



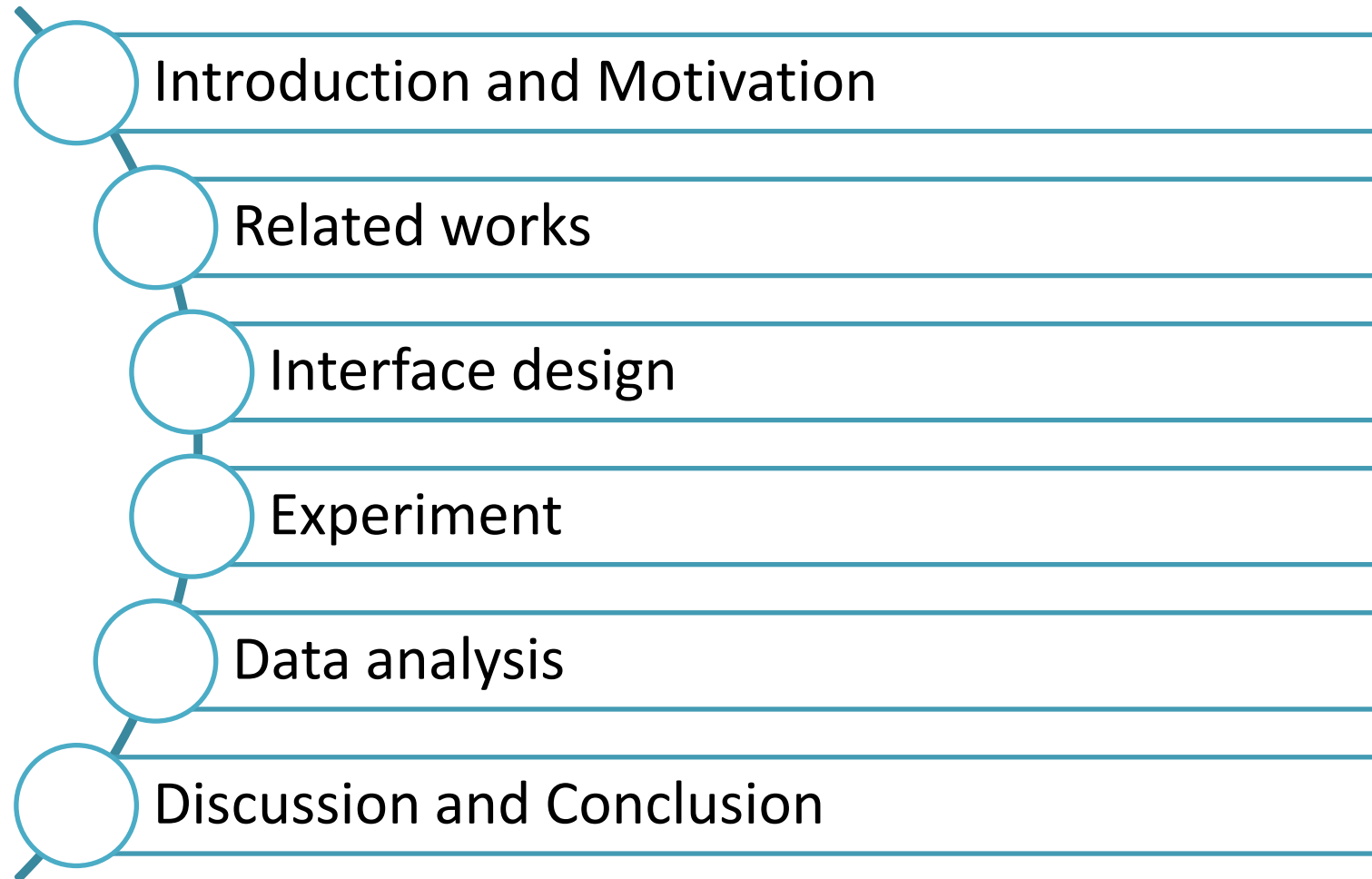
Cartography M.Sc.

Using Information Chunking for Spatial Learning based on Augmented Reality

Author: Zhang, Jiongyan

Supervisor: MSc. Wang, Shengkai (TUM)

Outline



Introduction and Motivation

Motivation

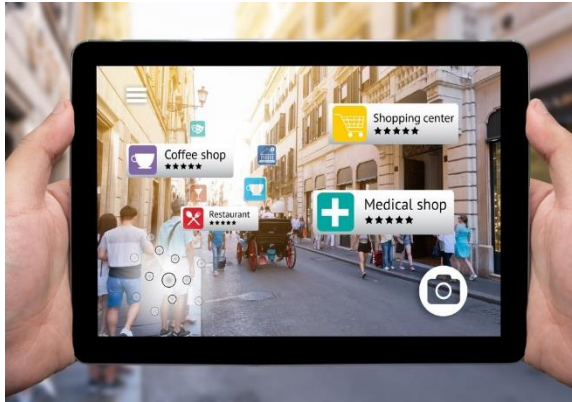
Related Works

Design

Experiment

Analysis

Discussion



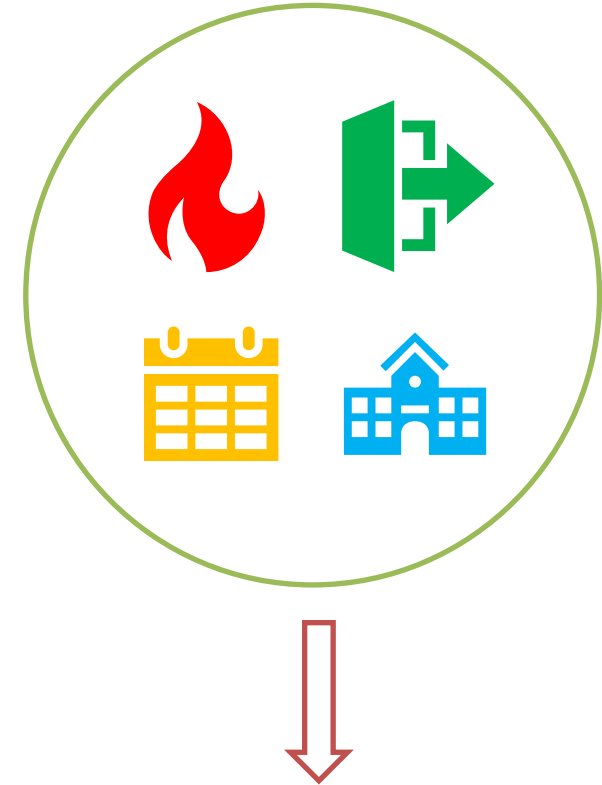
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Augmented Reality (AR) can carry virtual landmarks, which draws people's attention and guide people.



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However, too many landmarks lead to information overload, decreasing learning efficiency – especially in the indoor environment.



Necessity to do indoors spatial learning – when facing daily and emergent situation.

How to solve this problem?

How to solve: *Chunking*?

Motivation

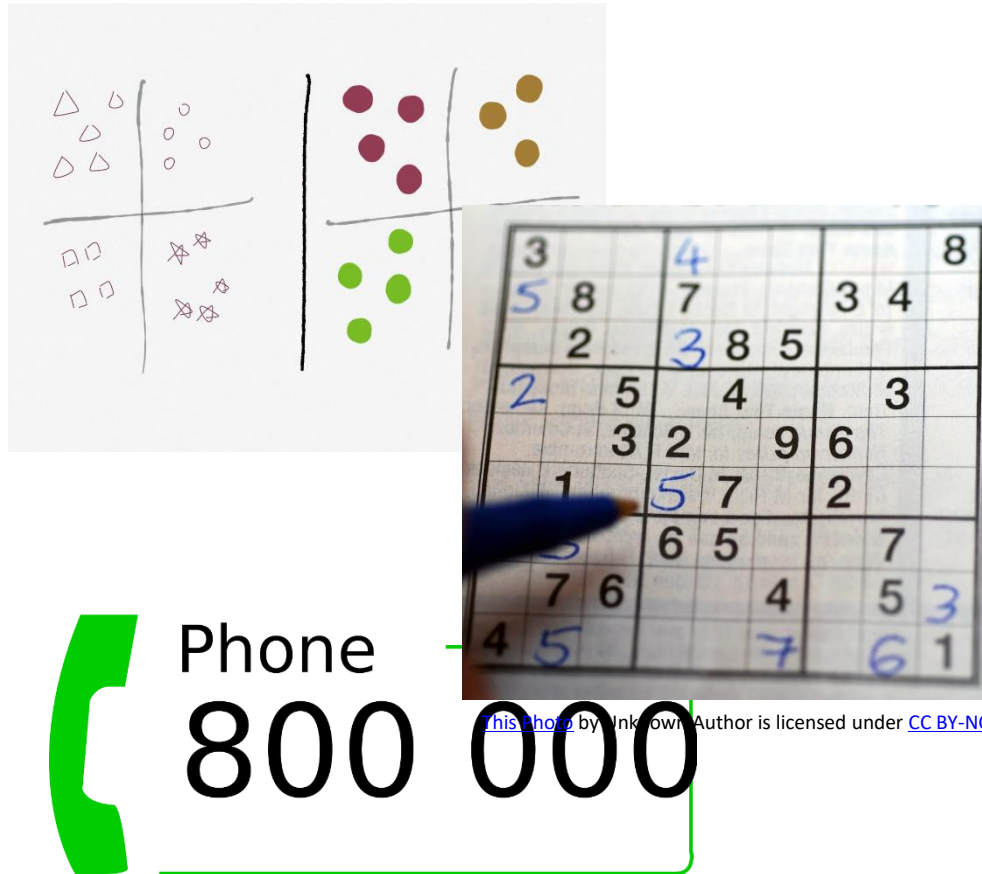
Related Works

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Divide items by some certain rules: colors, shapes, textures...



Apply to indoors environment:
Reflect the internal relationship of indoor space structure



Our goals

Motivation

Related Works

Design

Experiment

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Discussion

- Create a kind of chunking method to balance the information
- Designing a kind of visual guidance to assist spatial learning
- Carrying out the control experiment to analyze the effect: we anticipate that our chunking system will be better than the one without chunking.

