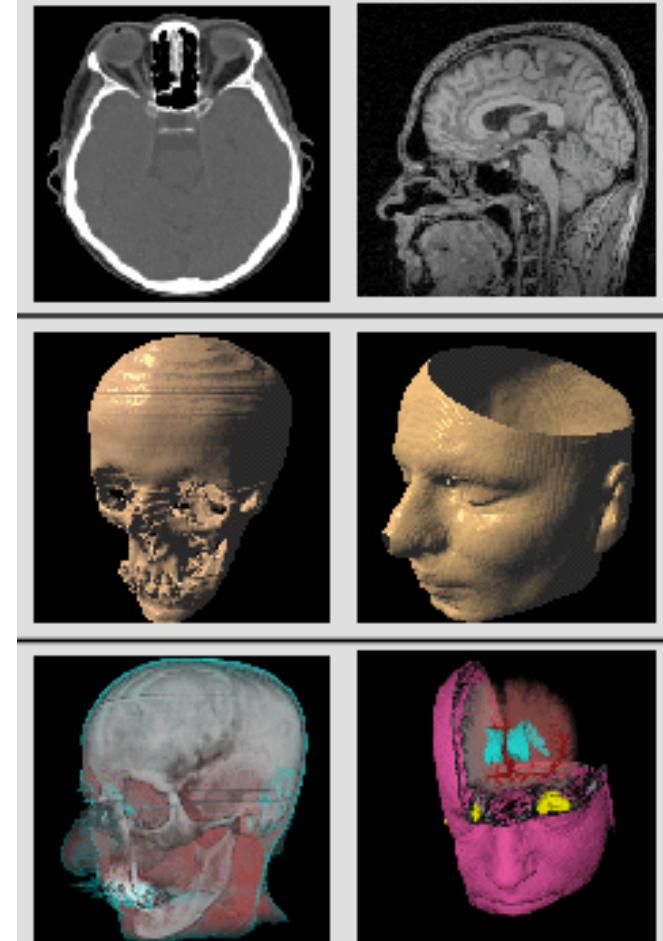


# Volume Visualization

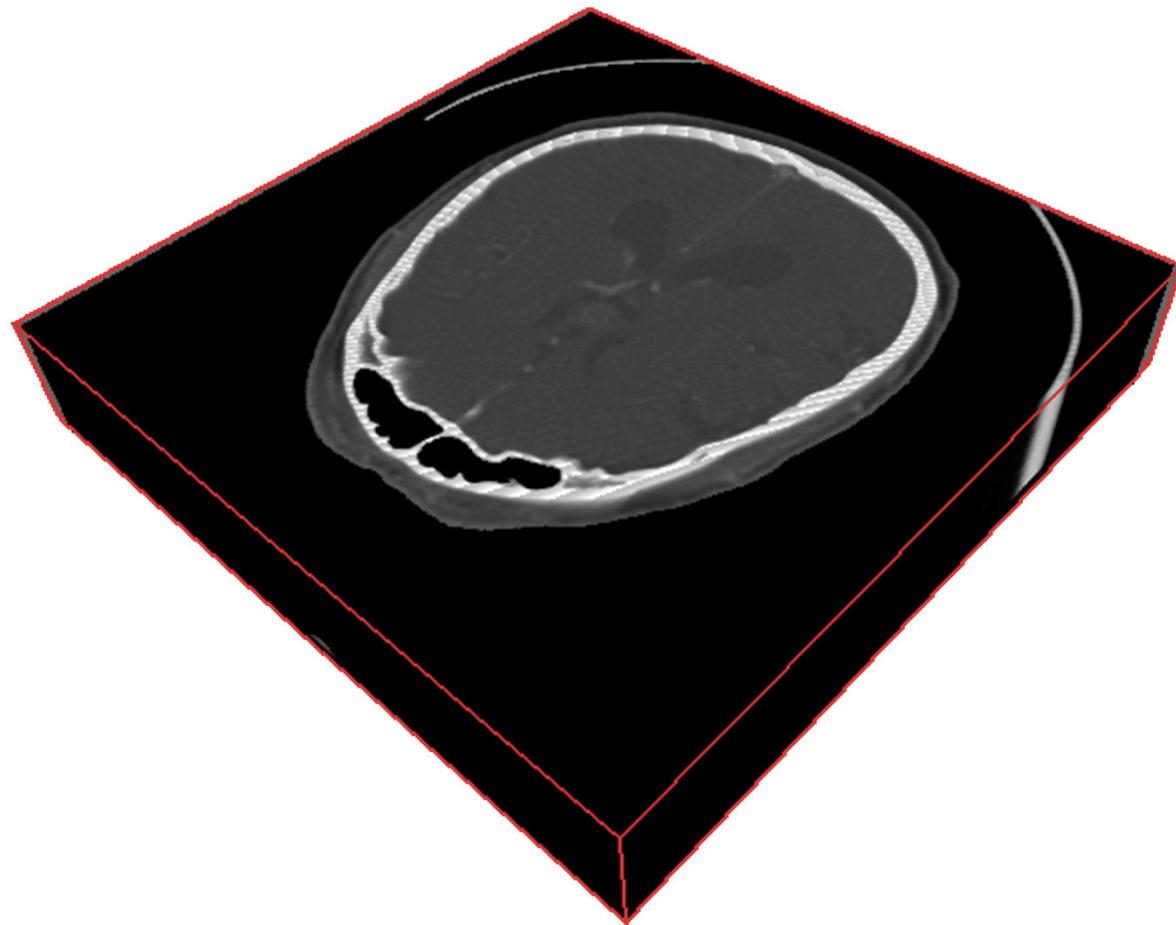
# Volume Visualization



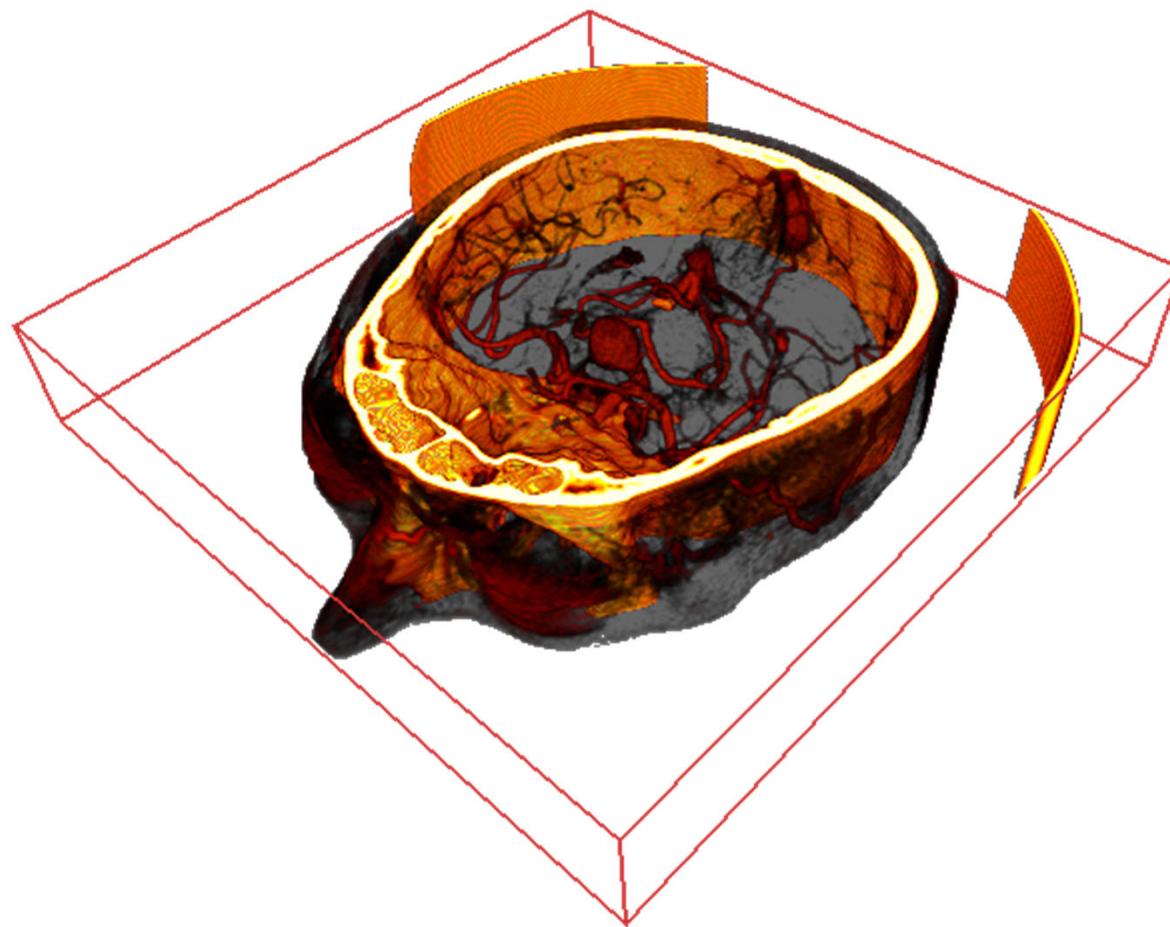
- 2D visualization  
slice images  
(or multi-planar  
reformatting MPR)
- *Indirect*  
3D visualization  
isosurfaces  
(or surface-shaded  
display: SSD)
- *Direct*  
3D visualization  
(direct volume  
rendering: DVR)



