

# Exploring Data in VR: Opportunities and Challenges



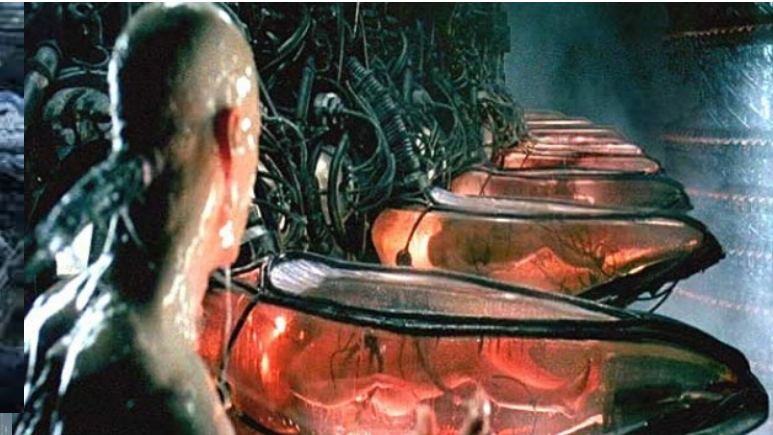
**Andreas “Andi” Bueckle, Ph.D.**  
**Research Lead**

*Cyberinfrastructure for Network Science Center  
Department of Intelligent Systems Engineering  
Luddy School of Informatics, Computing, and Engineering  
Indiana University, Bloomington, IN, USA*



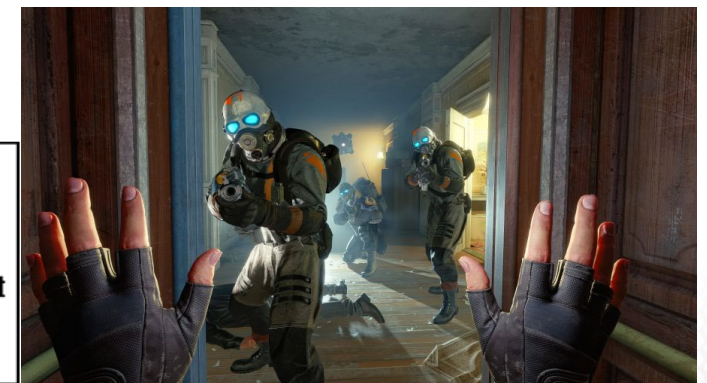
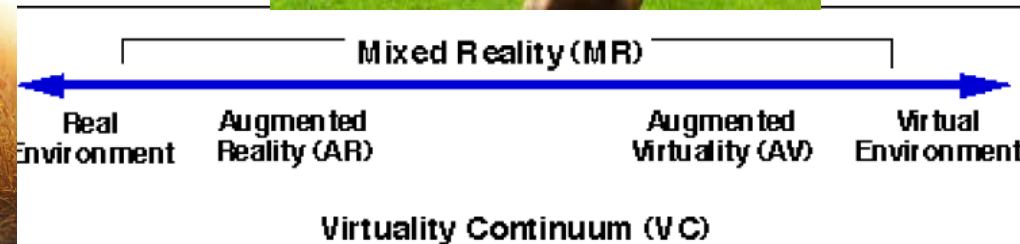
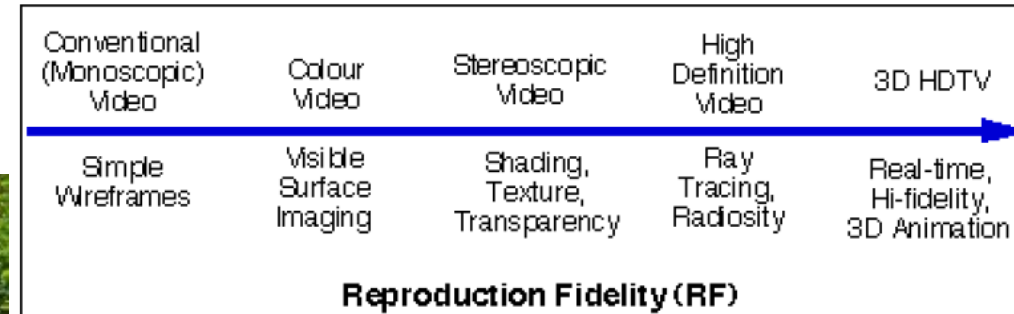
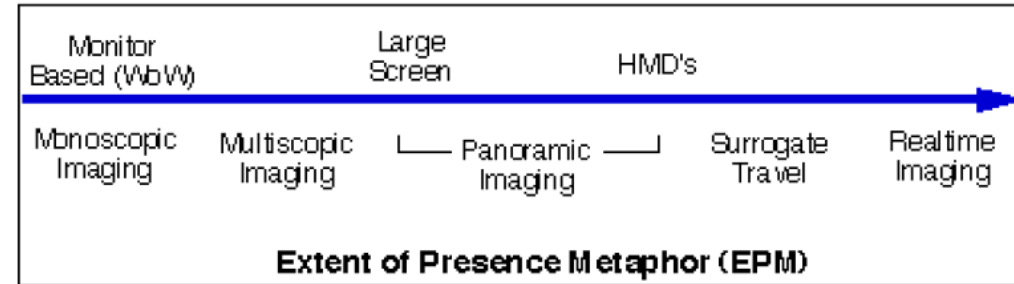
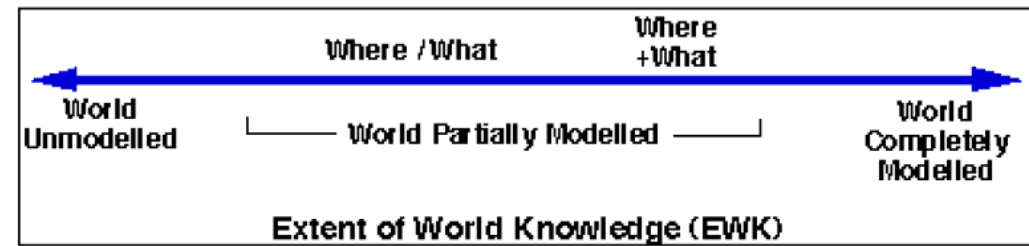
# A Note on Nomenclature

- Virtual reality, augmented reality, mixed reality, hybrid reality – what does it all mean?



# The Reality-Virtuality Continuum

- Milgram & Kishino (1994) proposed a spectrum to describe the **reality-virtuality continuum**
- Along three dimensions
  - Extent of World Knowledge (EWK)
  - Extent of Presence Metaphor (EPM)
  - Reproduction Fidelity (RF)





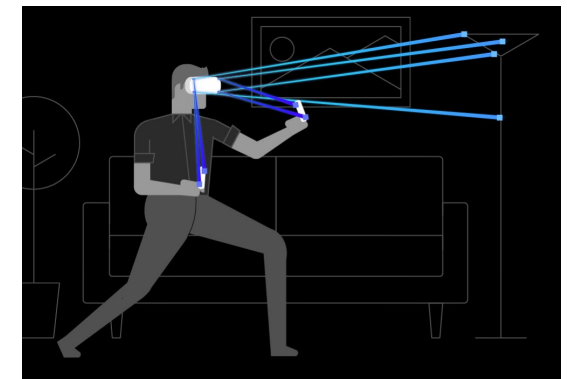
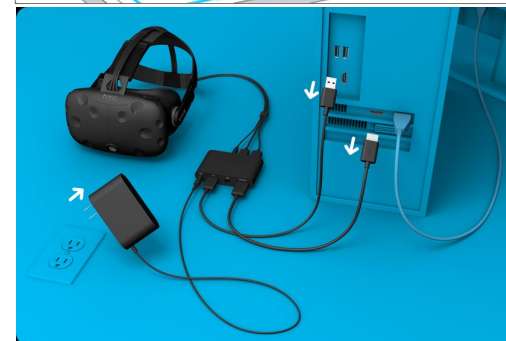
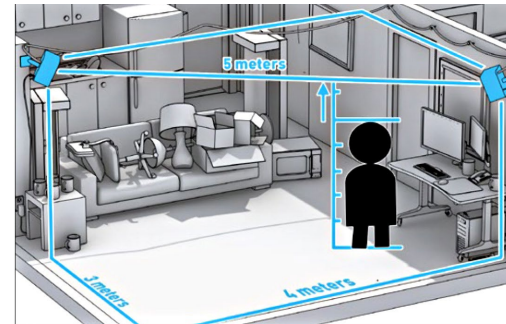
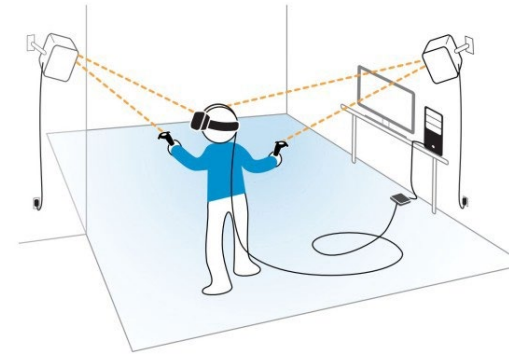
# What We Mean by “VR” in This Talk





# Introduction

- Recent rise of consumer-grade VR
- Many options
  - price
  - resolution
  - field of view
  - size
  - Tracking
- Content delivery platforms
  - Steam
  - Oculus Store
  - WebXR (browser)



HTC Vive

Oculus Quest 2



# Vision...



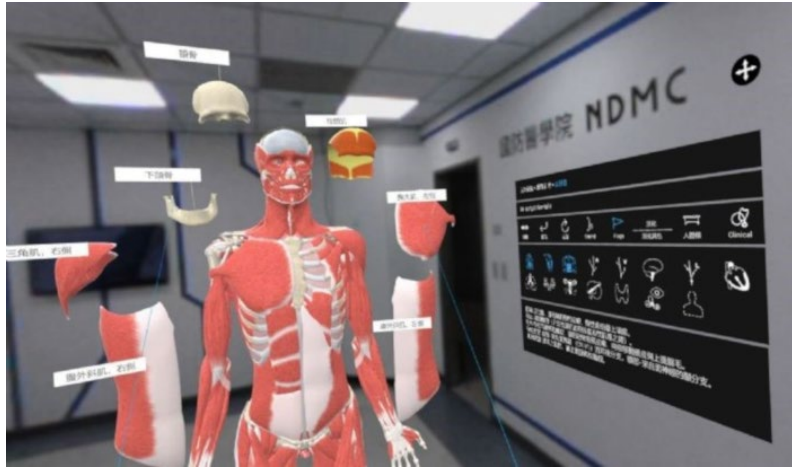
[https://www.reddit.com/r/Thatsabooklight/comments/kf2ve0/the\\_medical\\_infusion\\_devices\\_center\\_background/](https://www.reddit.com/r/Thatsabooklight/comments/kf2ve0/the_medical_infusion_devices_center_background/)



<https://medcitynews.com/2019/09/the-benefits-of-ar-in-healthcare/>



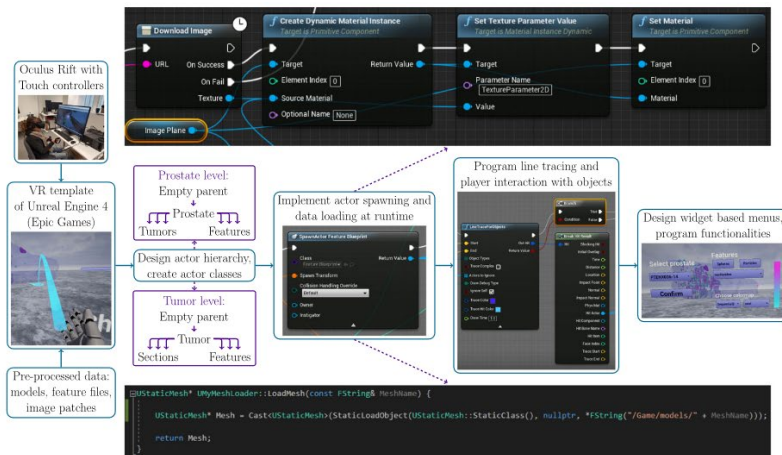
# ...and Reality



<https://www.mobihealthnews.com/news/asia/ndmc-partners-htc-deepq-build-largest-mr-anatomy-classroom-taiwan>



[https://cgvr.cs.uni-bremen.de/research/atlas\\_19/](https://cgvr.cs.uni-bremen.de/research/atlas_19/)

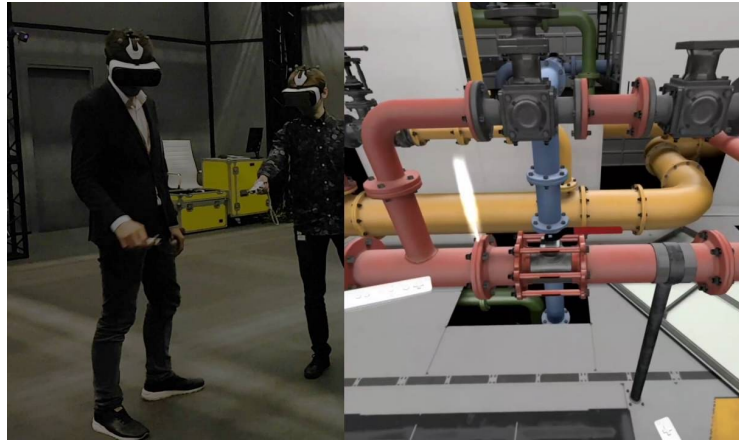


**Fig. 3** VR implementation steps illustrated. The example on top shows how images (cropped serial sections) are loaded with Blueprint nodes. The example in bottom is the C++ function used for loading meshes

Liimatainen, Kaisa, Leena Latonen, Masi Valkonen, Kimmo Kartasalo, and Pekka Ruusuvoori. "Virtual Reality for 3D Histology: Multi-Scale Visualization of Organs with Interactive Feature Exploration." *BMC Cancer* 21, no. 1 (December 2021): 1133. <https://doi.org/10.1186/s12885-021-08542-9>.