Related works

Motivation

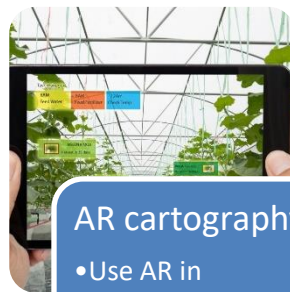
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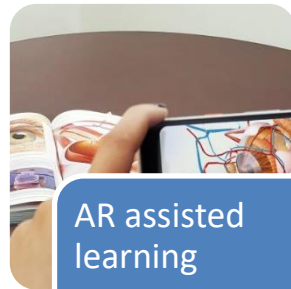
Analysis

Discussion



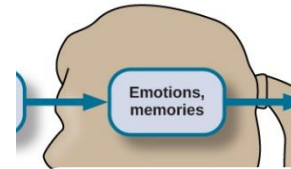
AR cartography

- Use AR in cartography can increase user experience.



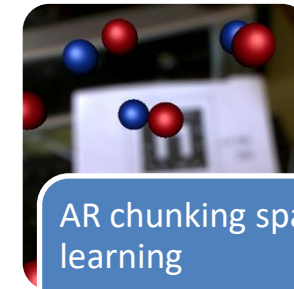
AR assisted learning

- AR can improve users' learning efficiency.



Chunking assisted learning

- Chunking method can balance users' work memory.



AR chunking spatial learning

- Combining AR and chunking: Quantitative Vs. Qualitative



Sketch map analysis

- Set a pivot to adjust the whole map structure to digitalize the sketch.

Images:

<https://www.completebusinessnews.com/agricultural-drones-is-it-worth-getting-one/>

<https://edtech4beginnerscom.files.wordpress.com/2020/03/2.png?w=1140>

https://s3-us-west-2.amazonaws.com/courses-images-archive-read-only/wp-content/uploads/sites/902/2015/02/23224821/CNX_Psych_07_01_Concepts.jpg

https://claretsience5.weebly.com/uploads/1/2/3/7/123740240/gas_9_orig.jpg

https://cdn.pixabay.com/photo/2016/07/14/00/27/hand-1515895_960_720.png



Design principle: chunking methods

Motivation

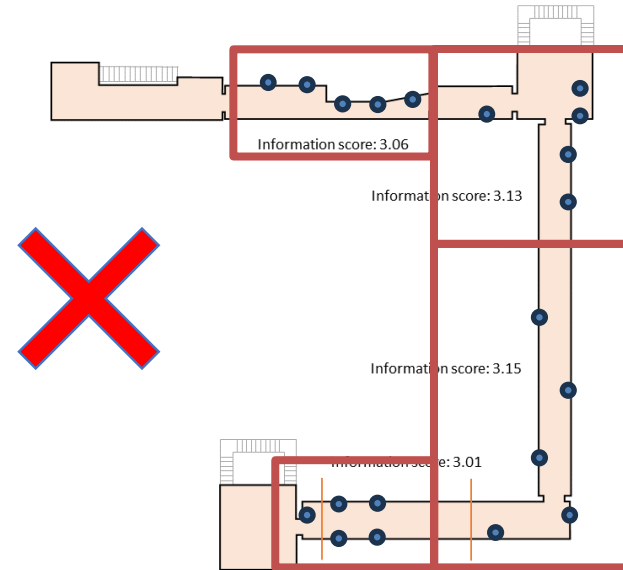
Related Works

Design

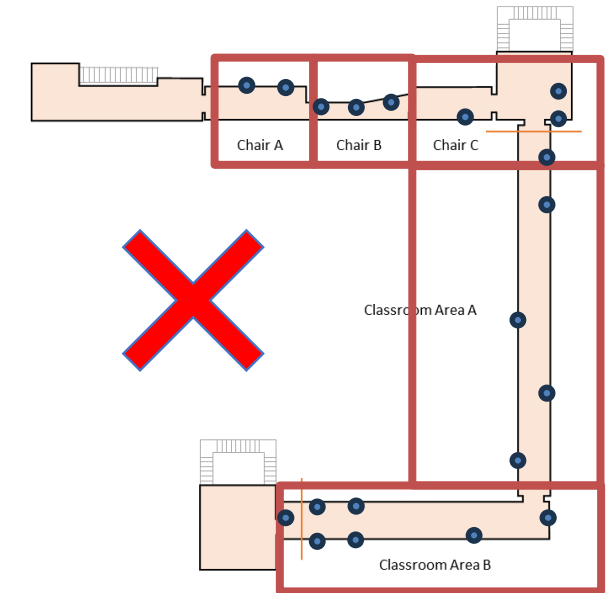
Experiment

Analysis

Discussion



Information volume chunking: Split the inherent structure of space



Semantics chunking: Spatial semantics not continuous



Try to find a better and more flexible solution

Design principle: how to chunk

Motivation

Related
Works

Design

Experiment

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Discussion

Use classification and hierarchy visualization to chunk:

👉 Indoors spatial design has certain connection and we need to visualize the potential relationship.

- Classification: **classify** indoors objects into several types.
- Hierarchy: **highlight** most important objects to reduce information overload.
- No rigid segmentation – **more flexible**.

Design principle: classification

Motivation

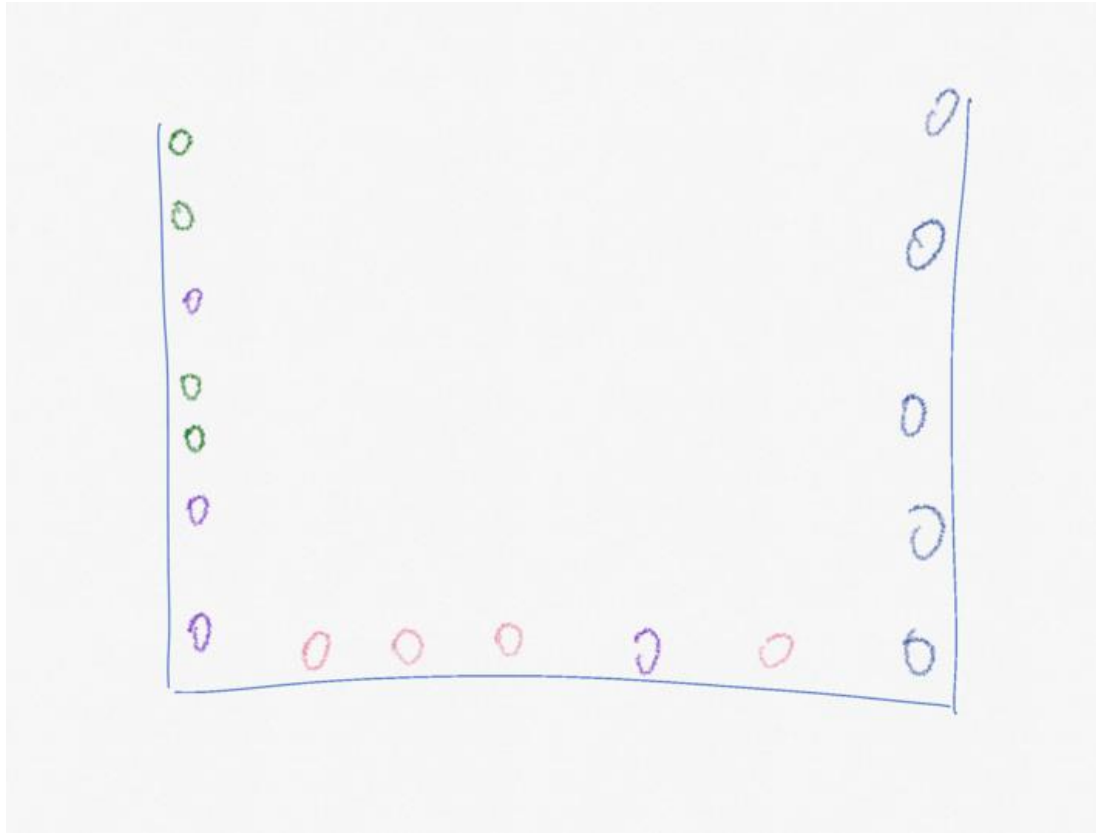
Related Works

Design

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Using different colors to represent different kinds of targets:

Category	RGB	Color
Cartography Dept	(0.13f , 0.54f , 0.13f , 1.0 f)	Green
Photogrammetry Dept	(0.8 f , 0.55f , 0.22f , 1.0 f)	Brown
Traffic Eng.	(0.0 f , 0.54f , 0.54f , 1.0 f)	Teal
Transportation Cons.	(0.62f , 0.16f , 0.94f , 1.0 f)	Purple
OpenLab	(0.7 f , 0.13f , 0.13f , 1.0 f)	Dark Red
Restrooms	(1.0 f , 1.0 f , 0.0 f , 1.0 f)	Yellow
Fire Hydrants	(1.0 f , 0.5 f , 0.5 f , 0.5 f)	Pink
Trash Bins	(1.0 f , 0.5 f , 0.0 f , 0.5 f)	Orange
Stereoscopes	(0.0 f , 1.0 f , 0.0 f , 0.5 f)	Light Green
Show boards	(0.0 f , 0.5 f , 1.0 f , 0.5 f)	Blue
Independent Objects	(0.8 f , 0.7 f , 0.0 f , 0.54f)	Olive
Highlight Color	(1.0 f , 0.0 f , 0.0 f , 1.0 f)	Red
Transparent Color	(0.0 f , 0.0 f , 0.0 f , 0.0 f)	White

