

A User Study to Compare Four Uncertainty Visualization Methods for 1D and 2D Datasets

Jibonananda Sanyal, Song Zang, Robert J. Moorhead

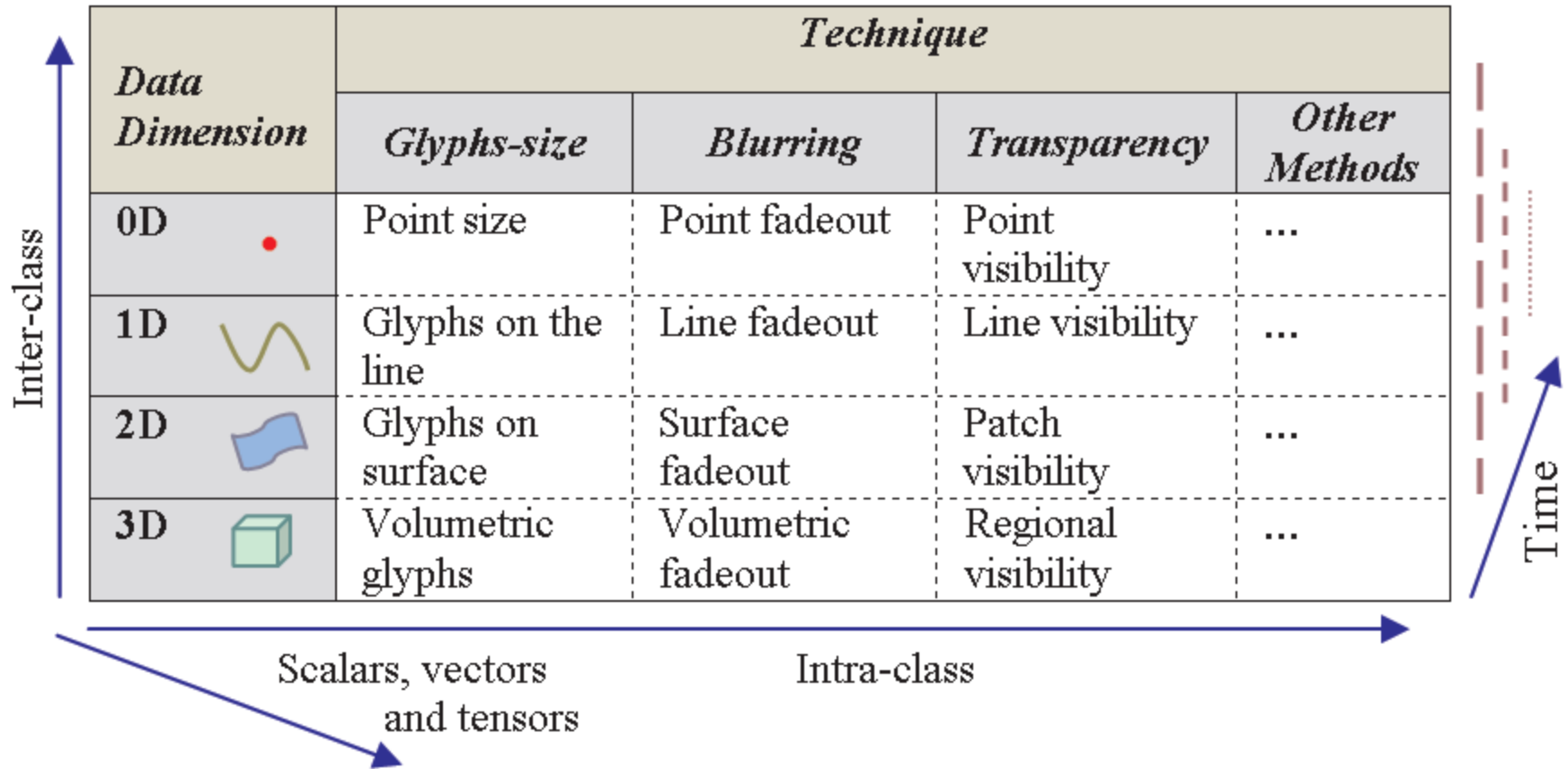
Background

- Define uncertainty
 - *CIPM - Statistical Method
 - Scientific Judgment
 - *NIST - A combined standard uncertainty
- Classify uncertainty visualizations
- Thomas presented a typology to visualize uncertainty information pertinent to geospatially referenced data.
- Olston, Mackinlay: statistical uncertainty & bounded uncertainty.

Background

- Schmidt presented the multivariate nature of bathymetric uncertainty.
- Rheingans visualized the positional uncertainty of molecules.
- Lundstroom presented animation method to illustrate uncertainty in medial volume renderings.
- Some user studies to understand effectiveness of uncertainty visualization but they were specific studies.