# Use Cases

- Training
  - Vehicles
  - Machines
  - HUDs
  - Mission planning
  - Studying information processing and overload
- Tactical Augmented Reality (TAR)
  - Enhance what is already there
- Measuring and timing movement and interaction between user and environment



<https://www.youtube.com/watch?v=0NormS9SLOW>



<https://www.airforcetimes.com/news/your-air-force/2019/10/08/academy-brings-vr-pilot-training-to-cadets/>



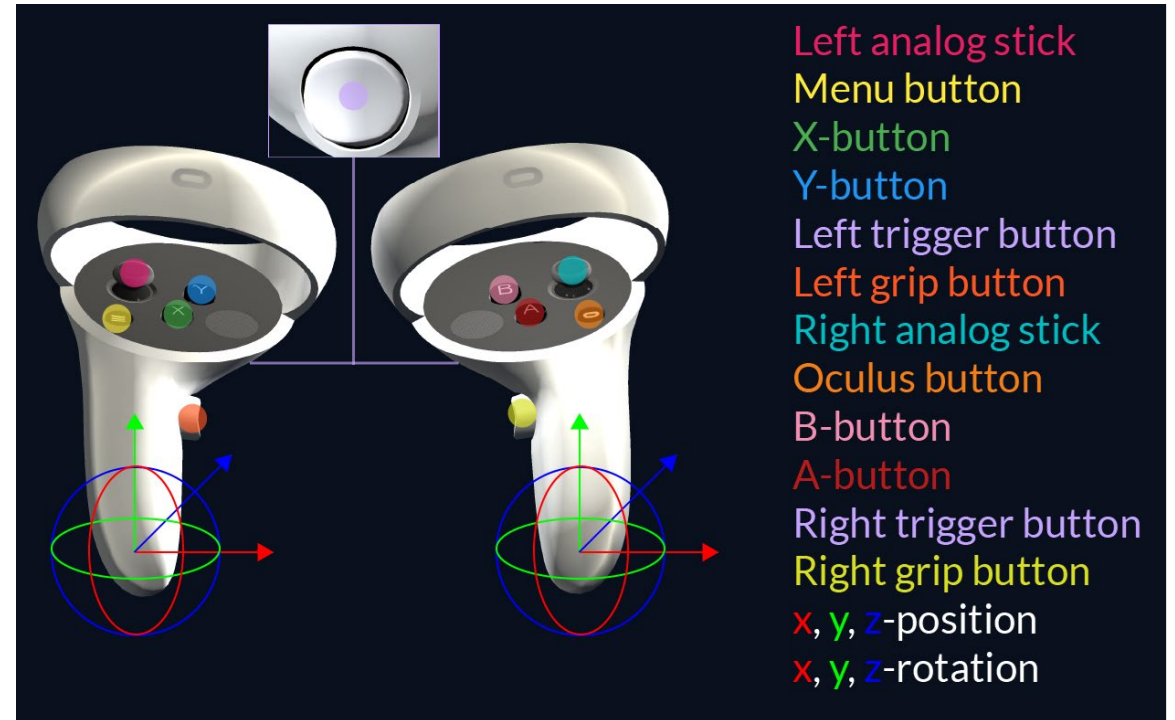
<https://www.roadtovr.com/iti-vr-crane-training-simulator-test/>



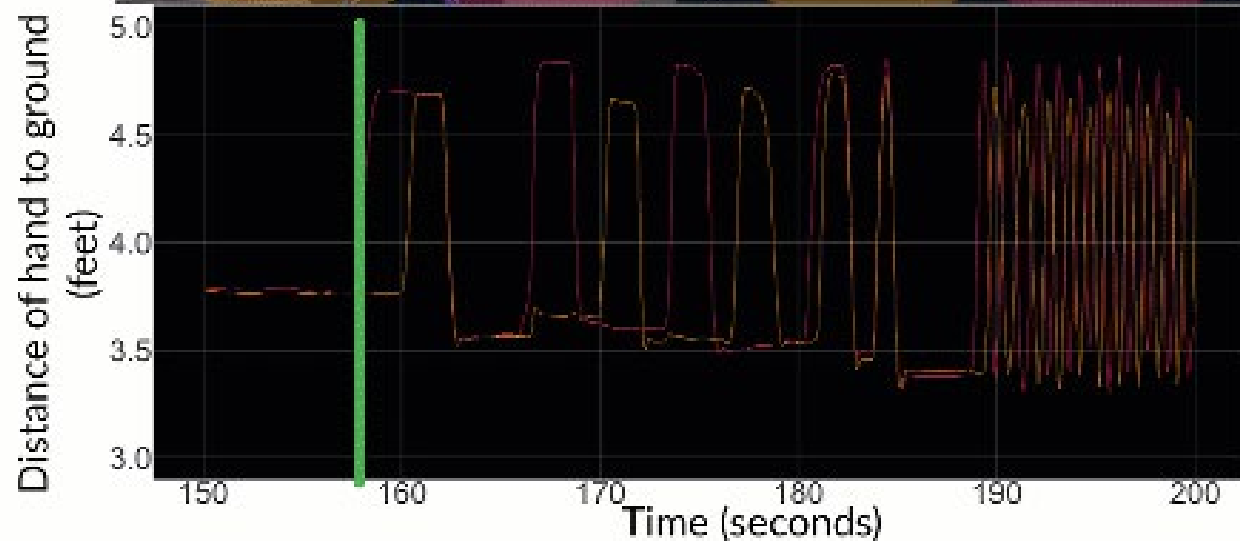
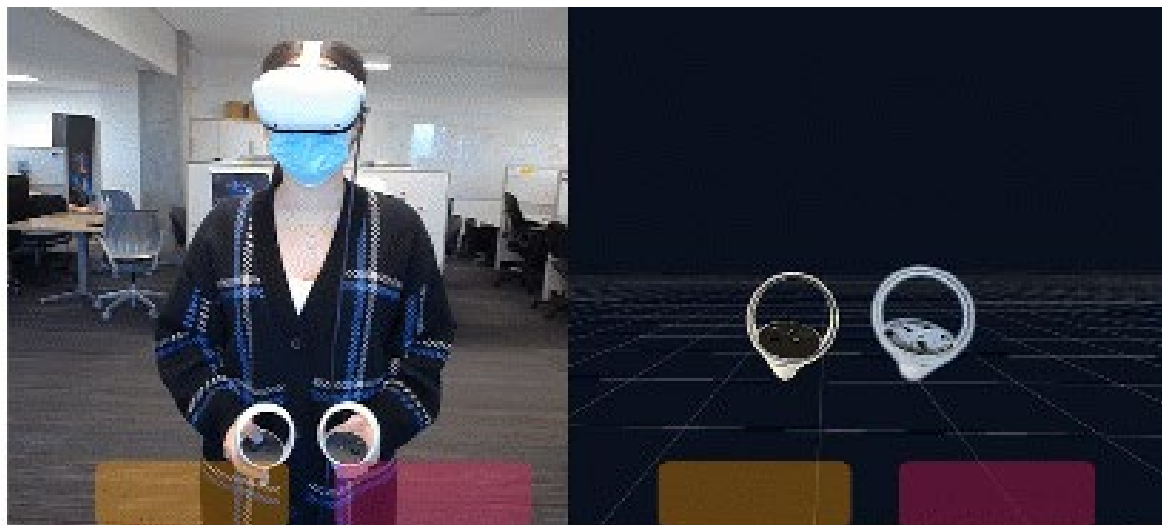
# Input devices



Left mouse button  
Right mouse button  
Middle mouse button/wheel  
x, y-position



Left analog stick  
Menu button  
X-button  
Y-button  
Left trigger button  
Left grip button  
Right analog stick  
Oculus button  
B-button  
A-button  
Right trigger button  
Right grip button  
x, y, z-position  
x, y, z-rotation



Tag		Untagged		Layer		Default	
Transform							
Position	X	-0.12334	Y	0.770906	Z	0.160071	
Rotation	X	23.184	Y	15.435	Z	14.053	
Scale	X	1	Y	1	Z	1	
XR Controller (Action-based)							

elapsedTime	ControllerLeftPosY	ControllerRightPosY
146.7885	1.145622	1.145195
146.9156	1.146054	1.145453
147.0404	1.146554	1.145594
147.166	1.146521	1.145718
147.2754	1.146712	1.146041
147.4028	1.147	1.146333
147.5262	1.147393	1.146196
147.6518	1.149418	1.146329
147.7639	1.150053	1.146693
147.8906	1.150788	1.146913
148.0158	1.150822	1.146652
148.1395	1.150867	1.147119
148.2646	1.1518	1.147748

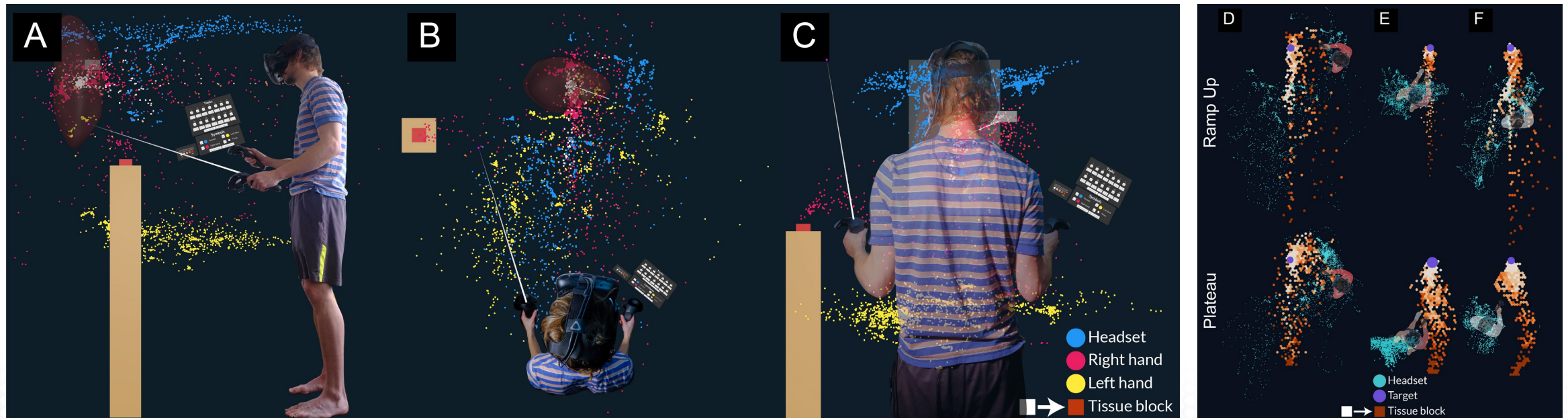


# Where is the Data?

# Data Visualization in VR: Vision

“Visual data exploration seeks to integrate humans in the data exploration process, applying their perceptual abilities [...]. The basic idea is to present the data in some visual form, allowing data analysts to [...] interact with it.” (Keim, 2001)

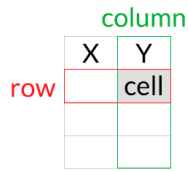
- Symbiosis of computers and humans
- Visualization is for humans only
- Many formalizations for making, interpreting, and teaching data visualization



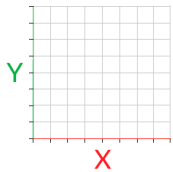


# Data Visualization Literacy Framework

**Table**  
columns by rows



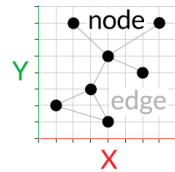
**Graph**  
x-y coordinates



**Map**  
latitude/longitude



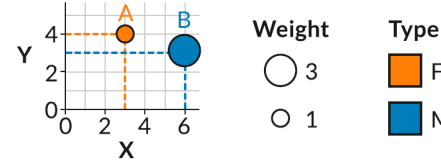
**Network**  
local similarity



Data Scales	Logical Math Operations				Measure of Central Tendency	Examples
	= ≠	< >	+ -	x ÷		
Nominal	✓				mode	🏠 🌲 🚗
Ordinal	✓	✓			median	😊 😐 😞
Interval	✓	✓	✓		arithmetic mean	0-6 7-12 13-18
Ratio	✓	✓	✓	✓	geometric mean	0 1 2 3

	Outlier	Trend	Clustering
Position			
Size			
Color			

Label	X	Y	Weight	Type
A	3	4	1	F
B	6	3	3	M



Qualitative		Quantitative	
Categorical	Sequential	Diverging	Cyclic

		Geometric Symbols		Linguistic Symbols	Pictorial Symbols			
		Point	Line					
Spatial	Position	X						
	Y							
Retinal	From	Size			Text Text Text			
		Shape			Text Text Text			
	Color	Value			Text Text Text			
		Hue			Text Text Text			
		Saturation			Text Text Text			
	Texture	Granularity						
		Pattern						
	Optics	Blur			Text Text Text			
	Motion	Speed						

Börner, Katy, Andreas Bueckle, and Michael Ginda. "Data Visualization Literacy: Definitions, Conceptual Frameworks, Exercises, and Assessments." *Proceedings of the National Academy of Sciences* 116, no. 6 (2019): 1857-64. <https://doi.org/10.1073/pnas.1807180116>.

# Perceptual Challenges for vis in VR

- 2D is simplicity
- VR is 3D by nature
- Occlusion
  - Depth cue -> limits what we can see in 3D
  - We experience the world in 2.05D (Munzner, 2014; Ware, 2008)
- Foreshortening
  - Shows size difference where there should be none
- 3D costs time and cognitive effort
  - No 3D as purely aesthetic choice! (Few, 2012)

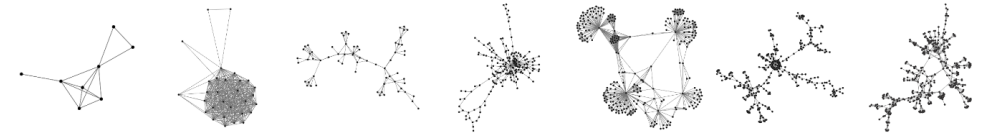
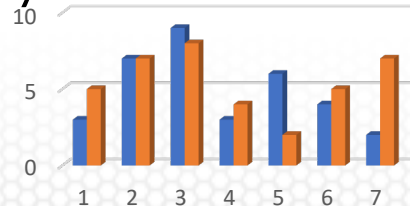
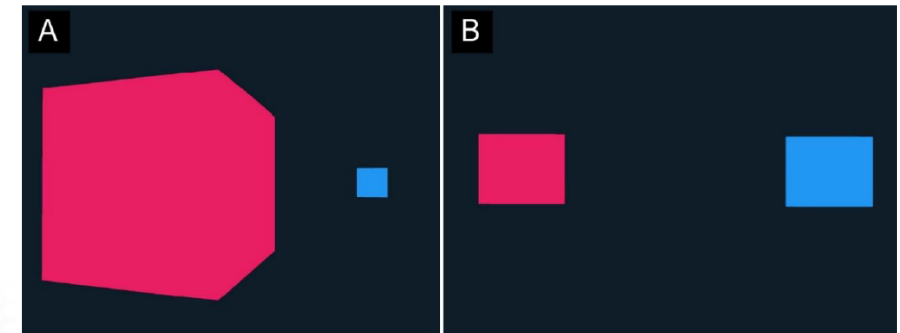
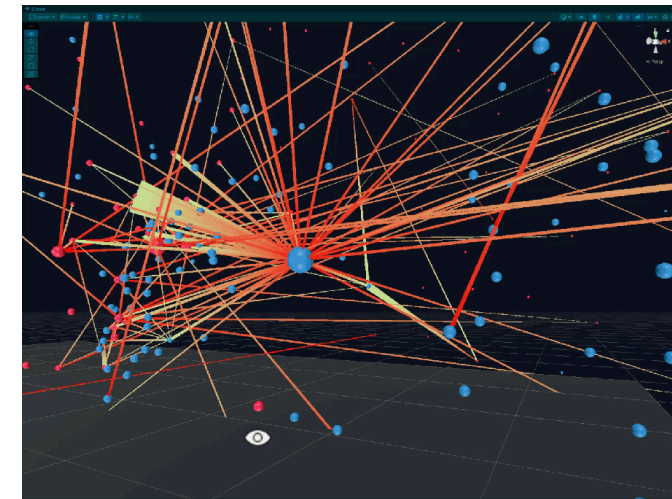


Figure 13. A visualization of each network layout, using the GEM layout.

