#### Optimization and Manipulation of Contextual Mutual Spaces for Multi-User Virtual and Augmented Reality Interaction

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# Why?



### Interactive Hologram Message





## Hologram Video Call



## Hologram Conference



## **Real World Interactions?**









### Star Wars Space



### **Real-World Spaces**



### Space!

#### • Size

- Limited available physical space
- Furniture arrangement further restricts space
- Number of users/rooms
  - Not a one-way message transmission
  - Instead, a multi-user interactive experience
- Communication interface
  - Pros and cons of different mediums
  - LED screen? Mobile phone? Headset?



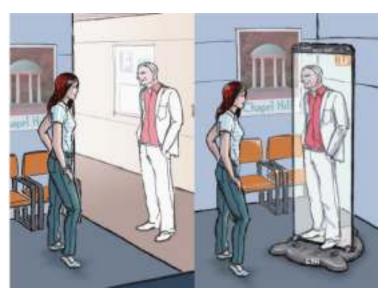
## Background/Related Works



### **Telepresence** Definition

- a meeting between participants in different geographical locations
- participants can appear in and affect a remote space
- "virtual joining of different spaces"





### Holographic Reconstruction & Avatar Projection

- First natural step in realizing telepresence
- Uses cameras or depth sensors for capture space
- Reconstructs virtual participant as hologram
- Projected in pre-defined local space
- Commonly visualized on situated autostereo, volumetric, lightfield, cylindrical, or holographic displays



## Toward a Compelling Sensation of Telepresence (2000)



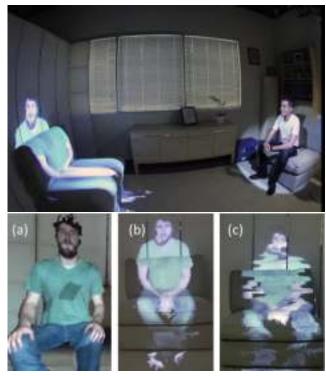
### Real World Video Avatar (2005)

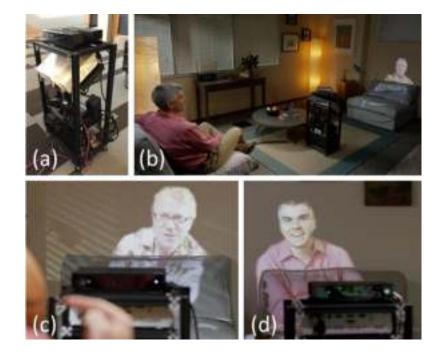




\*Tomohiro Tanikawa, et. al., Real world video avatar: real-time and real-size transmission and presentation of human figure. 2002.

### Room2Room: Enabling Life-Size Telepresence in a Projected AR Environment (2016)





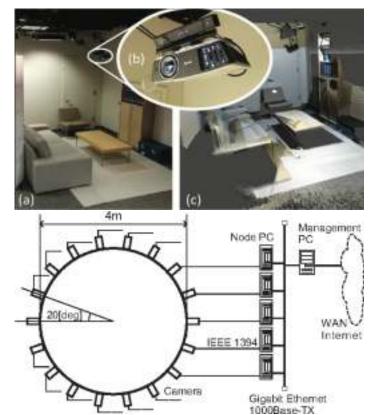
\*Tomislav Pejsa, et. al., Room2Room: Enabling Life-Size Telepresence in a Projected Augmented Reality Environment. 2016

## Issue: Small Predefined Space Severely Limits Motion



### Limited Space Size





\*Wei-Chao Wen, et. al., **Toward a Compelling Sensation of Telepresence**. 2000. \*Tomohiro Tanikawa, et. al., **Real world video avatar. real-time and real-size transmission and presentation of human figure**. 2002. \*Tomislav Pejsa, et. al., **Room2Room: Enabling Life-Size Telepresence in a Projected Augmented Reality Environment**. 2016

## Next Step: Increased Space for User Mobility



## Blue-C: A Spatially Immersive Display and 3D Video Portal for Telepresence (2003)





Figure 12: 3D mirror seen from a view into blue-e.