# Direct Volume Rendering



# Direct Volume Rendering

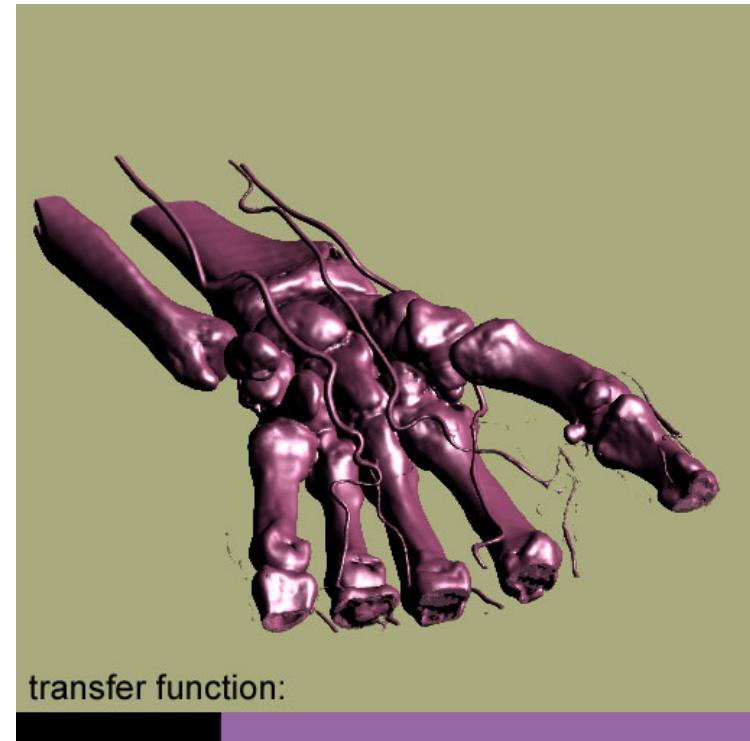
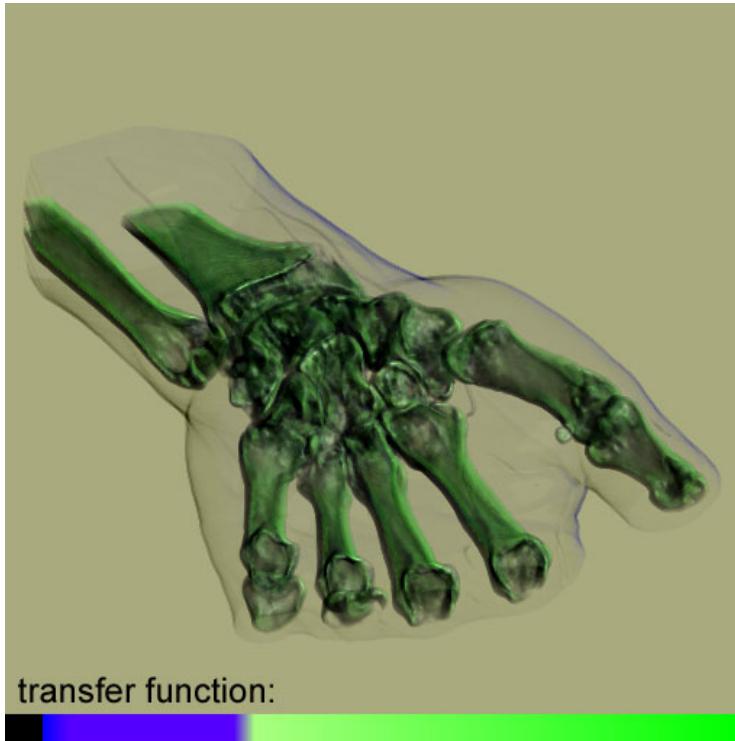


# Transparent Volumes vs. Isosurfaces



The *transfer function* assigns *optical properties* to data

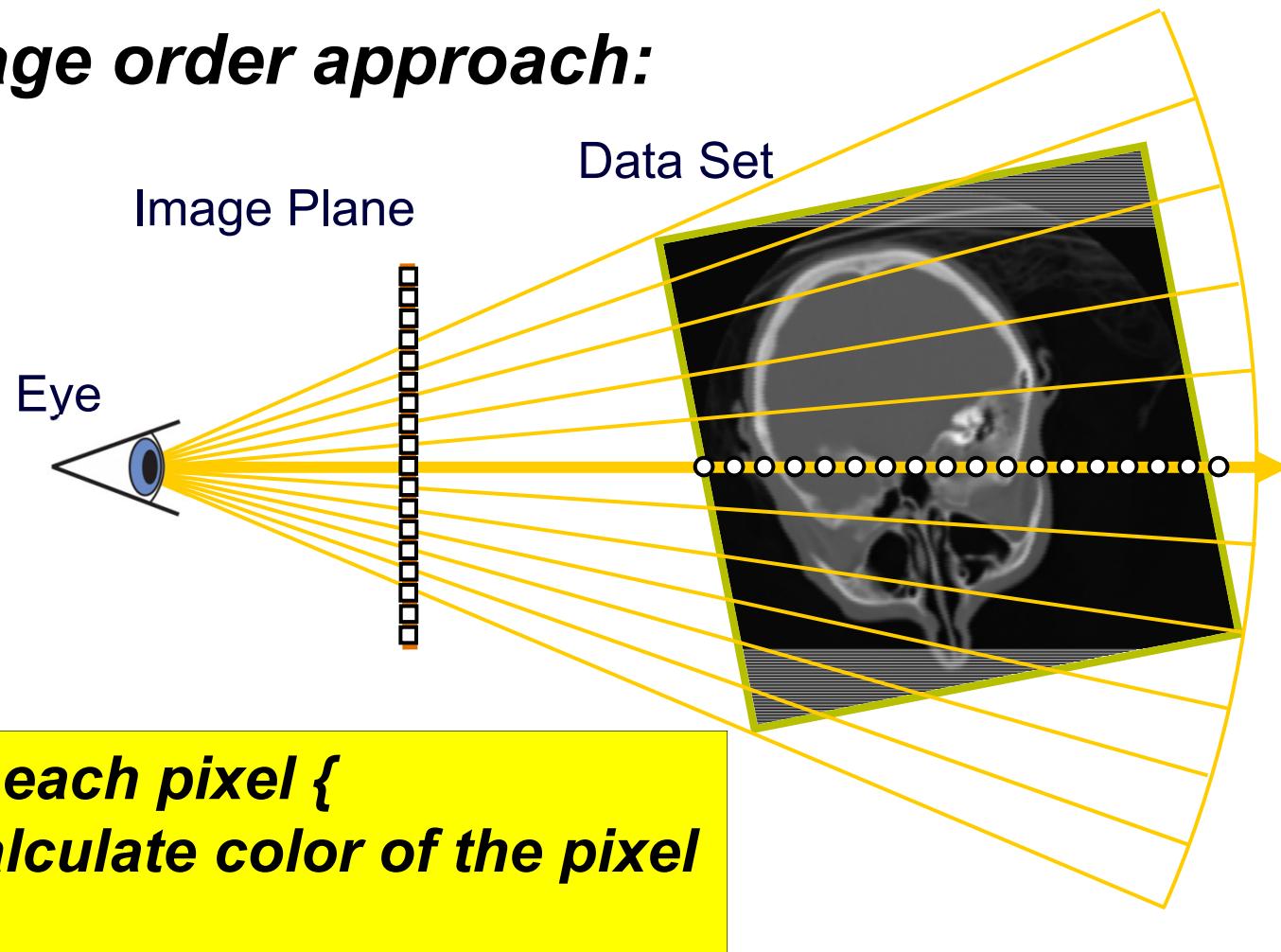
- Translucent volumes
- But also: isosurface rendering using step function as transfer function