Design principle: hierarchy

Motivation

Related Works

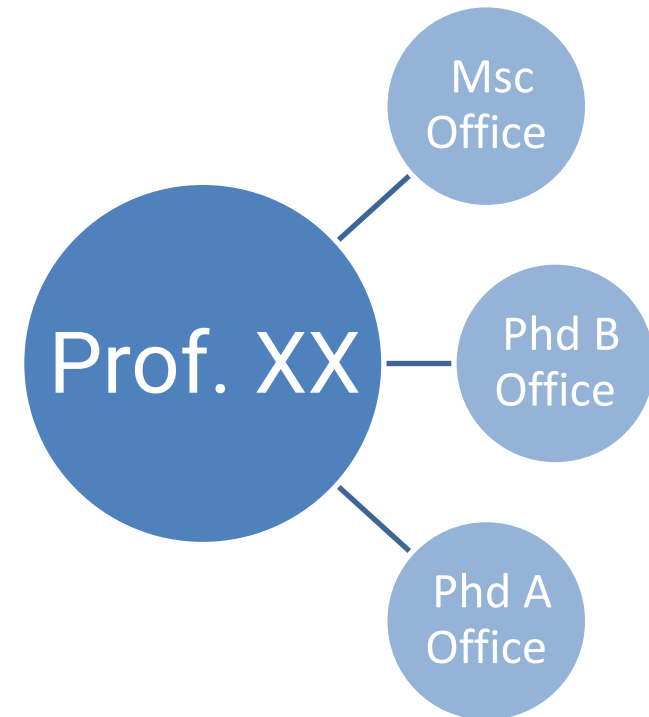
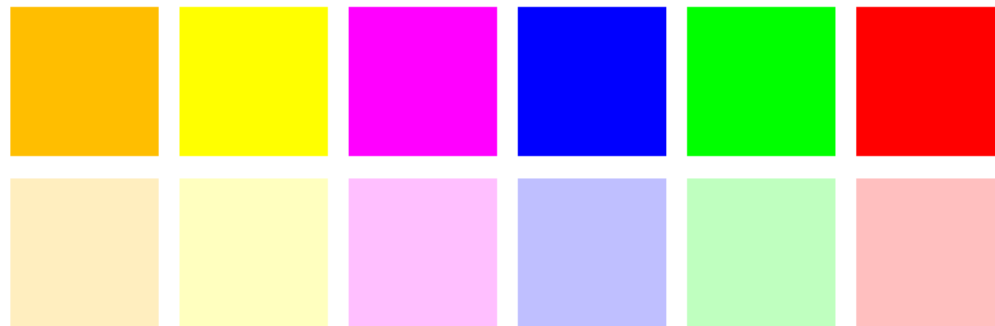
Design

Experiment

Analysis

Discussion

Highlight the key points: hierarchy of primary and secondary landmarks, using the **HSV color channel** to control color prominence and guide visual attention.



Platform and devices

Motivation

Related Works

Design

Experiment

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Discussion



Unity serves as a cross-platform game engine and development environment. (Version 2020.3.15f2, education license)



MRTK is a Mixed Reality Toolkit that constitutes interoperability across a diverse spectrum of software and hardware platforms. (MRTK 3, MIT license)



HoloLens 2, a product of Microsoft, is a mixed reality head-mounted. (Hololens 2, , Microsoft license)

Design visualization - simulator

Motivation

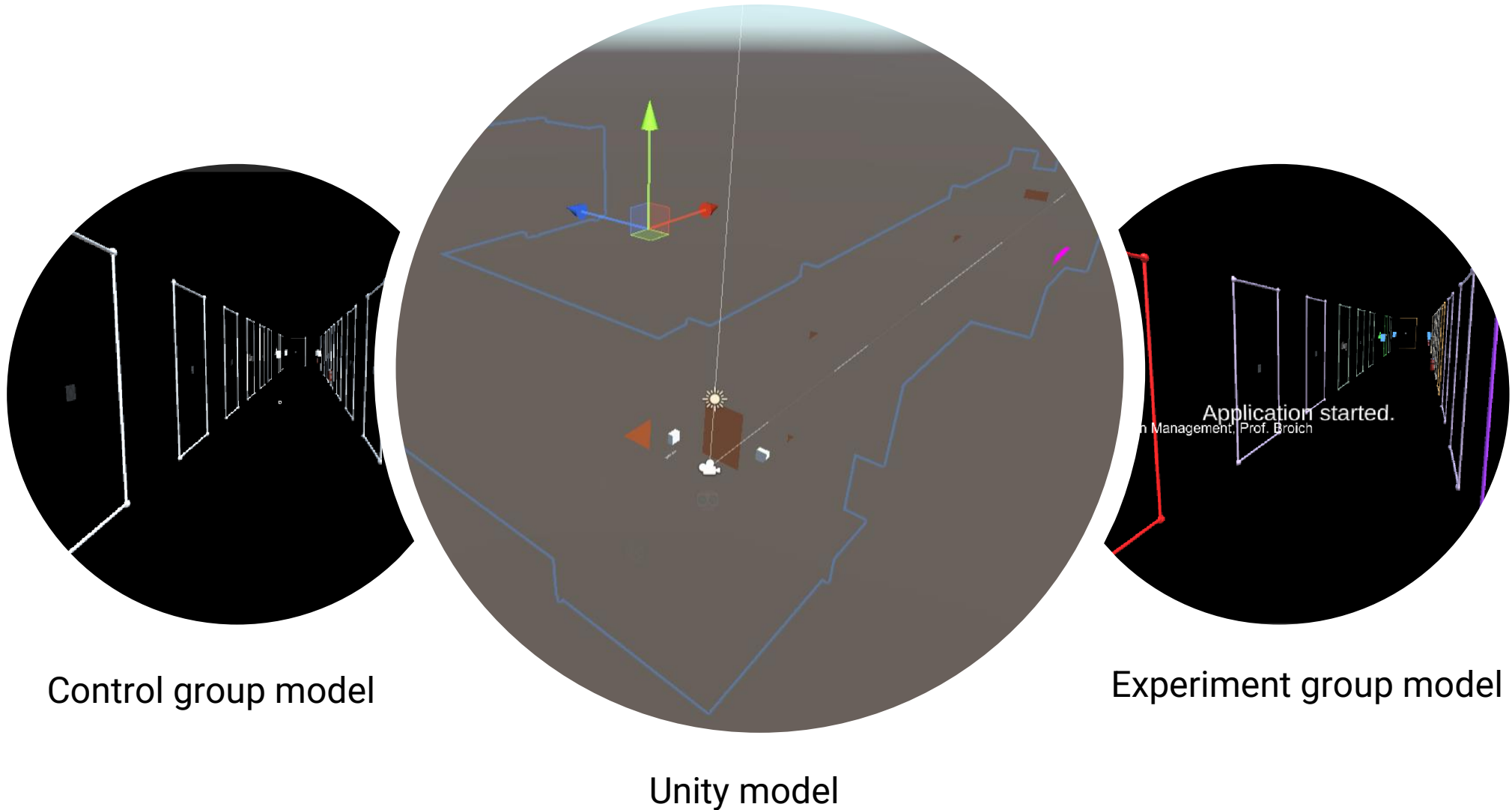
Related Works

Design

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Analysis

Discussion



Control group model

Unity model

Experiment group model

Design visualization - realword

Motivation

Related
Works

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Analysis

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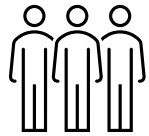


Control group real scene

Experiment group real scene



Participants



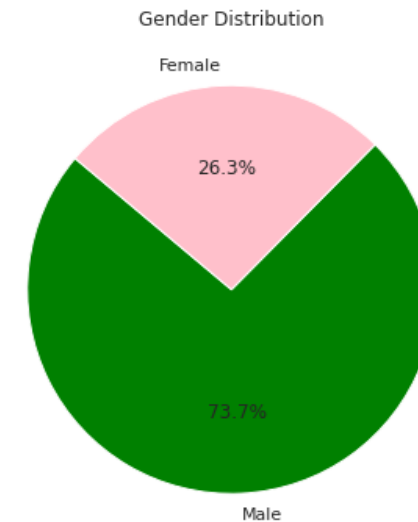
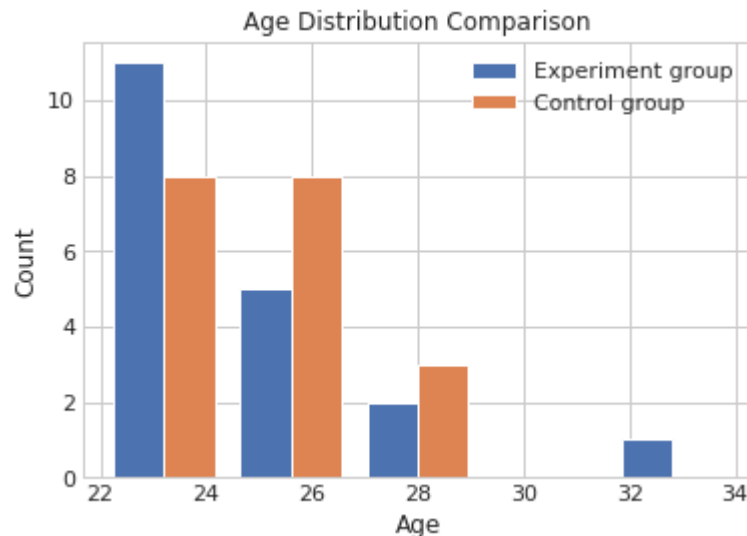
Experimental group: 19 volunteers.



Control group: 19 volunteers.