Figure D: Art performance with real-time MJ casual feedback.



Figure 16: Snapshot of fise 3D mirror hall application.



Figure 17: Snapshot of the fac att performance application.



### Immersive Group-to-Group Telepresence (2013)





\*Stephen Beck, et. al., Immersive Group-to-Group Telepresence. 2013.

## Issue: Lack of Shared Space With Multiple Users





\*Henry Fuchs, et al., Immersive 3D Telepresence. 2014.

### Virtual Disconnect

- limited ability for remote users to access each others space
- spaces are instead virtually disconnected and interaction occurs through a window between the spaces

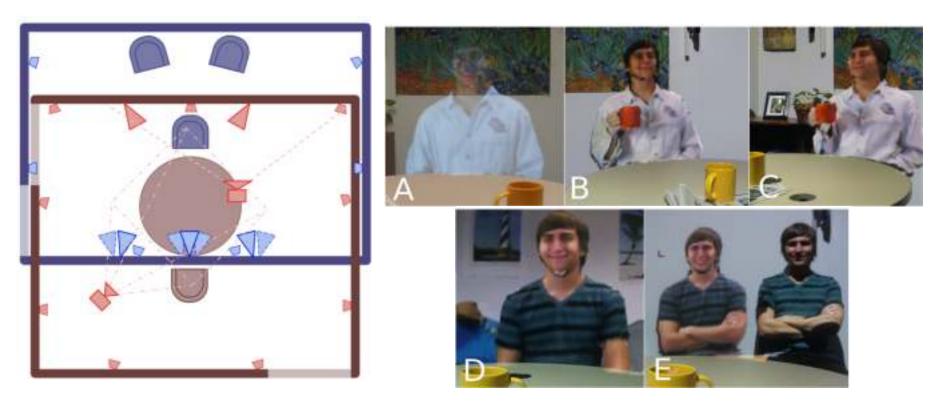




## Next Step: Sharing Virtual Ground Among Multiple Users



### General-Purpose Telepresence (2013)



# holoportation

http://research.microsoft.com/holoportation

## **Interactive 3D Technologies**

http://research.microsoft.com/groups/i3d

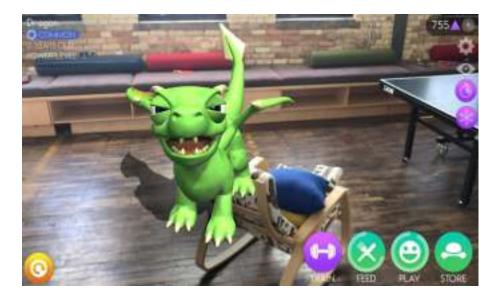
### Microsoft Research

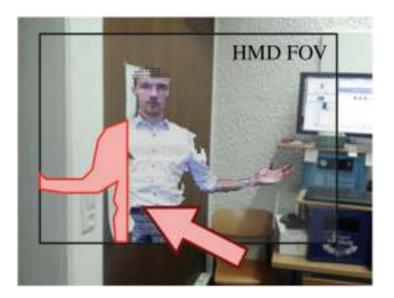
Sergio Orts-Escolano, et. al., Holoportation, 2017.