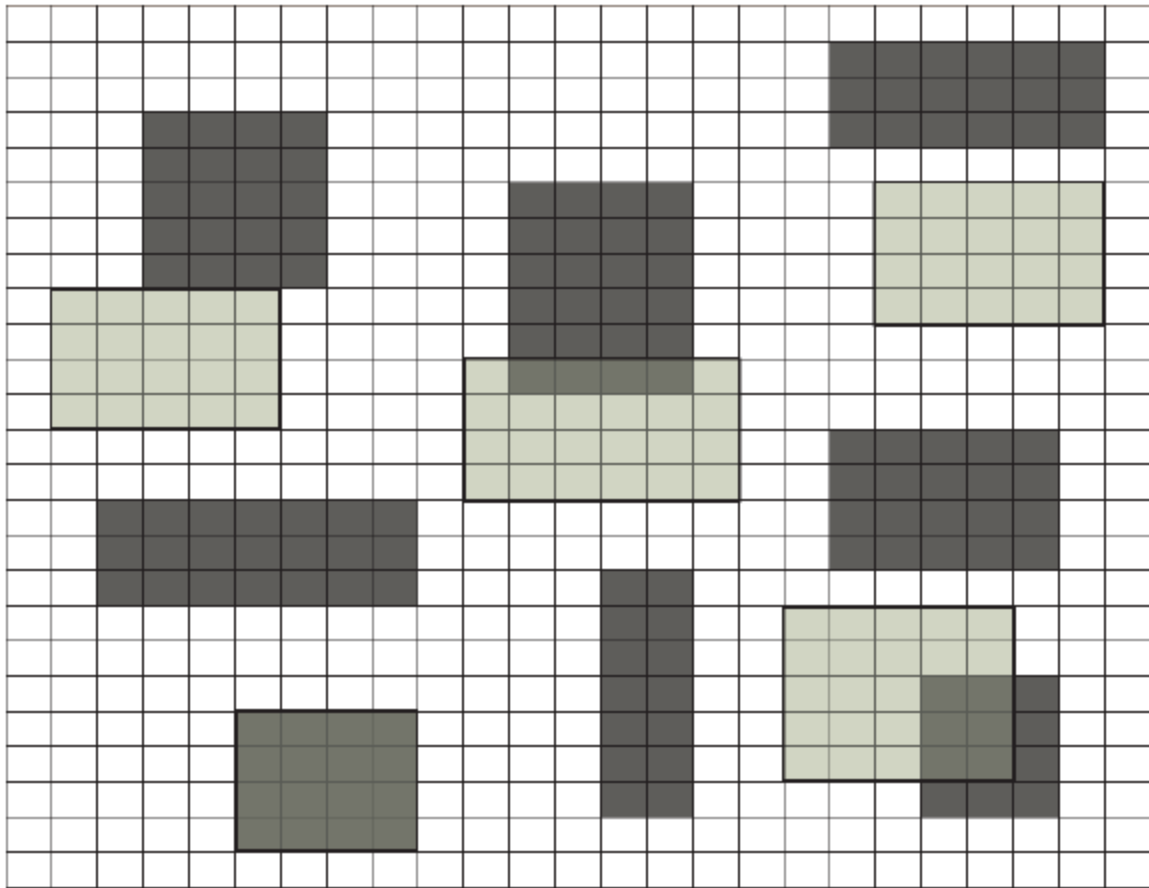
Uncertainty Evaluation Framework



Study Design

- Data Generation
- Visualization Techniques
- Participant Tool
- User-study tasks
- Interface design
- Participant Training
- Identifying tree parameters
- Main study