From (Zoss, 2018)

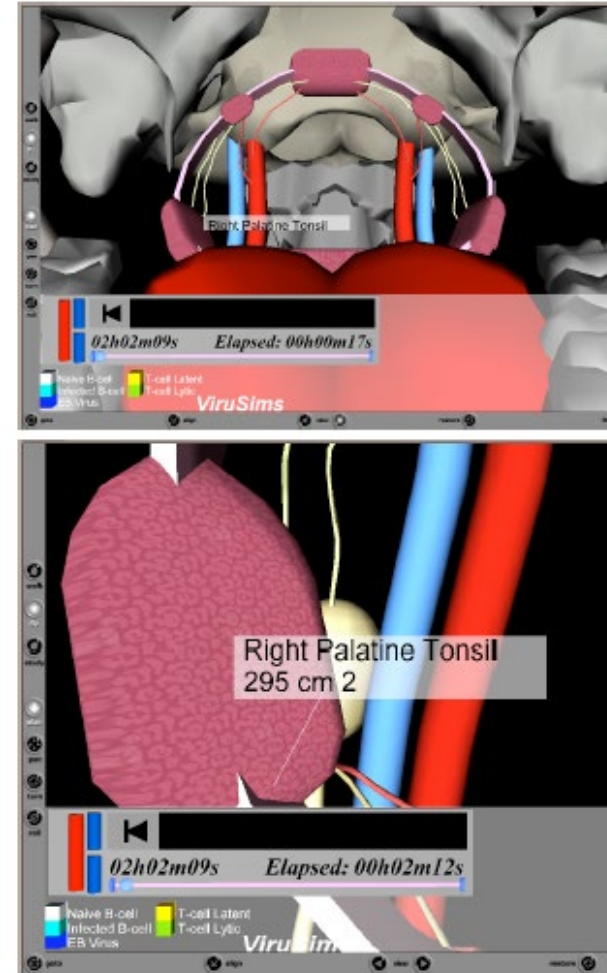


From (Bueckle, 2021)

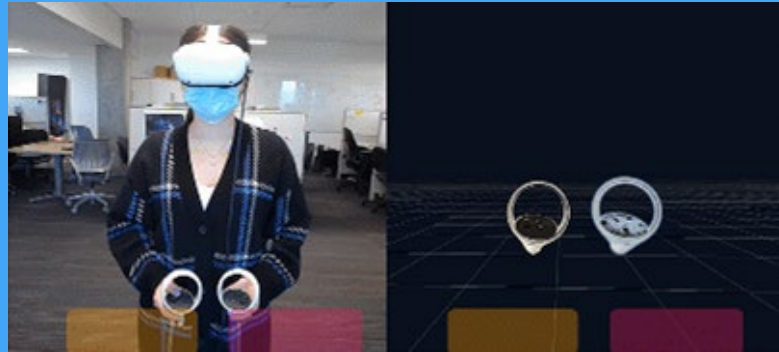


# Information-Rich Virtual Environments (IRVE)

- “An information-rich virtual environment (IRVE) is a realistic VE that is enhanced with the addition of related abstract information.”
- Bowman, Doug A, Chris North, Jian Chen, Nicholas F Polys, Pardha S Pyla, and Umur Yilmaz. “Information-Rich Virtual Environments: Theory, Tools, and Research Agenda,” 81–90. New York City, NY: ACM, 2003. <https://doi.org/10.1145/1008653.1008669>.



# Project 1: Optimizing Movement in VR



We can show someone in VR visualizations of their own movement data. Then maybe they can learn from it.

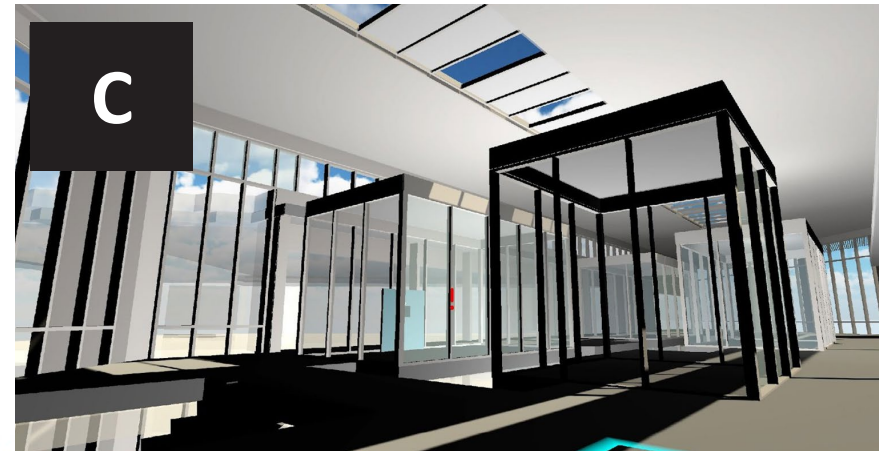
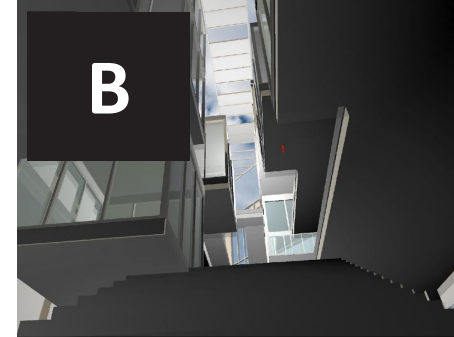
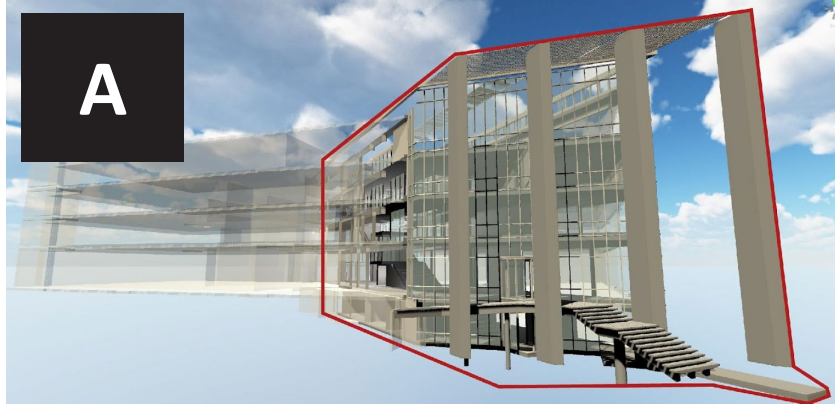


In a recent paper, we asked people to travel through a virtual building as fast as possible.

We wanted to check if they can beat their own time in a 2<sup>nd</sup> trial after having seen a visualization of their own movement.



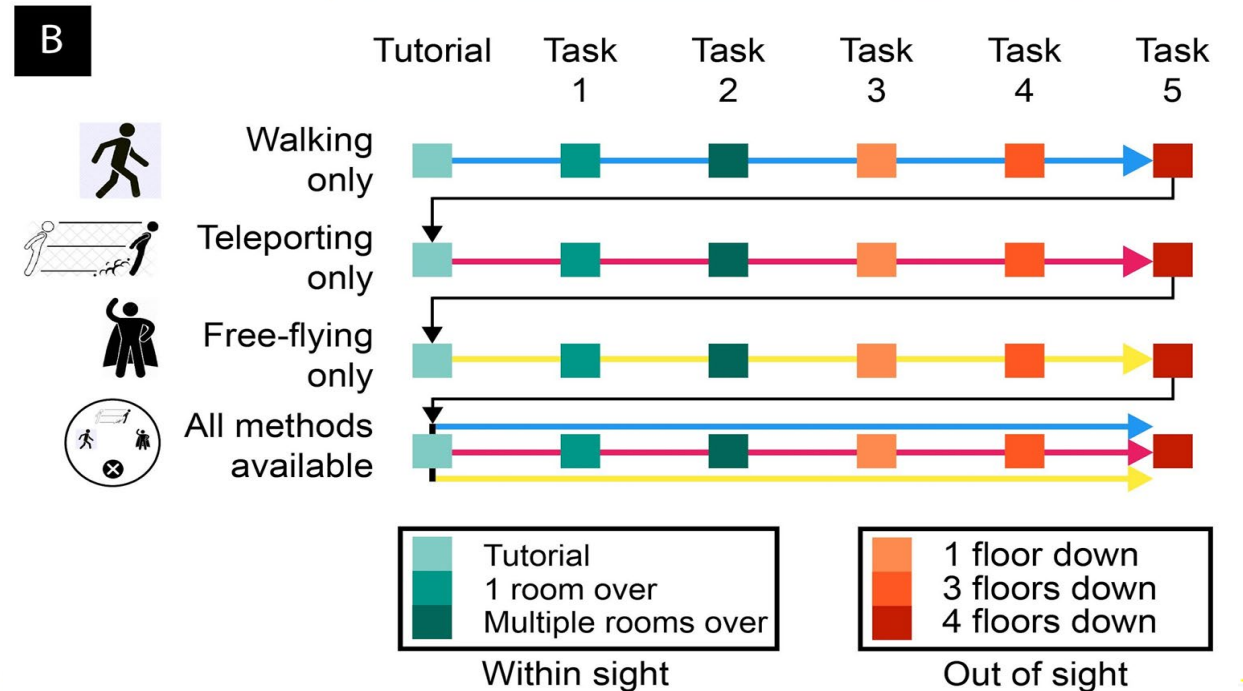
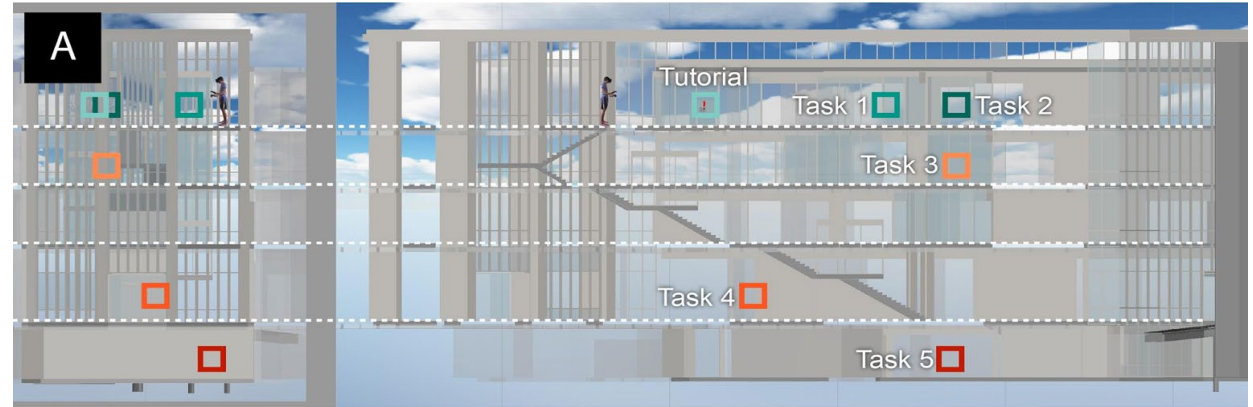
# Study design



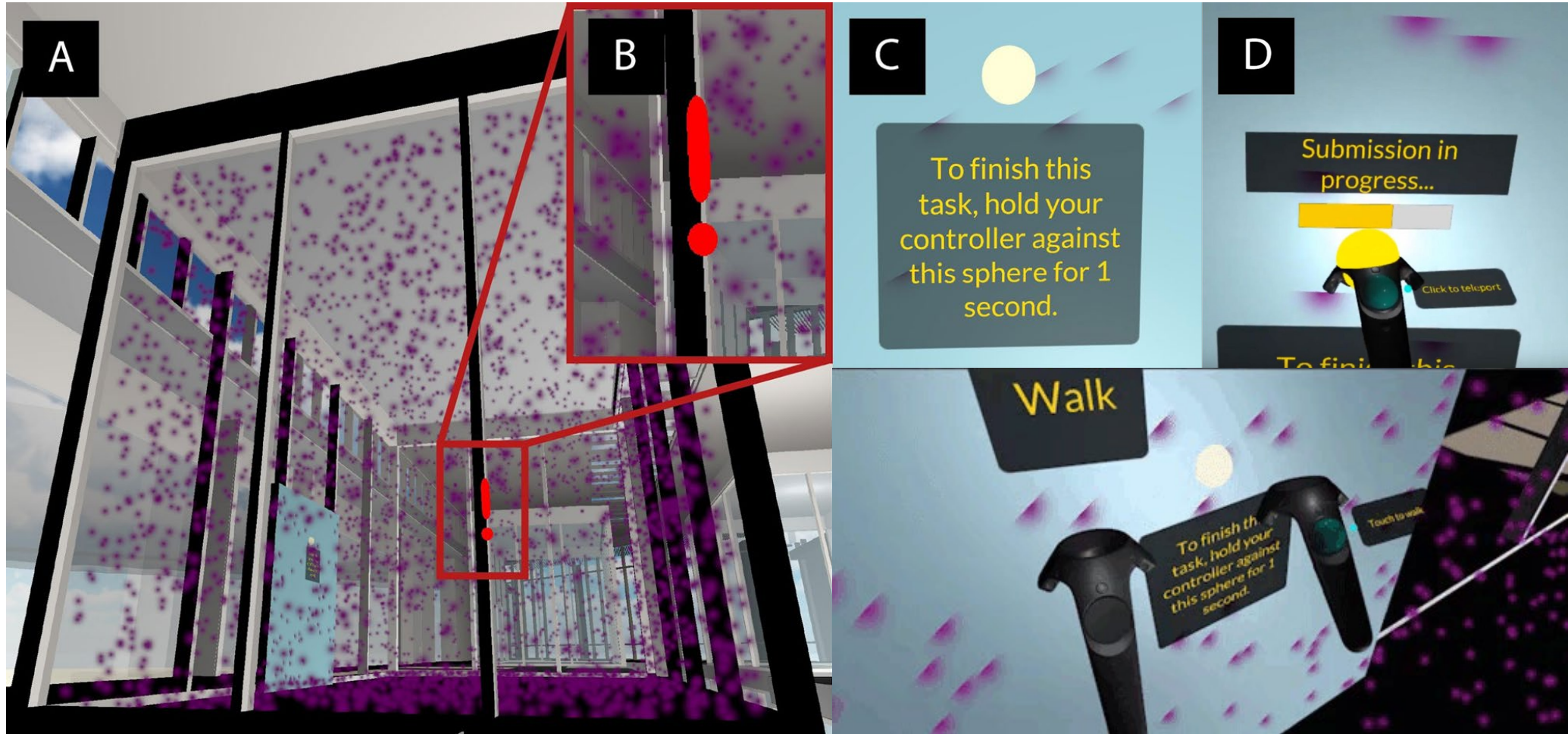


# Study overview

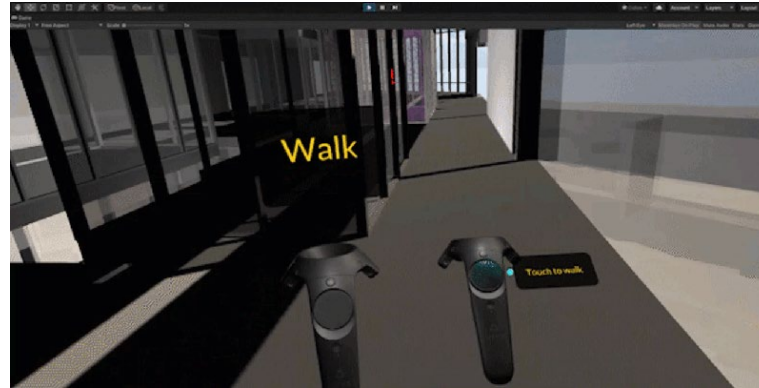
- 4 x 6 tasks
- 1<sup>st</sup> task is practice
- Movement methods
- Tasks get harder