## Issue: How Do We Find a Valid Mutual Space Region?



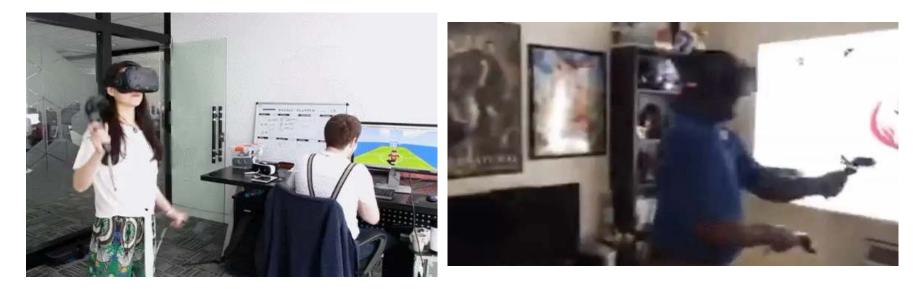
### Virtual Conflicts (Occlusion)







### Physical Conflicts (Collisions)

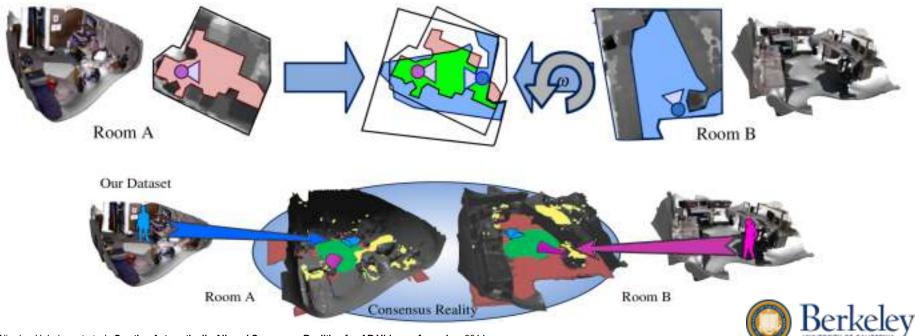




## Next Step: Automatically Calculate and Generate Mutual Space Boundary



### Solution Attempt 1: Creating Automatically Aligned Consensus Realities for AR Videoconferencing (2014)



\*Nicolas H. Lehment et. al., Creating Automatically Aligned Consensus Realities for AR Videoconferencing. 2014.

### **Major Limitations**

- System inputs limited to only 2 rooms
- Inefficient brute force algorithm used to search for best consensus space solution
- System would fail to output decent spaces for messy input rooms where furniture is arranged in a disorderly, non-optimal fashion
- Never tested in the real world via rendering in Augmented Reality



## Next Step?



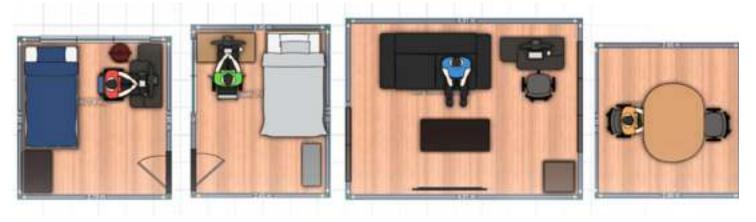
## Optimization and Manipulation of Contextual Mutual Spaces for Multi-User AR/VR Interaction



#### Notation

• To simplify the complexity of our algorithms, we projected our 3D rooms/objects in 2D on to the x-y plane as a top view of a floor plan

3D room  $R_i$  with objects  $\mathcal{O}_i = \{O_{i,1}, O_{i,2}, ..., O_{i,n_i}\}$ 2D room projection  $\overline{R}_i$  with each 2D object projection  $\overline{O}_{i,k}$ 



### **3D Scanned Dataset**

Scanned Data (MatterPort3D)





- Used Matterport3D's RGB-D dataset of 90 building-scale scenes
- Filtered out spaces that are not generally used for multi-user interaction (bathroom, small corridors, stairs, closets, etc.)
- Randomly grouped available rooms into subsets of size 2, 3, and 4
- Implemented our framework using the Rhinoceros 3D (R3D) platform and development libraries in Grasshopper