Age mainly from 24 ~ 28:

Participants are mainly male:



Experiment

Analysis

Discussion



Study area

Motivation

Related Works

Design

Experiment

















Analysis

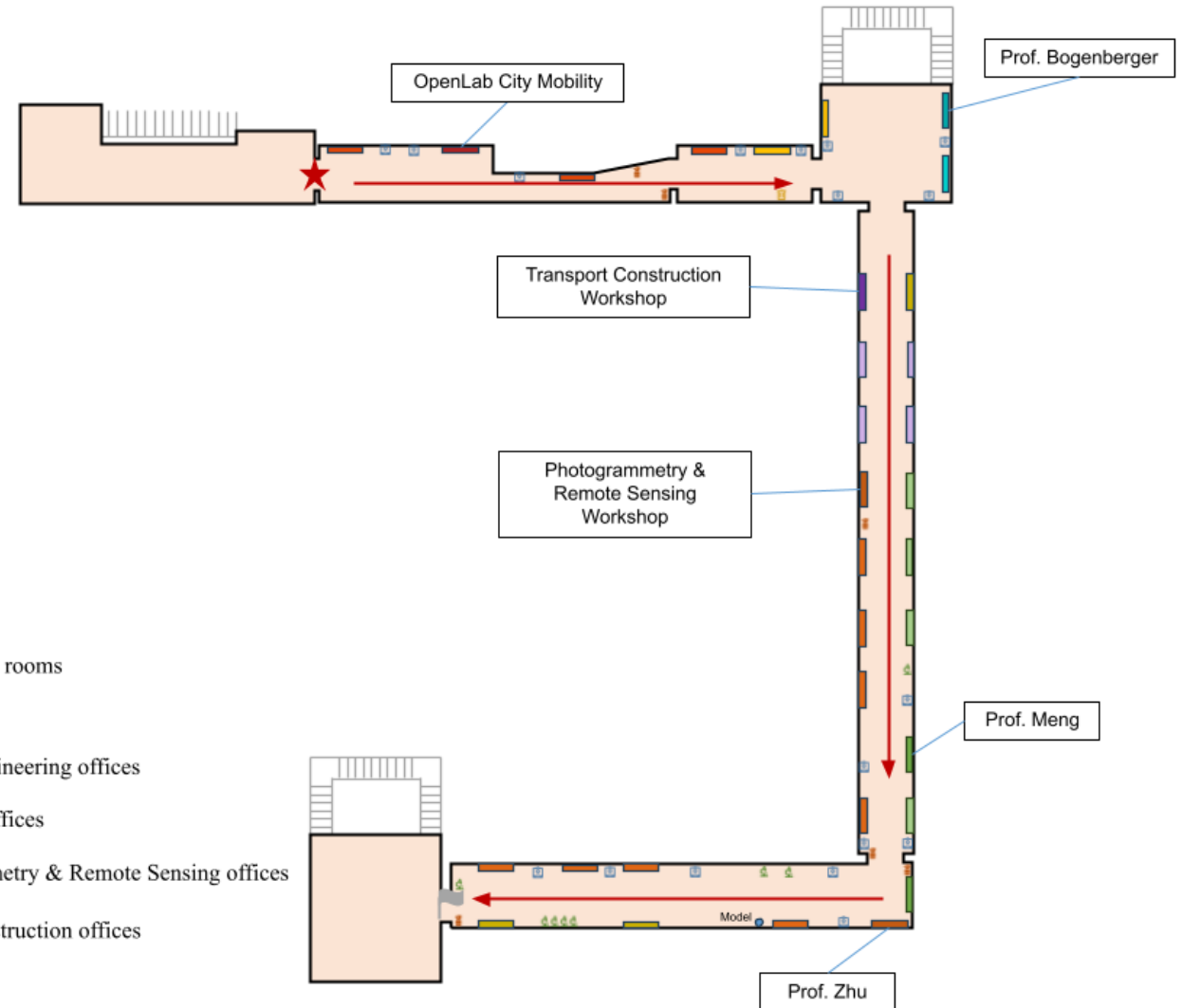
Discussion

Experimental Area Map

TUM Main Campus – 0507 – 10G

Legends

	Staircase or Corridor		Start Point
	Stairs		End Point
	Departure Route		Independent rooms
	Stereoscope		Toilet
	Show board		Traffic Engineering offices
	Trash bin		OpenLab offices
	Fire extinguisher		Photogrammetry & Remote Sensing offices
	Cartography offices		Traffic Construction offices



Experiment process

Motivation

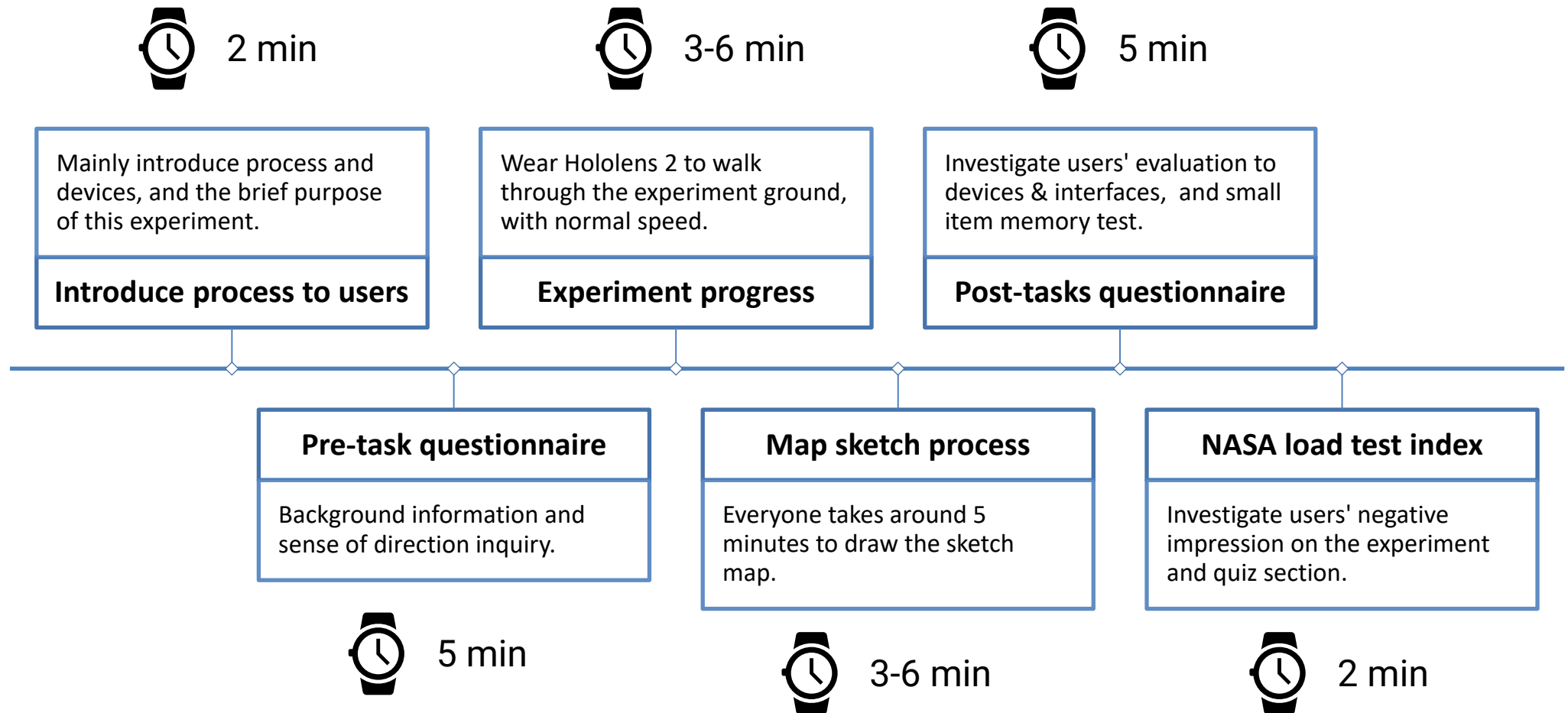
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Analysis

Discussion



Using Information Chunking for Spatial Learning based on Augmented Reality

Data preparation: structured data

Motivation

Related Works

Design

Experiment

Analysis

Discussion

Make each question's score into a vector:

1 = strongly agree / none, 7 = strongly disagree / a lot of

1	I am very good at giving directions.	strongly agree	1	2	3	4	5	6	7	strongly disagree
2	I have a poor memory for where I left things.	strongly agree	1	2	3	4	5	6	7	strongly disagree
3	I am very good at judging distances.	strongly agree	1	2	3	4	5	6	7	strongly disagree
4	My "sense of direction" is very good.	strongly agree	1	2	3	4	5	6	7	strongly disagree
5	I tend to think of my environment in terms of cardinal directions(N, S, E, W).	strongly agree	1	2	3	4	5	6	7	strongly disagree
6	I very easily get lost in a new city.	strongly agree	1	2	3	4	5	6	7	strongly disagree
7	I enjoy reading maps.	strongly agree	1	2	3	4	5	6	7	strongly disagree
8	I have trouble understanding directions.	strongly agree	1	2	3	4	5	6	7	strongly disagree



```
raduteThesis_Master > EXP_DATA > CO > 1 > {} data.json > ...  
1  {  
2    "direction": [3, 5, 3, 4, 5, 6, 1, 7, 1, 6, 6, 7, 3, 5, 5, 2, 6, 1, 1],  
3    "post": [5, 3, 3, 6, 6, 6, 6, 6, 6, 5, 5, 5, 7, 7, 7, 5, 4, 3, 5, 4, 6, 4, 6, 4],  
4    "nasa_1": [1, 1, 1, 1, 1, 1],  
5    "nasa_2": [11, 1, 1, 17, 17, 1]  
6  }
```