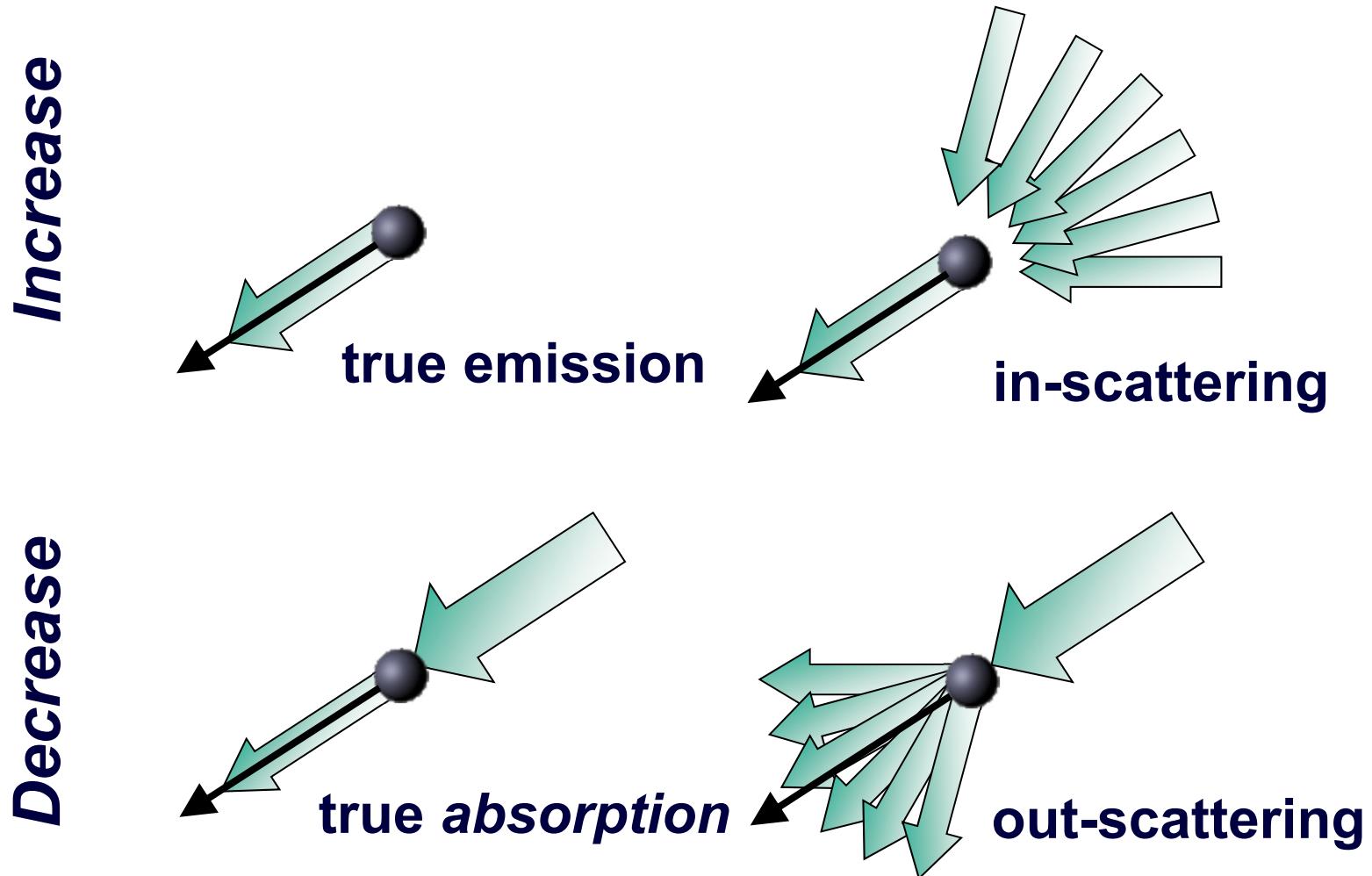
# Direct Volume Rendering



***Image order approach:***



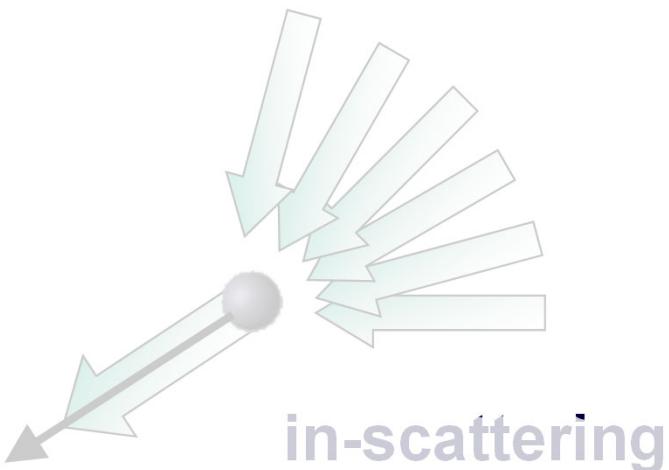
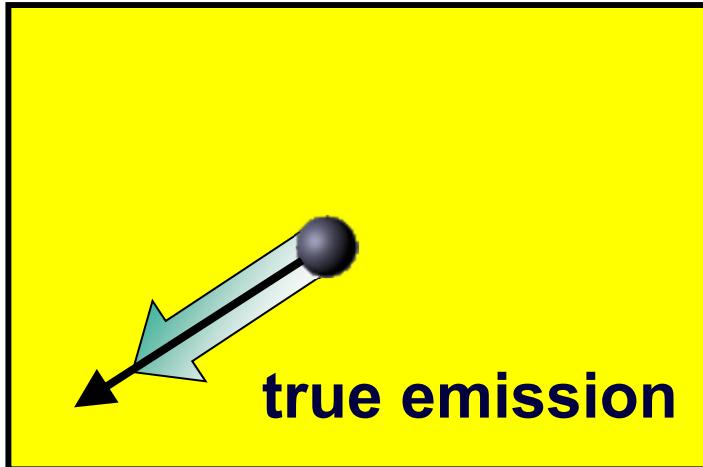
# Physical Model of Radiative Transfer



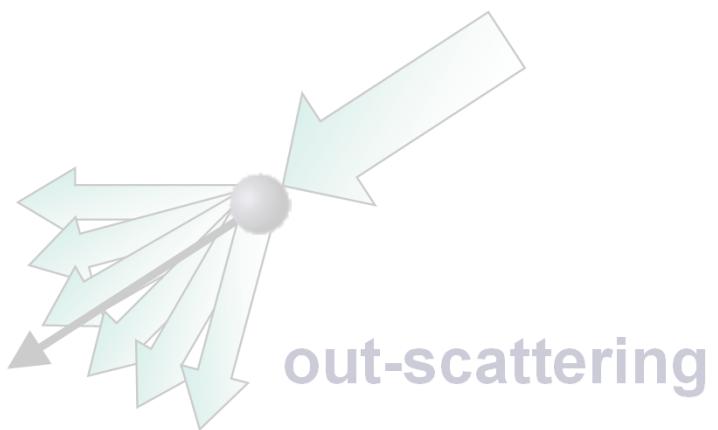
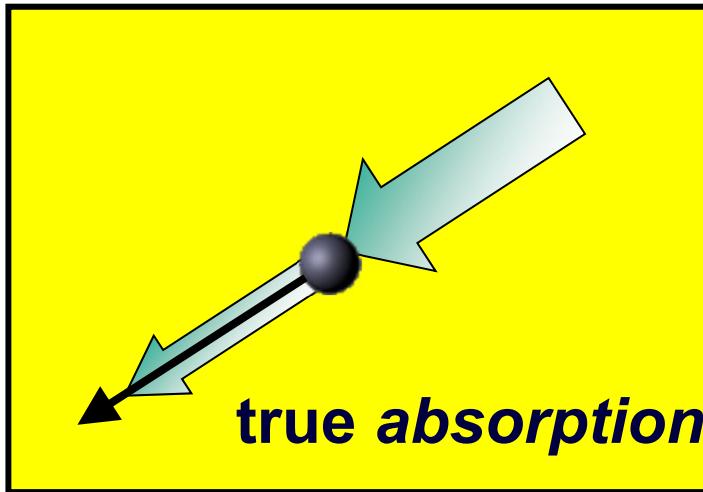
# Physical Model of Radiative Transfer



*Increase*



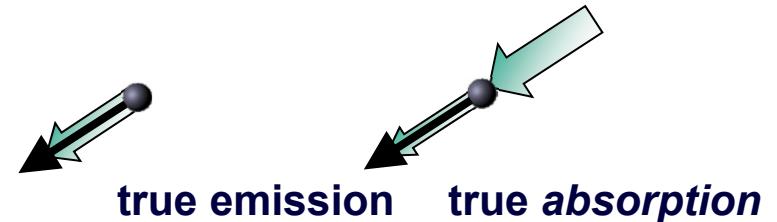
*Decrease*



# Volume Rendering Integral



Volume rendering integral  
for *Emission Absorption* model



$$I(s) = I(s_0) e^{-\tau(s_0, s)} + \int_{s_0}^s q(\tilde{s}) e^{-\tau(\tilde{s}, s)} d\tilde{s}$$

Numerical solutions:

