

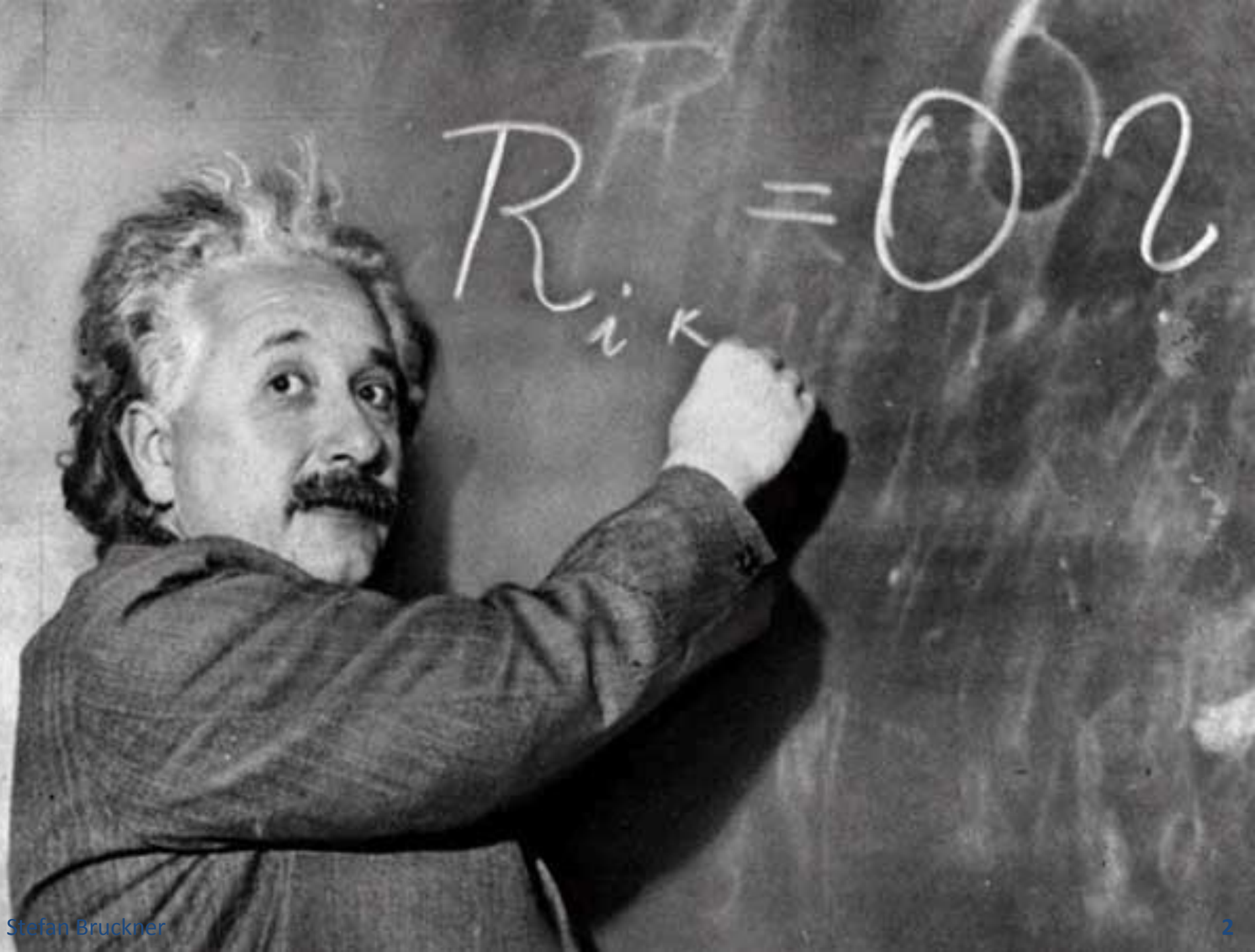
# Smart Visualization in Medicine

Stefan Bruckner

Department of Informatics  
**University of Bergen**

UNIVERSITETET I BERGEN





# “Smart” Visualization



- Alternative terms: knowledge-assisted, knowledge-based, etc.
- Incorporate domain knowledge into the algorithm design
- Knowledge can be about data, user intent, and algorithm behavior
- “Smartness” comes from the effective use of existing information

# Levels of Smartness



- **Technique level:** consider the fact that the data has been generated for a reason
- **Parameter level:** recognize that not every part of the parameter space is meaningful
- **Interface level:** exploit knowledge about the performance of techniques/parameters

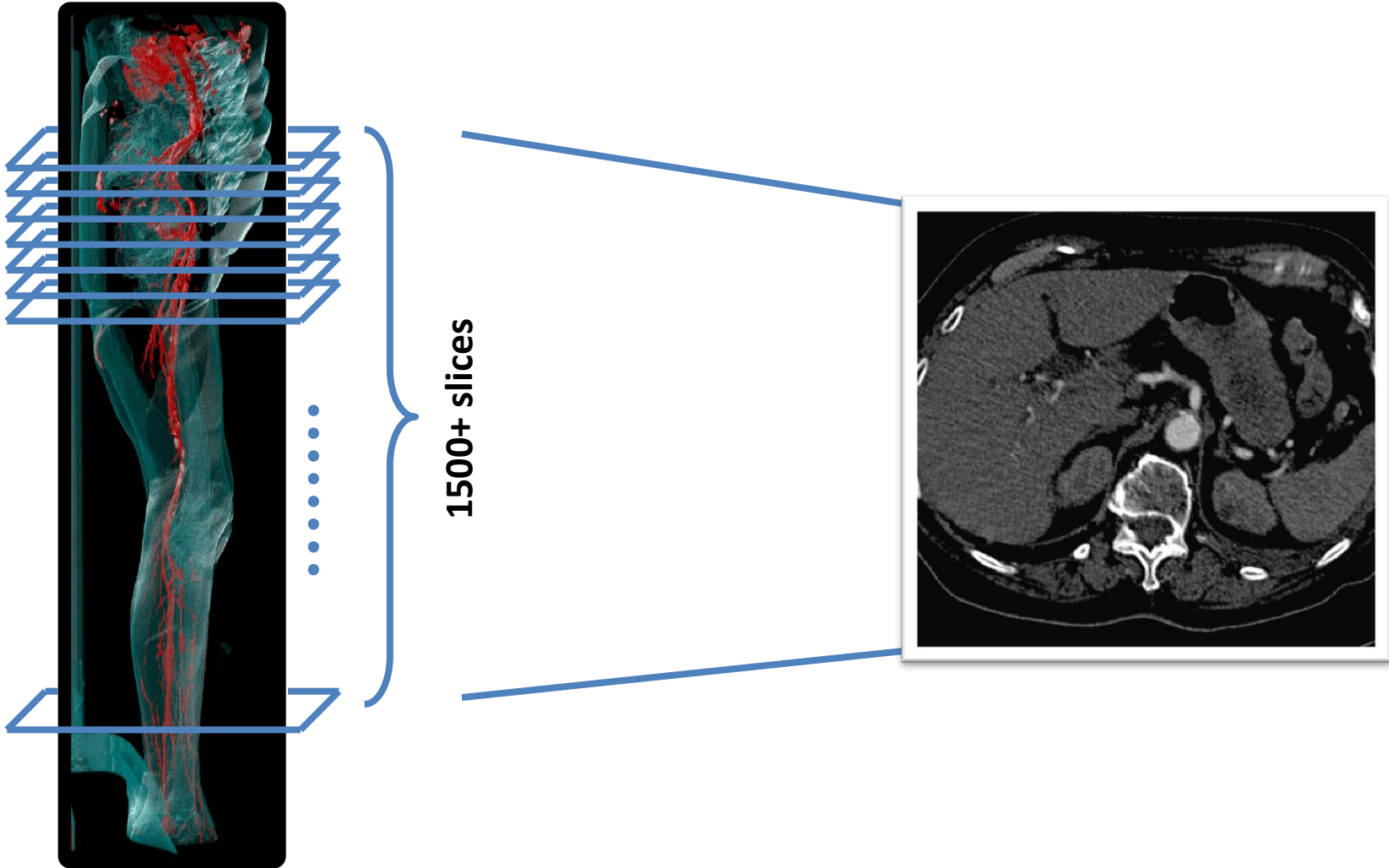
# Visualization in Radiology



- Different imaging devices (CT, MRI, ...)
- Archival of image data using PACS (Picture Archiving and Communication Systems)
- Imaging devices, output devices, workstations, and PACS are interconnected via the DICOM standard



# Vessel Investigation (1)



# Vessel Investigation (2)



- High-throughput scenario, radiologist has no time to “play around”
- Many slices to inspect: time-consuming and error prone
- Mental reconstruction of the vessel tree can be difficult

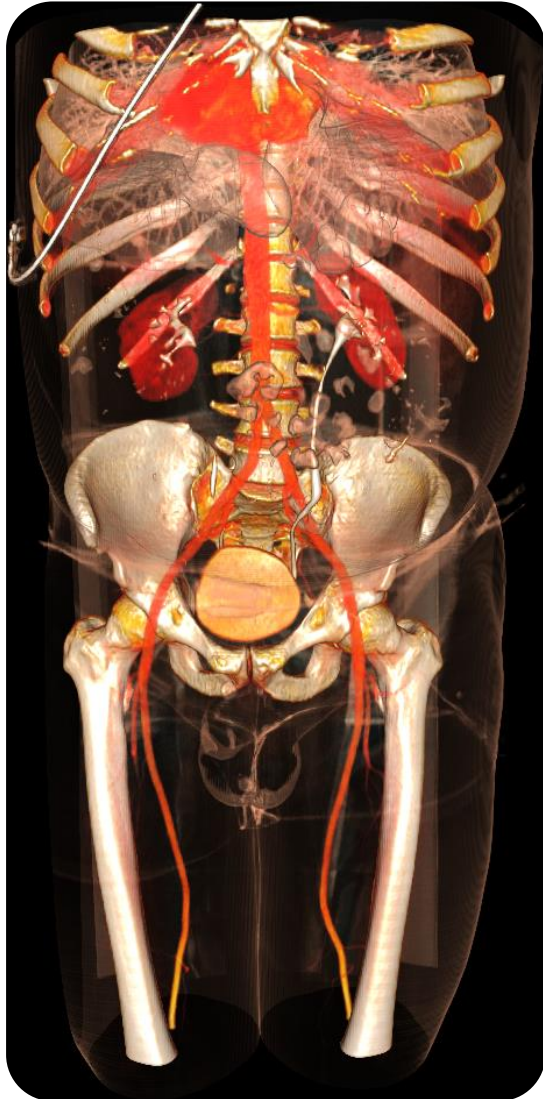
**Overall goal:** make examination as safe and fast as possible



# 3D Visualization Methods



**DVR** – Direct Volume Rendering



**MIP** – Maximum Intensity Projection





# DVR vs. MIP (1)



## DVR

Direct Volume Rendering

- Physically-based
- Optical model for emission & absorption
- May require complex transfer function
- Visual cues due to accumulation and shading

## MIP

Maximum Intensity Projection

- Practically-motivated
- Project maximum value along each viewing ray
- Suffices with window/level setting
- Spatial ambiguities caused by order-independency

# DVR vs. MIP (2)



## DVR

Direct Volume Rendering

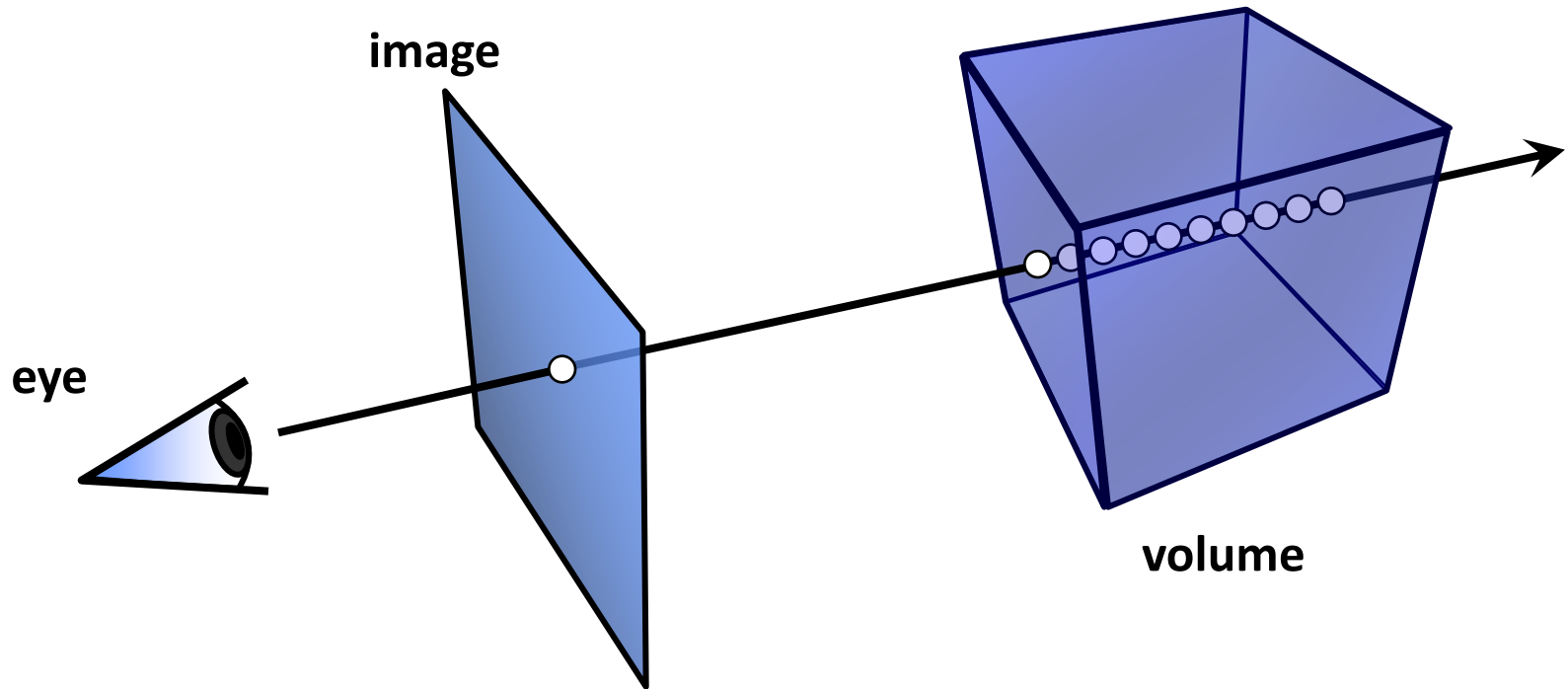
- Physically-based
- Optical model for emission & absorption
- May require complex transfer function
- Visual cues due to accumulation and shading

## MIP

Maximum Intensity Projection

- Practically-motivated
- Project maximum value along each viewing ray
- Suffices with window/level setting
- Spatial ambiguities caused by order-independency