Data Generation



Uncertainty
feature

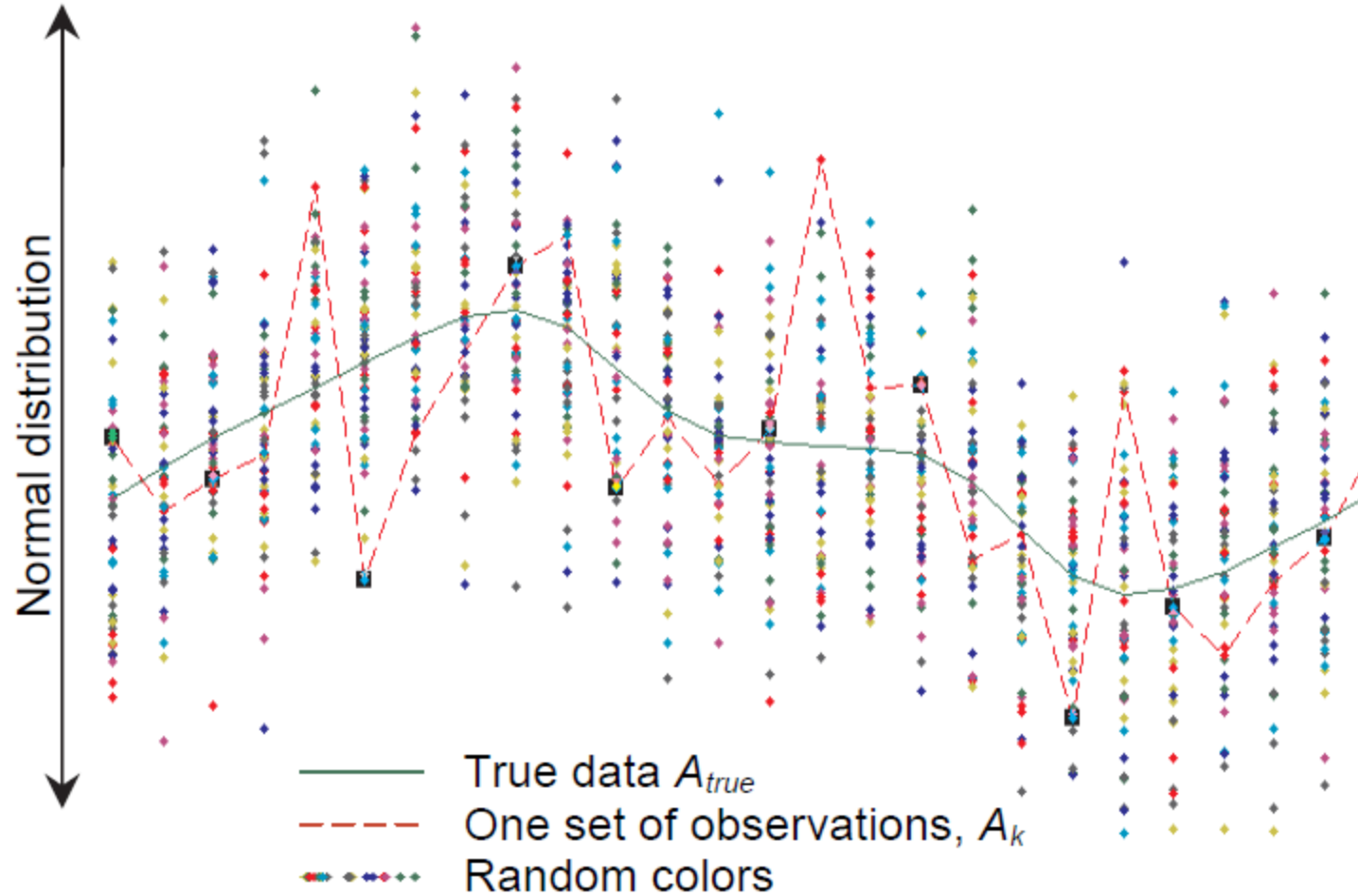


Data feature

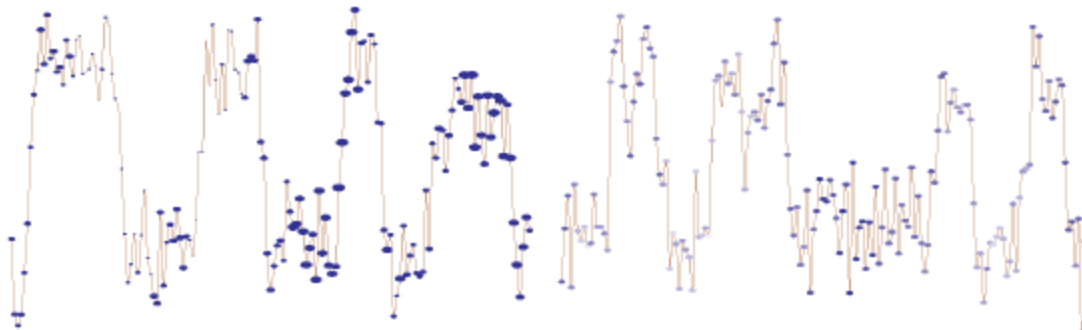


Overlap of data
and uncertainty
feature

Data Generation



Visualization Techniques

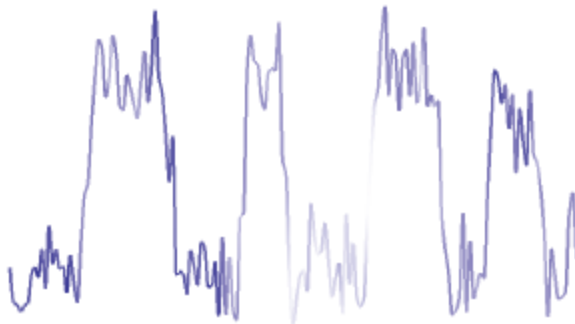


• High uncertainty
· Low uncertainty

a.

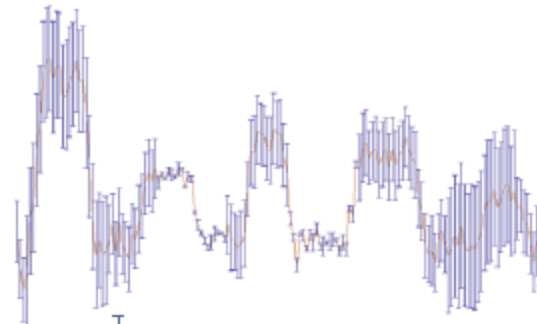
• High uncertainty
• Low uncertainty

b.