**Back-to-front compositing**

$$C'_i = C_i + (1 - A_i)C'_{i-1}$$

**Front-to-back compositing**

$$C'_i = C'_{i+1} + (1 - A'_{i+1})C_i$$

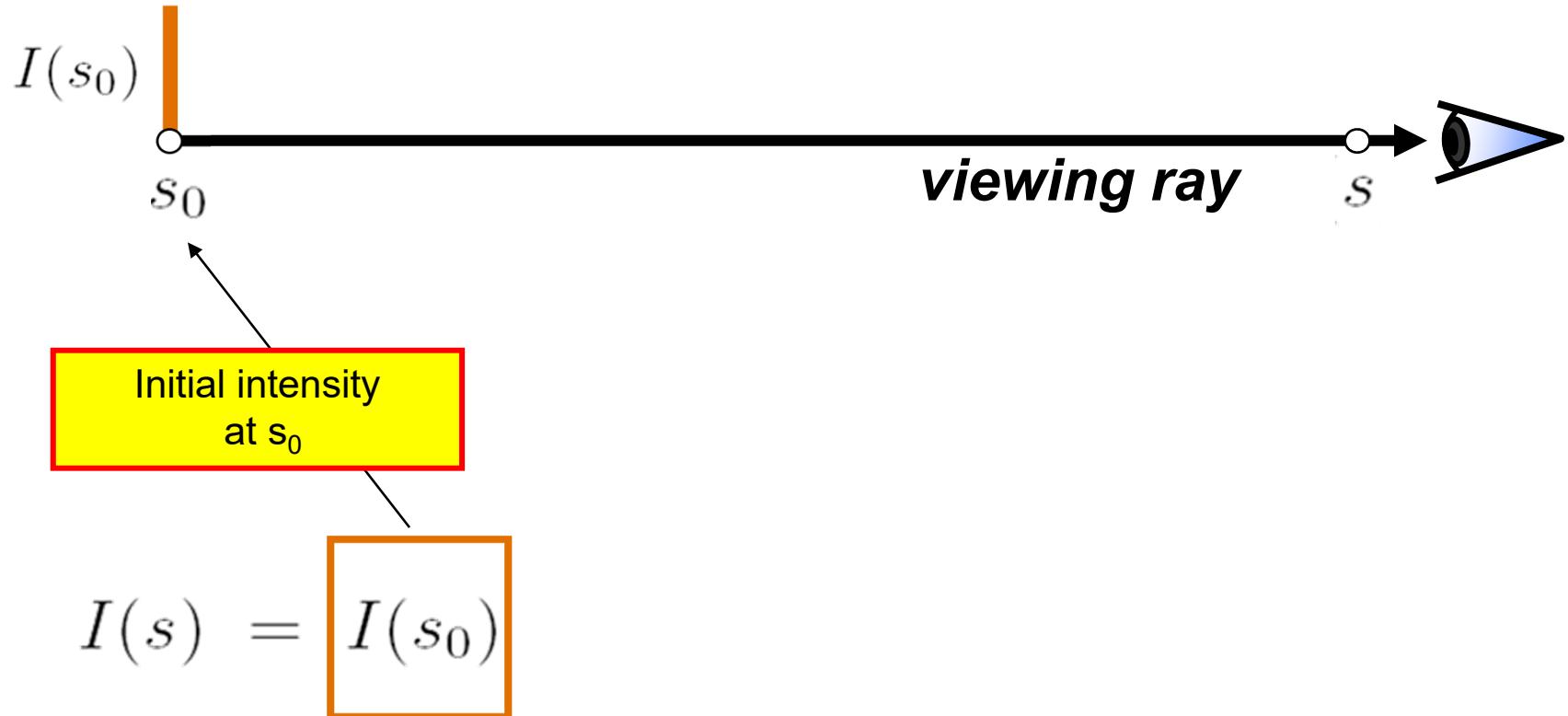
$$A'_i = A'_{i+1} + (1 - A'_{i+1})A_i$$

# Volume Rendering Integral



How do we determine the radiant energy along the ray?