## Methodology

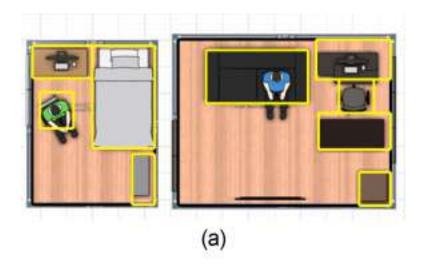


- Semantic segmentation on point cloud data
  - Segment spatial boundaries
  - Obtain the bounding boxes of each room's objects
- Identify a maximum mutual space area among the input rooms
  - Extract sittable and standable interaction spaces
- Users placed in space
  - Each user within the other users' line of sight

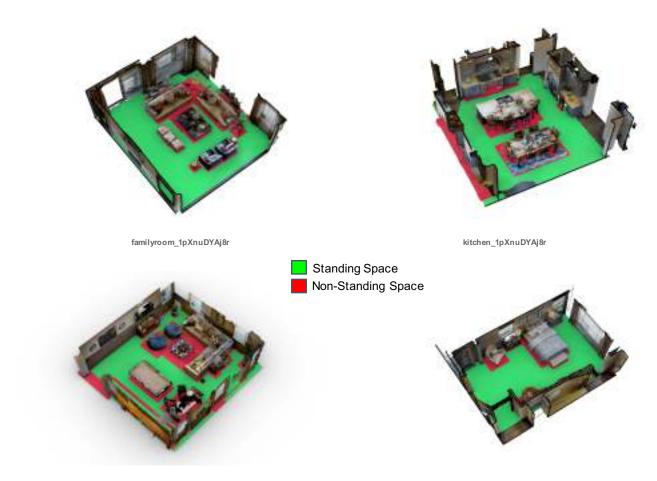


#### Standable

$$S_i = R_i - \bigcup_{k=1}^{n_i} O_{i,k}$$



- Volume of the room in which no object located within a human user's height range is present.
- Free user movement without risk of collision
- Safe to participate in activities like intense gaming, exercise, or performative arts
- Suitable for virtual reality experiences, where users may not be aware of the physical surroundings





9\_familyroom\_1pXnuDYAj8r

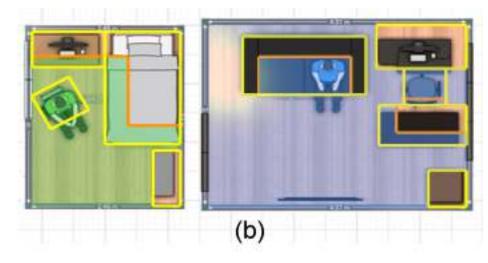
# Sittable

- Calculation requires more than that of standable
- Expands upon standable spaces by adding areas that humans can sit on as well
- Define sittable threshold to account for comfortable sitting positions
- Start by finding the nonsittable region of the room

We first define a sittable threshold  $\mathcal{E}(O_{i,k})$  $\mathcal{E}_{O_{i,k}}$  is the maximum distance inward from an edge of the object's bounding box that can be comfortably sit on.

 $N(O) \doteq \{ \forall p \in O : B(p, \varepsilon(O)) \cap O = B(p, \varepsilon(O)) \}, \quad (2)$ 

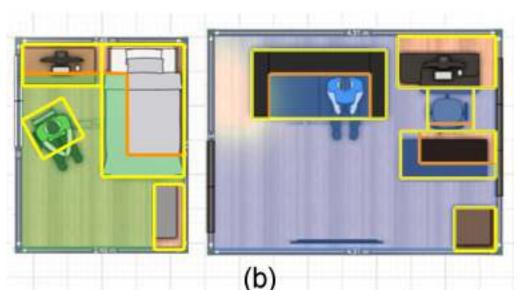
where  $B(p, \varepsilon(O))$  is a sphere in  $\mathbb{R}^2$  centered at p and with radius  $\varepsilon(O)$ .