Data preparation: un-structured data

→ Sketch map

Motivation

Related Works

Design

Experiment

Analysis

Discussion

NAME	TYPE	X	Y	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19
Transport	0	-4.15	22	0	2	0	3	2	1	0	1	0	0	1	1	1	1	0	2	2	0	1
Chair of Tr	0	-4.15	-2	1	2	0	1	2	1	0	1	0	0	1	1	1	1	0	2	3	1	1
Toile	0	-4.1	-2	3	3	0	3	3	0	0	3	3	0	3	3	3	3	0	3	0	3	3
Show boar	1	-3.9	0.3	0	0	0	0	3	0	0	0	0	0	0	0	0	0	0	0	0	0	3
Show boar	1	-2	3.7	0	3	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	3
Hydrolog	0	-1.75	10.4	0	0	1	0	0	1	0	0	0	0	0	0	0	0	0	2	2	0	3
Transporta	0	1.75	10.4	0	0	0	1	0	1	1	0	1	1	1	1	0	0	0	1	1	1	1
TC Secrete	0	-1.75	14.5	0	0	0	1	0	1	1	0	0	0	0	1	0	0	2	0	1	0	3
TC library	0	1.75	14.5	0	0	0	1	0	1	1	3	1	1	1	3	0	1	1	1	1	1	1
TC prof. fn	0	-1.75	18.6	0	0	0	1	0	1	1	0	1	1	1	0	0	0	2	1	1	0	0
TC Dr. Led	0	1.75	18.6	0	0	0	0	0	1	1	0	1	1	1	0	0	0	0	1	1	1	1
Carto Libr	0	-1.75	22.7	3	2	3	0	3	1	1	0	1	3	3	3	3	3	3	3	2	3	3
Photogram	0	1.75	22.7	0	0	0	1	1	1	1	0	1	0	1	0	0	0	0	1	1	0	1
Carto Mic.	0	-1.75	28.8	0	3	3	0	0	1	1	0	1	0	1	0	0	3	3	3	0	3	3
PR Mic. of	0	1.75	28.8	0	0	3	1	1	1	1	0	1	0	1	0	0	1	0	1	1	0	1
Carto Dr.	0	-1.75	30.9	0	0	0	0	0	1	1	0	1	0	1	0	3	1	3	0	3	0	3
PR Mic. of	0	1.75	30.9	0	0	0	1	1	1	1	2	1	0	1	0	0	1	0	1	1	0	1
Cartograph	0	-1.75	39.4	3	3	3	3	2	1	1	0	2	3	3	3	0	3	2	2	2	3	3
PR Mic. of	0	1.75	39.2	0	3	0	1	1	1	0	1	3	1	0	3	1	0	1	1	0	0	0
Cartograph	0	-1.75	43.5	0	3	0	0	0	1	1	0	1	0	3	0	0	2	2	2	2	3	0
QZ node	0	1.75	43	0	0	3	0	0	1	1	0	0	0	3	3	0	0	0	0	3	0	0
Show boar	1	-1.5	45.5	0	0	0	3	0	0	0	3	0	0	0	0	0	0	0	0	0	0	0
Show boar	1	1.5	45.5	0	0	0	0	0	0	0	3	0	0	0	0	0	0	0	3	0	0	0
Show boar	1	1.5	39.5	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Show boar	1	-1.5	35	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Fire exting	1	1.5	24.5	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Fire exting	1	-1.5	46	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Stereo sco	1	-1.5	32.5	3	0	3	3	0	0	3	0	0	3	3	0	3	0	3	3	3	0	3
Show boar	1	2.5	3.7	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Show boar	1	4	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Free exting	1	-1.5	48.8	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	3	0	0
Free exting	1	27.5	50.3	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0
Stereo sco	1	17	50	3	3	3	3	3	3	3	3	3	0	3	3	0	3	3	3	3	3	3
Stereo sco	1	17.5	50	3	3	3	3	3	3	3	3	3	0	3	3	0	3	3	3	3	3	3
Stereo sco	1	19	50	3	3	3	3	3	3	3	3	3	0	3	3	0	3	3	3	3	3	3
Stereo sco	1	19.5	50	3	3	3	3	3	3	3	3	3	0	3	3	0	3	3	3	3	3	3
Stereo sco	1	27.5	47.5	0	0	0	3	0	3	0	0	0	0	0	0	0	0	0	3	0	0	0
Stereo sco	1	6	48.5	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0

```

3      },
4      "1": {
5          "1-1": "Azzzzzzzzzz",
6          "1-2": "zz",
7          "2-1": "zzzzzzzzzzzzzzzz",
8          "2-2": "zzzzzzzzzzzzzzzz",
9          "3-1": "zzzzzzzzzz",
10         "3-2": "zzzzzzzzzzzz",
11         "fire": 1,
12         "time": "05:52",
13         "age": 24,
14         "gender": 1
15     },
16     "2": {

```

Quantitative Evaluation: Assign scores for each spatial object.

Spatial Evaluation: Using edit distance.



Important objects: rooms
Un-important objects: affiliated objects

Background research

Motivation

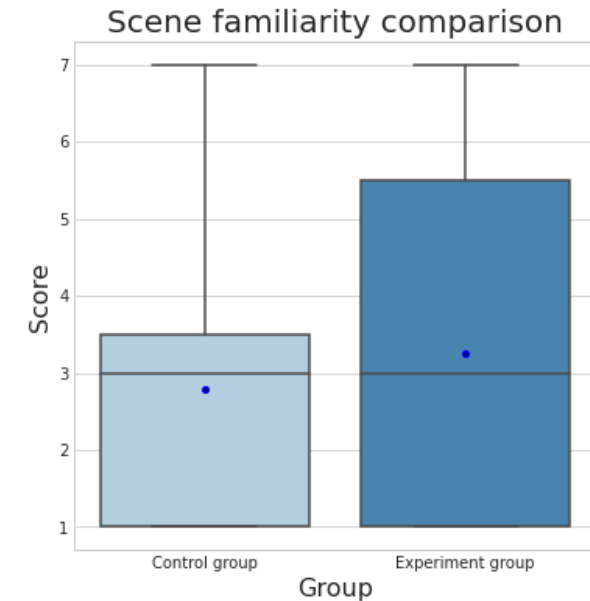
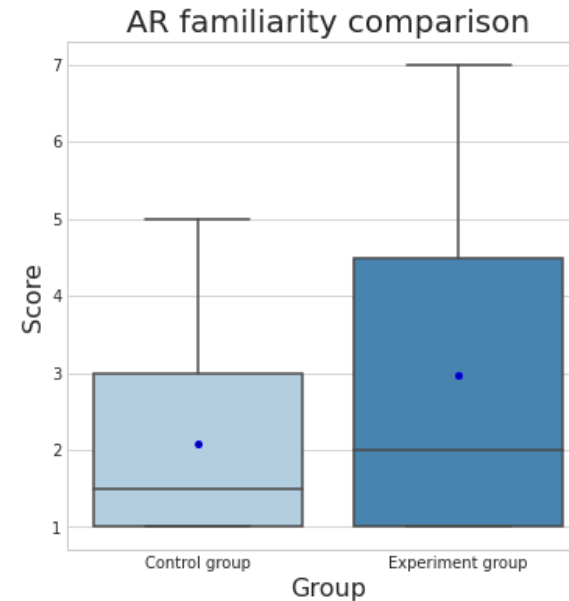
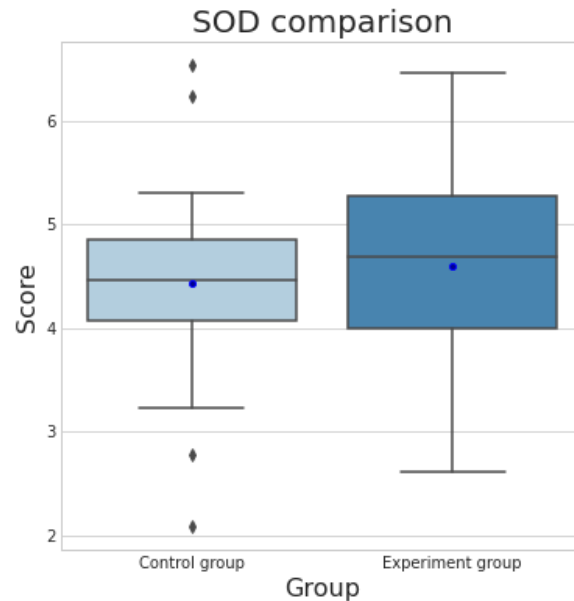
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Aspect	Levene P-Value	Diff P-Value
SOD	0.796	0.632
Scene Familiarity	0.173	0.480
MR Familiarity	0.187	0.112

No significant difference
about main background
factors.

Sketch map research: quantitative view - Overall

Motivation

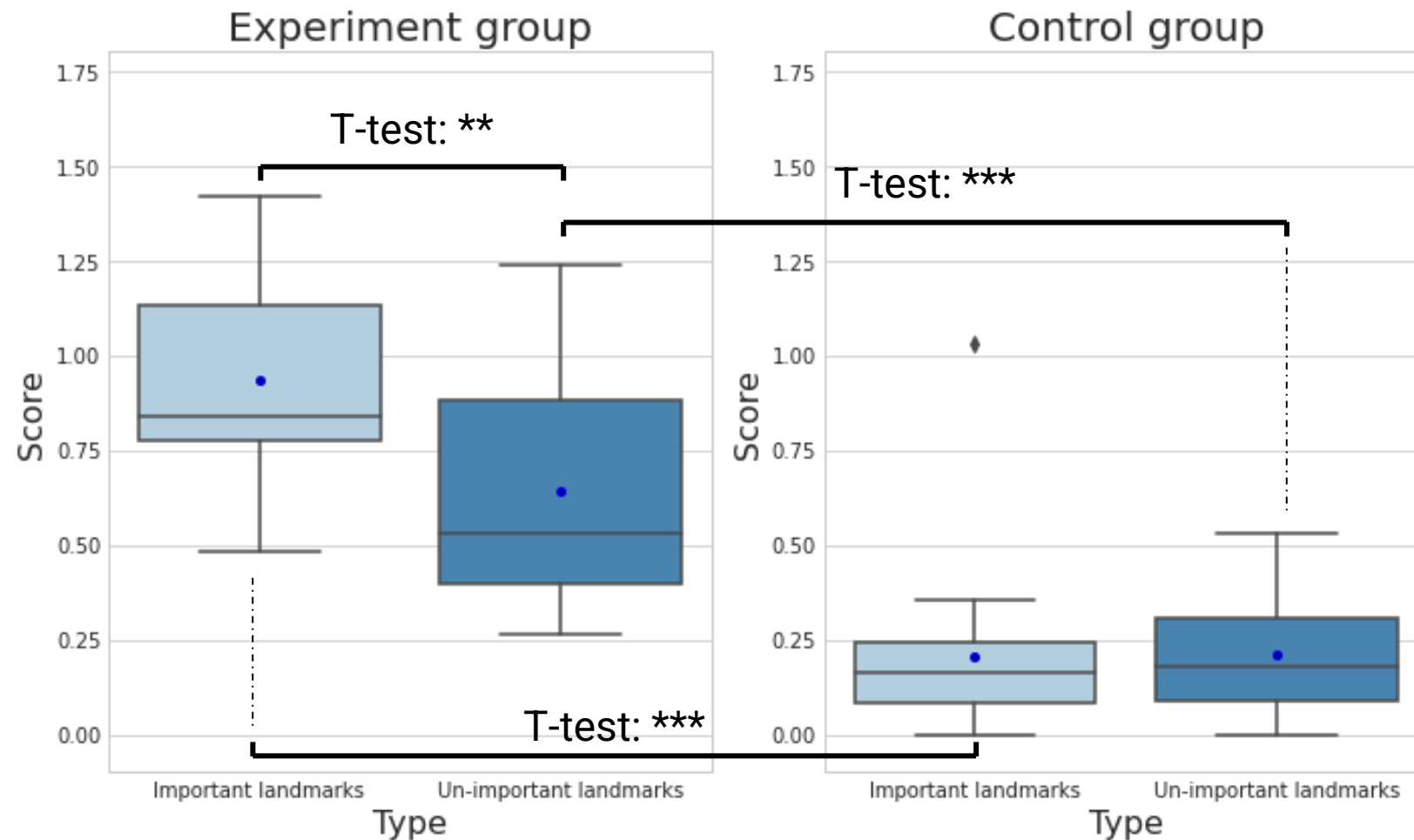
Related Works

Design

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Discussion



Experimental group acts better than Control group.