**Physical model:** emission and absorption, no scattering

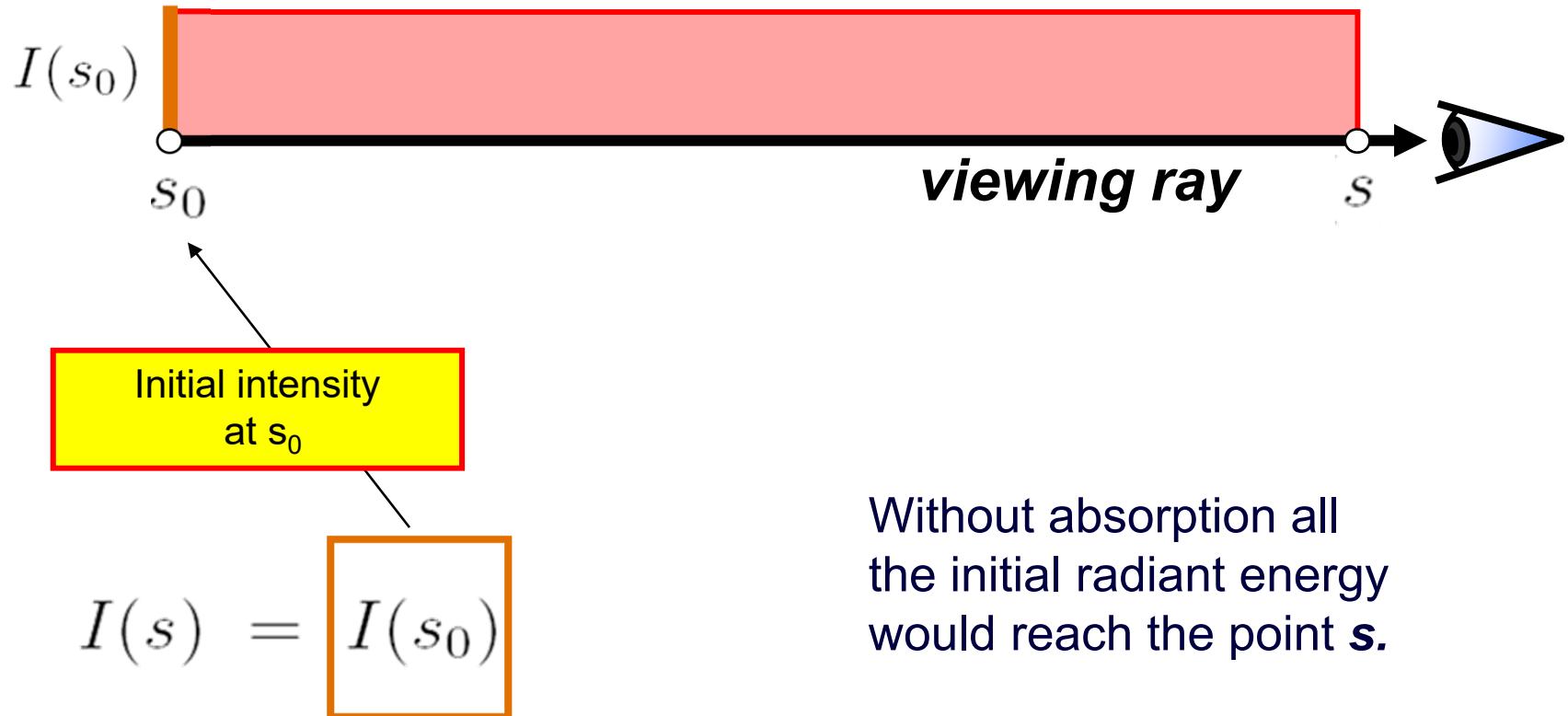


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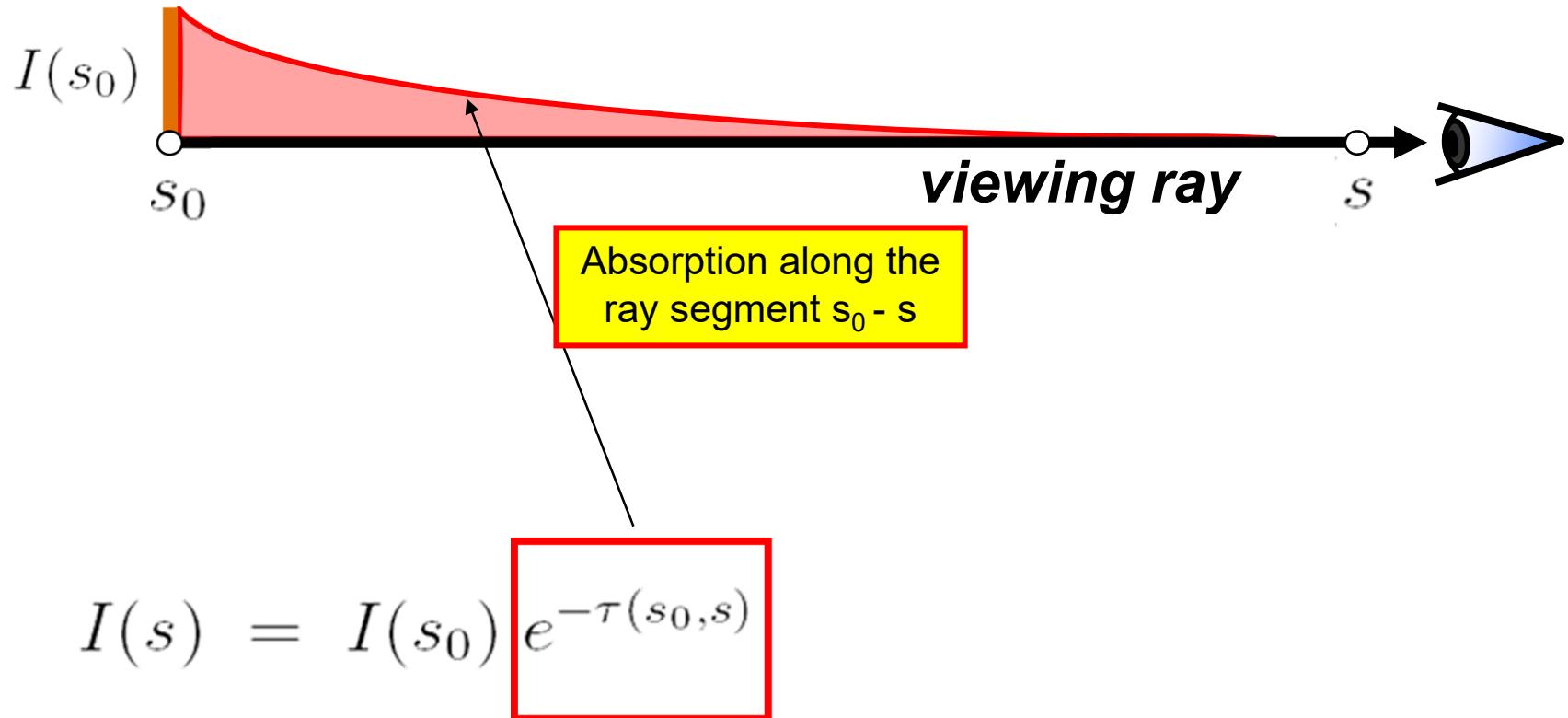