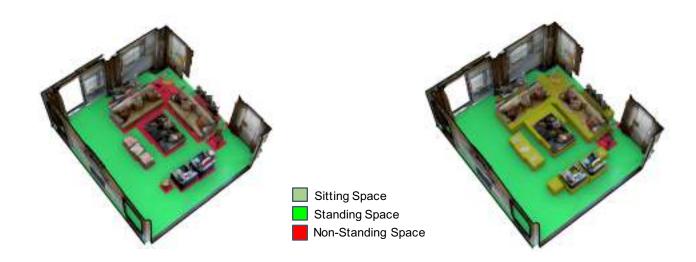


## Sittable

- Also need to account for surrounding boundary adjacency
- Combine constraints and subtract to find available sittable space for each object
- Add up the regions for each object with the standable space to find the total sittable space

$$C(O_{i,k}) = \{ \forall p \in O_{i,k} : B(p, \varepsilon(O_{i,k}) + \rho(O_{i,k})) \cap \overline{R}_i \neq \emptyset \\ \text{or } B(p, \varepsilon(O_{i,k}) + \rho(O_{i,k})) \cap O_{i,h} \neq \emptyset, h \neq k \}.$$
$$A(O) = O - N(O) \cup C(O)$$
$$A(R_i) = \bigcup_{k=1}^{n_i} A(O_{i,k}) + A(S_i)$$

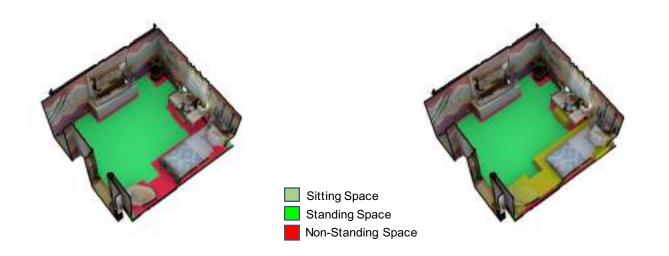




Standables Only

Standables + Sitables





Standables Only

Standables + Sitables



Optimization and Manipulation of Contextual Mutual Spaces for Multi-User Virtual and Augmented Reality Interaction; Keshavarzi et al.

### **Maximizing Mutual Spaces**

- Define rigid-body motion
- Find optimal rigid body motion set to maximize interaction space area
- Find maximum mutual standable (or sittable) space

we define a rigid-body motion in  $\mathbb{R}^2$  as  $G(F, \theta)$ , where  $\theta$  describes a translation and a rotation.

$$(\theta_1^*, \cdots, \theta_m^*) = \arg \max K(\bigcap_{i=1}^m G(S_i, \theta_i))$$
  
 $M_S(R_1, \cdots, R_m) = \bigcap_{i=1}^m G(S_i, \theta_i^*)$ 











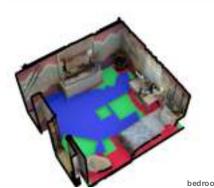








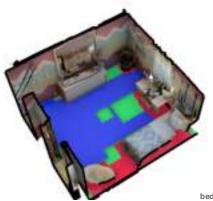
















### **Furniture Optimization Problem**

- Improved size of shared interaction space further
- Manipulated scene with alternative furniture arrangements based on objective goal of achieving an increased mutual spatial boundary area with minimum effort

Effort  $E = w ||G||_t$ , where *w* is a given parameter that approximates the weight of each object.

Then, the total effort to re-arrange the space is  $E(R_i, \Theta_i) = \sum_{k=1}^{n_i} w_k \|G(O_{i,k}, \theta_{i,k})\|_t,$ where  $\Theta_i = \{\theta_{i,1}, \cdots, \theta_{i,n_i}\}$  denotes the collection

of  $n_i$  rigid-body motion parameters.