# Study overview (cont'd)



# Movement methods



 Walking



 Teleport

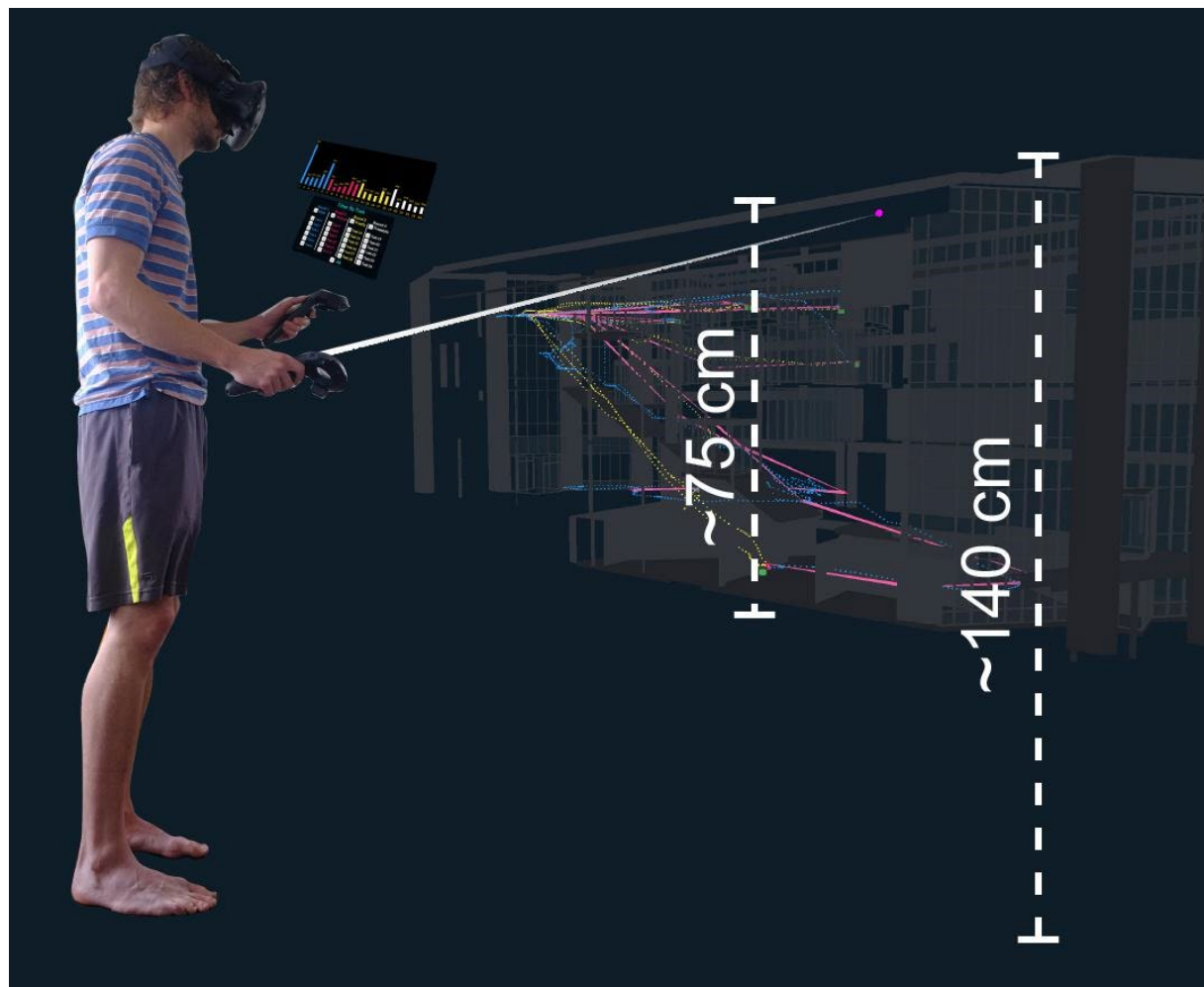


 Free-fly

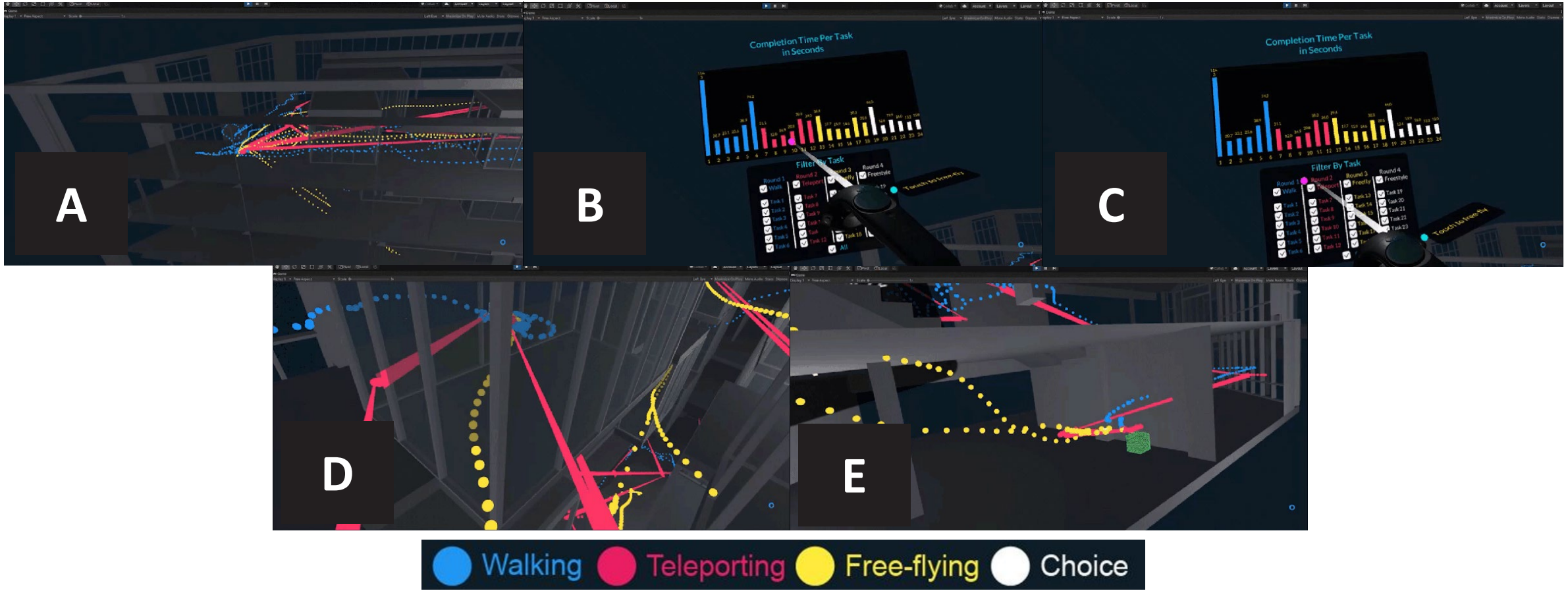


Choice between all 3





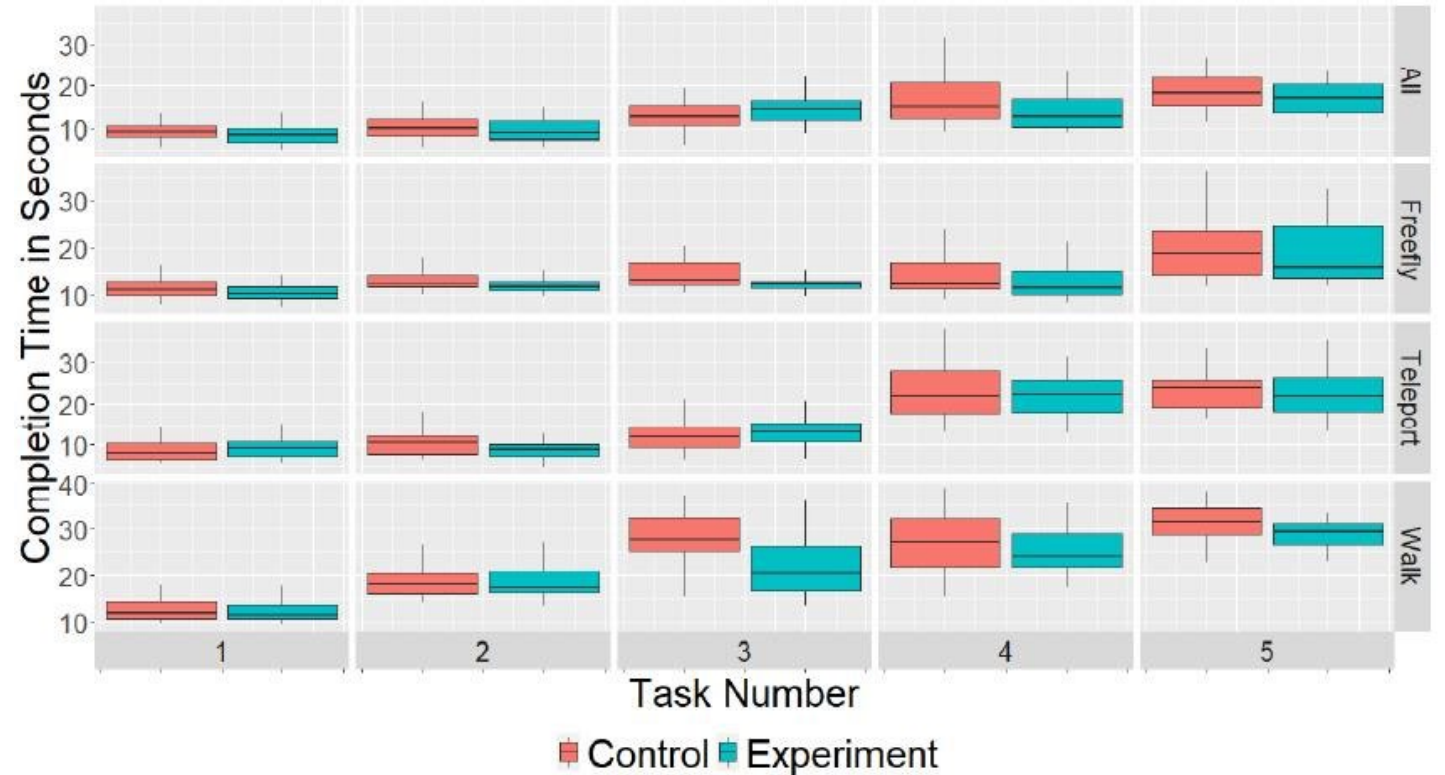
# Data is beautiful



## Did it work?

- Yes!
- People who saw their own data were faster by 1 second:
  - $m_{\text{control}} = 16.44 \text{ s}$
  - $m_{\text{experiment}} = 15.44 \text{ s}$

$(t = 2.465, p = 0.01383)$  ✓



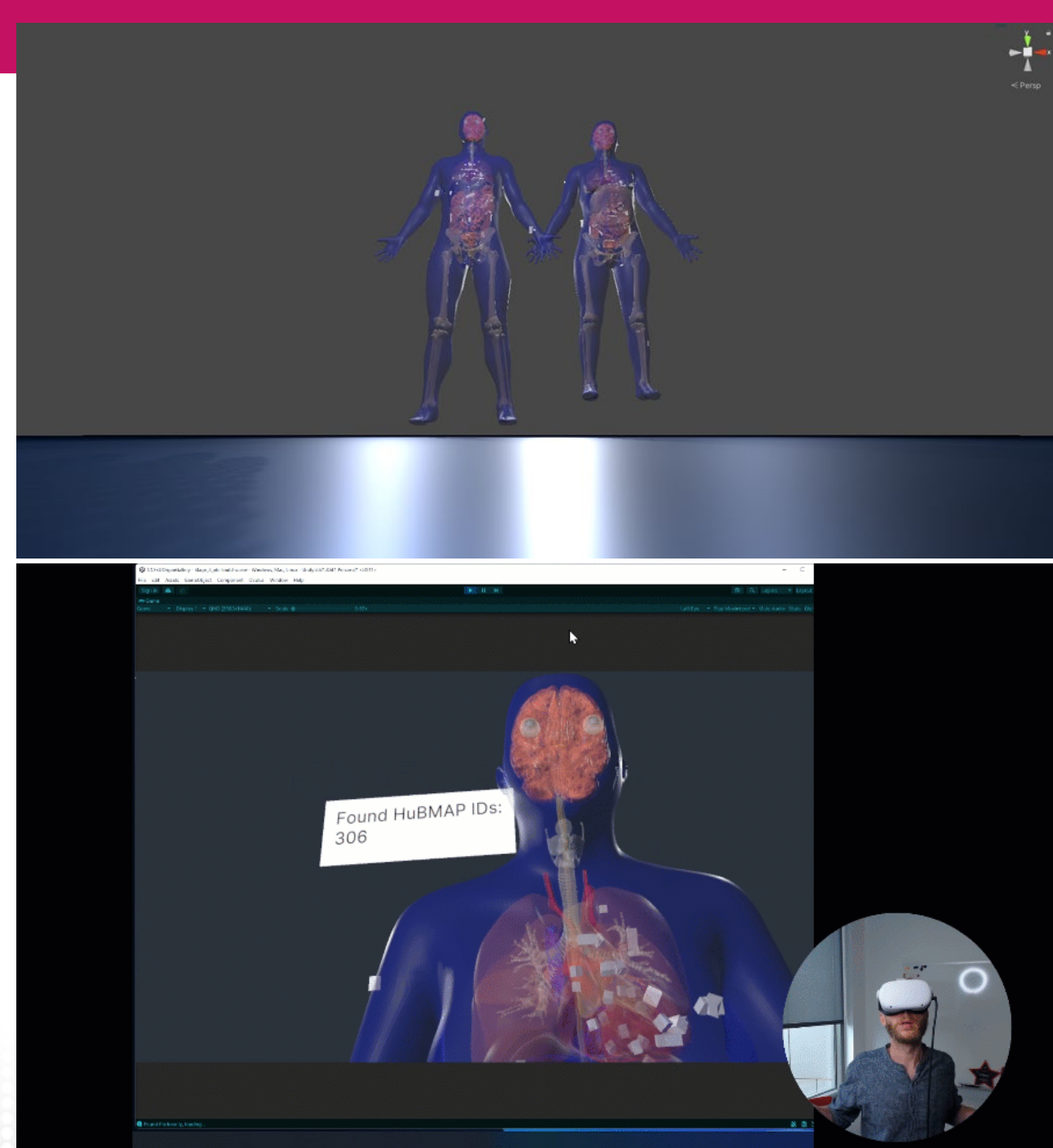


# Project 2: The Common Coordinate Framework (CCF) Organ VR Gallery

Also called the “Human Reference Atlas in 3D VR”

# The CCF Organ VR Gallery

- Human BioMolecular Atlas Program (HuBMAP) and other single-cell mapping efforts
- Integrates 3 data types for human tissue:
  - **Spatial**
  - **Biological structure**
  - Specimen/clinical metadata (not covered in this talk)
- Code: <https://github.com/cns-iu/ccf-organ-vr-gallery>
- Preprint: Bueckle, Andreas, Kristen M Browne, Bruce W Herr II, and Katy Börner. "The Common Coordinate Framework (CCF) Organ VR Gallery." OSF, January 12, 2022. <https://doi.org/10.31219/osf.io/z9gm3>.