No significant difference between important landmarks and un-important landmarks recall in Control group.

Sketch map research: quantitative view - Blocks

Motivation

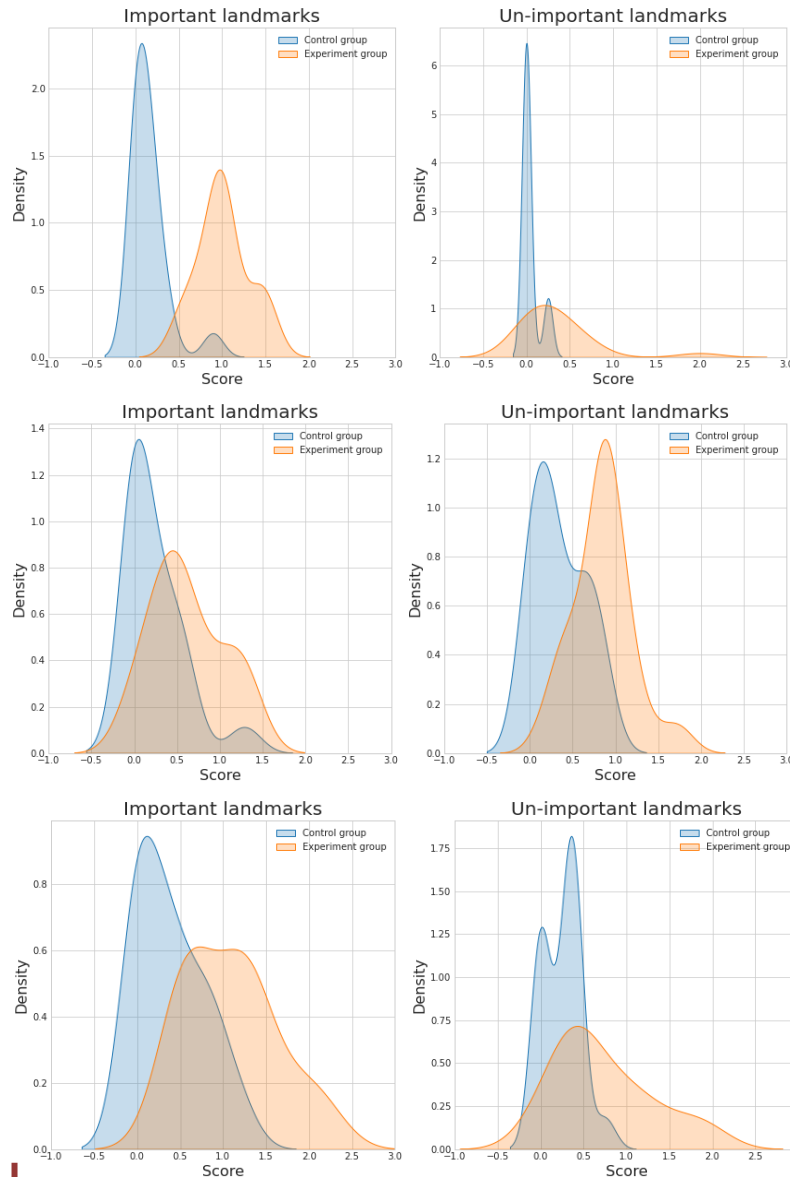
Related Works

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BLOCK 1

In any block, the experiment group acts better than the control group:

- **Important landmarks:** Exp. Group acts worse in Block 2; Con. Group acts worse in Block 1.

BLOCK 2

- **Un-important landmarks:** Exp. Group acts better in Block 2; Con. Group acts worse in Block 1.

BLOCK 3



Sketch map research: spatial view - Overall

Motivation

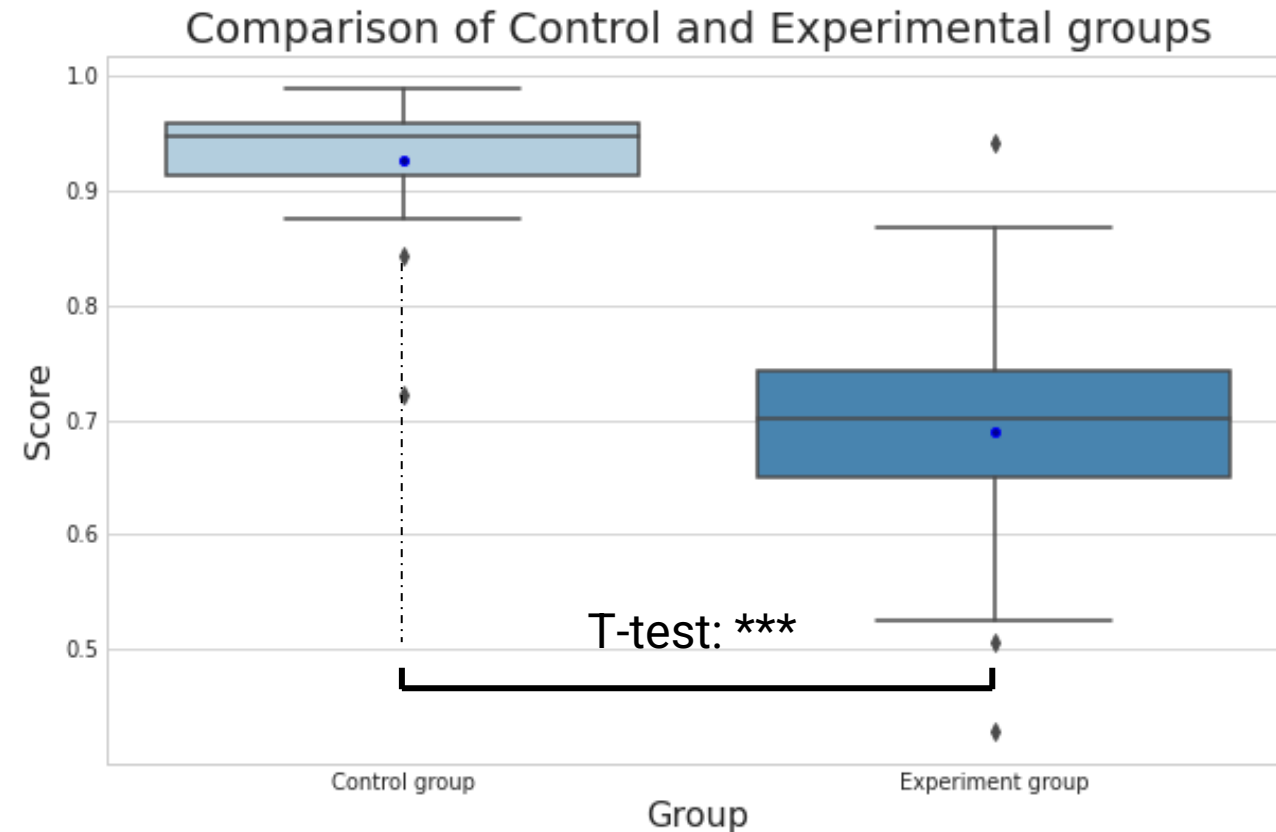
Related Works

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Experiment group shows better performance than Control group in the spatial relationship aspect, with significant difference.

Sketch map research: spatial view - Blocks

Motivation

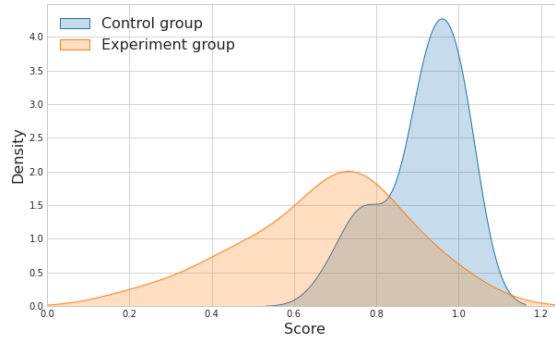
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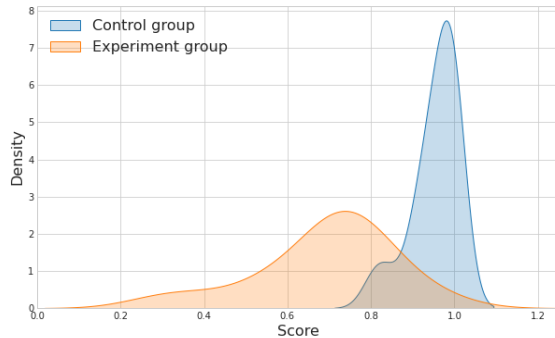
Experiment

Analysis

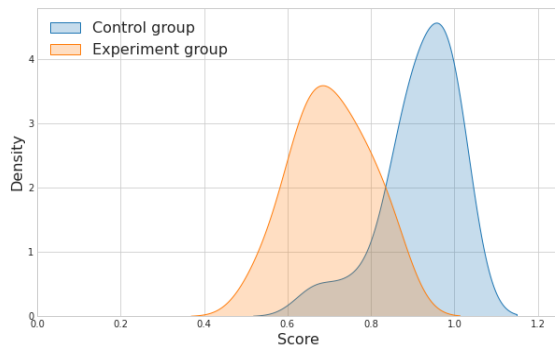
Discussion



BLOCK 1



BLOCK 2



BLOCK 3

1. Experiment group has better performance in each block;
2. Each block has comparable edit distance scores within Experiment group or Control group.