#### Furniture Optimization Solver Algorithm

Since solving for the optimal object transformation is an NP-Hard problem, in this paper, we will demonstrate a heuristicbased but practical algorithm to optimize it in a step-by-step

$$\min \sum_{i=1}^{m} E(R_i, \Theta_i^s) \quad \text{subj. to} \quad K^s(\bigcap_{i=1}^{m} G(S_i, \Theta_i^s)) \text{ increases } 10\%,$$

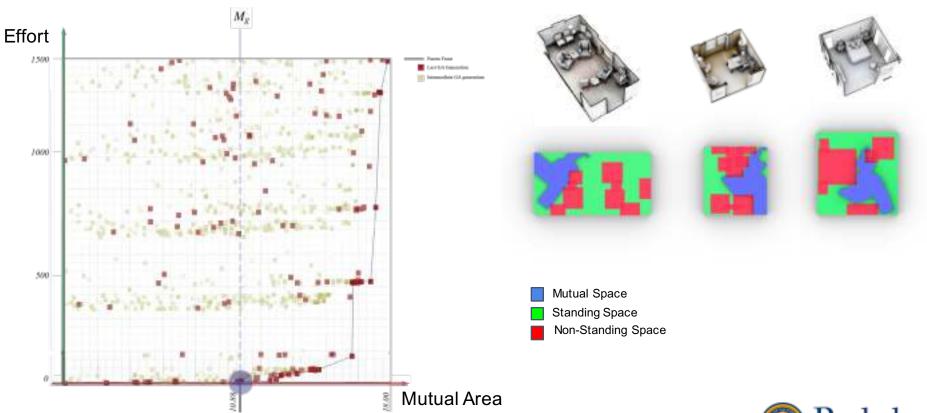
where  $K^s$  indicates the area value at the *s*-th step with respect to transformation coefficients  $\Theta_i^s$  and  $\theta_i^s$ . The iteration would stop if the optimization cannot further increase the area of the mutual space.



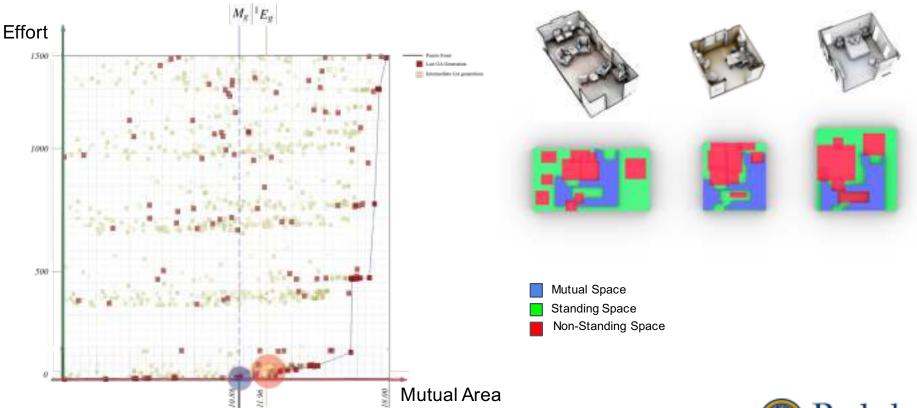
#### **Furniture Optimization Solver Demonstration**