□ High uncertainty
■ Low uncertainty

c.



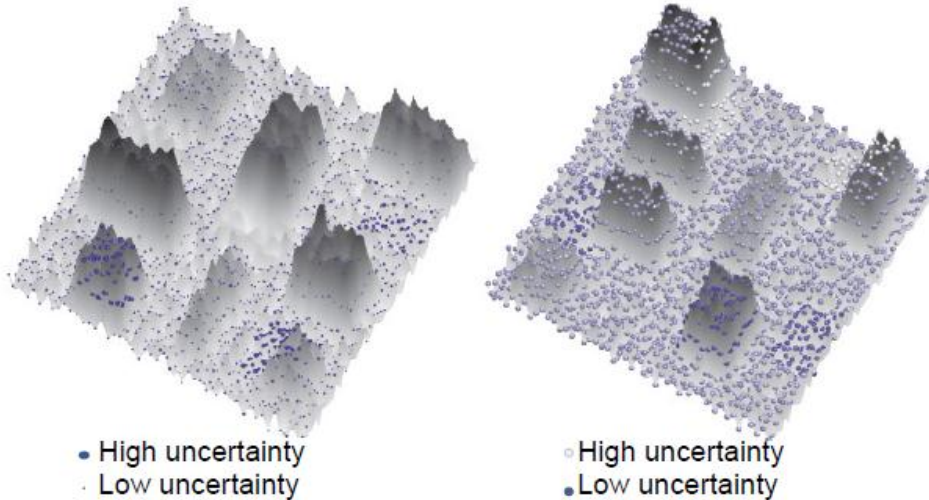
| High uncertainty
± Low uncertainty

d.

Uncertainty visualization techniques explored for 1D datasets.

- Scaling the size of glyphs
- Altering the color attribute of glyphs
- Color-mapping the surface of data with uncertainty
- Using the traditional error bars.

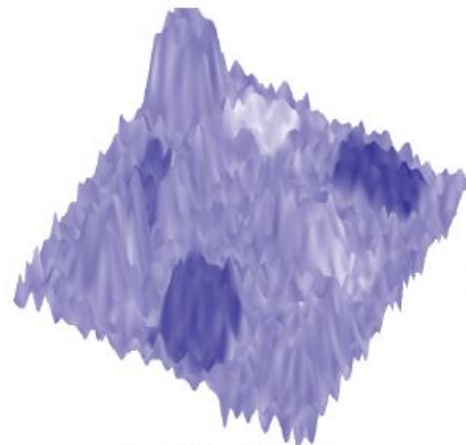
Visualization Techniques



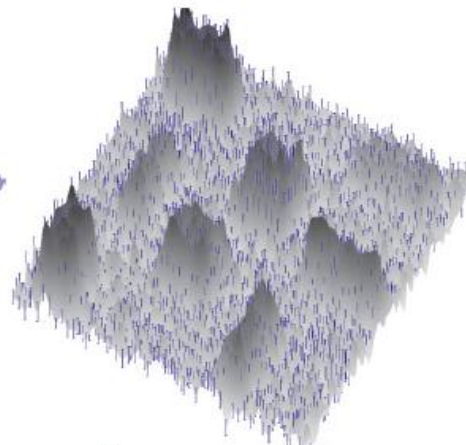
a.

○ High uncertainty
● Low uncertainty

b.



c.



d.

Uncertainty visualization techniques explored for 2D datasets.

- Scaling the size of glyphs
- Altering the color attribute of glyphs
- Color-mapping the surface of data with uncertainty
- Using the traditional error bars.

Participant Tool

- 36 participants: 6 participants in a pilot study, 27 in main study (2 researchers, 3 trial run people) (27 male and 19 female).
- Most people understand statistics, charts, graph.
- 15 hours weekly.