# Volume Ray Casting

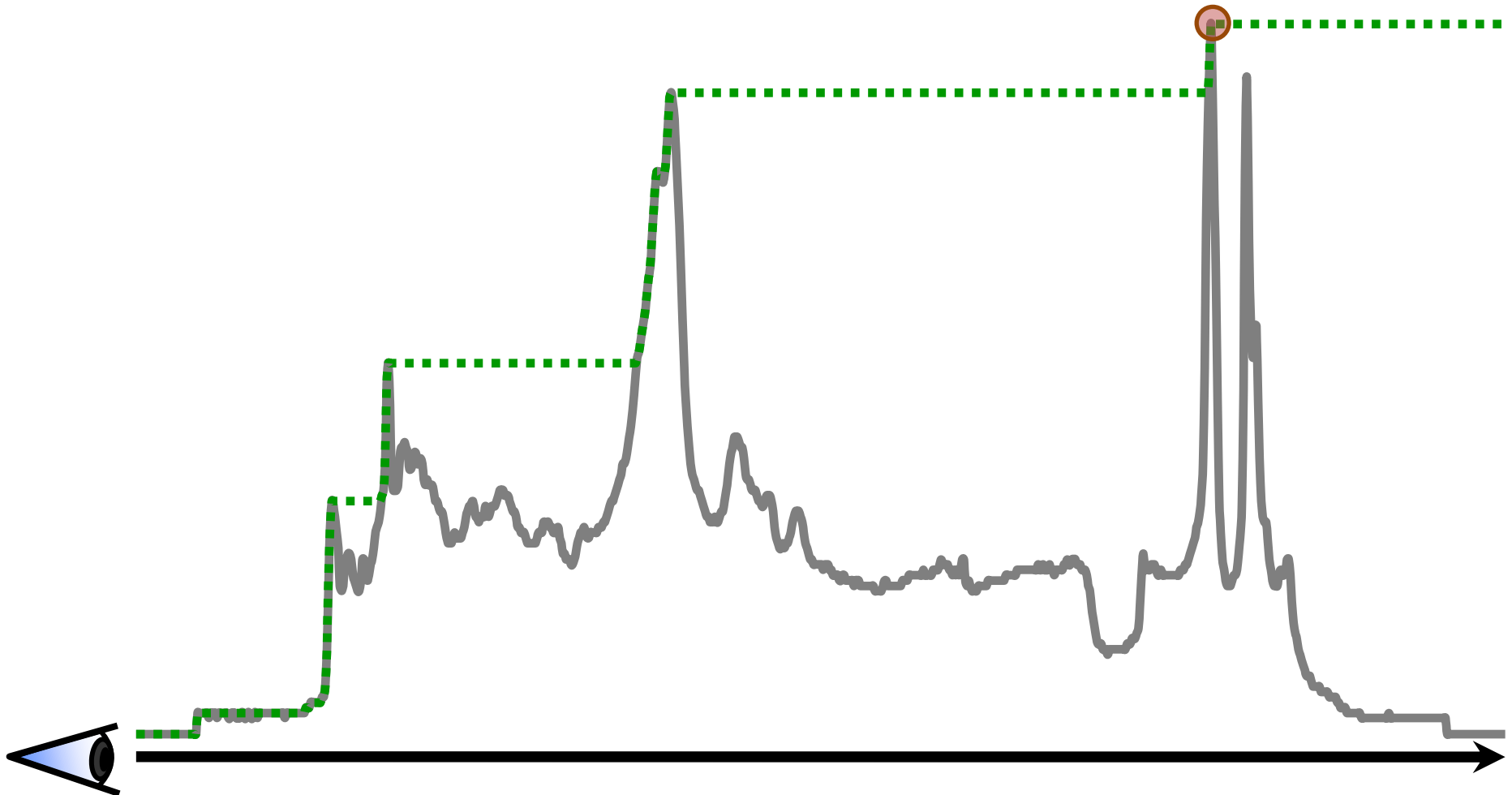


# Maximum Intensity Projection



data value

maximum value



# Direct Volume Rendering

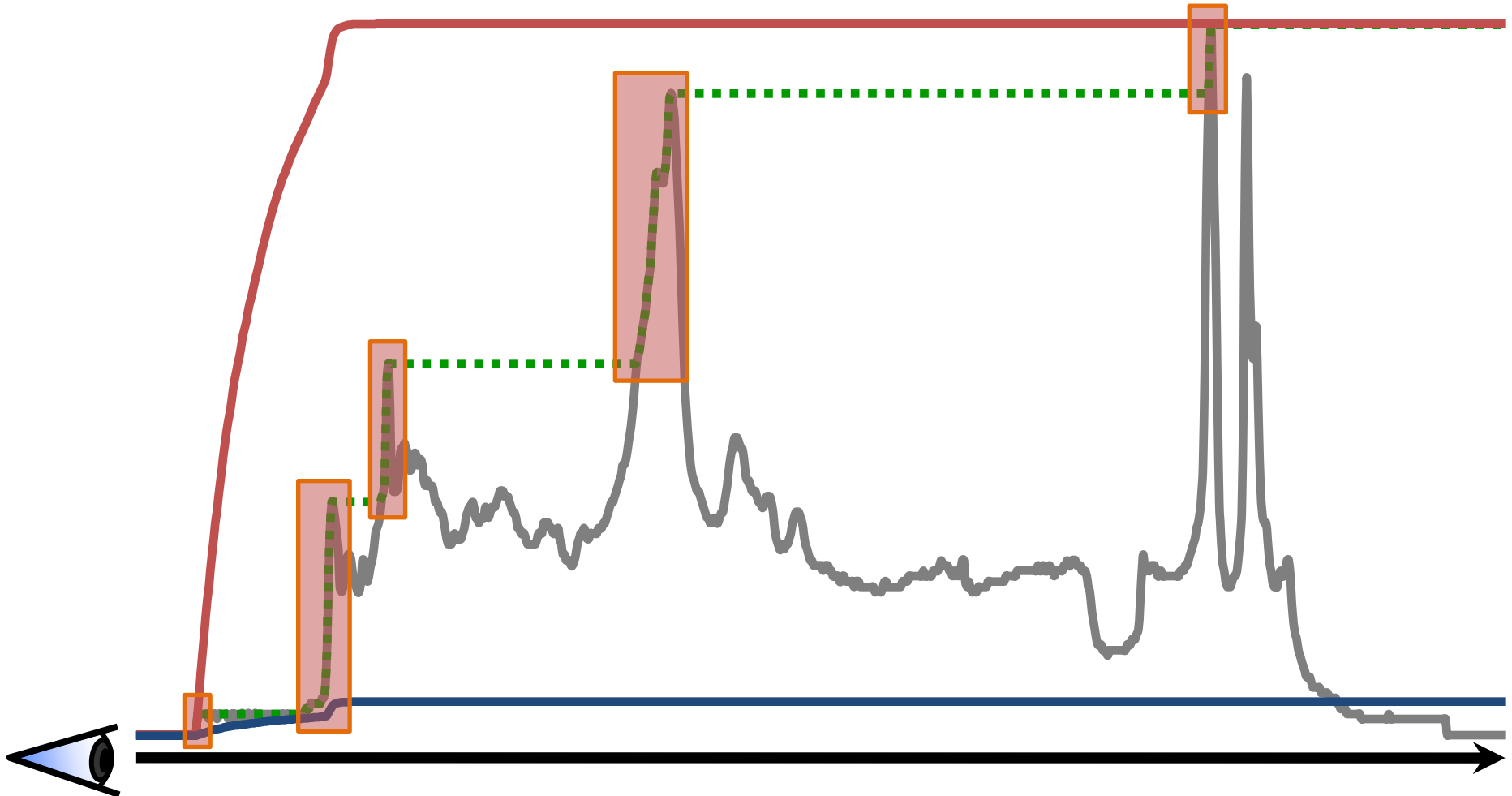


data value

maximum value

accumulated opacity

accumulated color



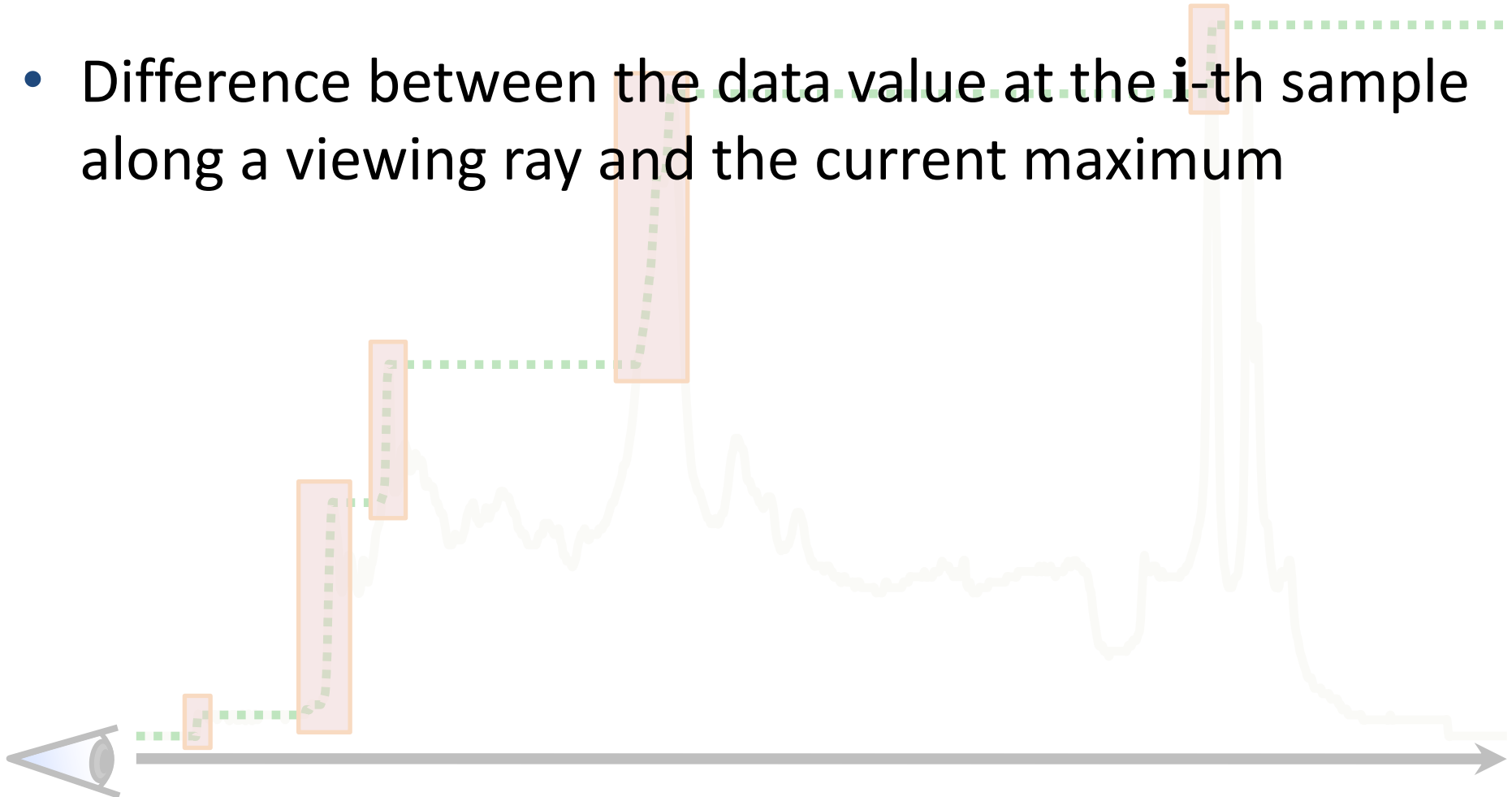
# Maximum Intensity Difference



data value

maximum value

- Difference between the data value at the  $i$ -th sample along a viewing ray and the current maximum





# Maximum Intensity Difference

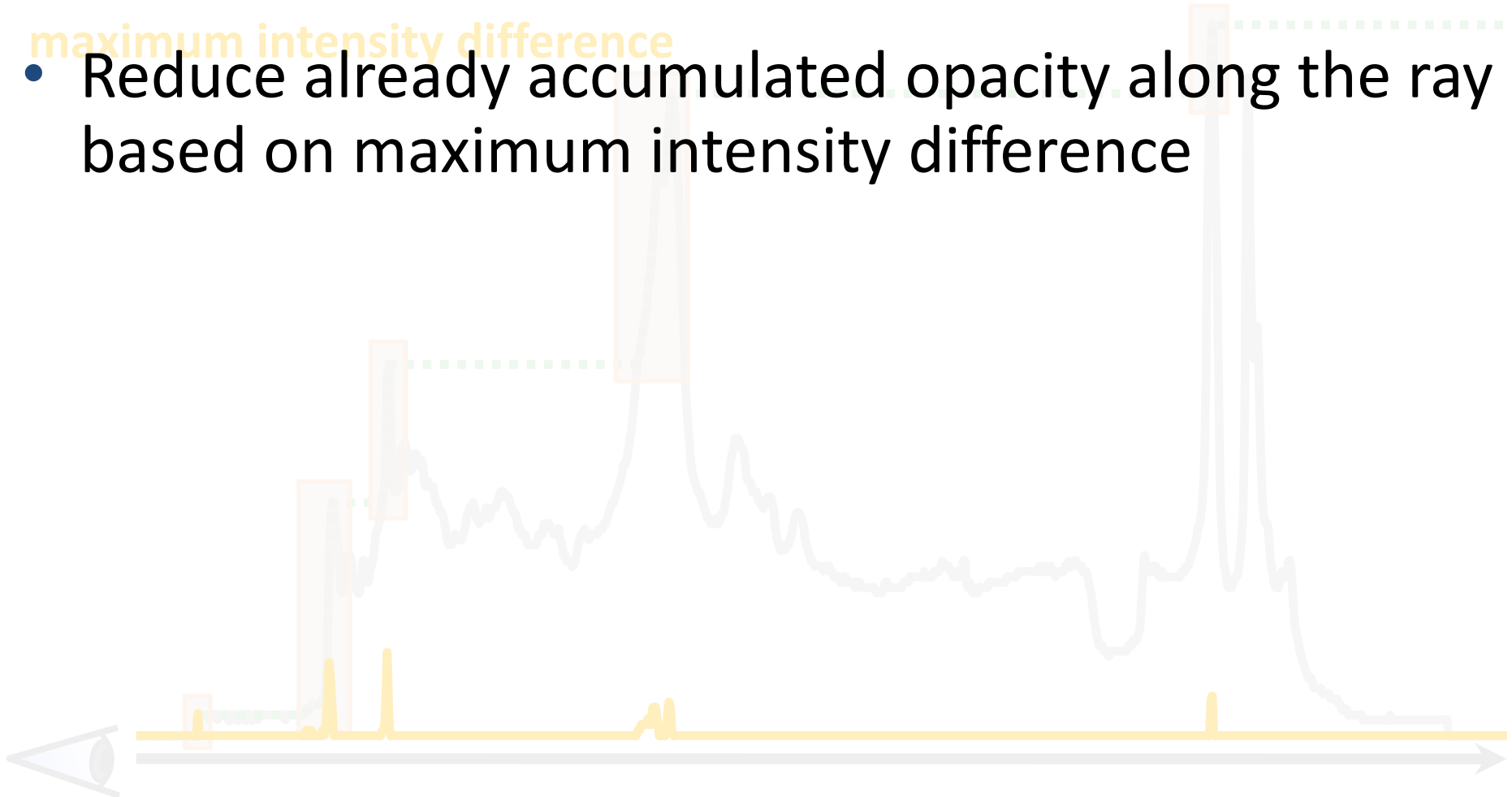


data value

maximum value

maximum intensity difference

- Reduce already accumulated opacity along the ray based on maximum intensity difference