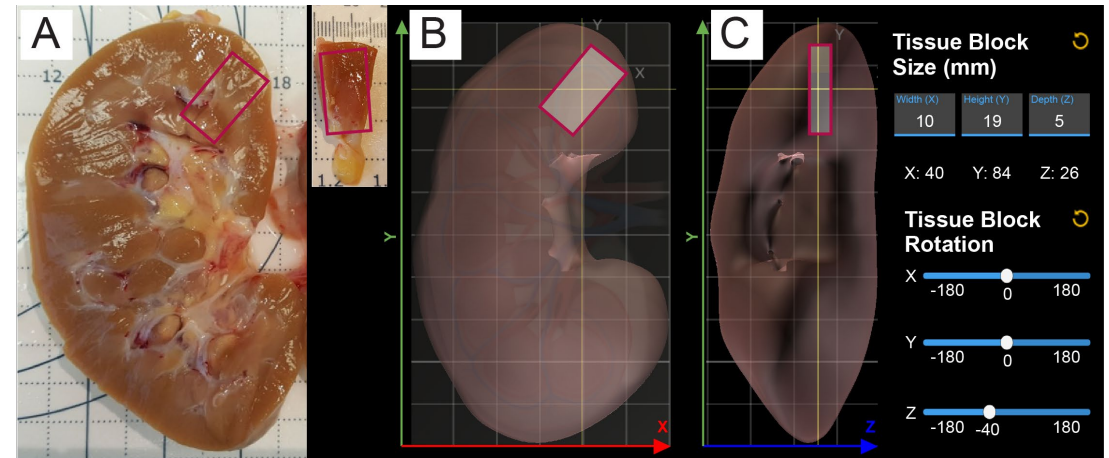
# Spatial Data

Warning: graphical image of a kidney coming up!



# The Meat of the Matter

- Documenting tissue extraction sites is non-trivial
- Photos of reference organs (if available) on cutting boards with spatial markers
- We used the Visible Human male, left kidney (100 mm high, 60 mm wide, 40 mm deep)
- Spitzer, V., M. J. Ackerman, A. L. Scherzinger, and D. Whitlock. "The Visible Human Male: A Technical Report." *Journal of the American Medical Informatics Association* 3, no. 2 (March 1996): 118–30. <https://doi.org/10.1136/jamia.1996.96236280>.



# Mapping to the CCF

NATIONAL CANCER INSTITUTE BBRB Biorepositories and Biospecimen Research Branch		<b>GTEx Tissue Harvesting Work Instruction</b>	
PR-0004-W1	VER. 03.05	Effective Date: mm/dd/yyyy	Page 13 of 21

**4.3.6.20 Colon**

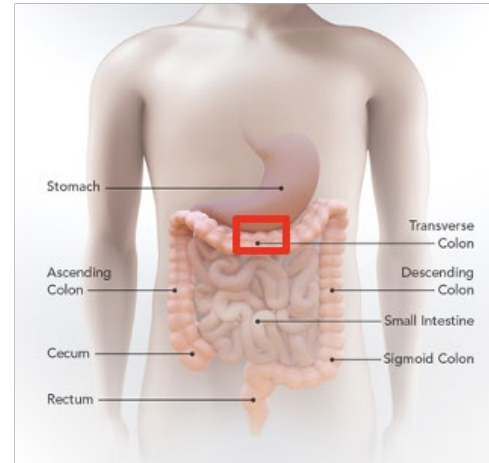
**4.3.6.20.1 Preferred Location: Transverse colon.** Gently rinse mucosa with normal saline before aliquot preparation. Aliquots should contain the full thickness of the colonic wall, i.e., **mucosa and muscularis propria**. Trim adjacent adipose tissue.

**4.3.6.20.2 Preferred Aliquot: 20 mm x 10 mm x thickness (≤4 mm),** divided into two adjacent 10 mm x 10 mm x thickness aliquots. Each cassette should contain two 10 mm x 10 mm x thickness aliquots.

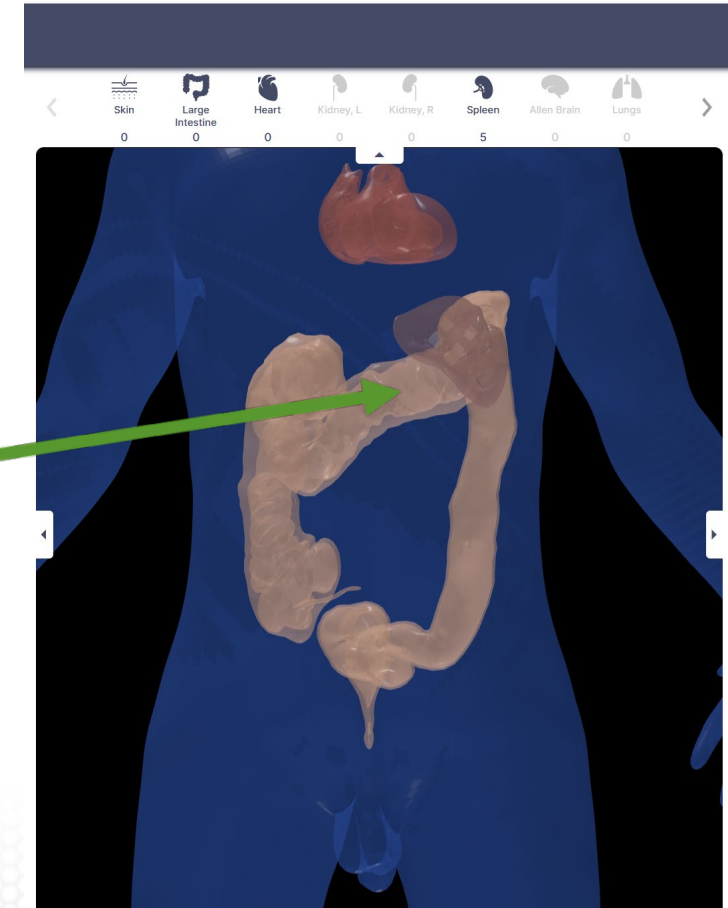
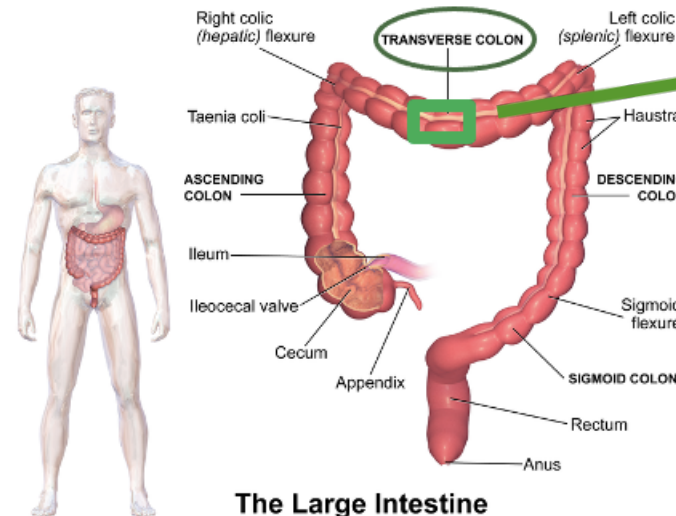
**4.3.6.20.3 Preferred Location: Sigmoid colon.** Preferred Location: Sigmoid colon. Gently rinse mucosa with normal saline before aliquot preparation. **Obtain only muscularis propria**; discard mucosa and any serosal adipose tissue.

**4.3.6.20.4 Preferred Aliquot: 20 mm x 10 mm x thickness (≤4 mm),** divided into two adjacent 10 mm x 10 mm x thickness aliquots. Each cassette should contain two 10 mm x 10 mm x thickness aliquots.

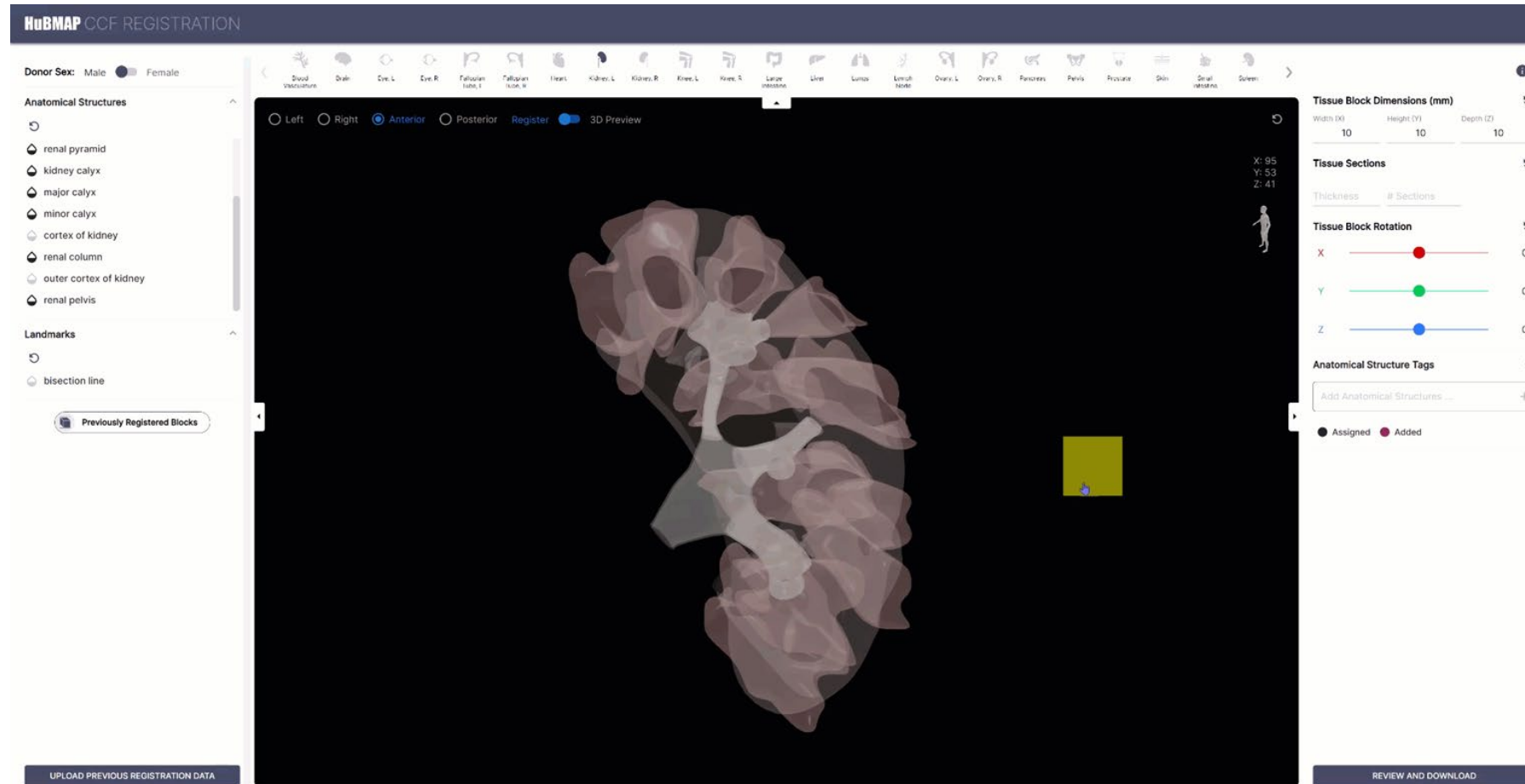
**Sigmoid Colon ('pelvic colon') Dissection Guide (Diagram 4)**



Recover the transverse colon starting 10 cm back from the right colic (hepatic) flexure.



# CCF Registration User Interface (RUI)



<https://hubmapconsortium.github.io/ccf-ui/rui/>

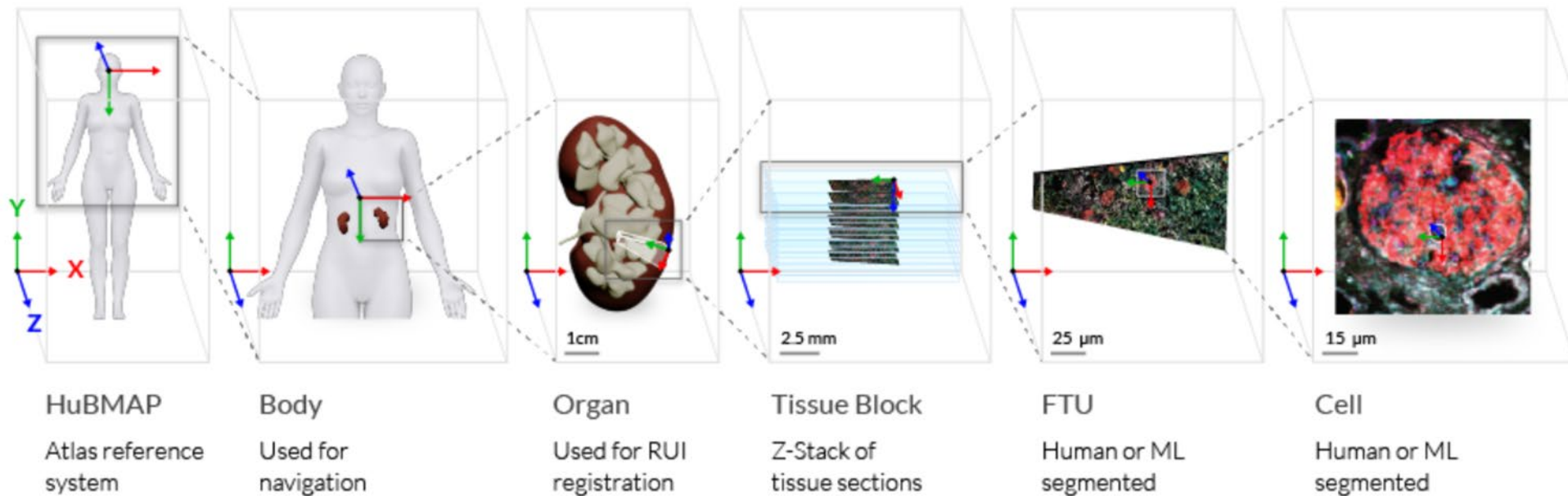


# CCF Exploration User Interface (EUI)

<https://portal.hubmapconsortium.org/ccf-eui>

# CCF

Allows us to 3D register tissue and explore tissue blocks spatially and semantically across macro-, meso-, and micro-scale.