User-study Tasks

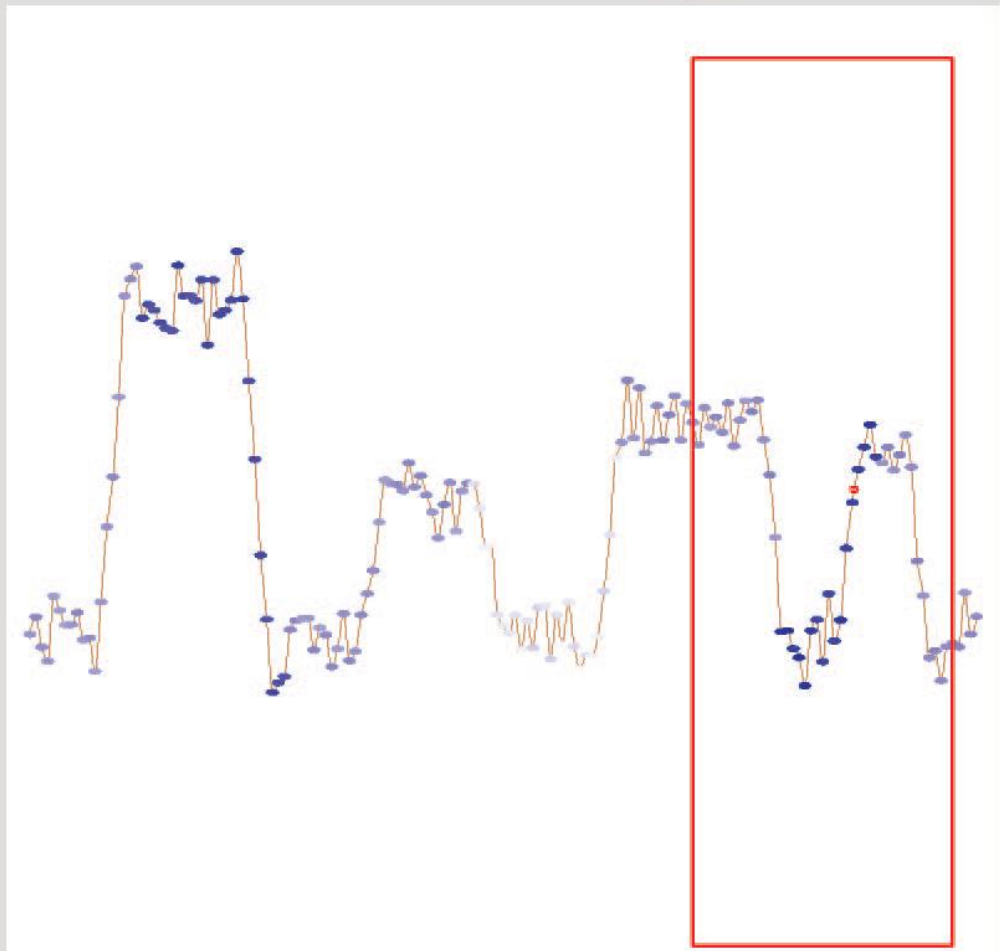
- Search Tasks:
 - Searching for locations of high or low uncertainty.
 - Expect users perform similarly with search tasks.
- Counting Tasks:
 - Counting data features (any peak in data) and uncertainty features.

Interface Design – 1D

Wizard of Oz

Question number: 5 of 8

Identify the spot of least uncertainty in the marked area.



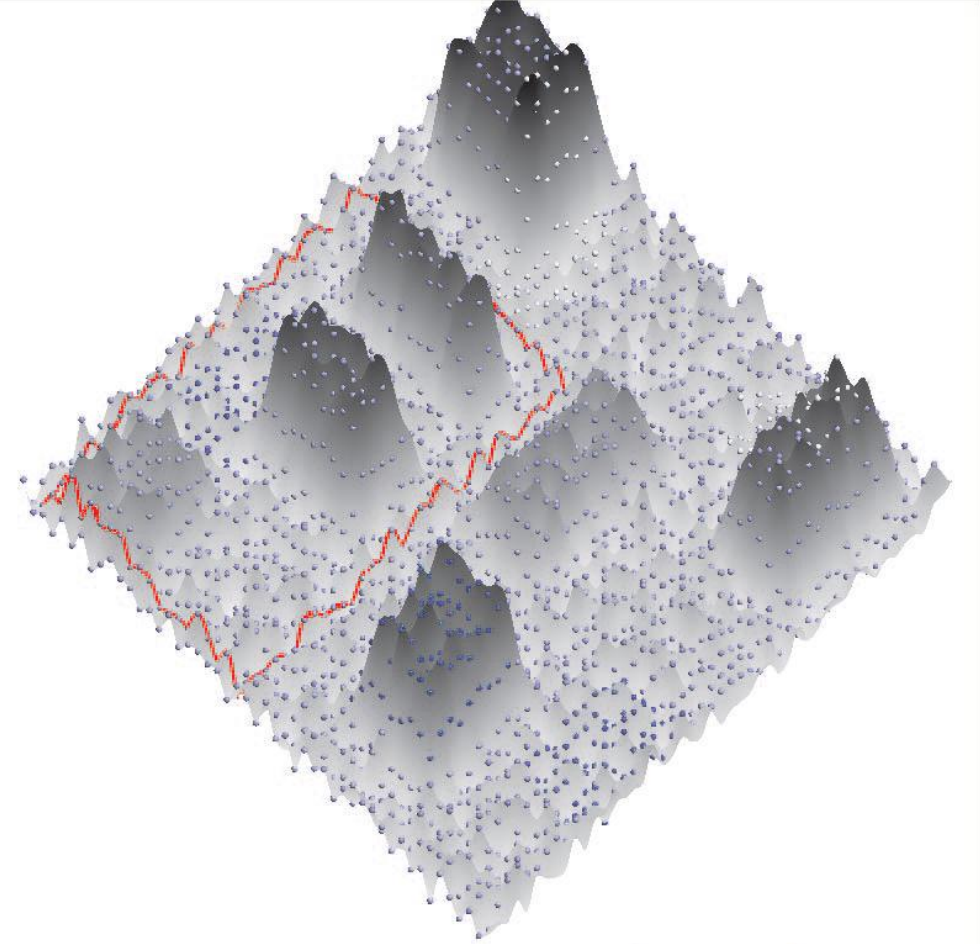
Most uncertainty Least uncertainty

Click Accept to confirm. Click Next for next question.