# Direct Volume Rendering



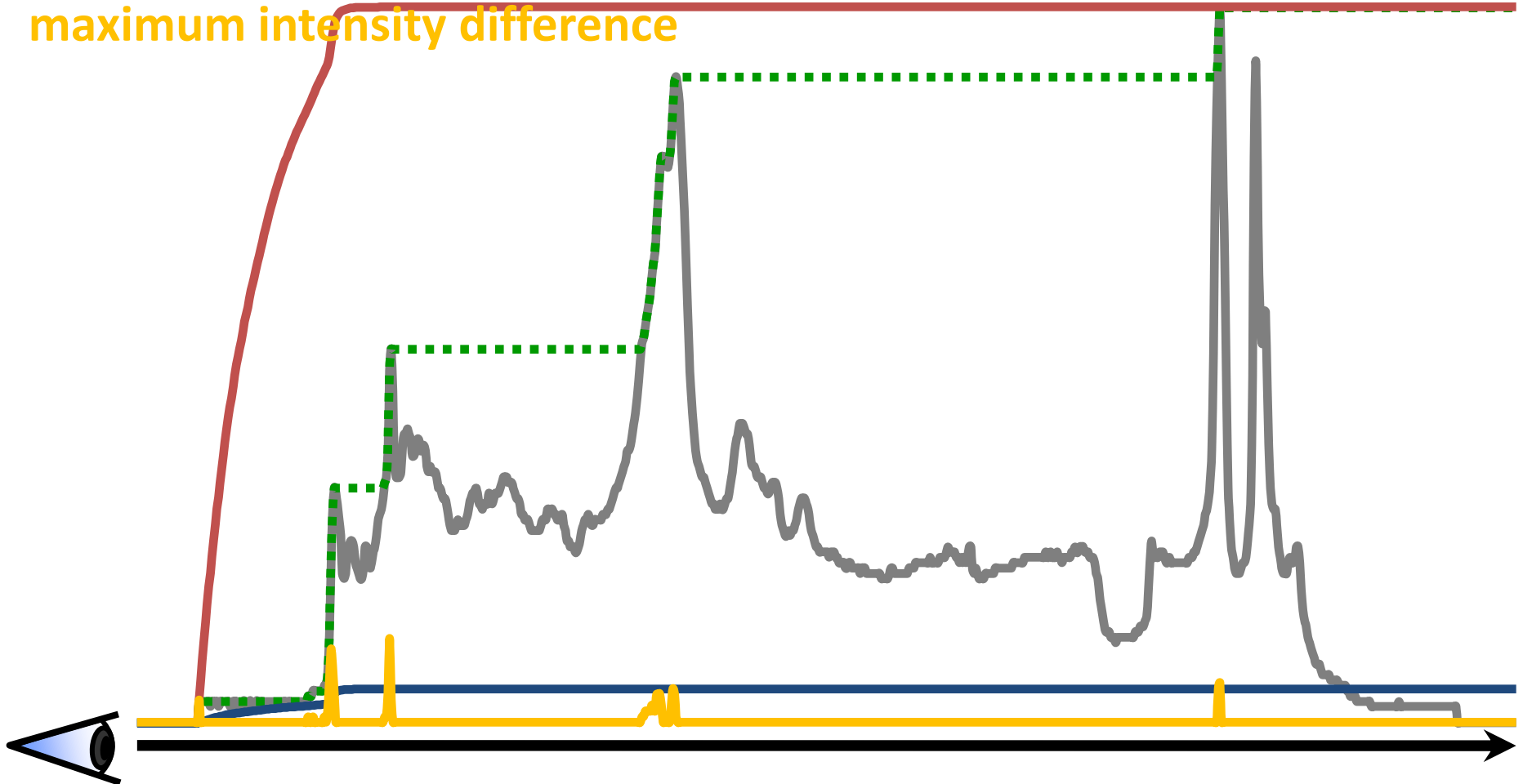
data value

maximum value

maximum intensity difference

accumulated opacity

accumulated color



# Max. Int. Difference Accumulation

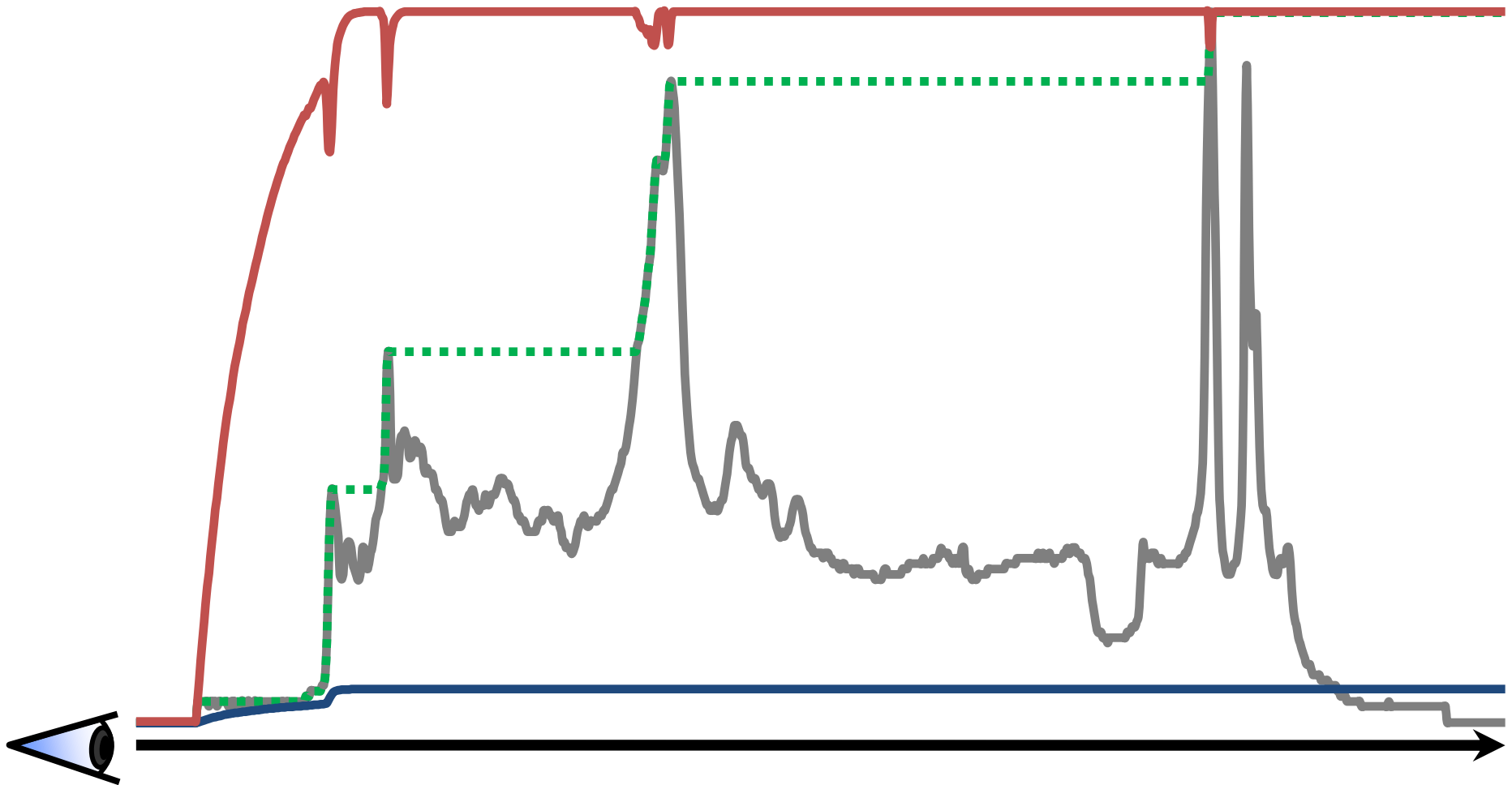


data value

maximum value

accumulated opacity

accumulated color



# Max. Int. Difference Accumulation

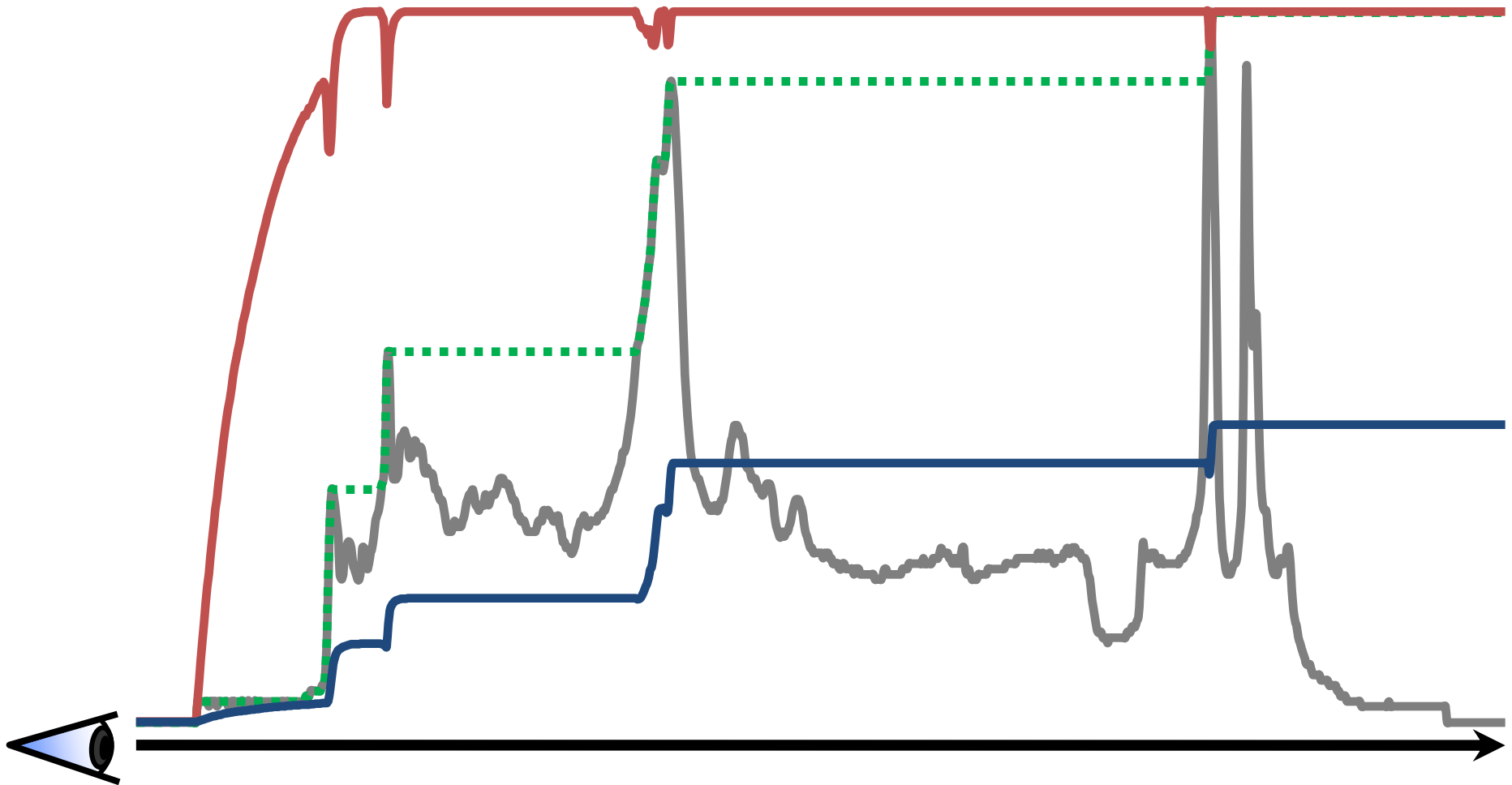


data value

maximum value

accumulated opacity

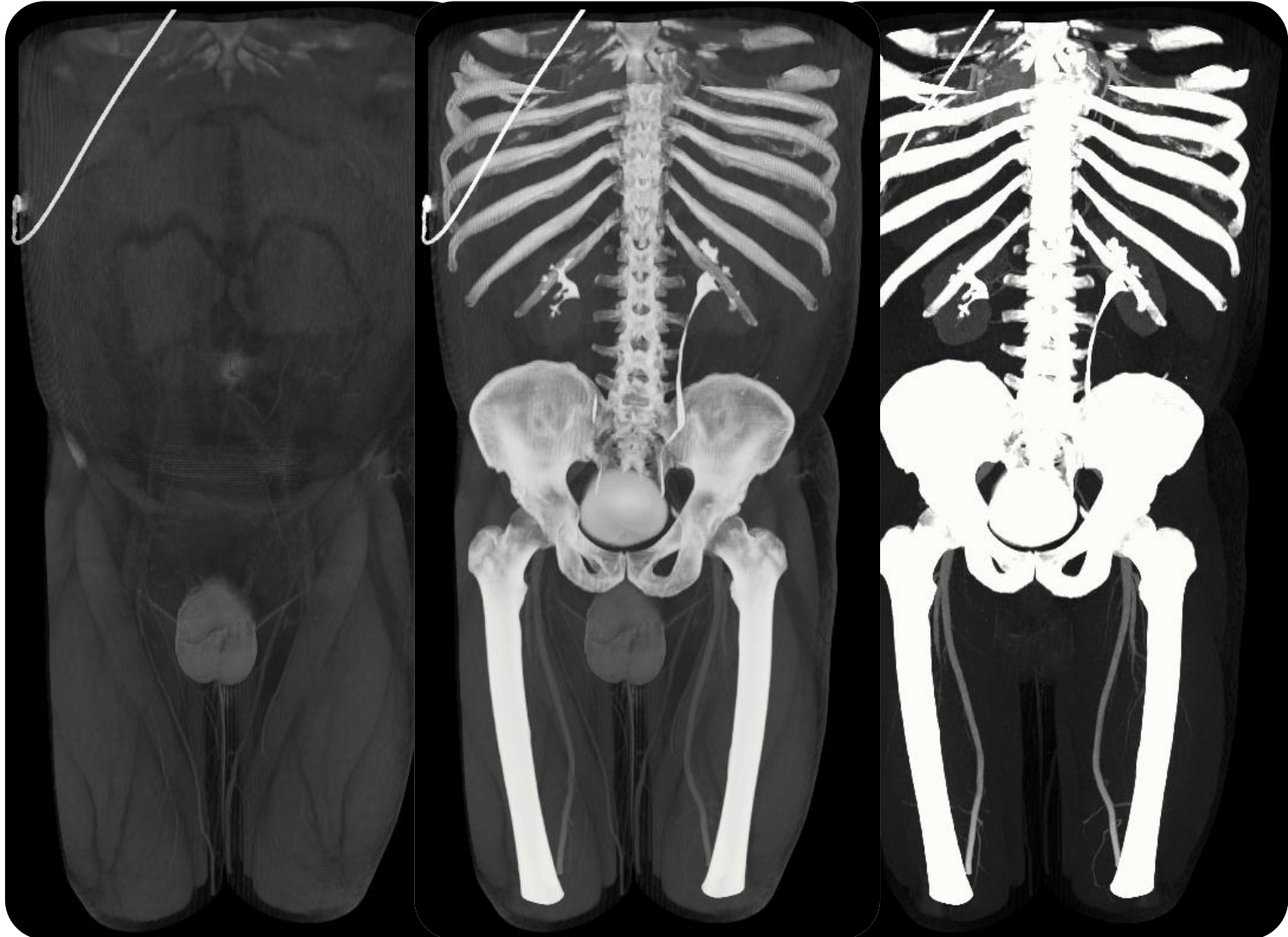
accumulated color



# MIDA = DVR + MIP (1)



**DVR** – Direct Volume Rendering    **MIDA** – Maximizing Intensity Difference    **MIP** – Maximum Intensity Projection