# Biological Structure



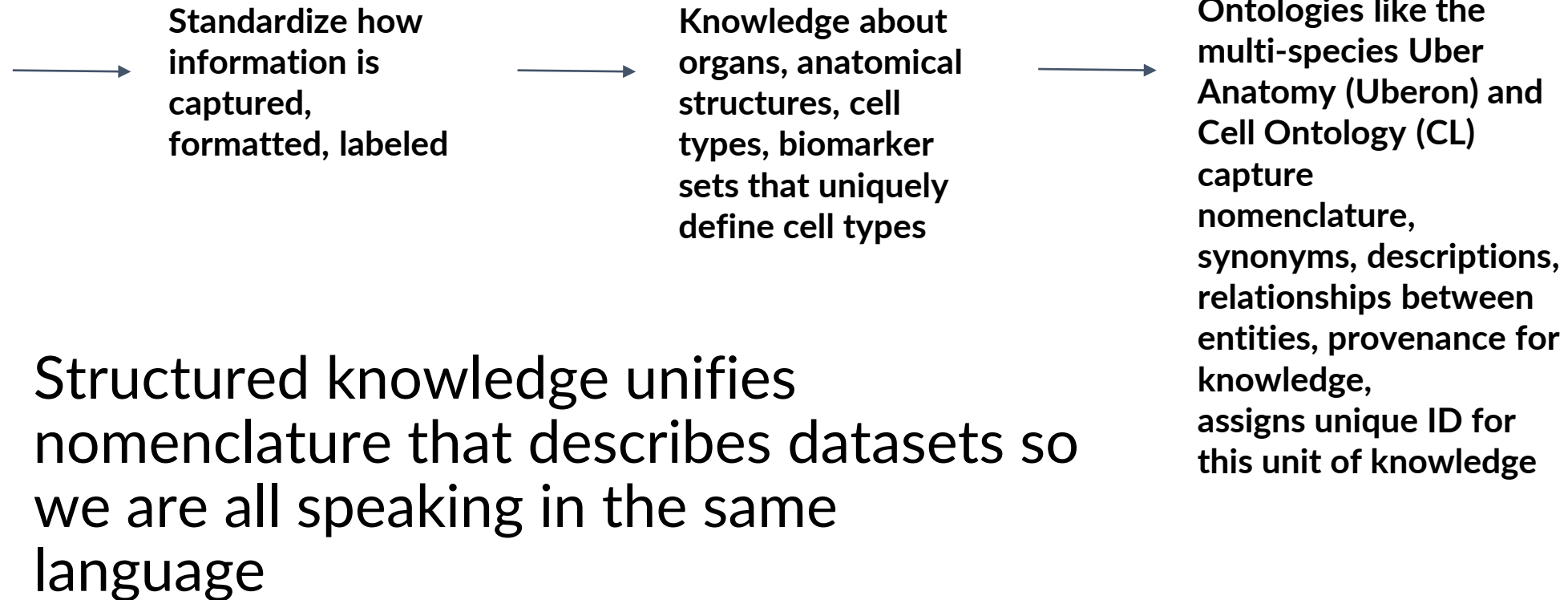
# Linked Open Data (LOD)

# Anatomical Structure, Cell Type, Plus Biomarker (ASCT+B) Table

# Background-Structuring Knowledge: What does an ASCT+B Table Do?



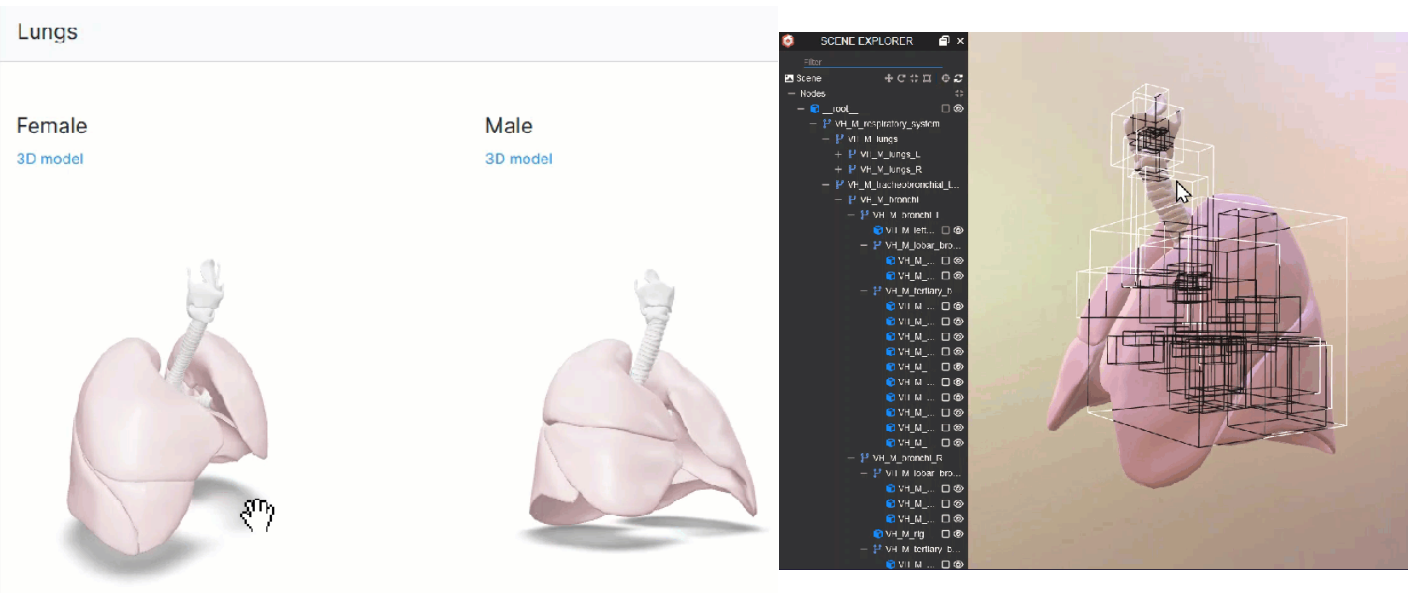
Unstructured knowledge sources  
~80% of biomedical knowledge





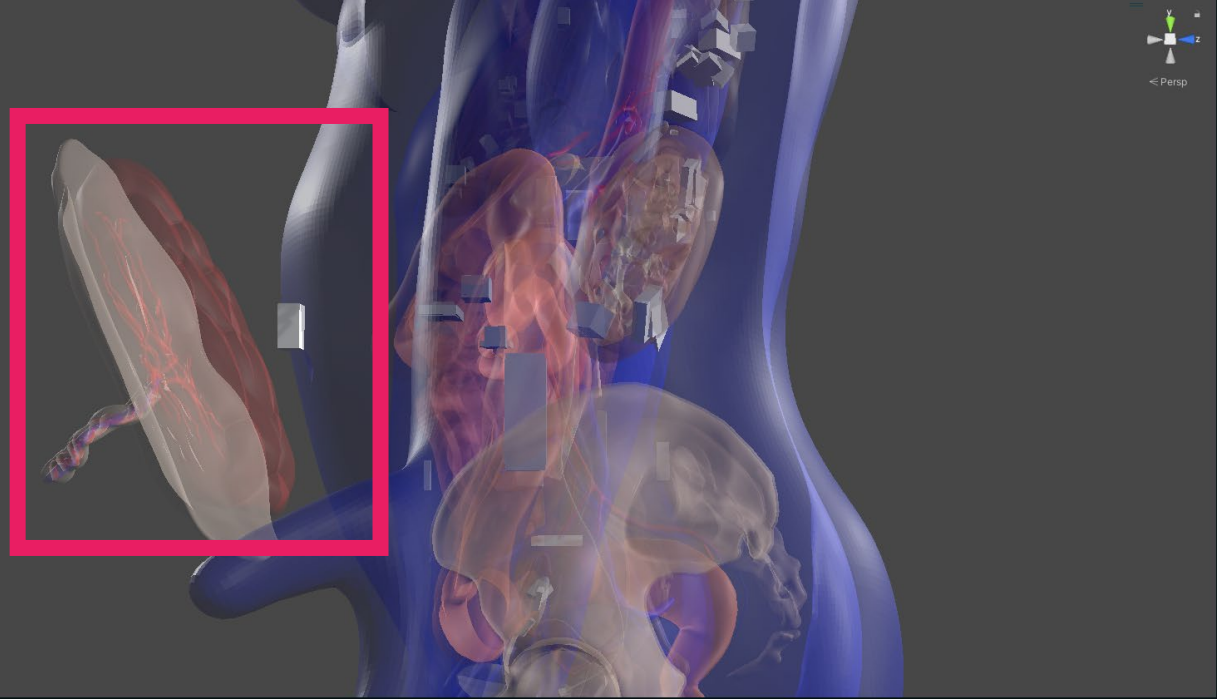
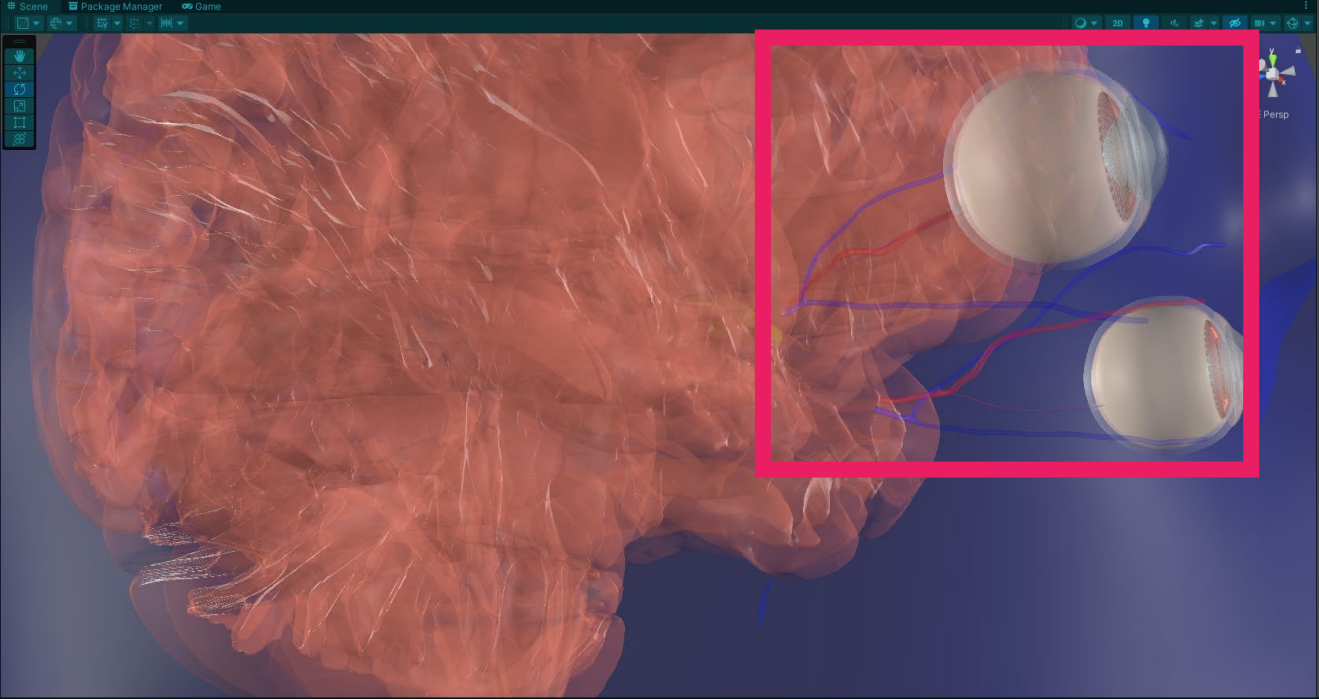
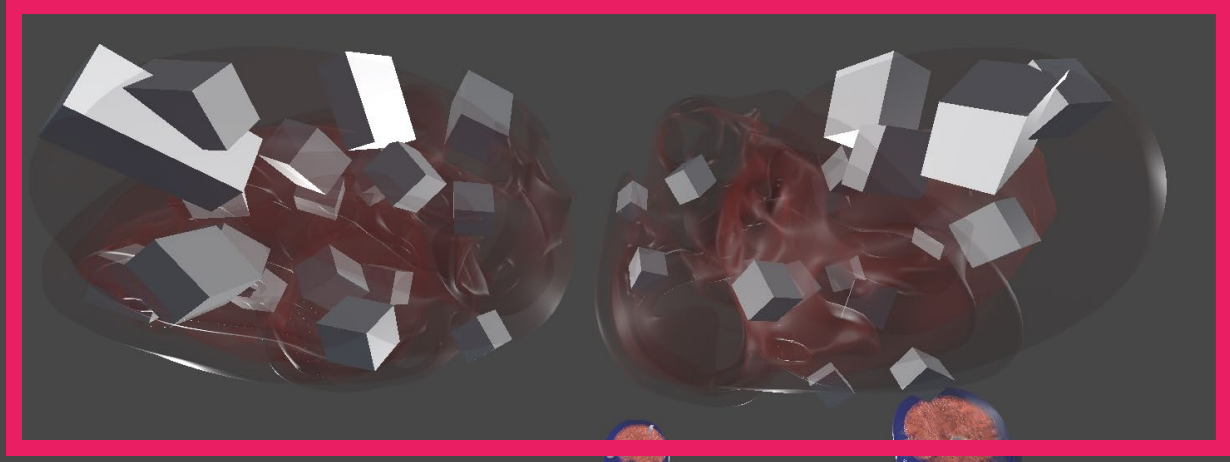
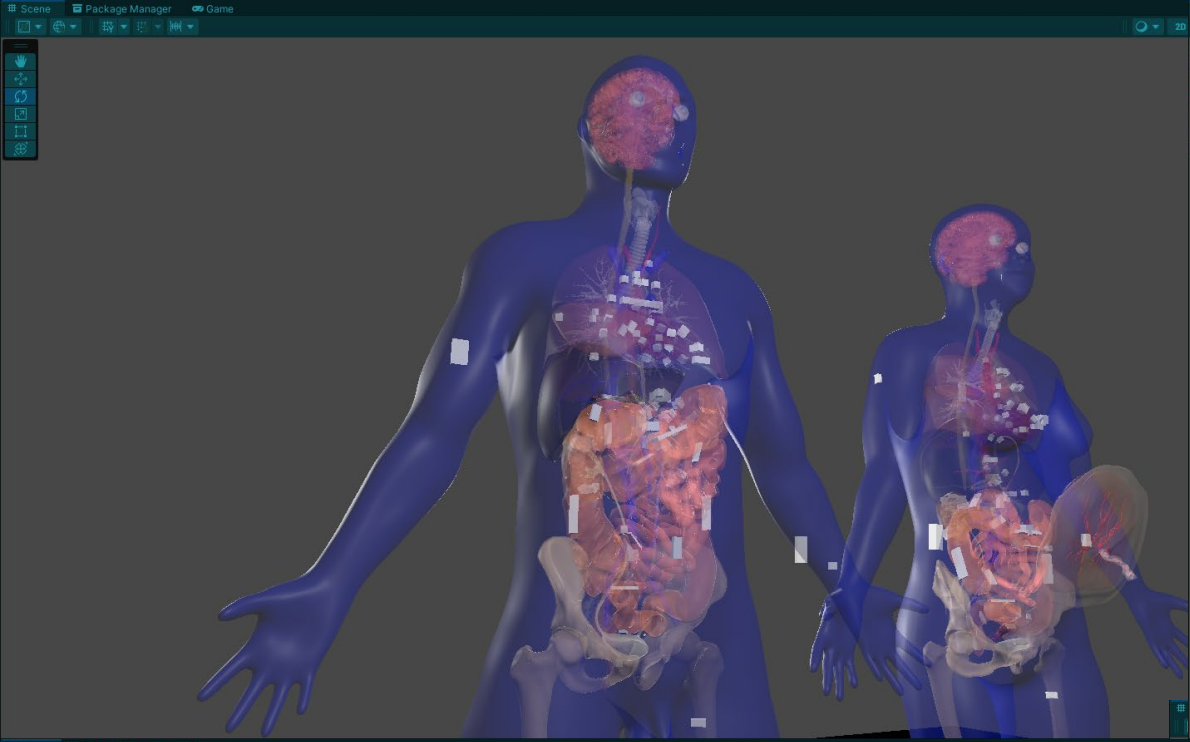
# Tie to Spatial Data: 3D Reference Models