Accept Next

Interface Design – 2D

Wizard of Oz



Question number: 13 of 96

How many data features are present in the marked area?

0

1

2

3

Click Accept to confirm. Click Next for next question.

Accept Next

High uncertainty Low uncertainty

Participant Training

- 15 – 20 minutes to brief the participant about user study.
- Users were assigned computer with training module.
- Familiarized users with 8 posed questions.

Identifying Free Parameters

- Pilot study
- 6 participants could use data from 4 of participants.
- Three size of error bars & glyph → compare small, medium and large presentations.
- 1 person – 144 questions.
- 1D data: use glyphs that had the largest size among the three evaluated sizes.
- 2D data: three glyph sizes used for glyph color-mapping.

Main Study

- 27 participants
- 98 questions (48 ques for 1D data, 48 ques for 2D data)
- 4 questions:
 - How many data features are present in the marked area?
 - How many uncertainty features are present in the marked area?
 - Identify the spot of least uncertainty in the marked area.
 - Identify the spot of most uncertainty in the marked area.

Methods of Analysis

Data Dim	Task t- values (df)	Significantly better	Significantly worse
1D	Search for location of low uncertainty (SLU) $F(3, 104) = 16.176, p < .0001$	Glyph size** Glyph size** Glyph size* Error bars*	Glyph color Surface color Error bars Surface color
	Search for location of high uncertainty (SHU) $F(3, 104) = 13.874, p < .0001$	Glyph color** Glyph color** Surface color** Surface color**	Glyph size Error bars Glyph size Errorbars
	Count uncertainty features (CUF)	No significant difference	
	Count data features (CDF)	No significant difference	
2D	Search for location of low uncertainty (SLU) $F(3, 104) = 6.775, p < .0001$	Surface color* Surface color* Surface color*	Glyph size Glyph color Error bars
	Search for location of high uncertainty (SHU) $F(3, 104) = 48.144, p < .0001$	Surface color* Surface color** Glyph size** Glyph color**	Glyph size Error bars Error bars Error bars
	Count uncertainty features (CUF) $F(3, 104) = 7.534, p < .0001$	Surface color* Surface color* Surface color*	Glyph size Glyph color Error bars
	Count data features (CDF) $F(3, 104) = 25.910, p < .0001$	Glyph size* Glyph size** Glyph size* Glyph color** Error bars**	Glyph color Surface color Error bars Surface color Surface color