# MIDA = DVR + MIP (2)

**DVR**



**MIDA**

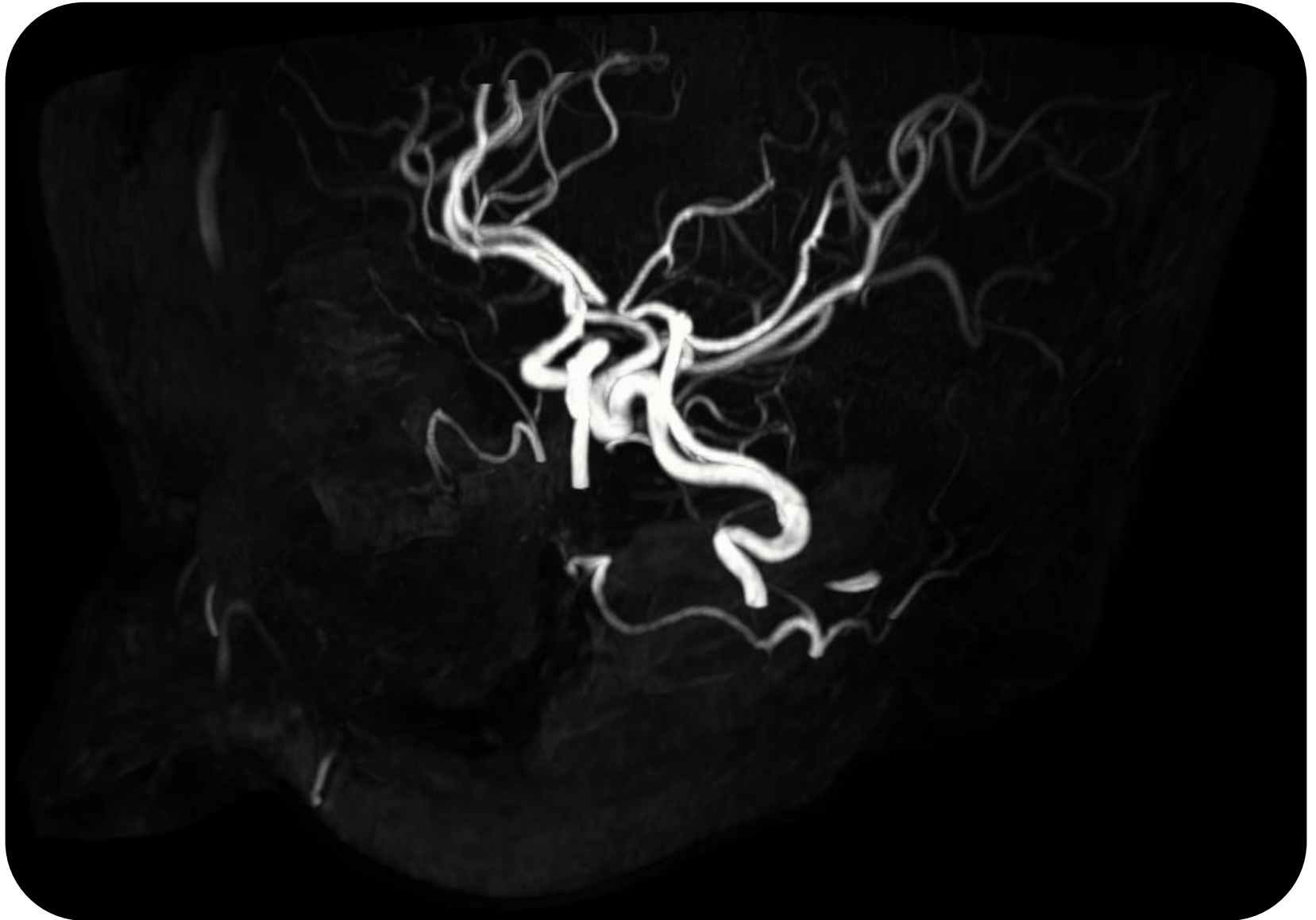


**MIP**

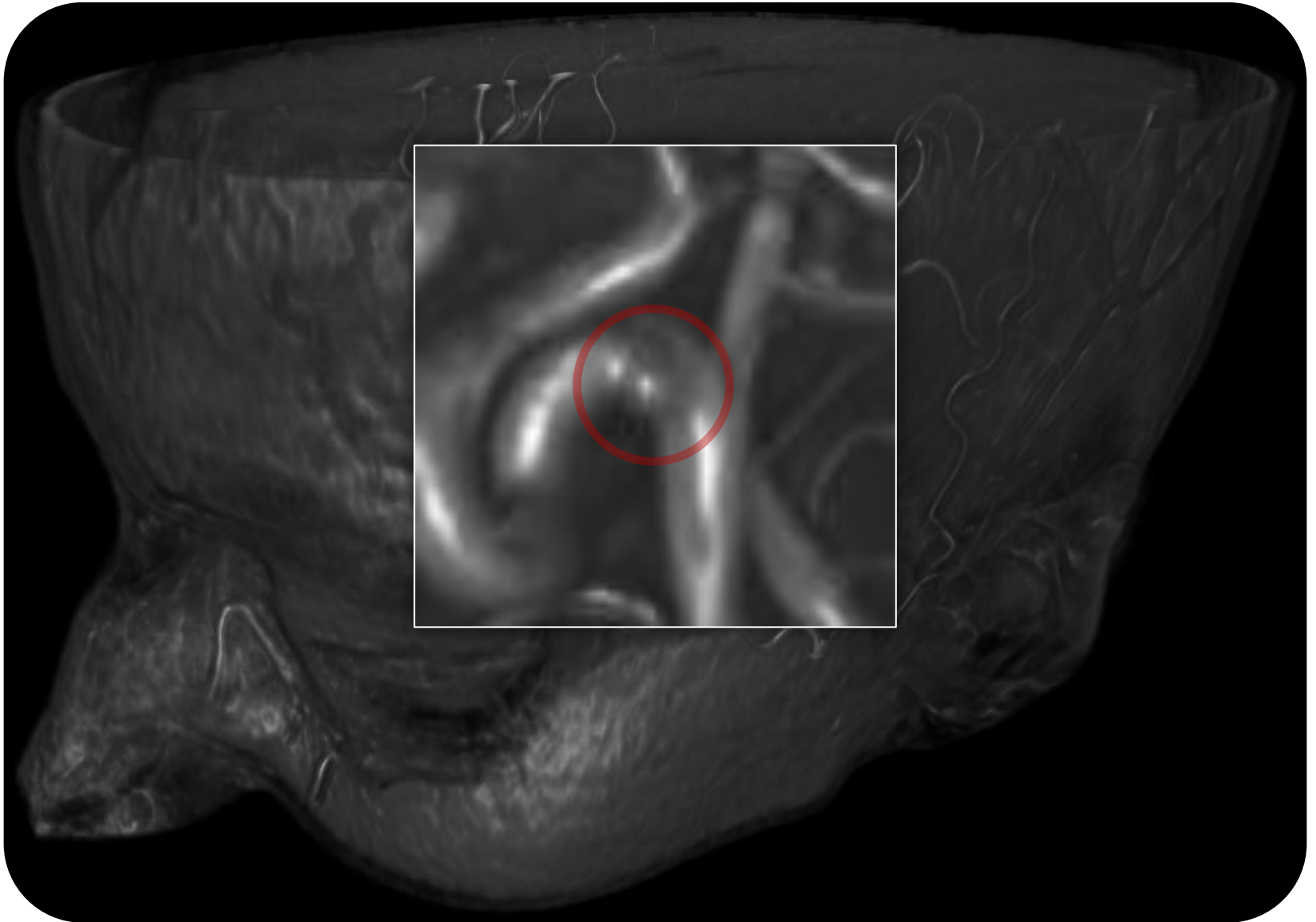




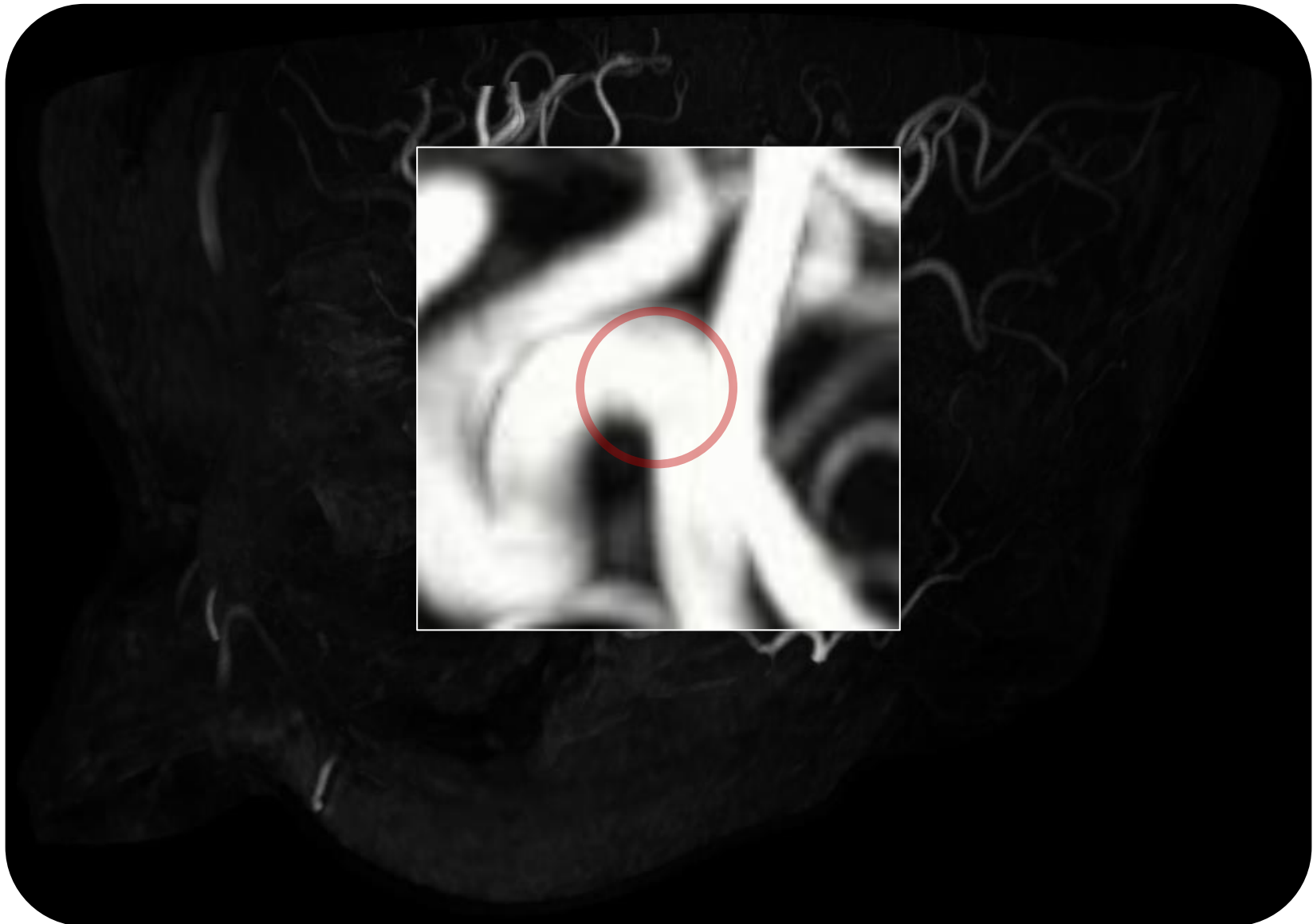
# MIP



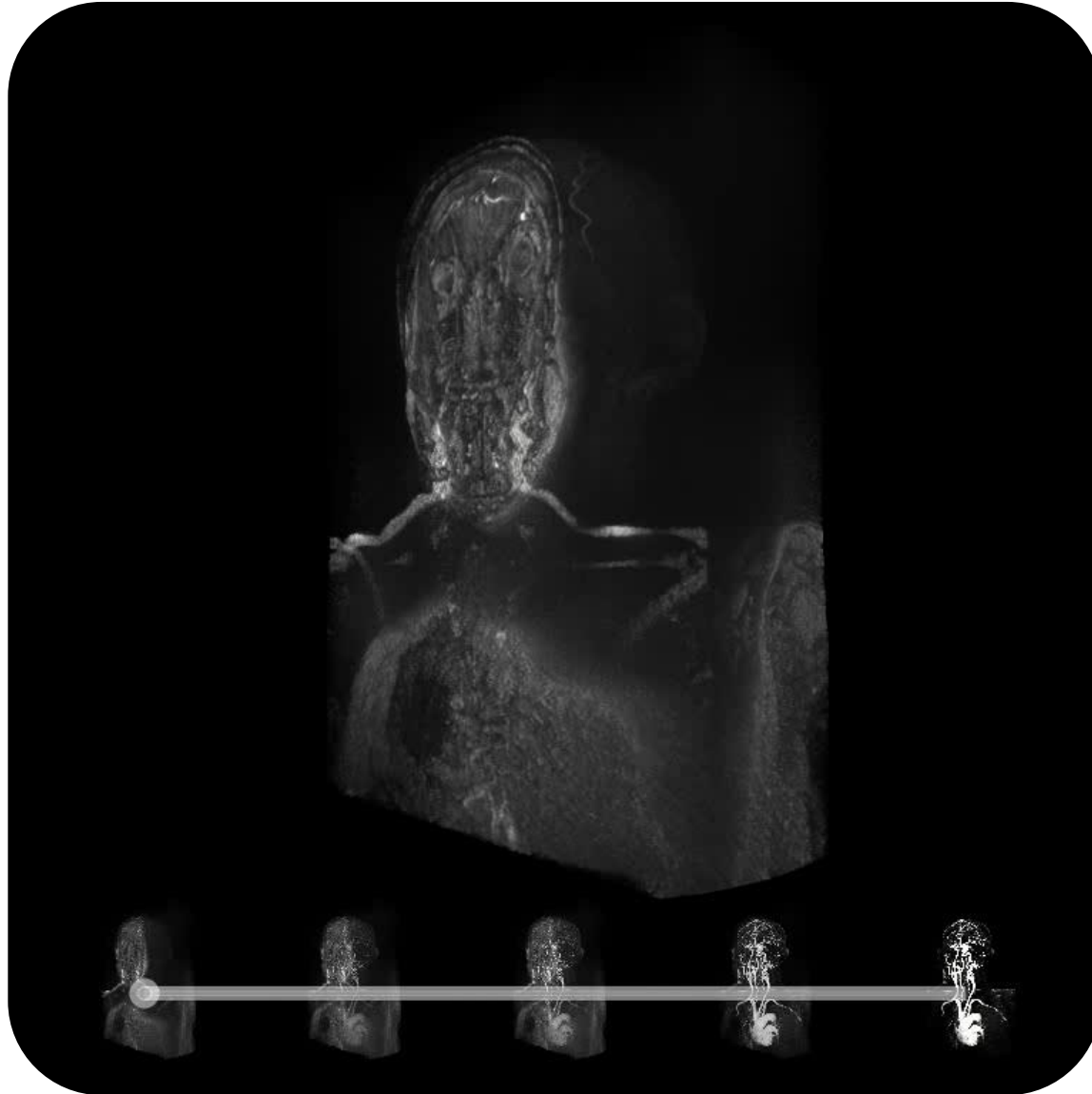
# MIDA



# MIP



# From DVR via MIDA to MIP

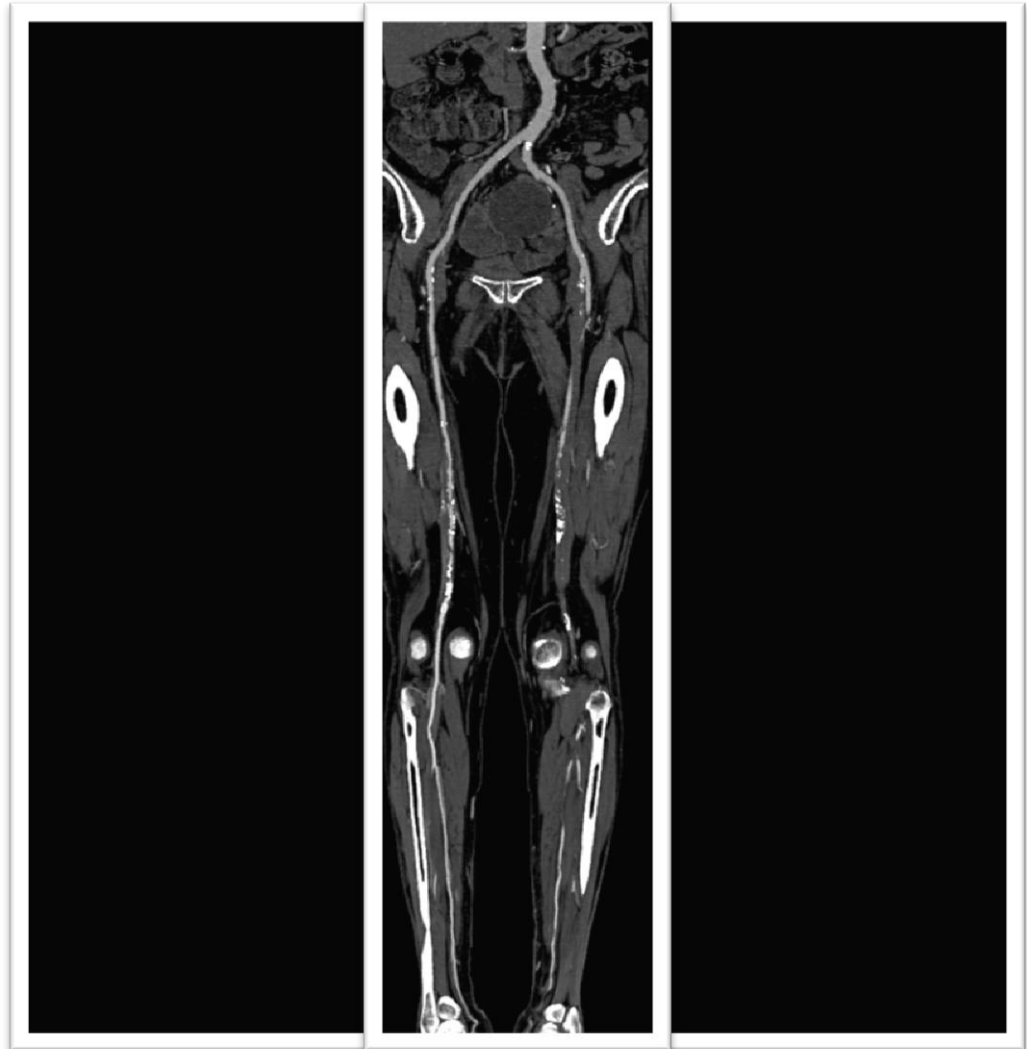
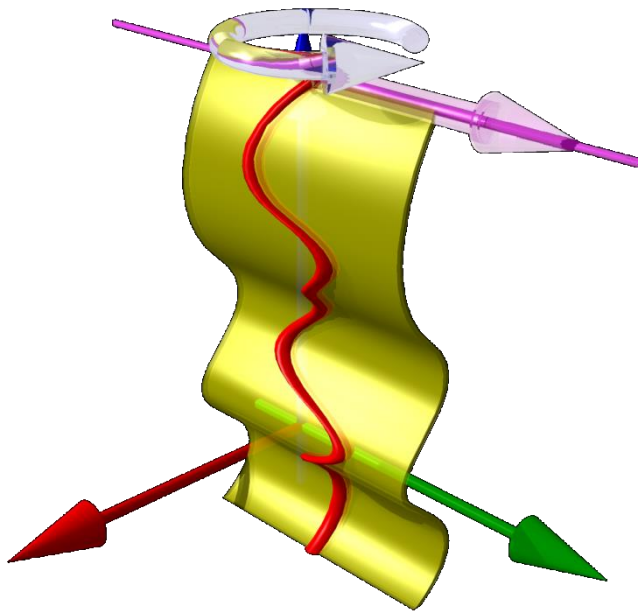


# Limitations of 3D Visualizations



- MIP & MIDA only incorporate information about data value semantics
- No knowledge about the geometrical arrangement of the focus object is used
- Detailed assessment of the vessel lumen is difficult

# Curved Planar Reformation (CPR)



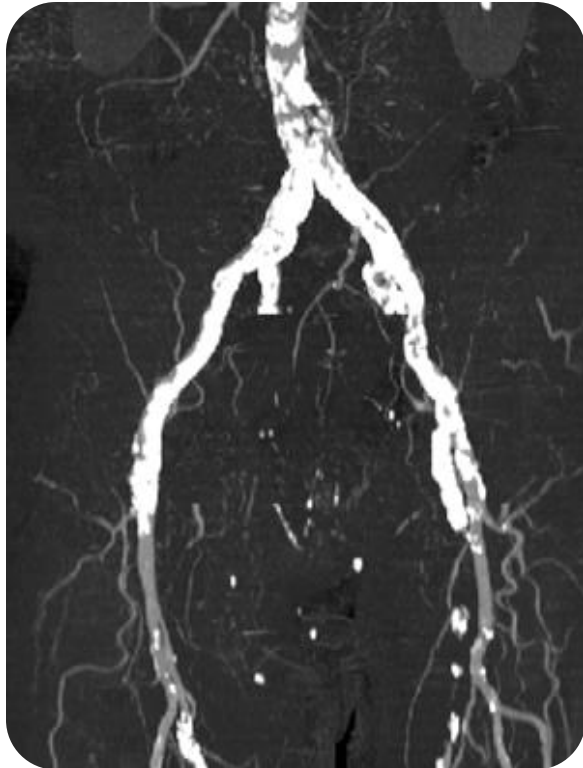


# Advantages of CPR



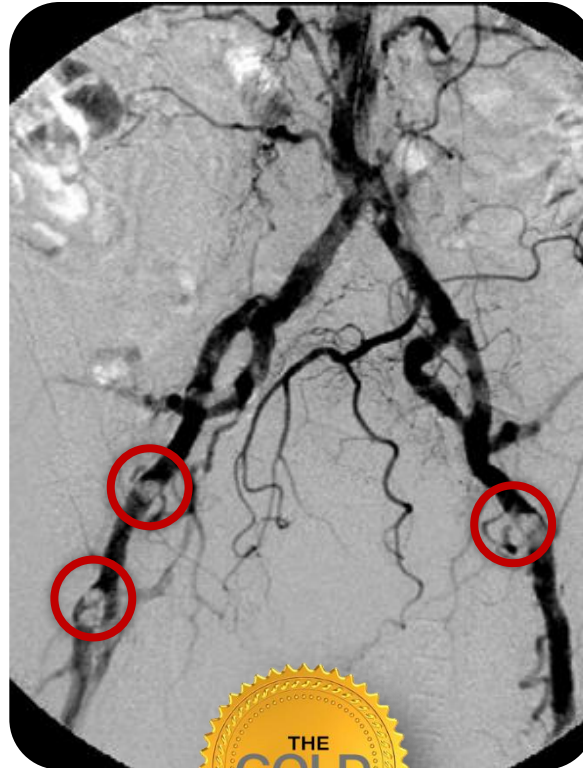
## MIP

Maximum Intensity Projection



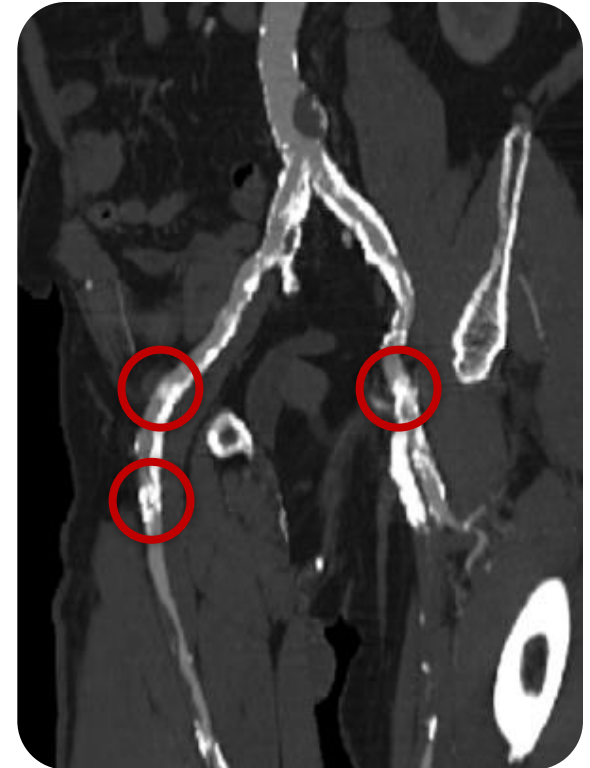
## DSA

Digital Subtraction Angiography



## CPR

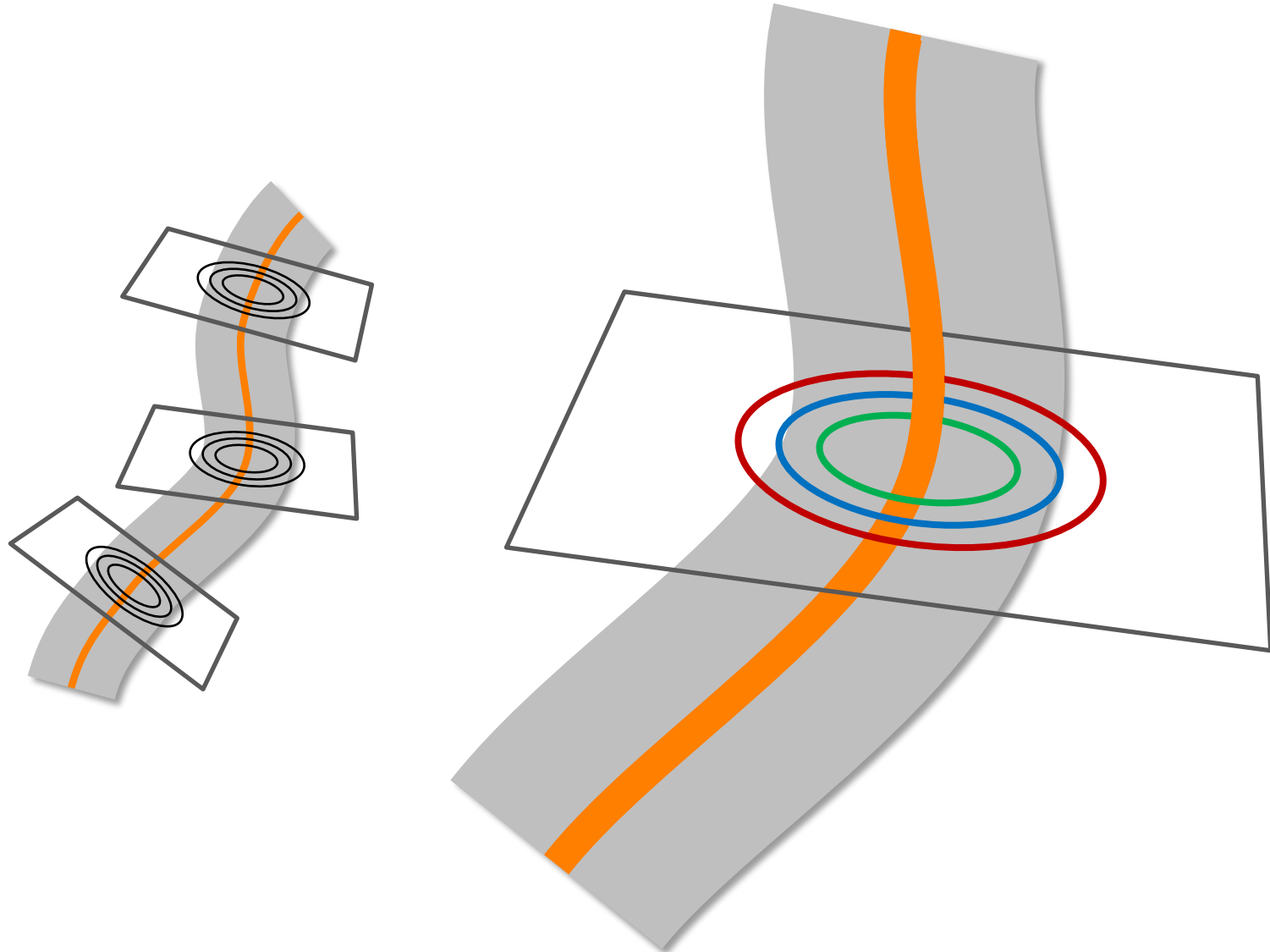
Curved Planar Reformation



- Drawbacks of CPR
  - Many images from various viewing angles
  - Extensive browsing through images
  - Cumbersome to memorize particular regions

**Solution:** aggregate rotations into a single image

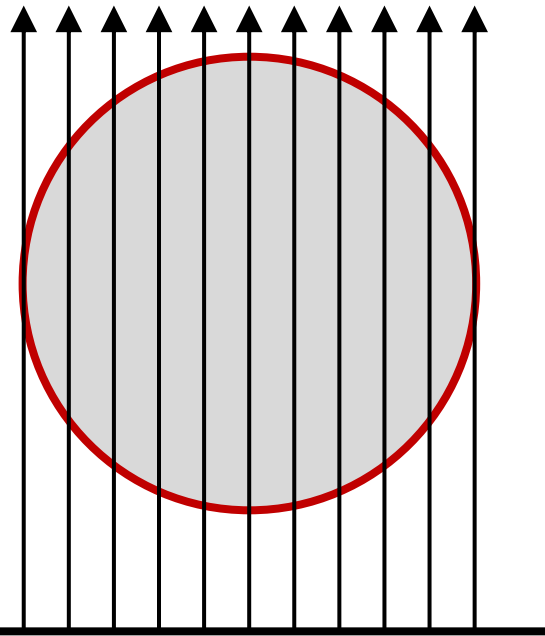
# Curvicircular Feature Aggregation



# 3D vs. CPR vs. CFA

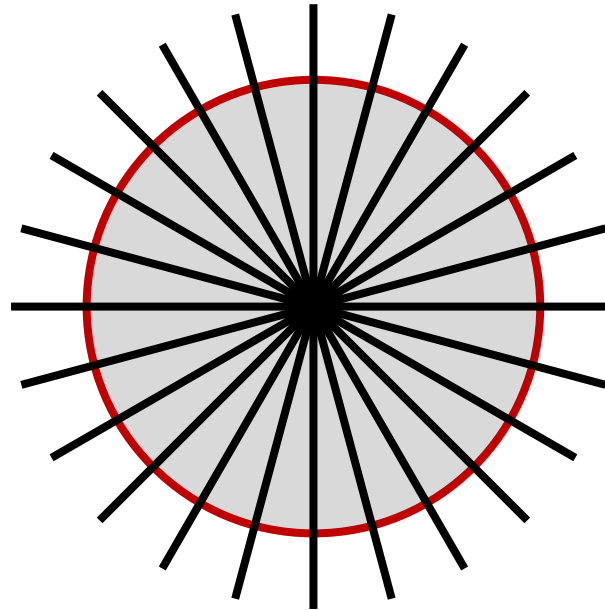


3D Visualization



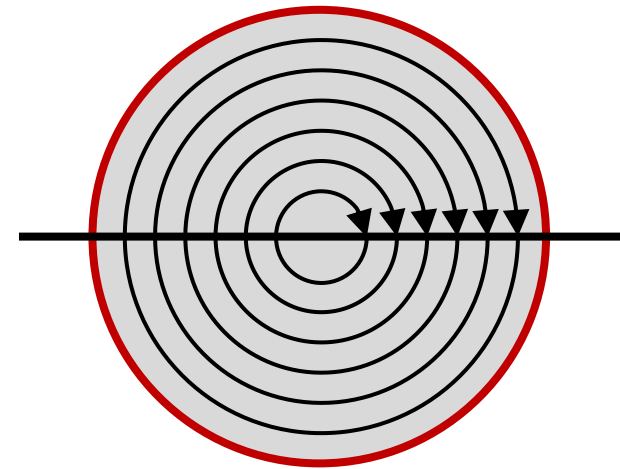
straight rays

Curved Planar  
Reformation (CPR)



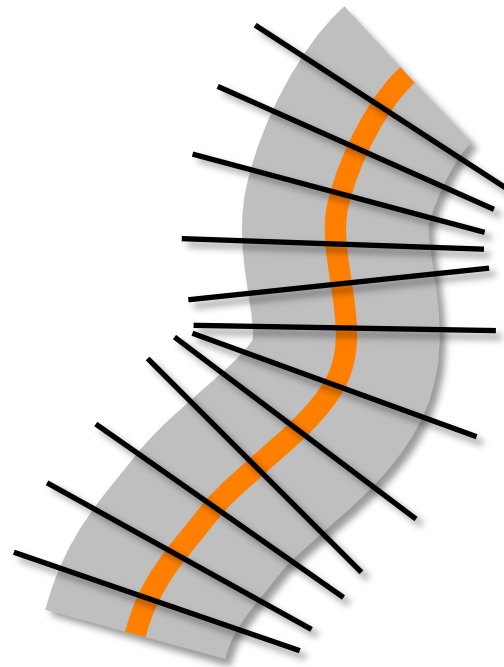
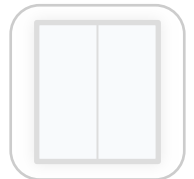
cut through vessel

Curvicircular Feature  
Aggregation (CFA)