- Custom built by our medical illustrator team with input from subject matter experts
- Support the RUI, EUI, and CCF Organ VR Gallery
- Anatomical structures labeled with ontology IDs

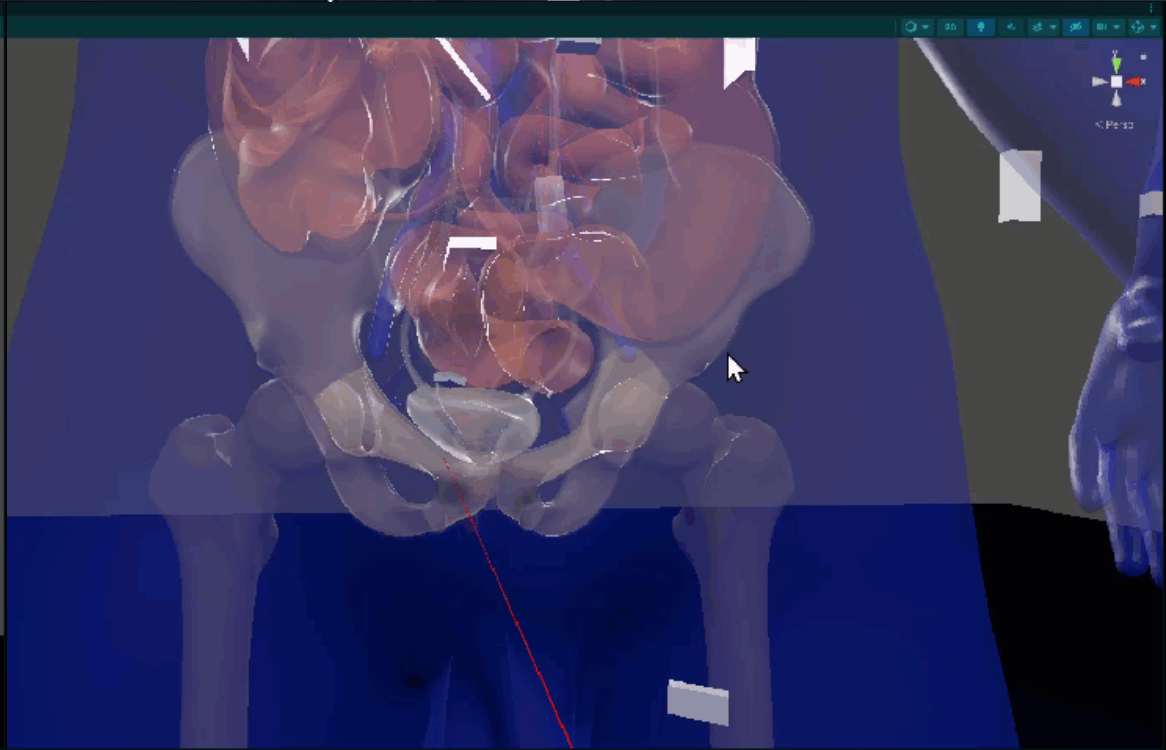
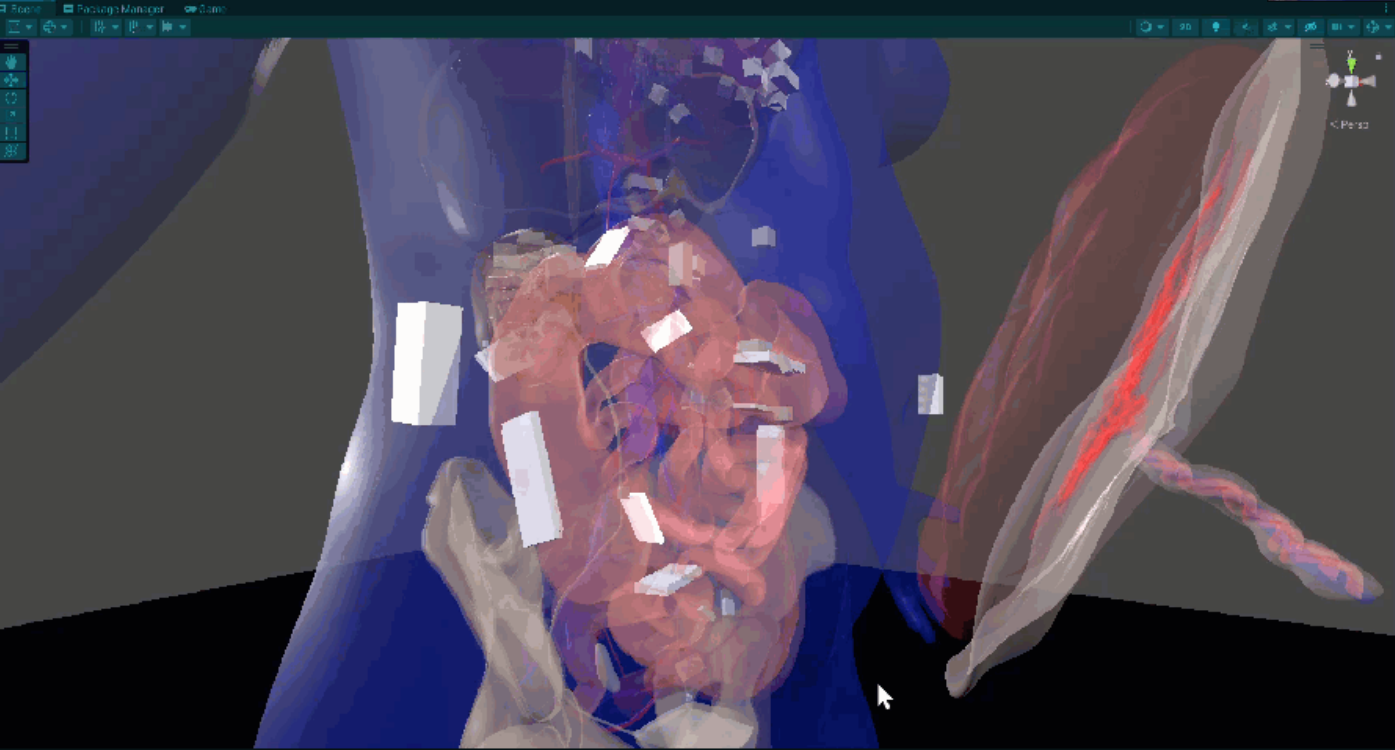
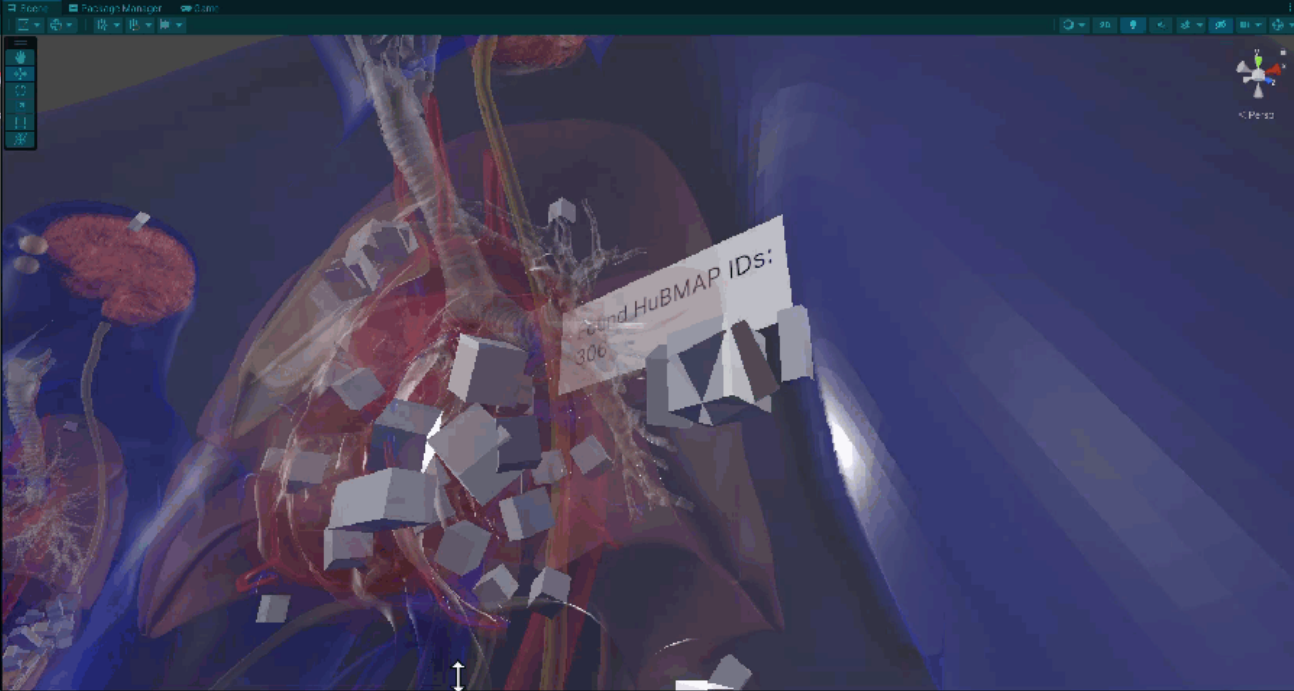
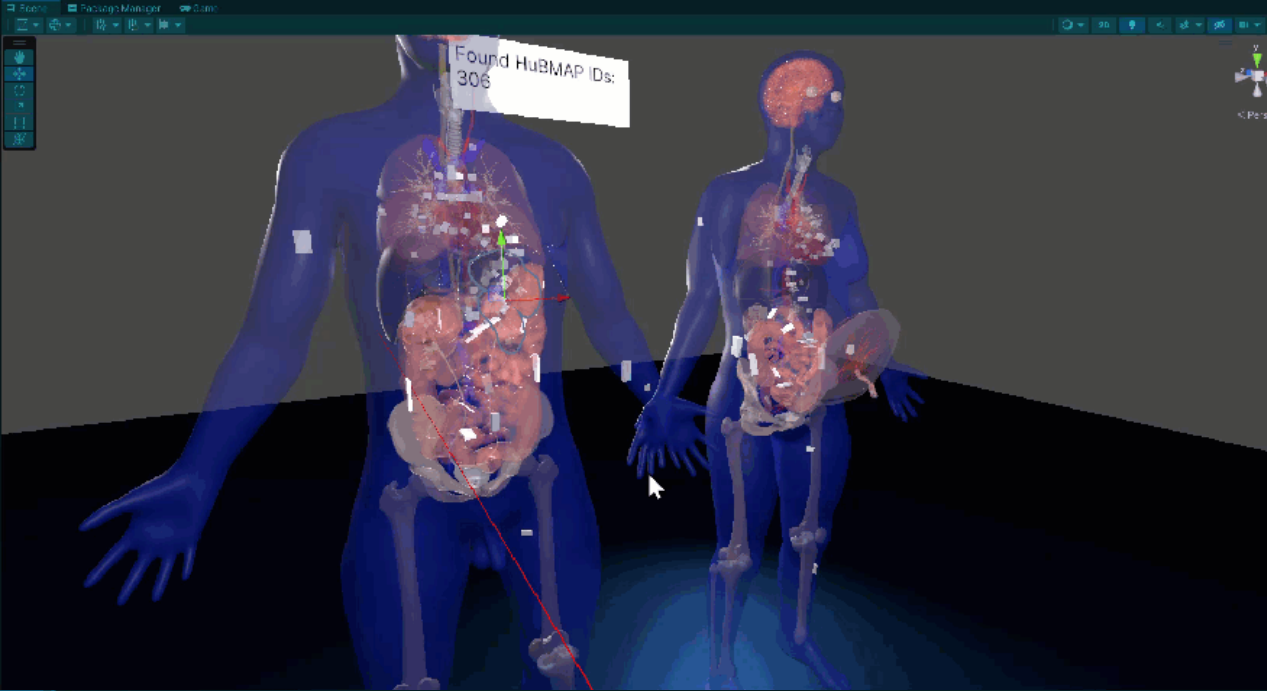