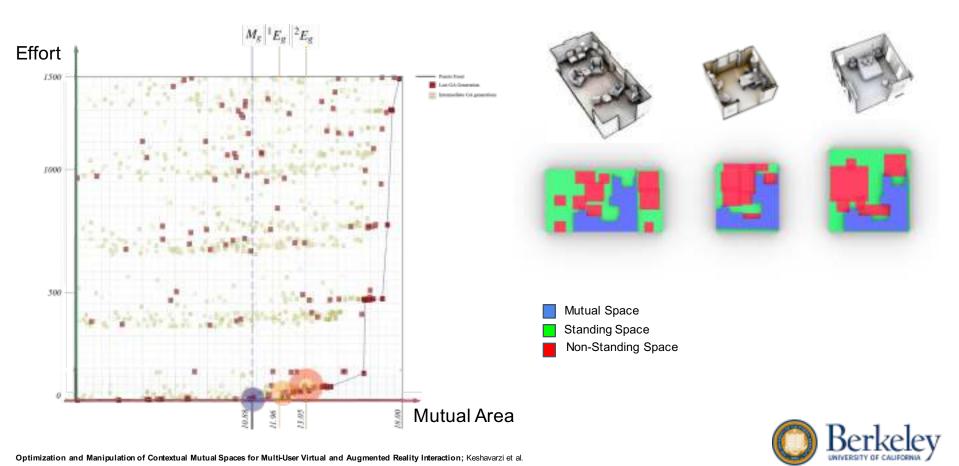
- Integrated with robust Strength Pareto Evolutionary Algorithm 3 (SPEA 2) available through the Octopus multi-objective optimization tool in R3D
- Penalty to avoid transformations with intersections of manipulated furniture
- System can identify solutions which increase the max mutual boundary area up to 65% more than its initial state without furniture movement optimization