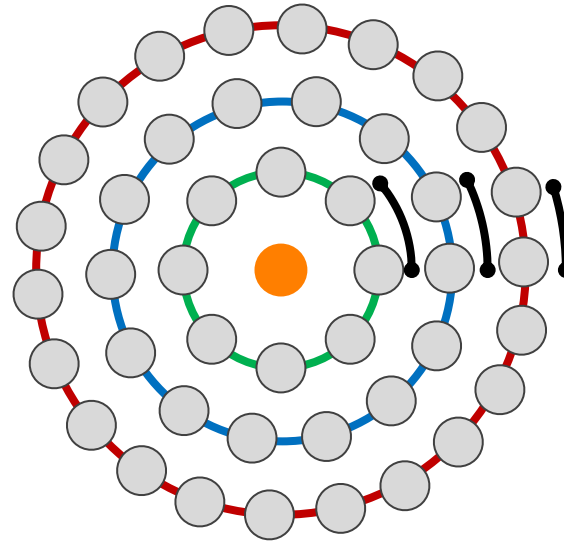
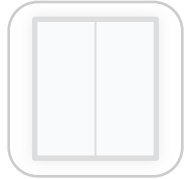


curved rays

# Traversal

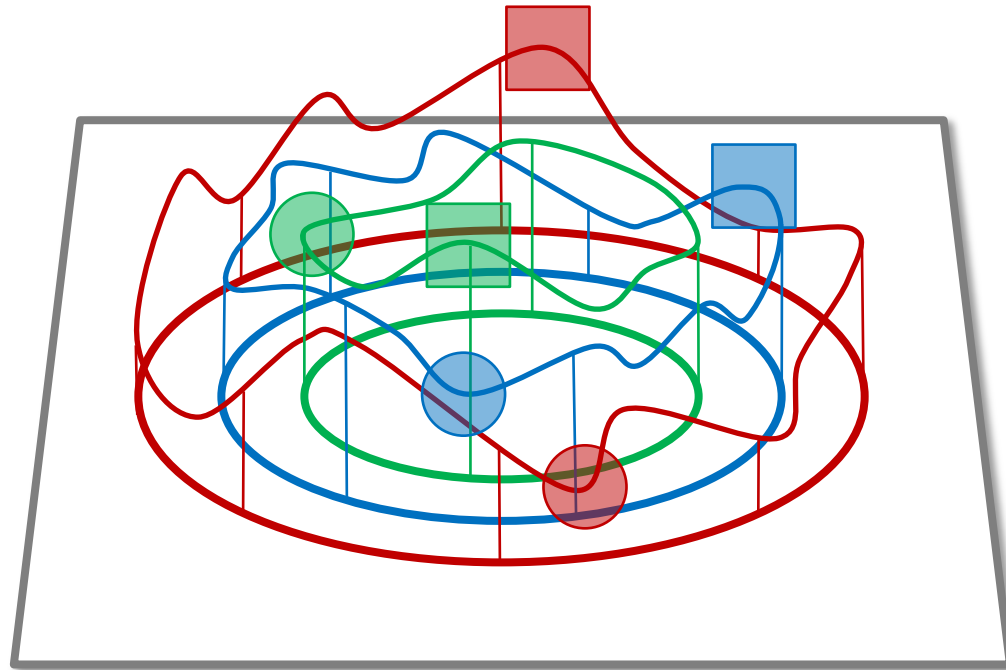
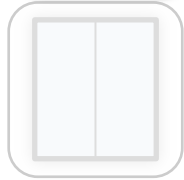


# Sampling



# Aggregation

Various methods possible:  
maximum (MIP), minimum (MINIP),  
MIDA, DVR, etc.



maximum intensity



minimum intensity

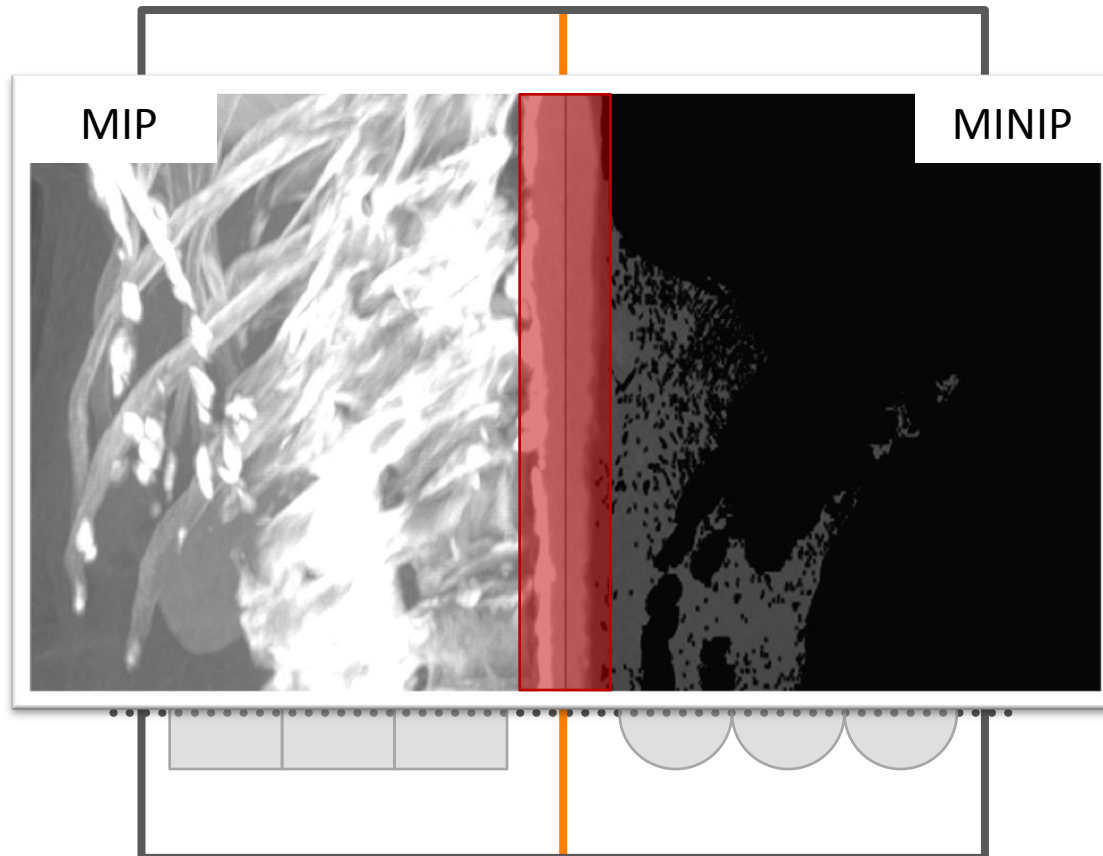


# Display

Complete vessel aggregated & straightened  
Image split into two parts along centerline

Maximum (MIP)

Minimum (MINIP)



Rows are sampling planes

Columns are circular rays

Min / max for every pixel of the image

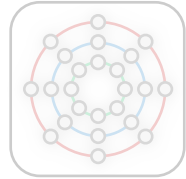
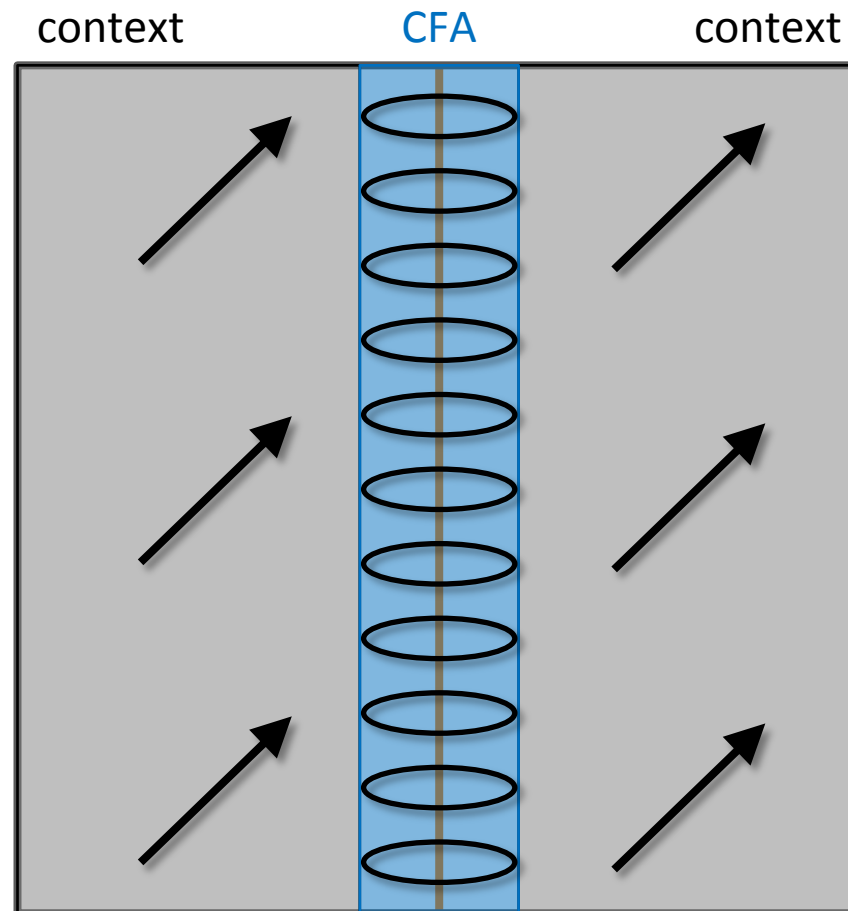


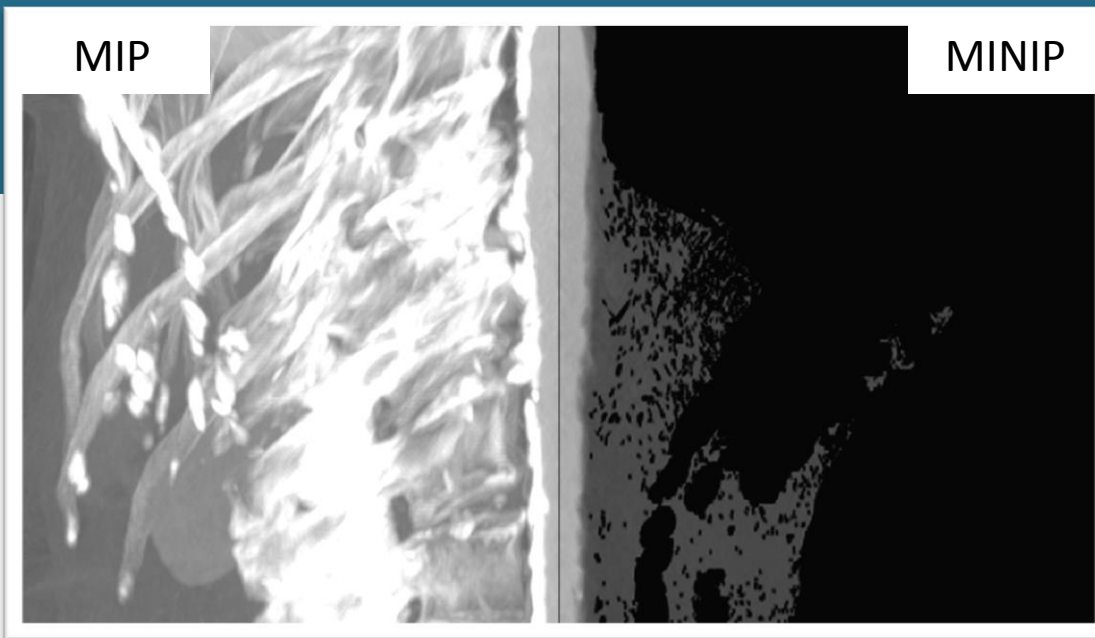


# Context

Requires vessel radius information

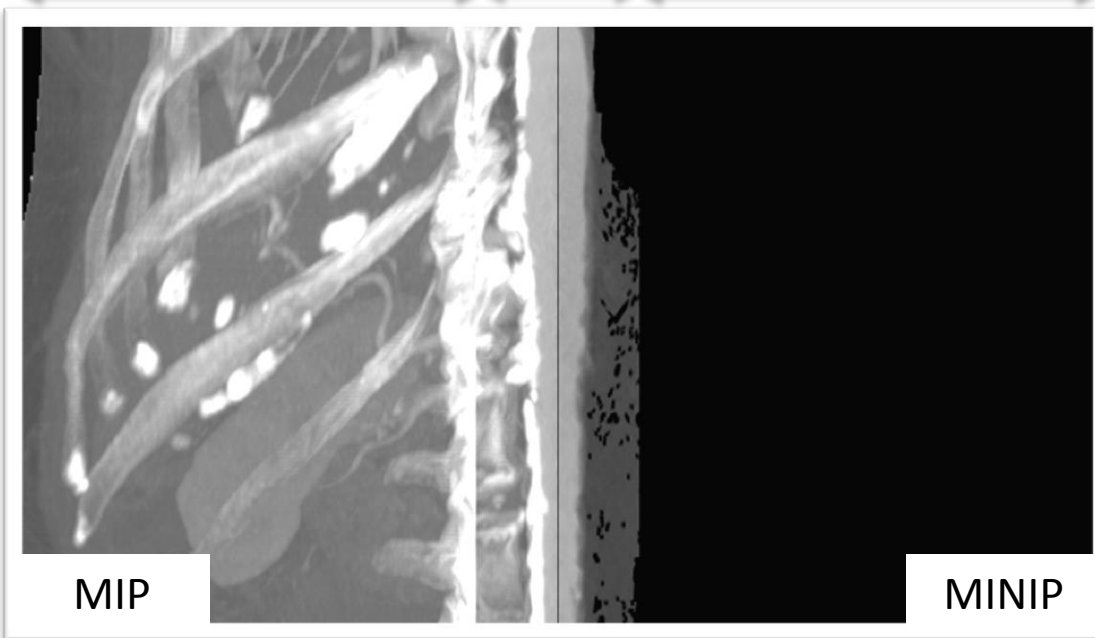
Cast straight rays outside the vessel lumen





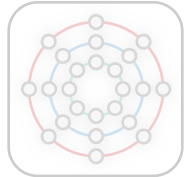
CFA

CFA + context



MIP

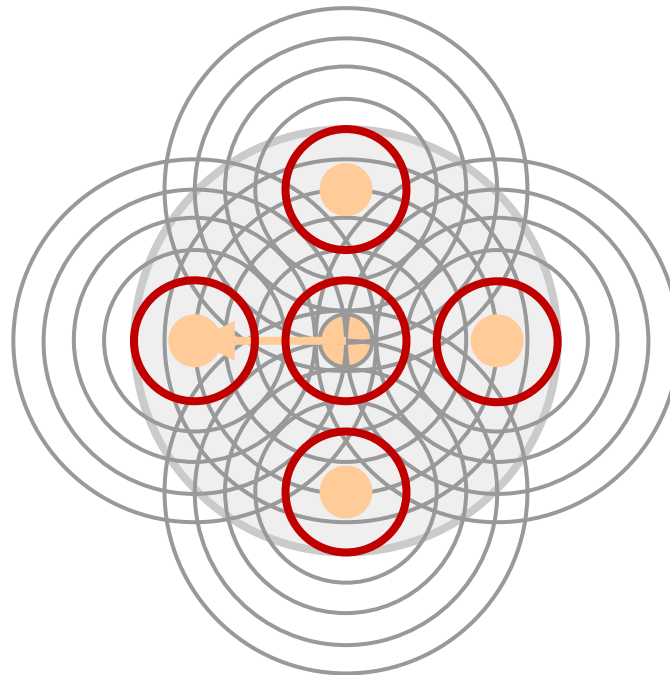
MINIP



# Stability

Centerline only has limited accuracy

Investigate changes caused by small variations



One aggregated value for every circular ray

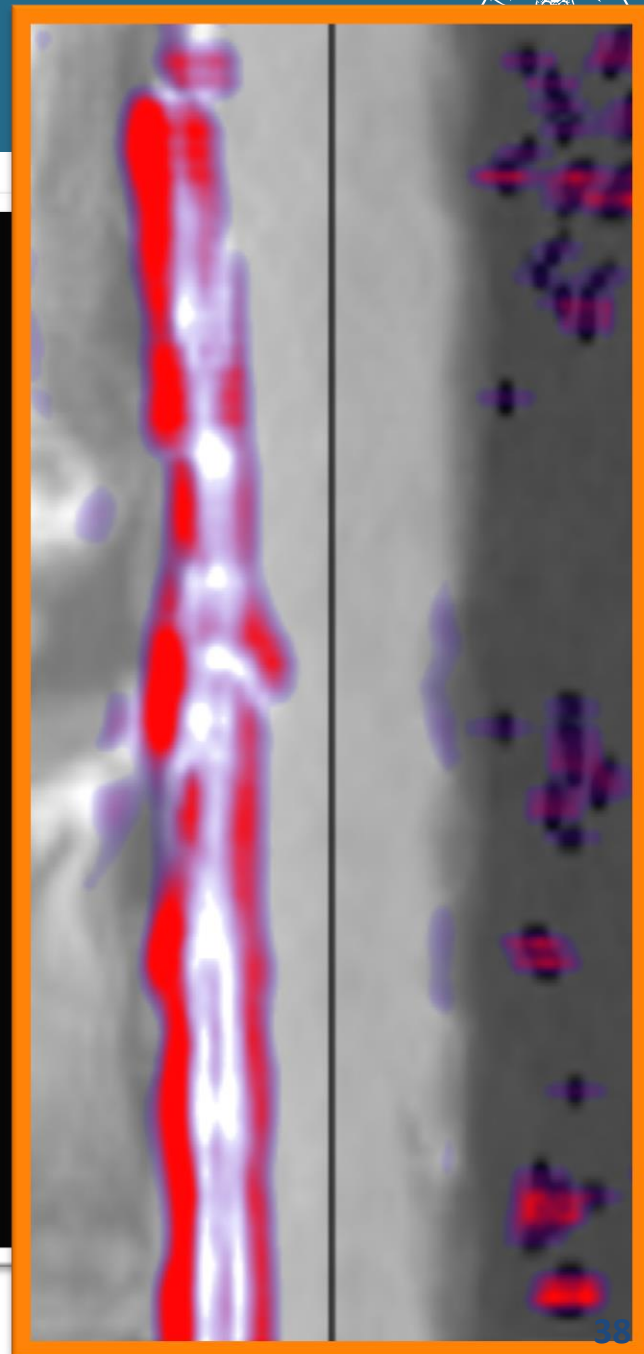
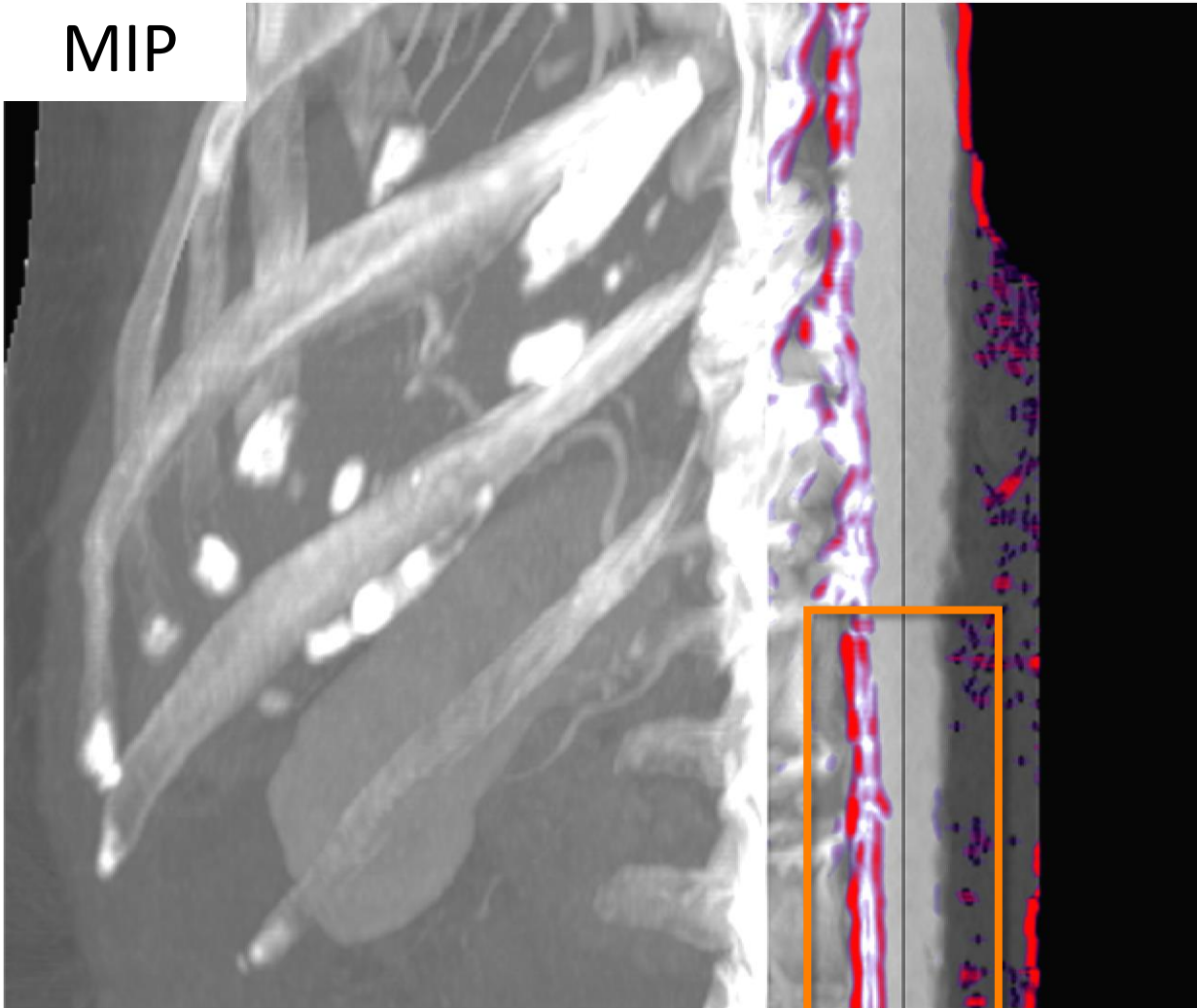
Variance defines stability