* $p \leq .0083$

** $p \leq .0001$

ANOVA results for pairwise comparison on techniques

Methods of Analysis

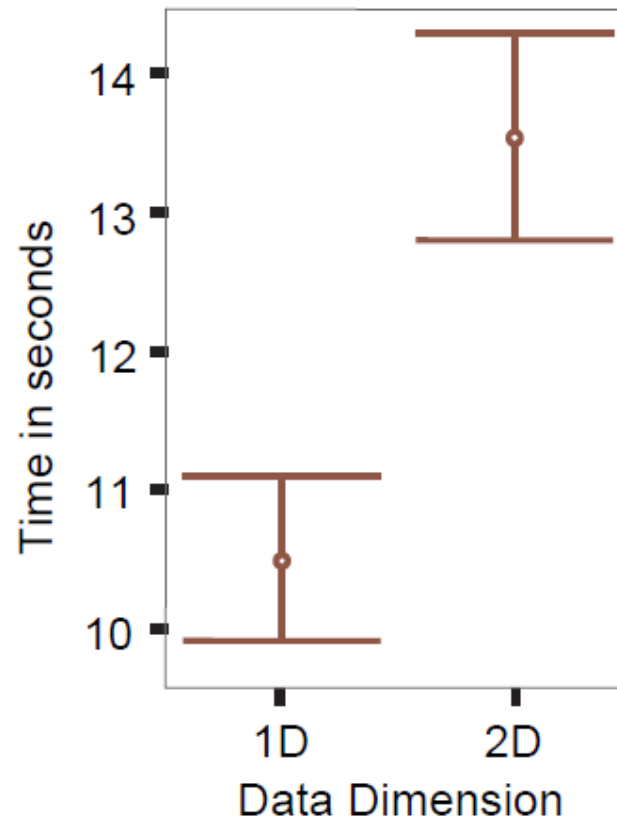
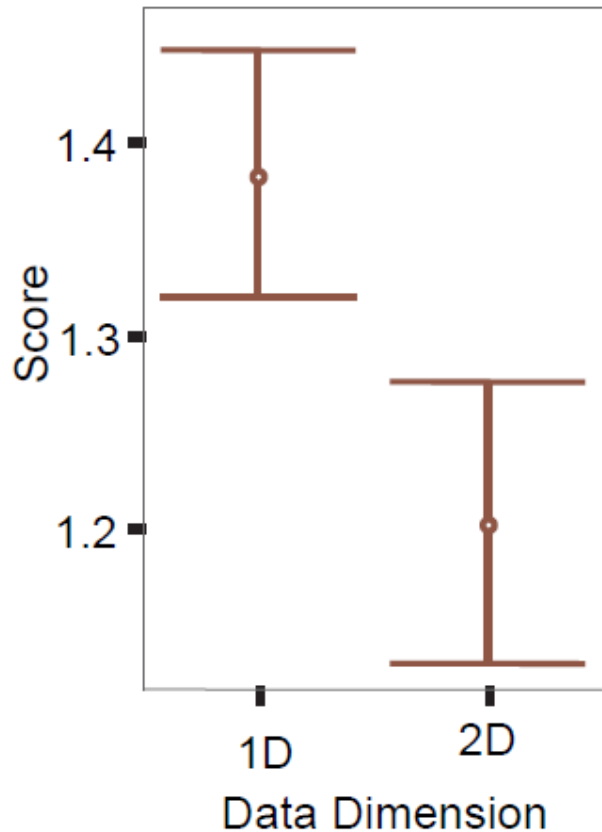
Data Dim	Technique t- values (df)	Significantly better	Significantly worse
1D	Glyph size $F(3, 104) = 13.499, p < .0001$	SLU**	SHU
		SLU**	CUF
		CDF**	SHU
	Glyph color $F(3, 104) = 6.880, p < .0001$	SHU*	SLU
		CDF**	SLU
		CDF*	CUF
	Surface color $F(3, 104) = 17.295, p < .0001$	SHU**	SLU
		CDF**	SLU
		CDF*	CUF
	Error bars $F(3, 104) = 11.587, p < .0001$	CDF**	SHU
		CDF**	CUF
	2D	Glyph size $F(3, 104) = 16.721, p < .0001$	SHU**
SLU**			CUF
CDF*			SHU
CDF**			SLU
CDF**			CUF
Glyph color $F(3, 104) = 11.780, p < .0001$		SHU**	SLU
		SLU*	CUF
		CDF**	SLU
Surface color $F(3, 104) = 36.356, p < .0001$		SHU*	SLU
		SHU**	CDF
		CUF*	CDF
		CUF*	SLU
	SLU**	CDF	
Error bars $F(3, 104) = 14.067, p < .0001$	SLU**	SHU	
	CUF**	SHU	
	CDF**	SHU	