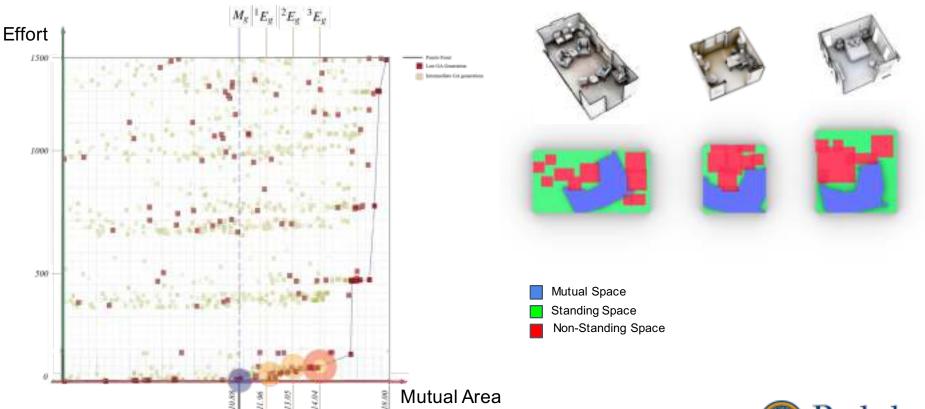




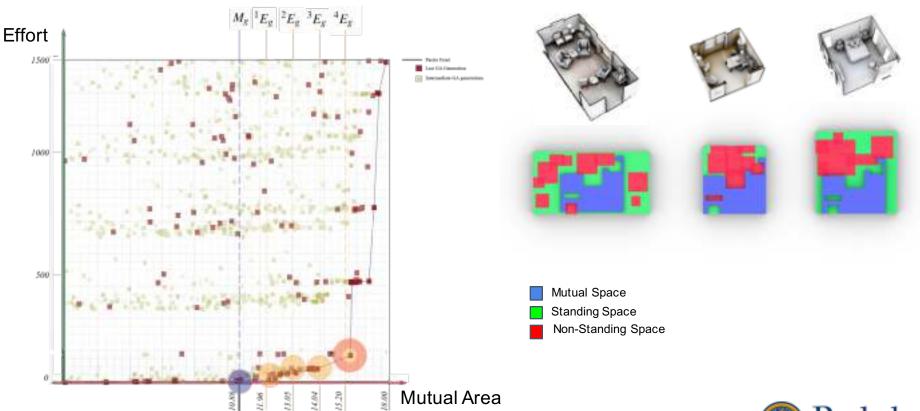




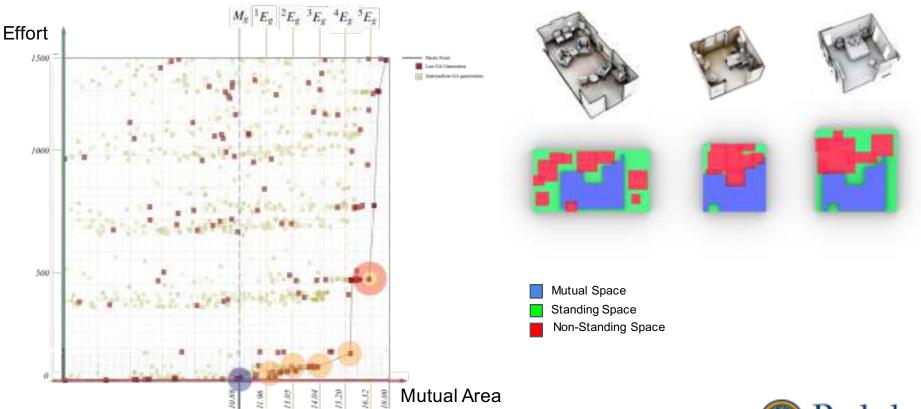














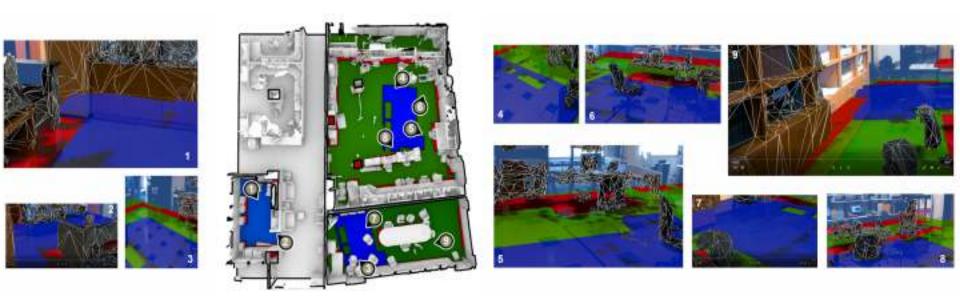
# Visualization and Conclusion



## Augmented Reality Visualization

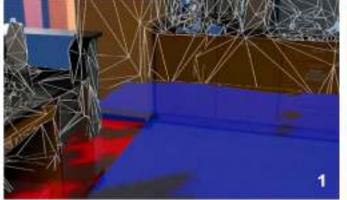
- Scan the surrounding environments of each user using a Matterport camera
- Send geometrical mesh data to a central server for processing
- Deploy the resulting spatial segmentation in augmented reality using the Microsoft Hololens, a mixed reality HMD



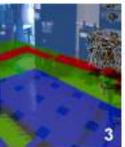


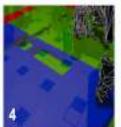
- Red non standable objects
- Green standable boundaries
- Blue mutual boundaries that are accessible between all users.
- Visualized boundaries are positioned slightly above the floor level, allowing users to identify the mutual accessible ground between their local surrounding and the remote participant's spatial constraints.

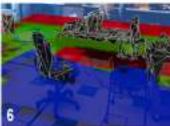


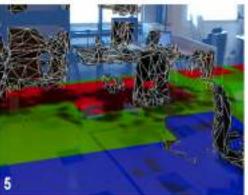


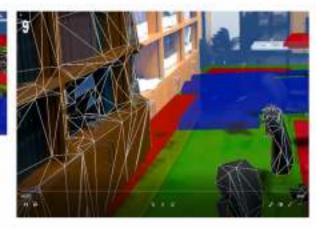




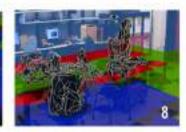














# Summary

- Introduced a novel optimization framework to generate maximum virtual space areas for multi-user interaction in AR relating to standing and sitting
- Further provided a manipulation framework as it recommends movement of surrounding furniture objects to expand the mutual space with minimal physical effort from the users
- Results of system proven to be quantitatively successful in maximizing shared space size
- Tested/visualized on Hololens to show immense potential in AR telepresence