Indicator of centerline centeredness

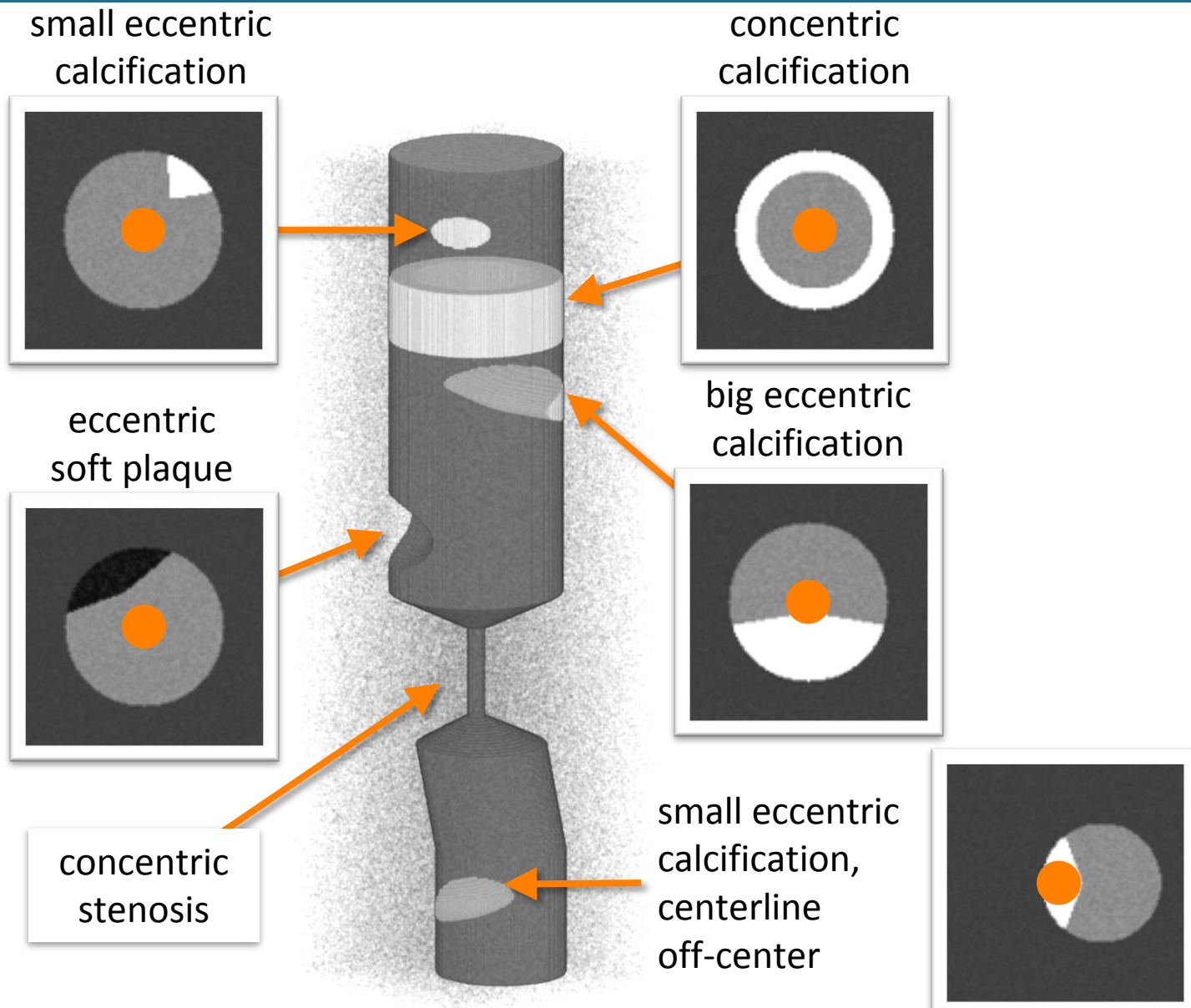
Overlaid for visual guidance

# Stability

MIP



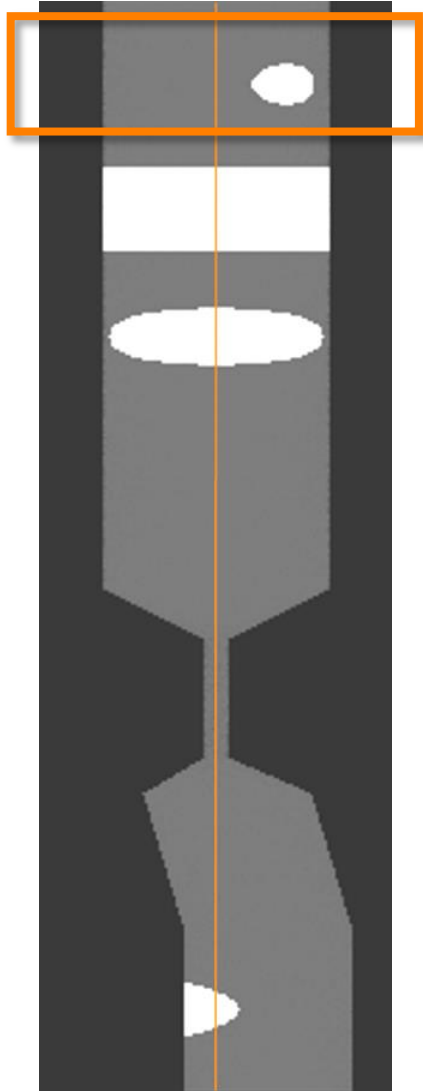
# Phantom Data Set (1)



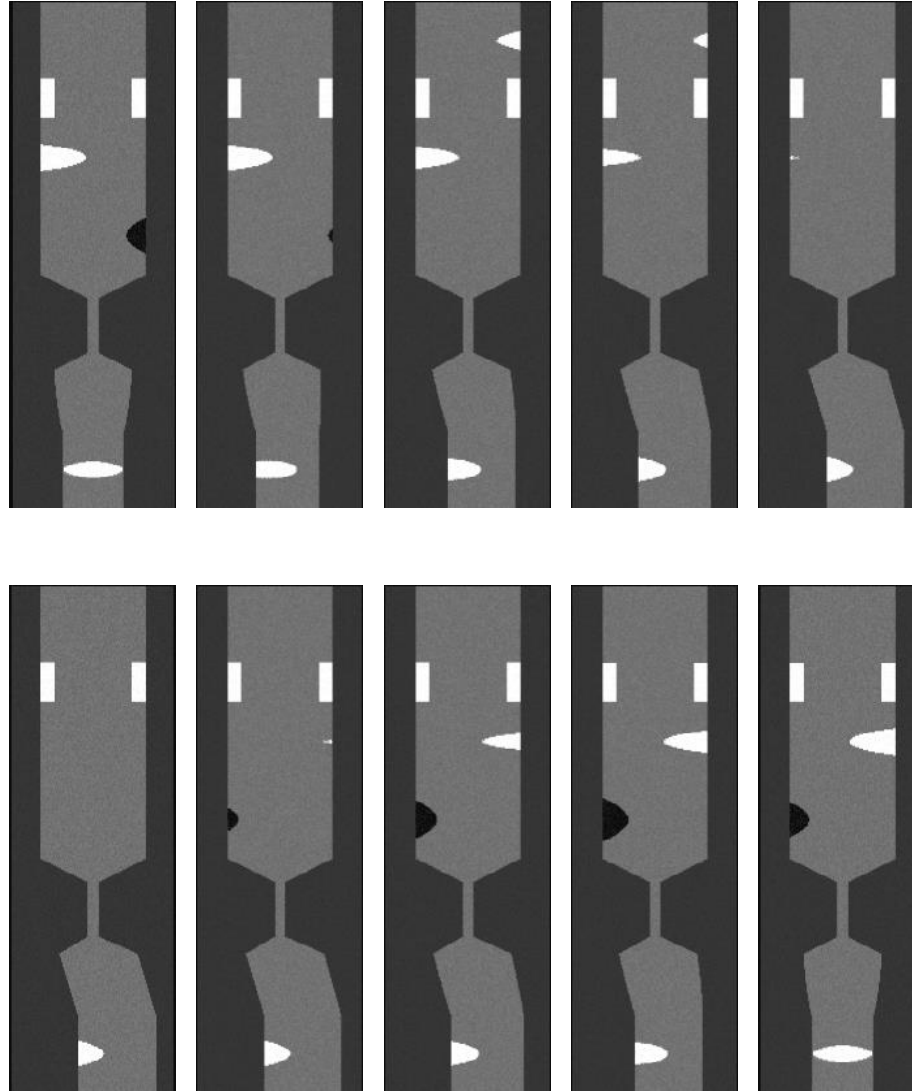
# Phantom Data Set (2)



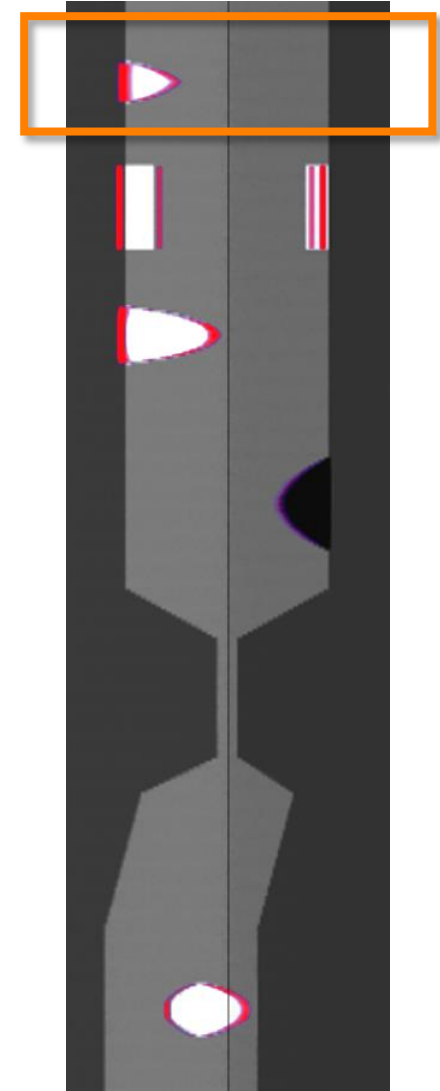
MIP



CPRs



CFA

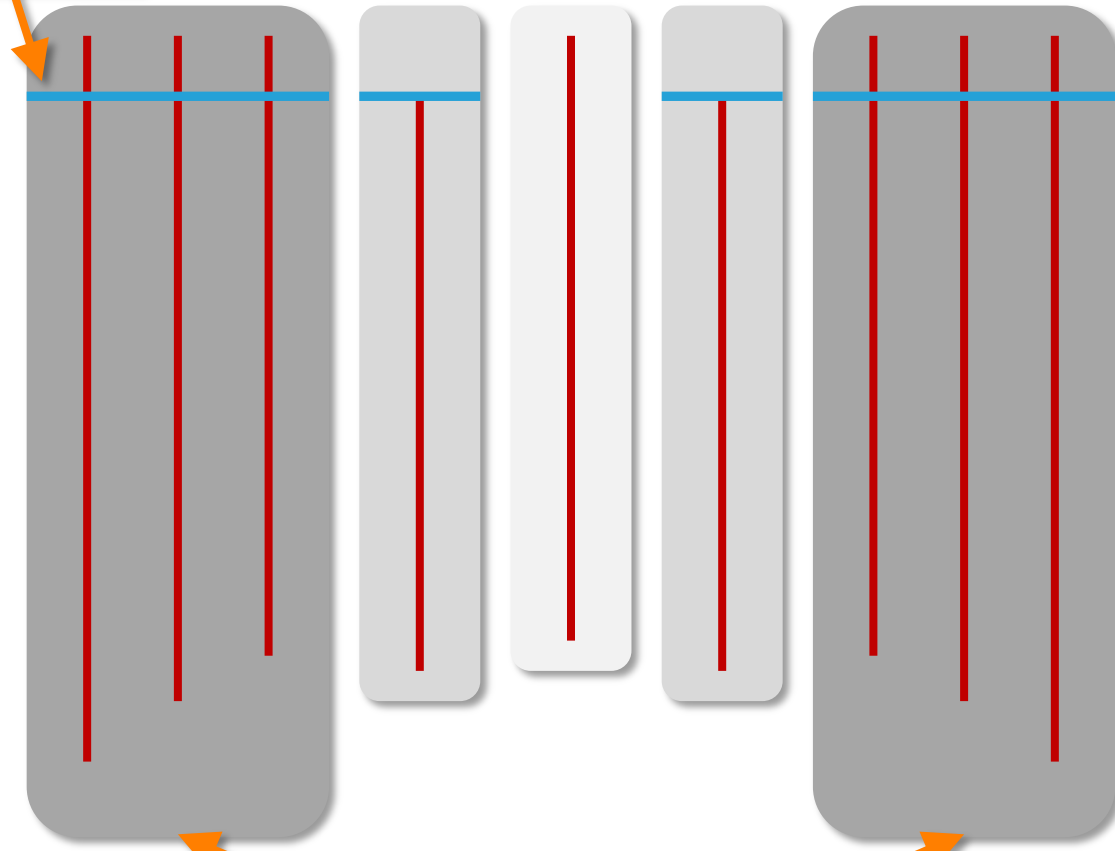
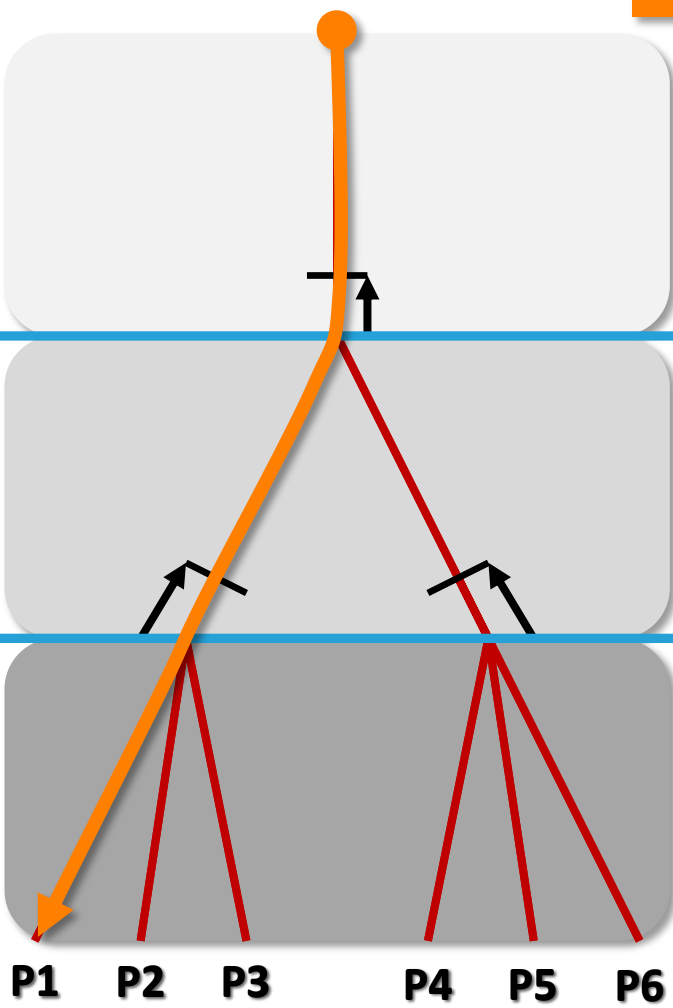


# Presentation

## Vessel Tree

transition margin

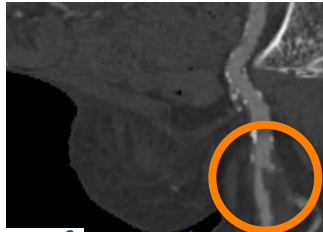
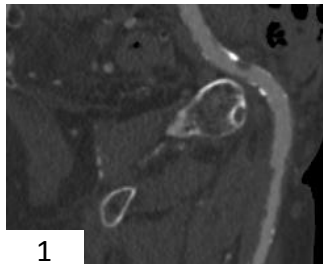
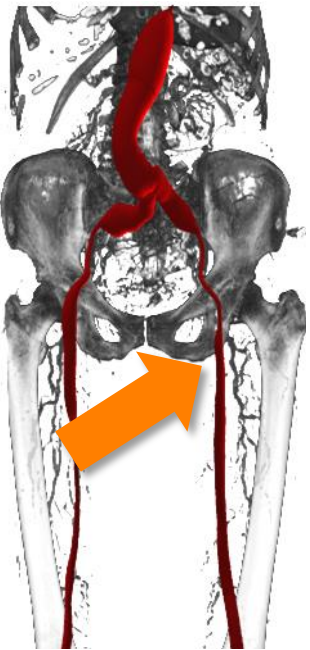
## Anatomical Layout