Small items memory test

Motivation

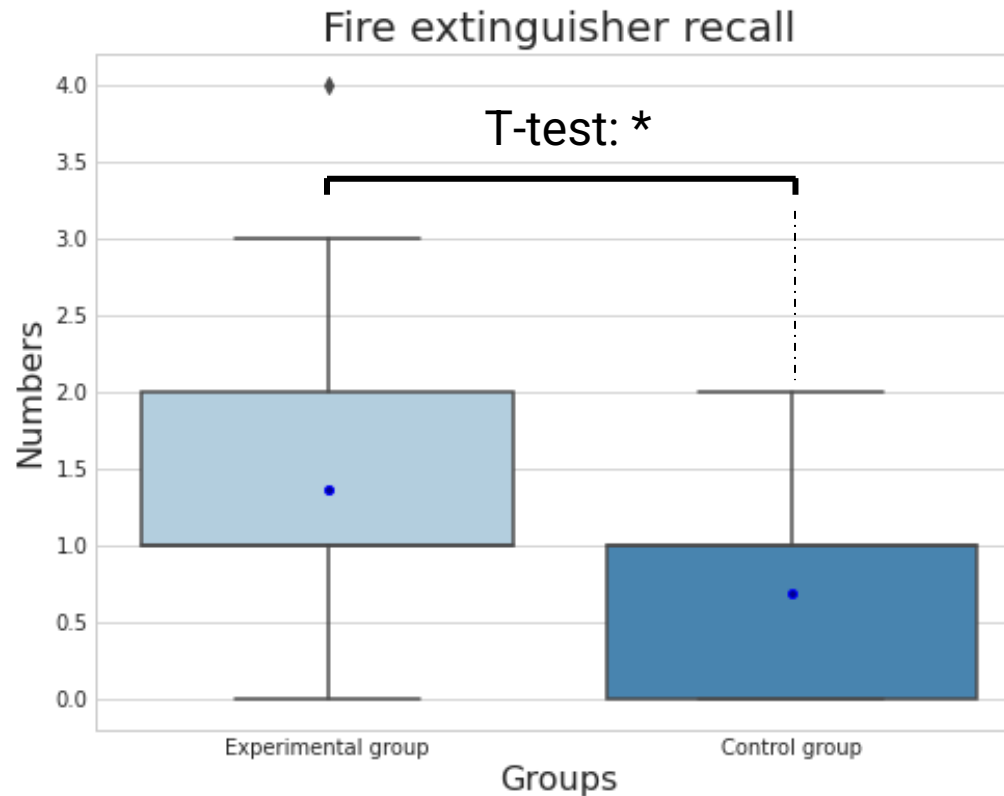
Related Works

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Experiment group acts better than Control group. However, in the absolute aspect, both groups don't achieve a high score in this part.

Post-task question analysis

Motivation

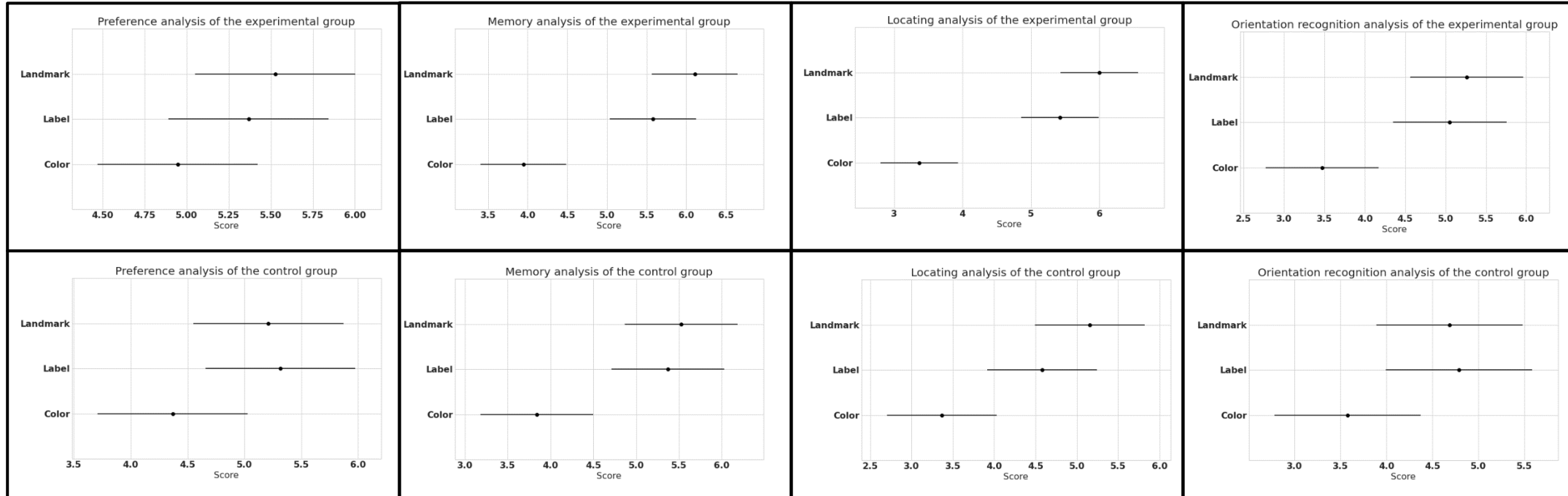
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We examine landmarks, labels and colors effects in four aspects: preference, memory, locating assistance and orientation assistance. Colors seem a relatively urgent part for further improvement (by Tukey HSD Test). It is caused by interference from natural light, device limitation, etc.

NASA Task Load Index

Motivation

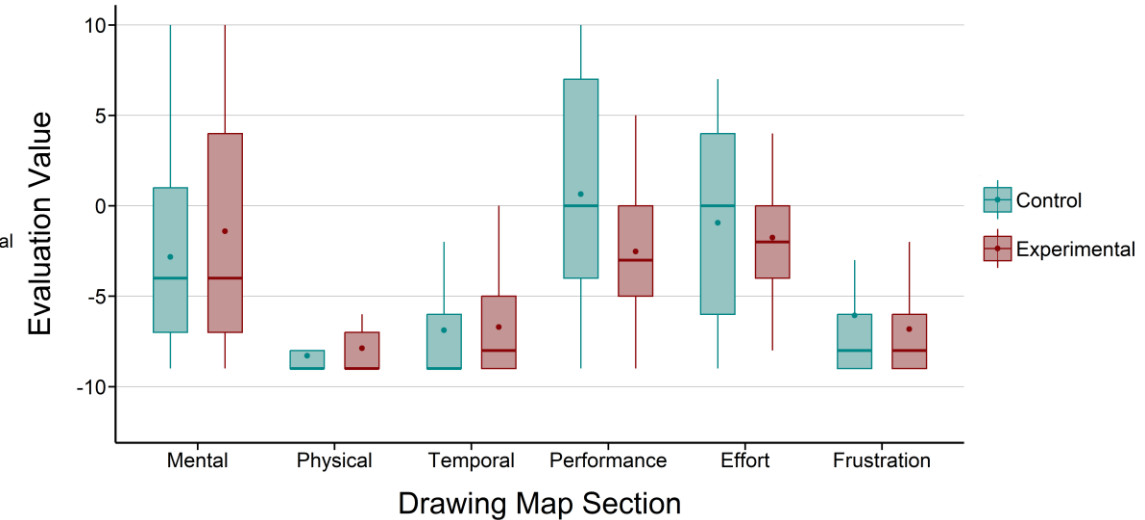
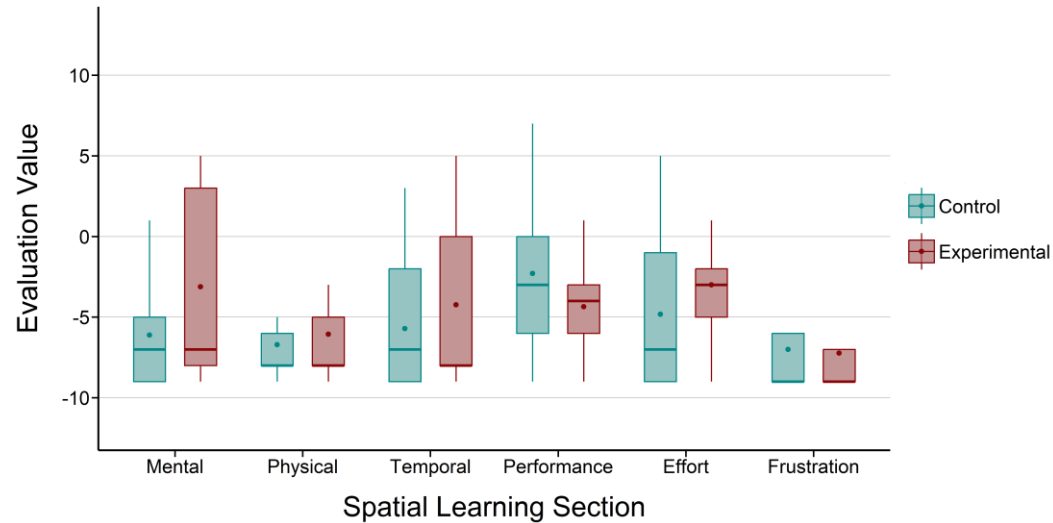
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Generally, Experiment group shows greater pressure than Control group, but feels better performance, which is corresponding to the analysis result (Dunning-Kruger effect).