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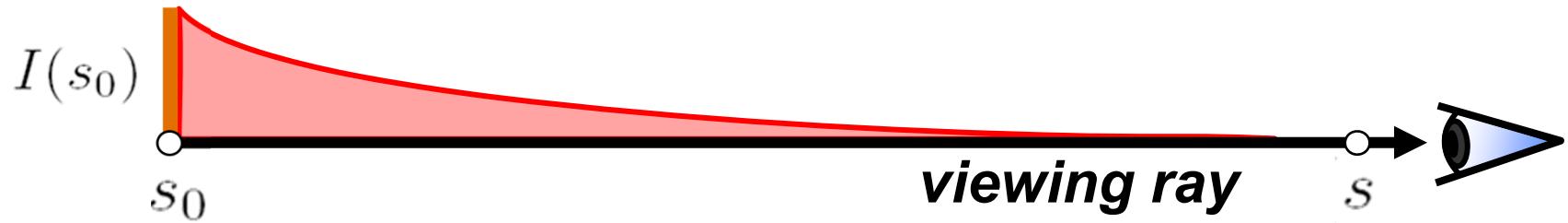


# Volume Rendering Integral



How do we determine the radiant energy along the ray?

**Physical model:** emission and absorption, no scattering



**Optical depth  $\tau$**   
**Absorption  $\kappa$**

$$I(s) = I(s_0) e^{-\tau(s_0, s)}$$

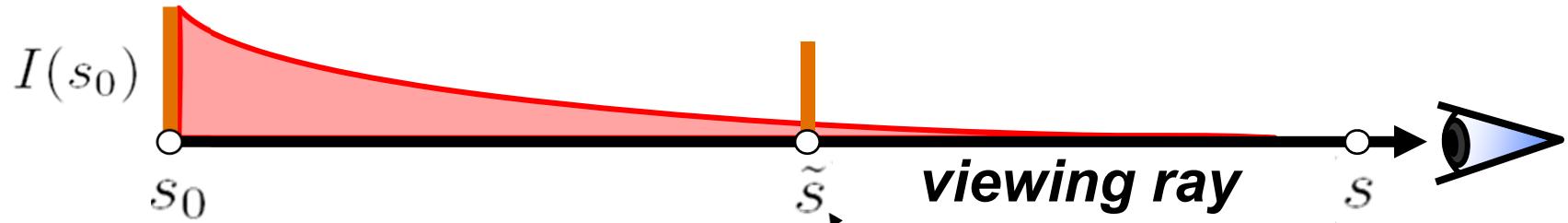
$$\tau(s_1, s_2) = \int_{s_1}^{s_2} \kappa(s) ds.$$

# Volume Rendering Integral



**How do we determine the radiant energy along the ray?**

**Physical model:** emission and absorption, no scattering



One point  $\tilde{s}$  along the viewing ray emits additional radiant energy.

$$I(s) = I(s_0) e^{-\tau(s_0, s)} +$$

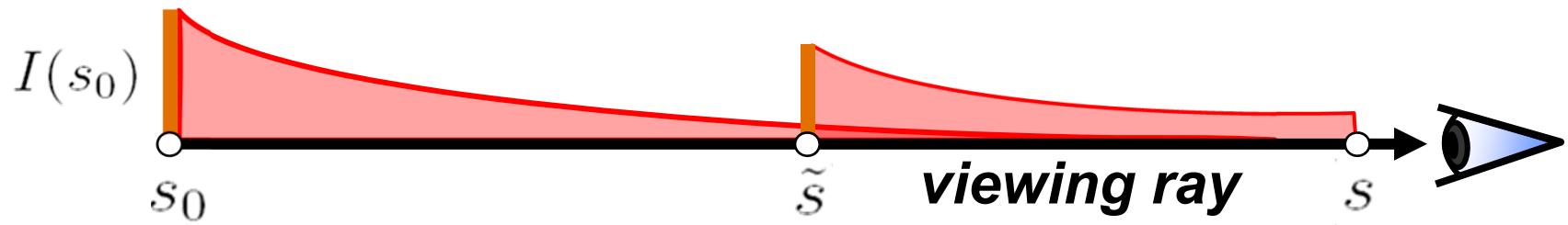
$$q(\tilde{s})$$

# Volume Rendering Integral



**How do we determine the radiant energy along the ray?**

***Physical model:*** emission and absorption, no scattering



**Every** point  $\tilde{s}$  along the viewing ray emits additional radiant energy

$$I(s) = I(s_0) e^{-\tau(s_0,s)} + \int_{s_0}^s q(\tilde{s}) e^{-\tau(\tilde{s},s)} d\tilde{s}$$

# Thank you.

Thanks for material

- Helwig Hauser
- Eduard Gröller
- Daniel Weiskopf
- Torsten Möller
- Ronny Peikert
- Philipp Muigg
- Christof Rezk-Salama