path names

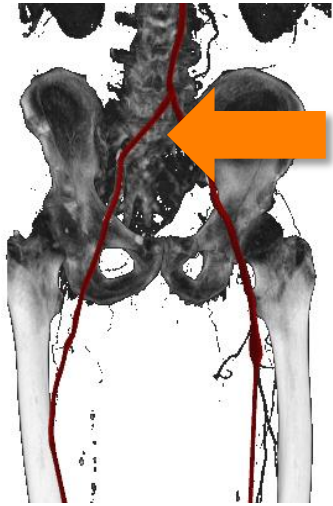


# Vessel Stenosis

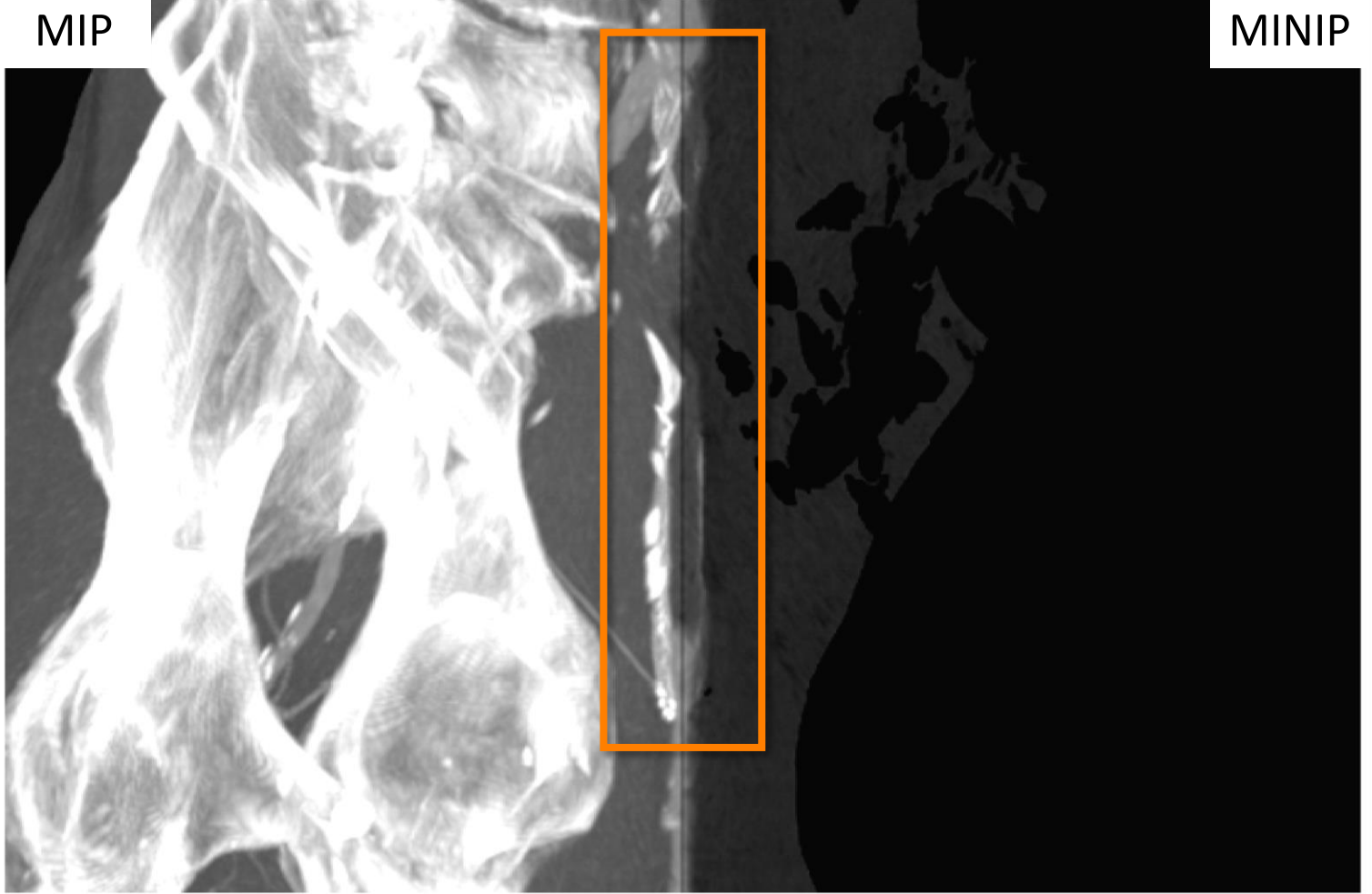




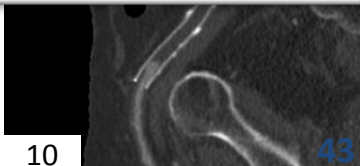
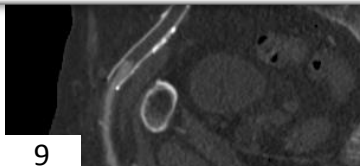
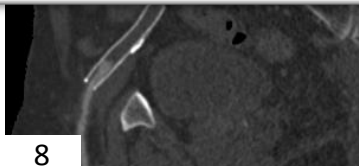
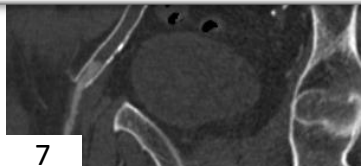
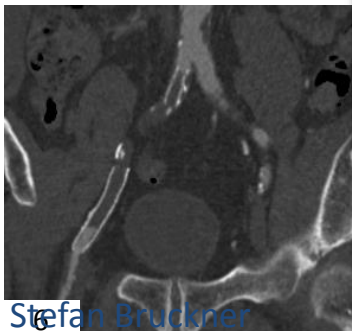
# Vessel Occlusion



MIP



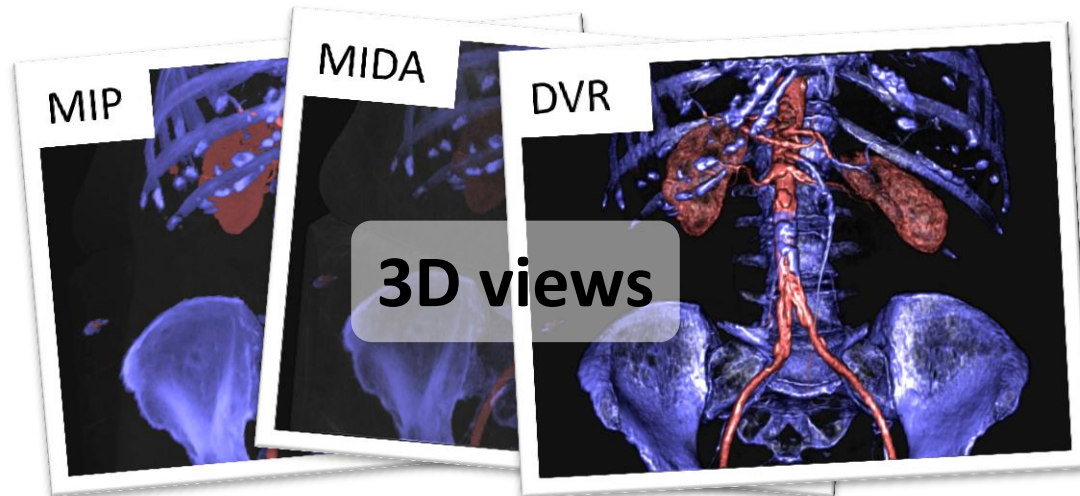
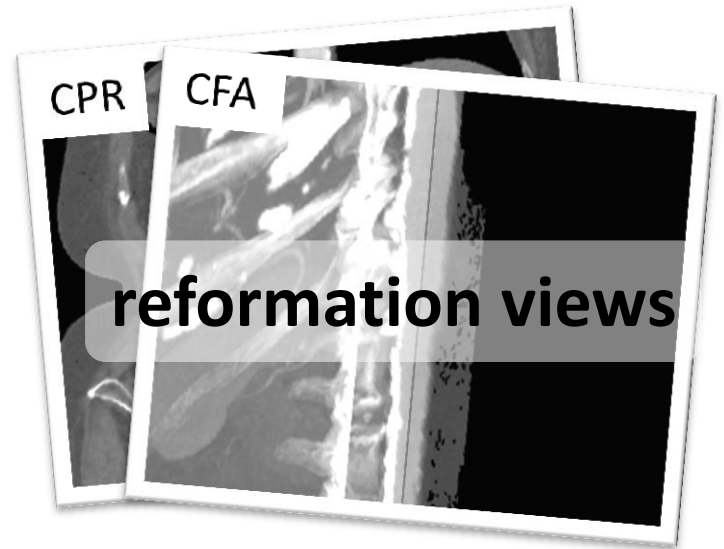
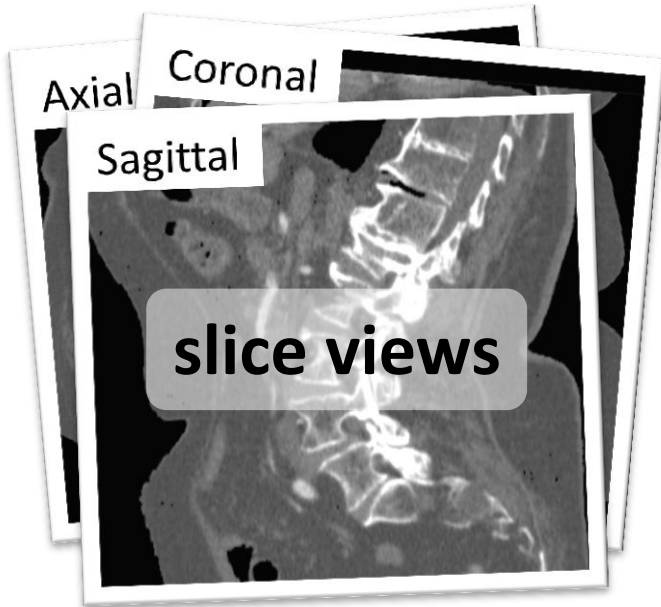
MINIP



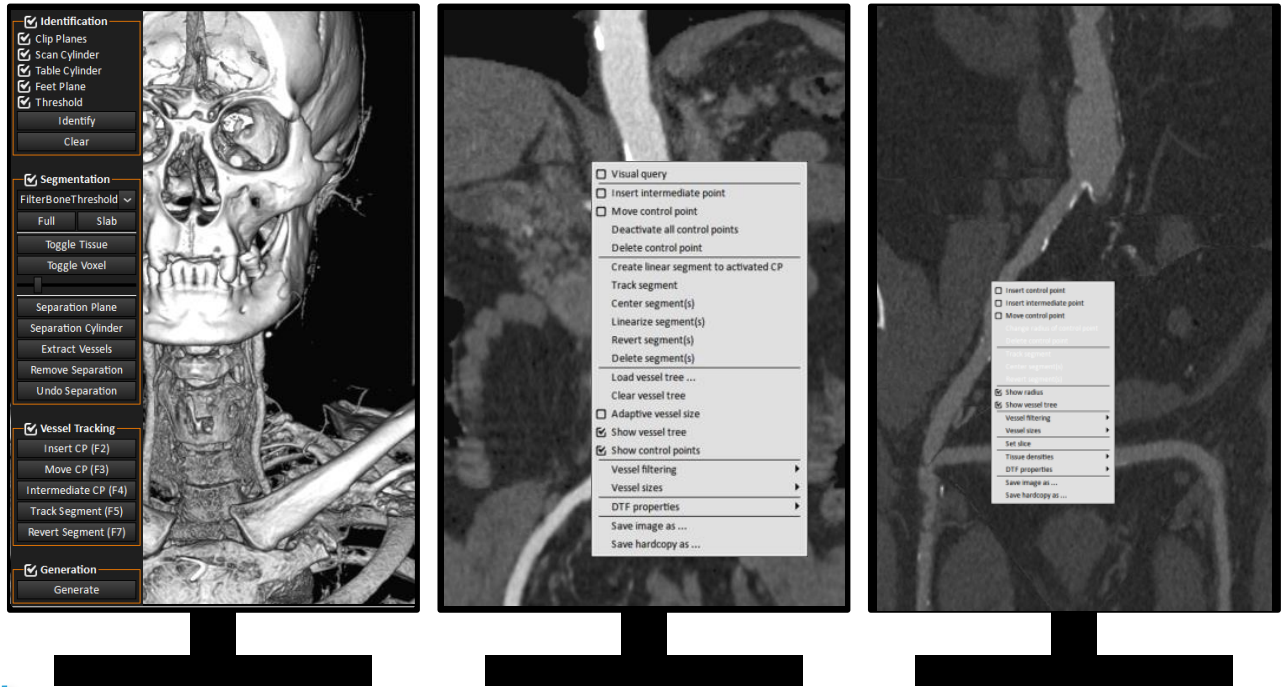
# Demonstration



Phantom Data Set



# Medical Workstations



- Multiple high-resolution diagnostic monitors
- Many different views (identified by weird acronyms)
- Parameters, options, and settings gallore

# Smart View Concept



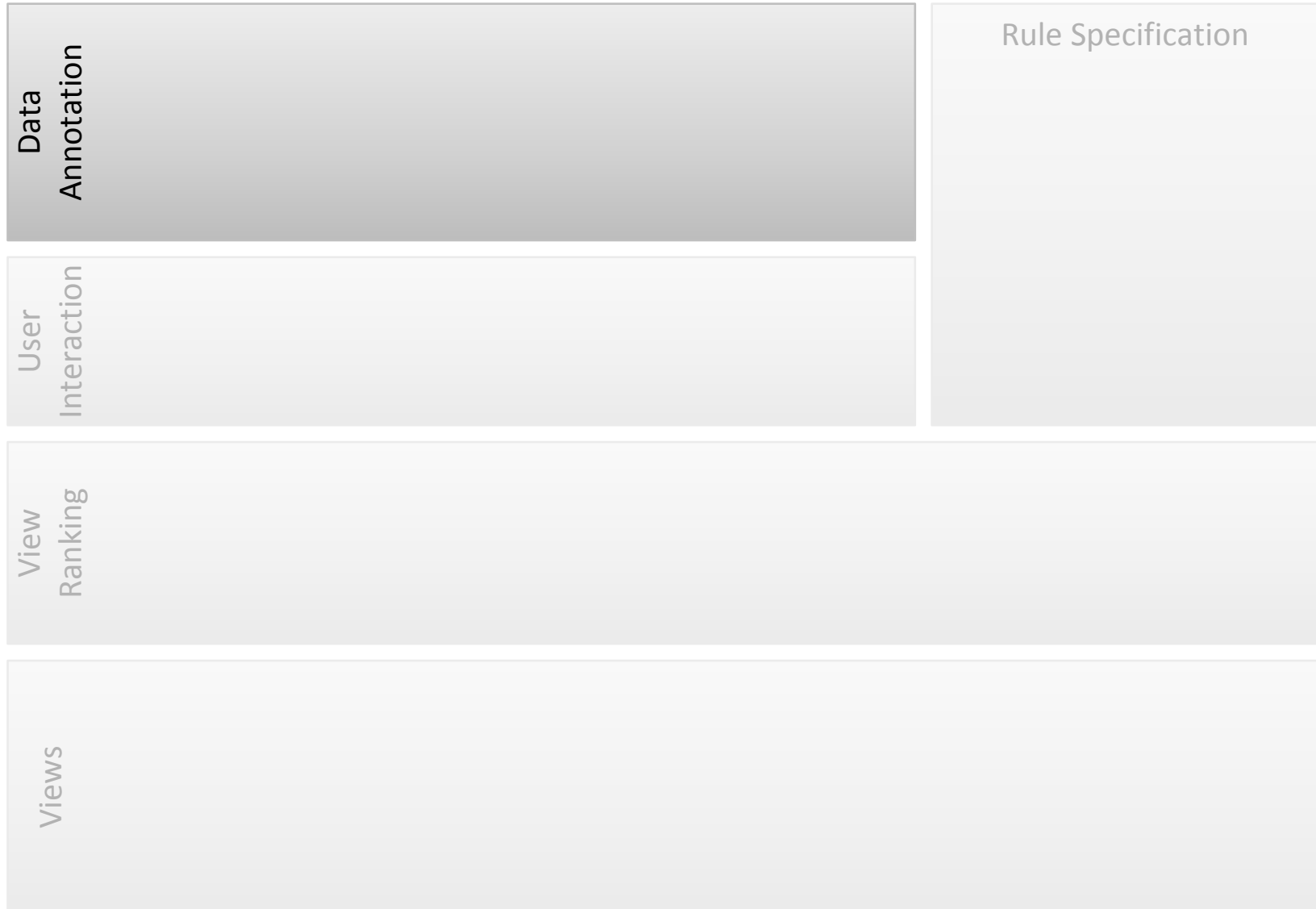
- Menues, panels, and toolbars are artificial and unfamiliar constructs (a lightbox has no menu)
- Images should be central, radiologists know how to interpret them
- Usefulness of individual views depends on the context

**Approach:** avoid additional scaffolding – the image itself becomes the user interface

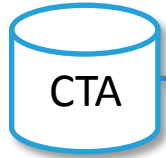
# Smart Views (1)



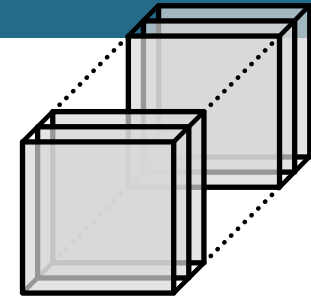
# Smart Views (2)



# Data Annotation (1)



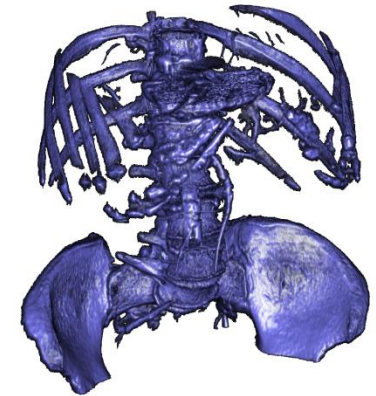
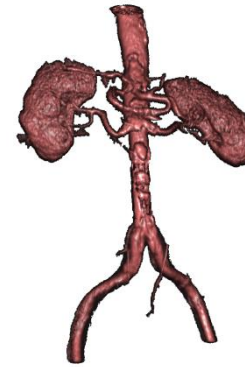
- Computed Tomography Angiography
- Contrast agent for vessel enhancement
- Data set consists of slice images



512 x 512 x 1500

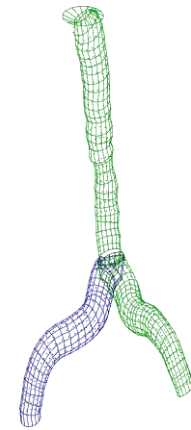
Mask  
Information

- Vessel & bone masks
- Defined by radiological assistants



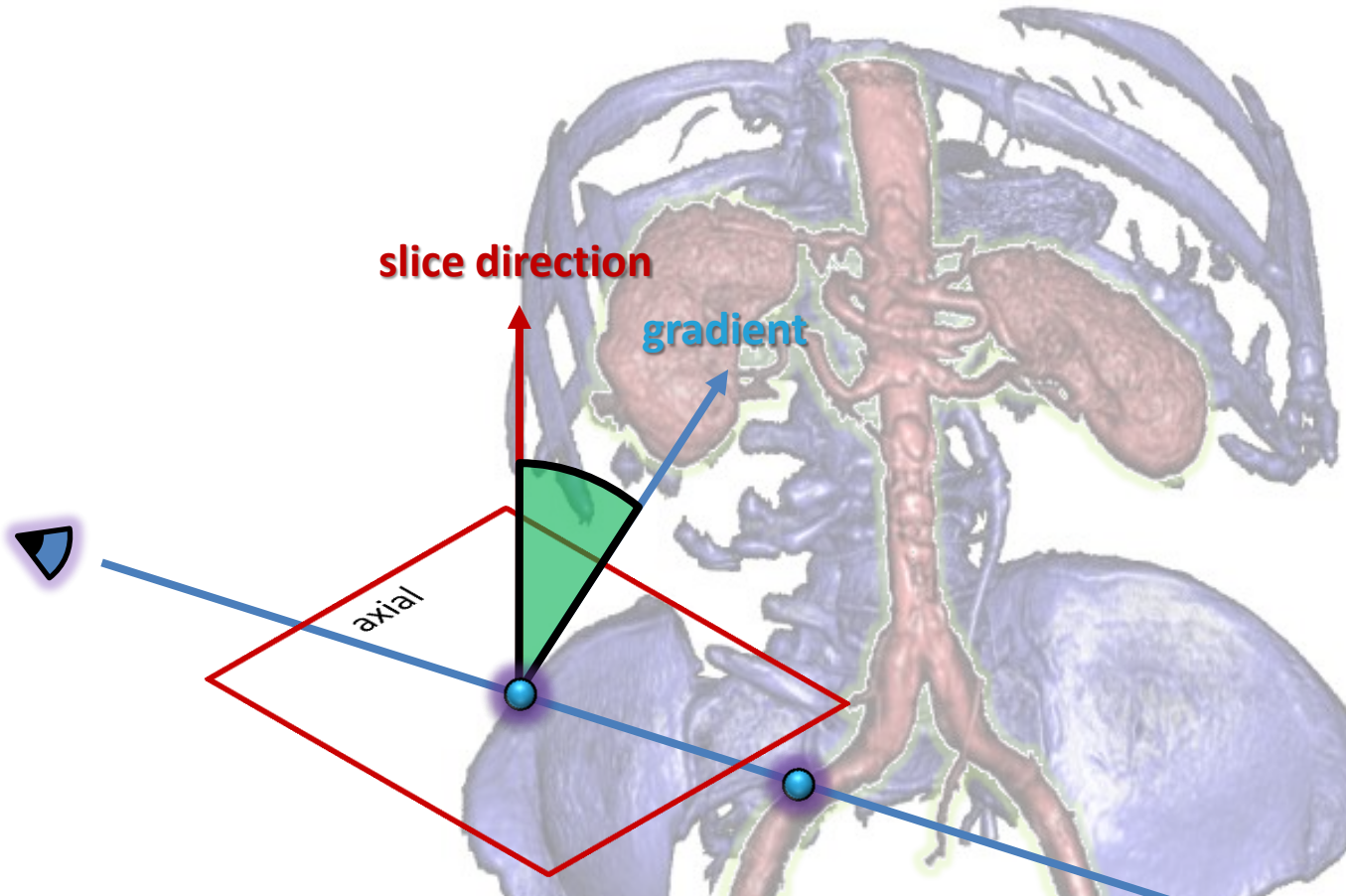
Vessel Tree  
Information

- Acyclic graph
- Edges are segments between branchings
- Segments can be selected
- Defined by radiological assistants