Correlation analysis: collinearity diagnosis

Motivation

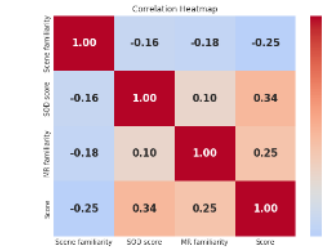
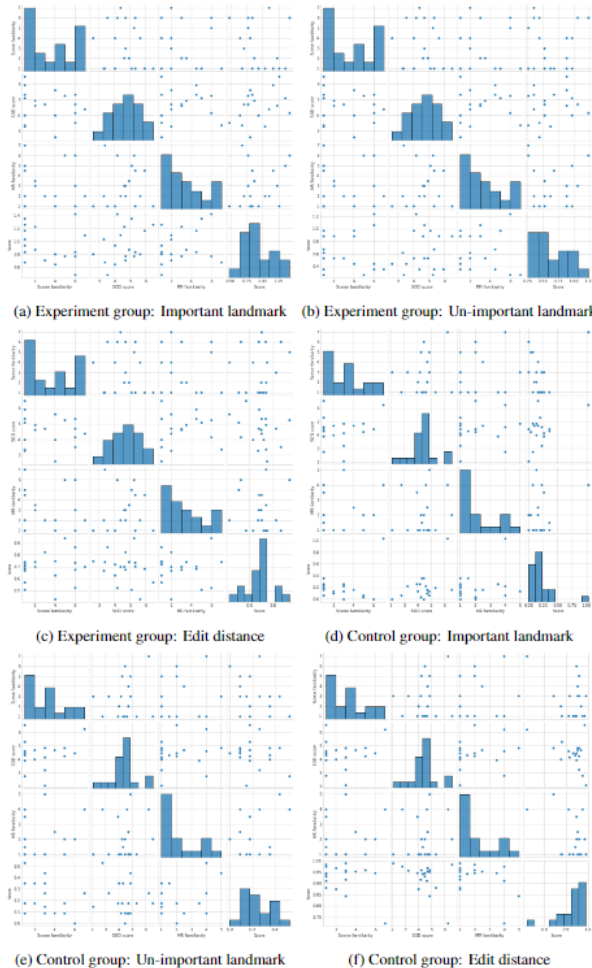
Related Works

Design

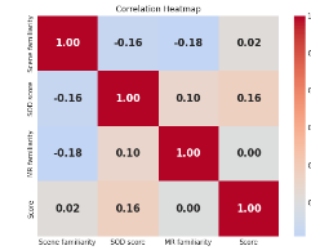
Experiment

Analysis

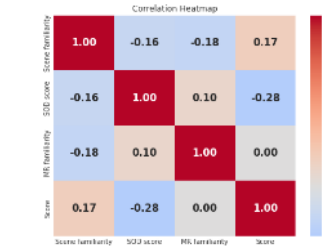
Discussion



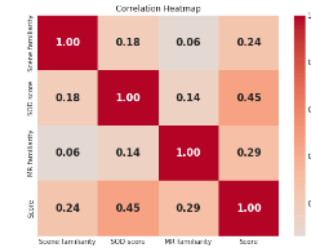
(a) Experiment group: Important landmark



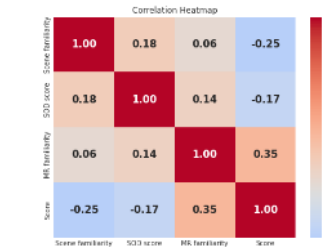
(b) Experiment group: Un-important landmark



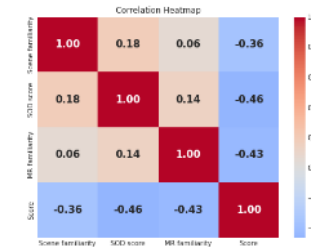
(c) Experiment group: Edit distance



(d) Control group: Important landmark



(e) Control group: Un-important landmark



(f) Control group: Edit distance

Scatter plot of variables

Heatmap of variables



Correlation analysis: classical models – EXP.

Motivation

Related Works

Design

Experiment

Analysis

Discussion

Model	MSE	R ²
Linear	0.199	-3.508
Polynomial	1.039	-22.509
Ridge	0.188	-3.264
Lasso	0.112	-1.542
DT	0.134	-2.026

Experimental Group: important landmarks

Model	MSE	R ²
Linear	0.030	-0.779
Polynomial	0.170	-9.233
Ridge	0.028	-0.699
Lasso	0.018	-0.106
DT	0.029	-0.429

Experimental Group: edit distance

Model	MSE	R ²
Linear	0.205	-2.582
Polynomial	0.456	-6.963
Ridge	0.184	-2.212
Lasso	0.069	-0.207
DT	0.235	-3.110

Experimental Group: un-important landmarks

The classical regression model shows no relationship between dependent and independent variables during the experimental group test.

Correlation analysis: classical models – CON.

Motivation

Related Works

Design

Experiment

Analysis

Discussion

Model	MSE	R ²
Linear	0.019	-3.170
Polynomial	0.017	-2.582
Ridge	0.019	-3.003
Lasso	0.011	-1.262
DT	0.031	-5.671

Control Group: important landmarks

Model	MSE	R ²
Linear	0.001	-2.274
Polynomial	0.002	-5.187
Ridge	0.001	-2.207
Lasso	0.001	-1.050
DT	0.001	-2.738

Control Group: edit distance

Model	MSE	R ²
Linear	0.040	-7.722
Polynomial	0.075	-15.491
Ridge	0.038	-7.296
Lasso	0.018	-2.999
DT	0.079	-16.429

Control Group: un-important landmarks

The classical regression model shows no relationship between dependent and independent variables during the control group test.

Correlation analysis: Spearman correlation

Motivation

Related
Works

Design

Experiment

Analysis

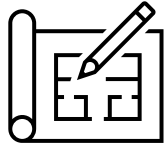
Discussion

Group & Dependent Variable	Scene familiarity	SOD	MR familiarity
Experimental & Important	0.240	0.213	0.384
Experimental & Un-important	0.895	0.767	0.936
Experimental & Edit distance	0.486	0.248	0.830
Experimental & Edit distance	0.146	0.491	0.715
Control & Un-important	0.362	0.810	0.422
Control & Edit distance	0.935	0.262	0.411

Spearman correlation p-values: as all the p-values > 0.05 , therefore, it is not considered that there is a relatively significant monotonic correlation between independent variables and dependent variables.

Discussion to the result

Motivation



Design a kind of chunking method: classification and hierarchy visualization.

Related Works



Use virtual guidance to help learning:

- The performance of Experiment group is better than Control group in many aspects.

Design



➤ Why better?

- NASA Task Load Index

- Control group with lower pressure: feel confusion and no motivation to remember things.
- Experiment group with higher pressure: get touch with organized information, with **a motivation to remember things**.

Experiment

Analysis

Discussion

- Blockwise analysis: **No great difference** in edit distance, low score in Block 2.
- Small and un-important items: Experiment group is better than control group, however, the memory for un-important items **still needs to be improved**.
- Correlation analysis: Our system suits **users from different backgrounds**.

Scene transferability

Motivation

Related Works

Design

Experiment

Analysis

Discussion

- Museum of Art and History
 - What → guide visitors through exhibitions
 - How → using virtual landmarks and color coding to categorize art and historical periods
- Conference Center
 - What → locate meetings or meeting rooms
 - How → with virtual signposts and color-coded schedules
- Library
 - What → find books and study areas
 - How → using virtual landmarks and interactive sub-maps
- Shopping Mall...
- University Campus...



[This Photo](#) by Unknown Author is licensed under [CC BY-NC](#): Museum



[This Photo](#) by Unknown Author is licensed under [CC BY-SA](#): Conference center

Limitations

Motivation

Related
Works

Design

Experiment

Analysis

Discussion

1. Limited participant pool: Future research should involve a more diverse set of participants.
2. Narrow experimental environment: diverse architectural contexts are needed.
3. Color design challenges: take care of actual visualization effect in the device.
4. Questionnaire refinement: improving the questionnaire design by incorporating a broader range of assessment methods.
5. Memory retention for inconspicuous landmarks.



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Thanks for your participation and listening!

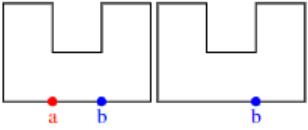
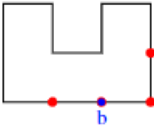
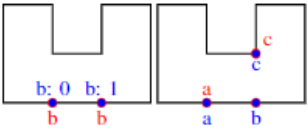
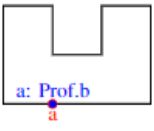
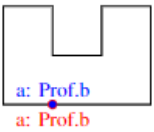
Feel free to raise any questions!

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Appendix: Quantify sketch map

Situation	Score
	0: Completely erroneous labeling or omission of labeling will both be recorded as a score of zero.
	0: Users may randomly label numerous unnamed landmarks in a certain area based on their impression that it contains numerous elements. However, if they cannot accurately indicate the corresponding landmark locations and content, nor provide meaningful spatial reference information, their score is also considered as zero in such cases.
	1: Users fall into two categories: In the first scenario, a user can label a landmark but cannot recall its specific content; however, they are aware of the category to which the landmark belongs, which warrants a score of 1. Alternatively, users who cannot recall the specific content or category of a landmark, yet provide sufficiently accurate surrounding annotations, demonstrating their comprehension of the spatial distribution within that area, also receive a score of 1.
	2: Users are capable of accurately placing marks and providing corresponding labels, although lacking in providing more detailed information. Such annotations can demonstrate the users' remembrance of the marked object and its relative spatial location, serving as global anchors for evaluating the spatial and semantic accuracy of other landmarks with less informational content.
	3: Users not only demonstrate accurate recall of the respective landmark's location but also provide detailed information, thereby ensuring semantic clarity as well.

	L	e	v	e	n	s	h	t	e	i	n
L	0	0.5	1	1.5	2	2.5	3	3.5	4	4.5	5
e	0.5	0	0.5	1	1.5	2	2.5	3	3.5	4	4.5
v	1	0.5	0	0.5	1	1.5	2	2.5	3	3.5	4
e	1.5	1	0.5	0	0.5	1	1.5	2	2.5	3	3.5
n	2	1.5	1	0.5	0	0.5	1	1.5	2	2.5	3
s	2.5	2	1.5	1	0.5	0	0.5	1	1.5	2	2.5
h	3	2.5	2	1.5	1	0.5	0	0.5	1	1.5	2
t	3.5	3	2.5	2	1.5	1	0.5	0	0.5	1	1.5
e	4	3.5	3	2.5	2	1.5	1	0.5	0	0.5	1
i	4.5	4	3.5	3	2.5	2	1.5	1	0.5	0	0.5
n	5	4.5	4	3.5	3	2.5	2	1.5	1	0.5	0

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Quantitative score assignment

Edit distance

Appendix: Difference Testing