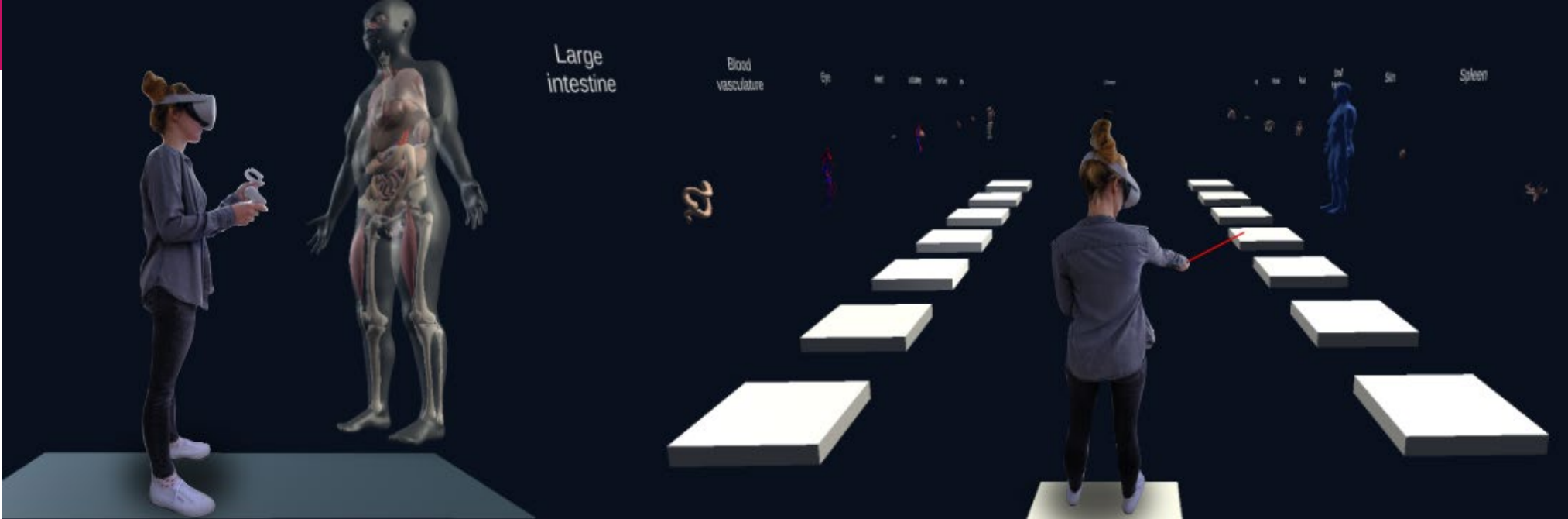
<https://hubmapconsortium.github.io/ccf/pages/ccf-3d-reference-library.html>

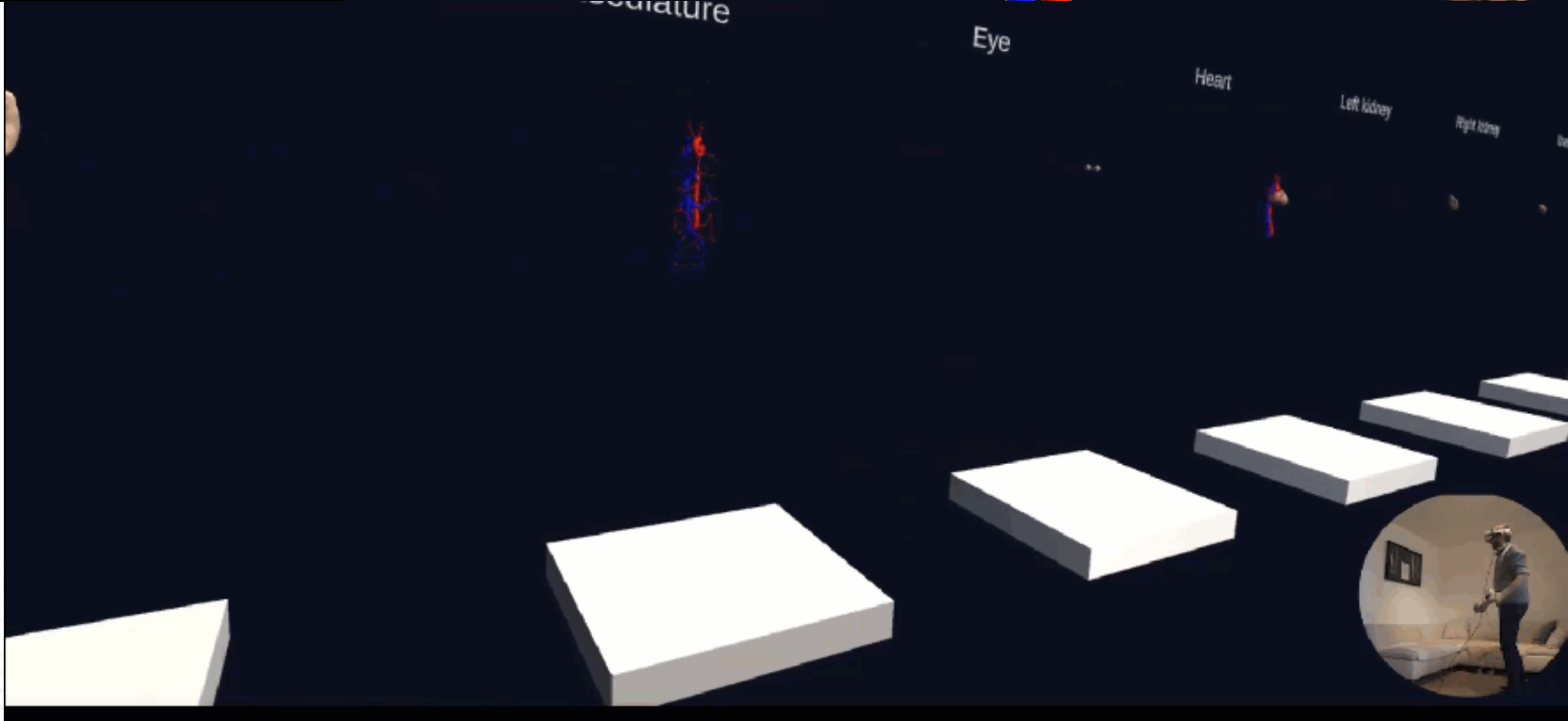
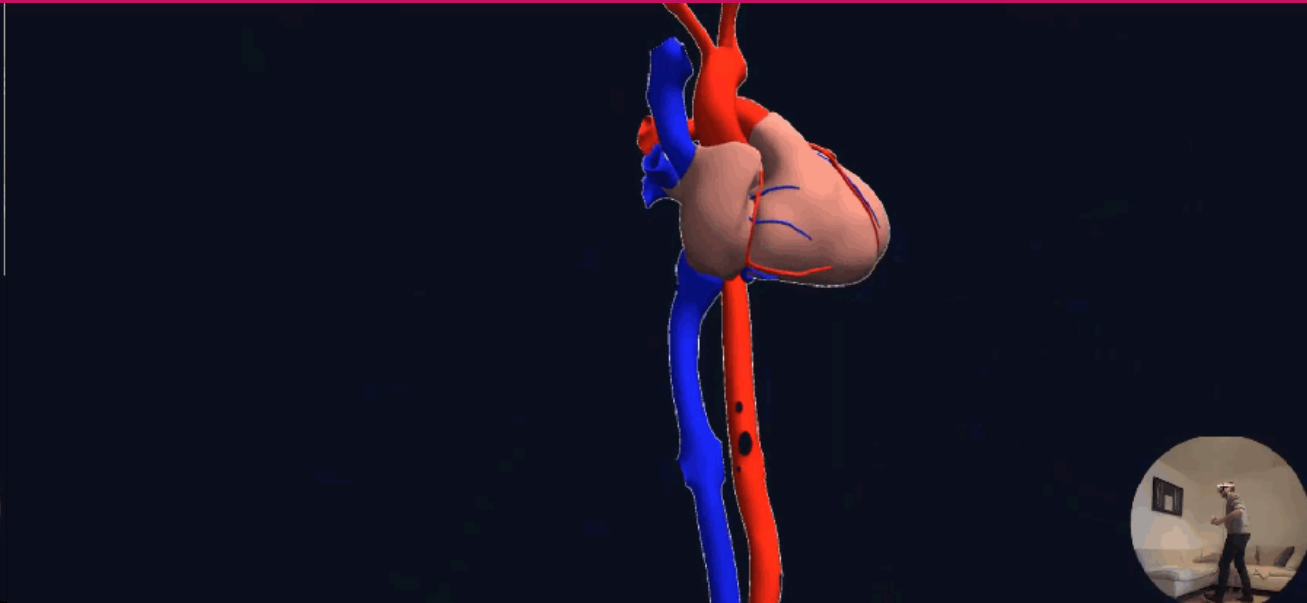
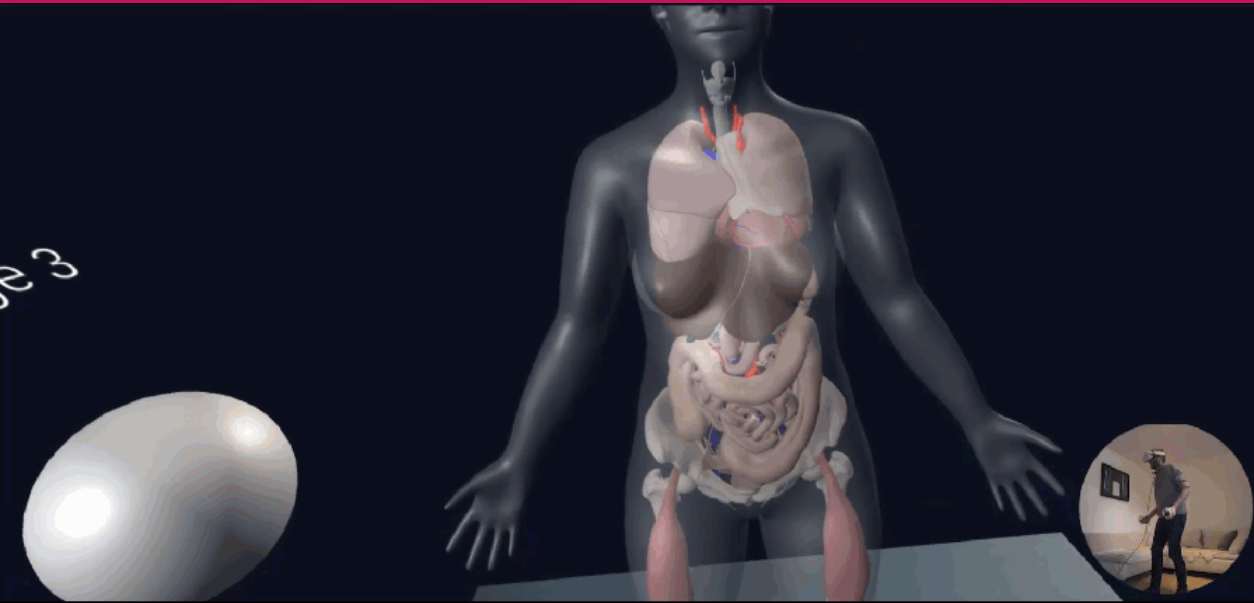
# A Closer Look at the Gallery







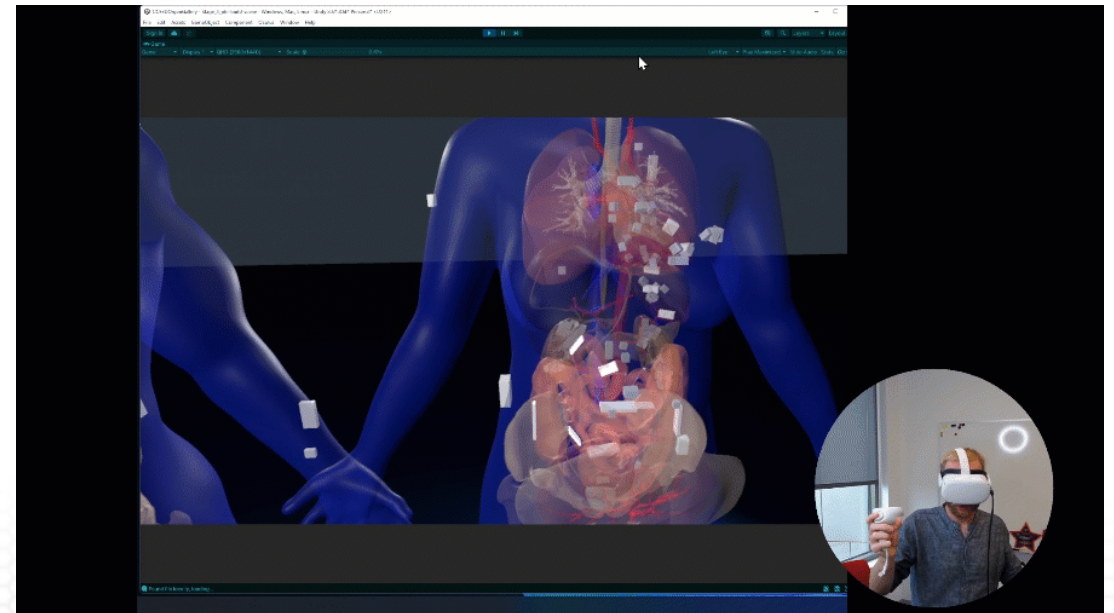






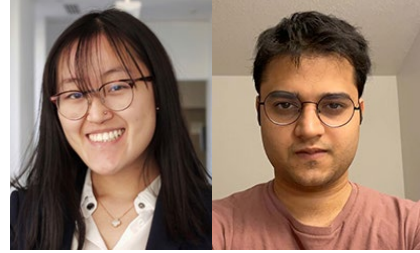
# Conclusion

- VR + data visualization = superpower
- Challenges:
  - Perception
  - Complexity
  - Use cases
  - AR hardware
- Information-Rich Virtual Environments in VR
- Integrate spatial and abstract data in one continuous immersive environment





# Become a Tester!



- Documentation: <https://www.figma.com/file/TopdFvriKNcV9Af2Hgo8aK/Documentation-Organ?node-id=0%3A1>
- Feedback: <https://forms.gle/wnGnZLyDvU9MEs5o8>
- Meta Quest 2 setup (general introduction): <https://www.figma.com/file/0MgWkoPyuWLWb8esFsYya5/CNS-Documentation?node-id=0%3A1>
- GitHub issues: <https://github.com/cns-iu/ccf-organ-vr-gallery/issues>
- Please contact Andreas Bueckle at [abueckle@iu.edu](mailto:abueckle@iu.edu)!

# Acknowledgements



- **Red Pill Blue Pill** VR R&D team:

- Catherine Qing
- Yash Ramesh Kumar
- Naval Pandey
- Riley Halloran
- Shefali Luley

- Center Director:  
Katy Börner



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# Your Turn