# Data Annotation (2)


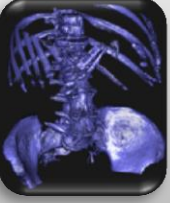
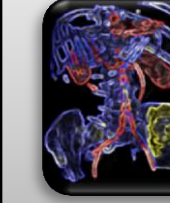
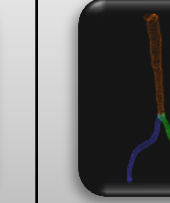


if  $\text{dot}(\text{gradient}, \text{direction}) = 0$   
 $\Rightarrow$  gradient lies in slice plane  
 $\Rightarrow$  slice is highly relevant

Store depth of first hit with masks  
 $\Rightarrow$  vessel mask depth layer  
 $\Rightarrow$  bone mask depth layer

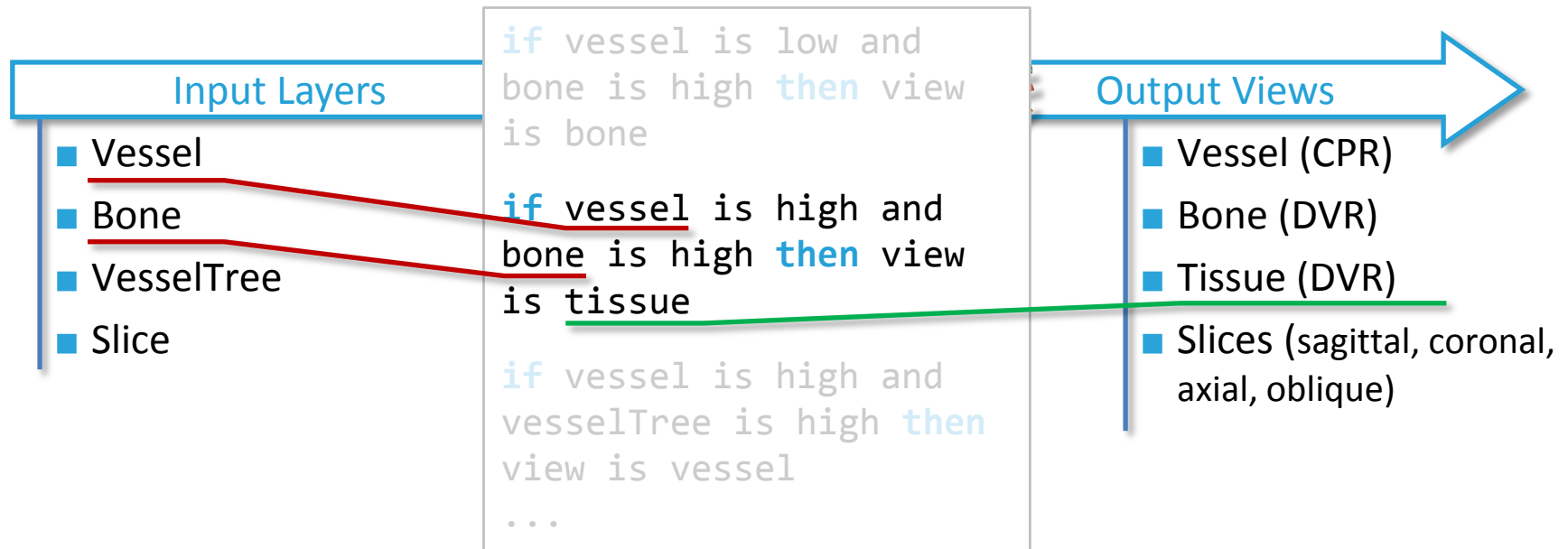
# Smart Views (3)



Data Annotation	Vessel Layer 	Bone Layer 	Slice Layer 	Vessel Tree Layer 	Rule Specification
User Interaction					
View Ranking					
Views					

# Rule Specification (1)

- Relations between input and output
- User-defined rules
- If-then clauses





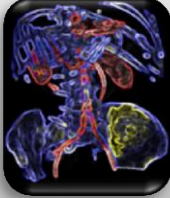
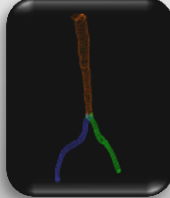
# Rule Specification (2)



- Rules stored in an external file
- Adapted to specific demands of users
- Defined by domain experts
- Flexible extension by adding new rules
- Human readable form

# Smart Views (4)

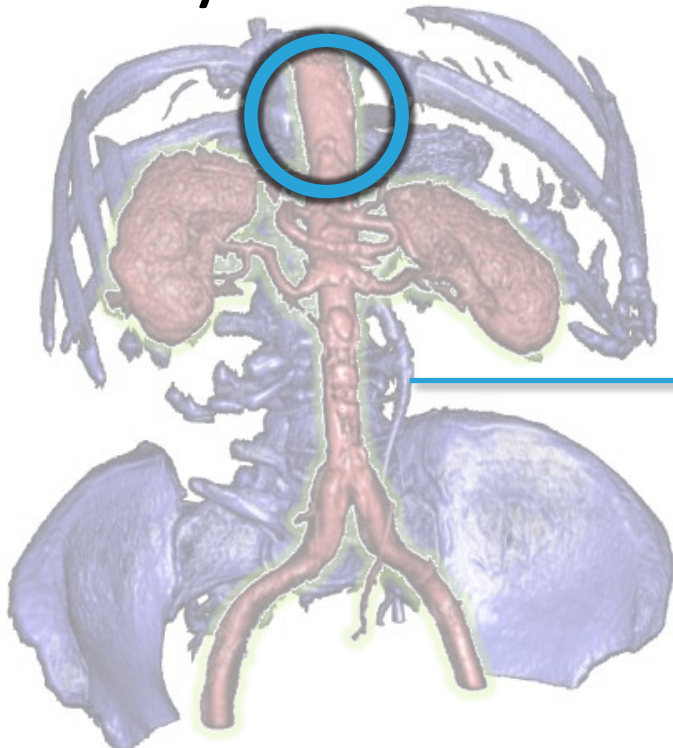


Data Annotation	Vessel Layer 	Bone Layer 	Slice Layer 	Vessel Tree Layer 	Rule Specification  If bone then use DVR If vessel then use CPR If tissue then use DVR
User Interaction					
View Ranking					
Views					

# User Interaction

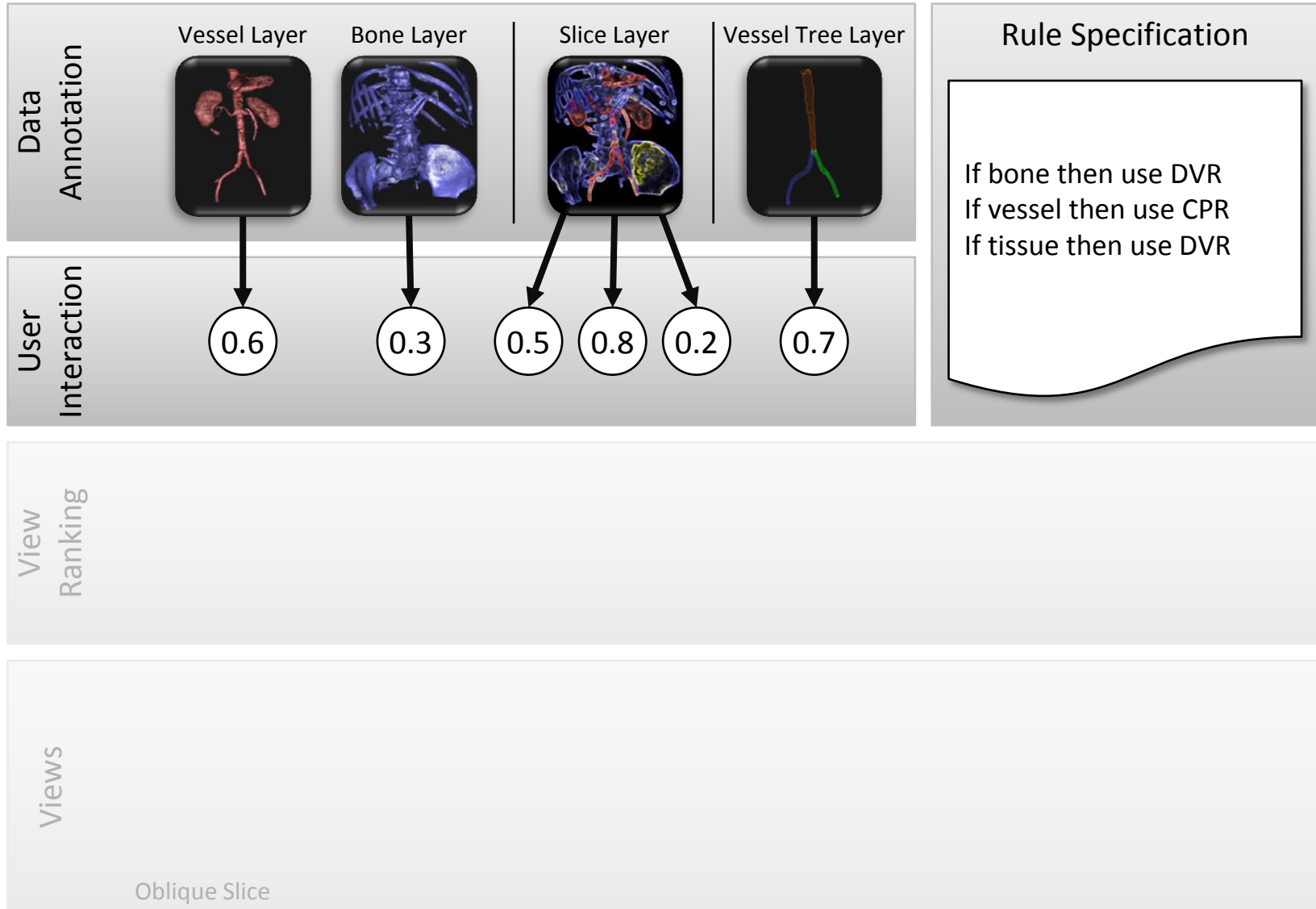


- User defines a ROI by moving the mouse
- Compute input values for all variables
- Layers are used inside the ROI



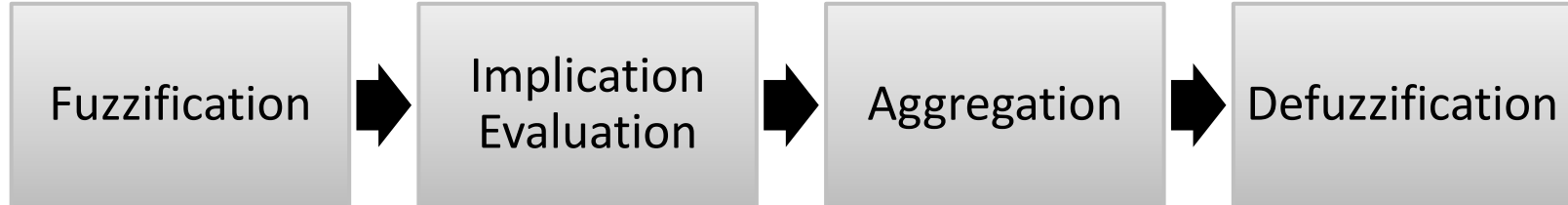
- One value for every input variable
- Sum over all pixels inside the ROI
- Pixels weighted with distance to center
- Specific layers for input variables

# Smart Views (5)



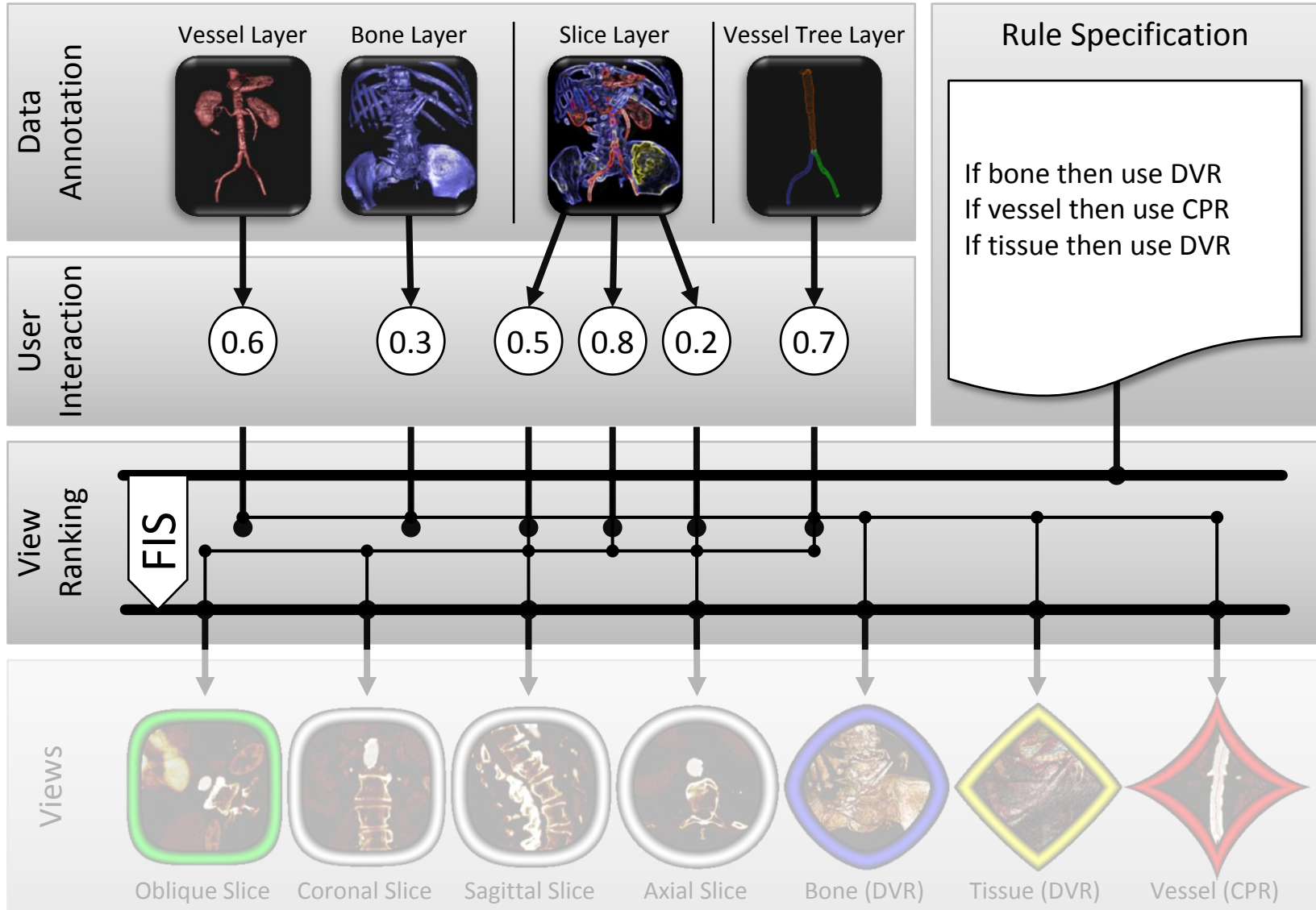
# View Ranking

- Fuzzy logic for the inference system
  - ⇒ Fuzzy Inference System
  - ⇒ Fuzzy rules specified by domain experts

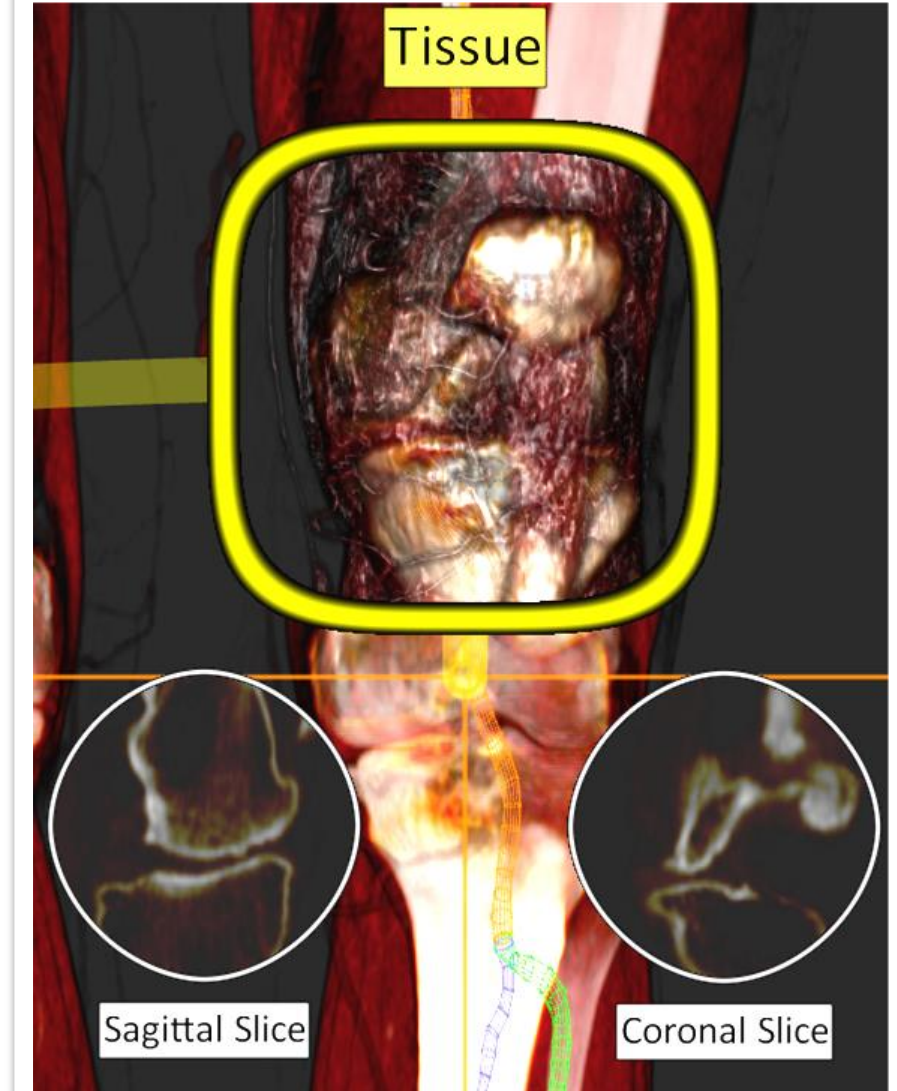




# Smart Views (6)



# Integrated Smart Views



# Demostration



# What's Next?



- Adaptive rule base: smart systems should become smarter over time
- Incorporate mechanisms to capture data about the success and failure of an operation
- Employ machine learning methods to improve the system based on user actions
- Use acquired information for goal-directed exploration of the algorithm space

# Conclusion



- Smart visualization means using the right tool (algorithm) for the job (task)
- Knowledge about both task and algorithm behavior is essential

**Challenge:** acquire and use this knowledge in a systematic manner

**Acknowledgements:** Gabriel Mistelbauer, Rüdiger Schernthaner, Ivan Baclija, Arnold Köchl, Milos Srámek, Armin Kanitsar, M. Eduard Gröller

Smart Visualization in Medicine

**THANK YOU FOR YOUR  
ATTENTION**