* $p \leq .0083$

** $p \leq .0001$

ANOVA results for pairwise comparison on tasks

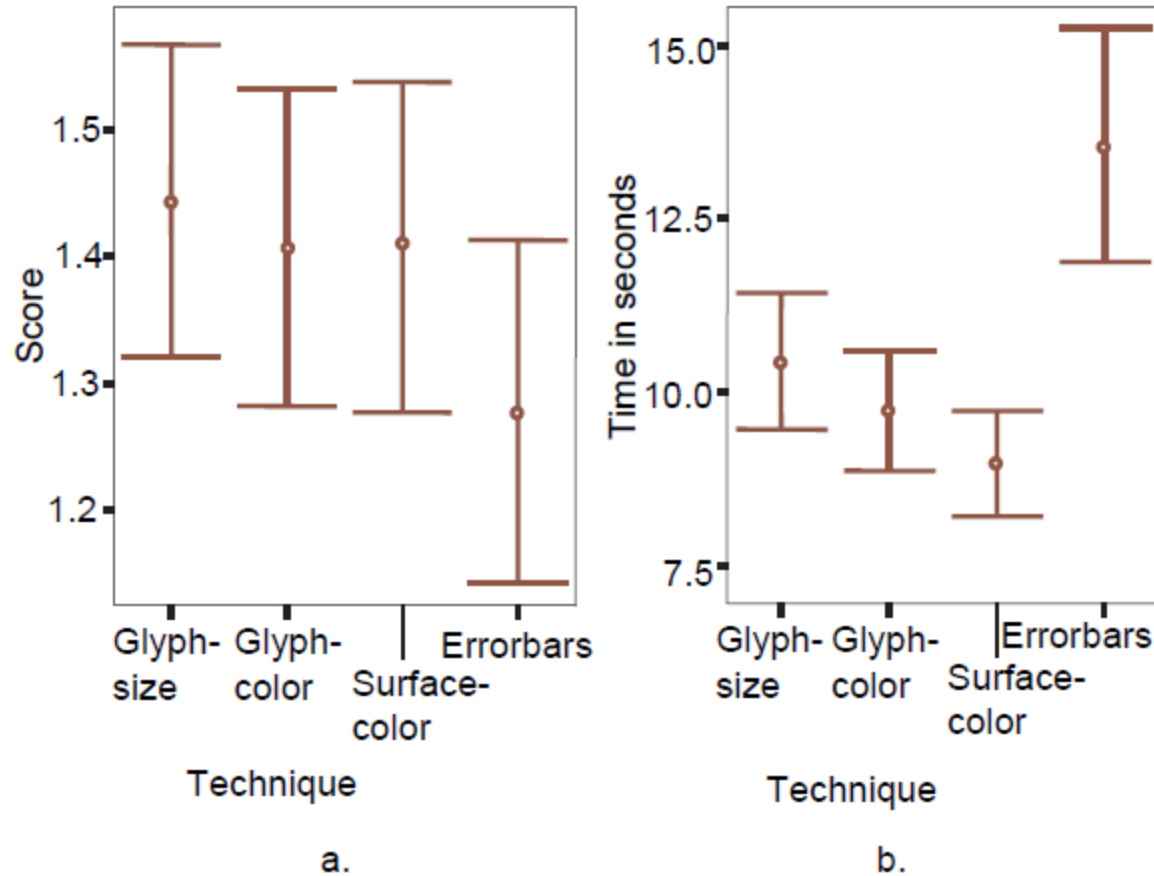
Result & Discussion



Overall performance of the two datasets.

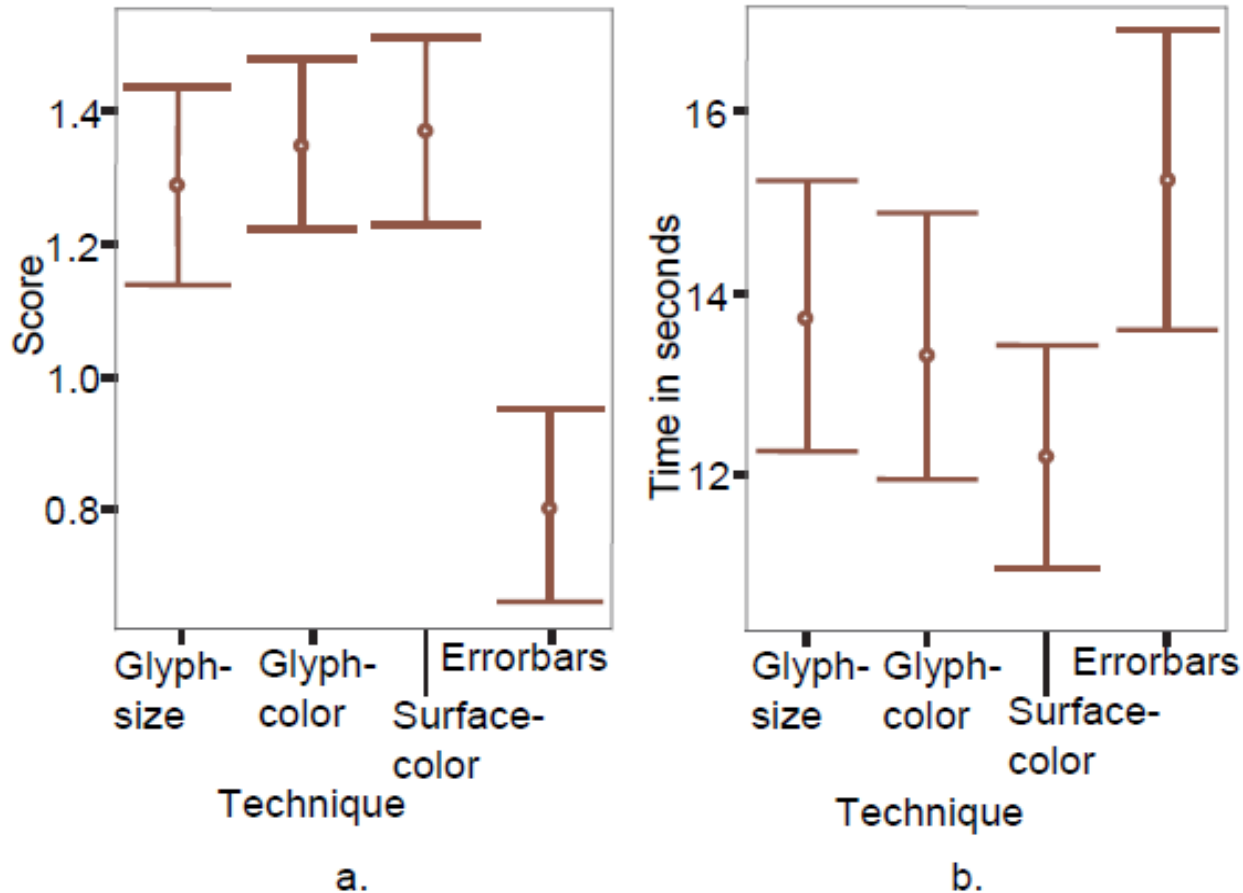
- a) Average scores attained for each dataset
- b) Response time recorded for each dataset.

Result & Discussion



- Performance plots for the 1D dataset
- a) Average scores for each technique
 - b) Response times recorded for each technique.

Result & Discussion



Performance plots for the 2D dataset
a) Average scores for each technique
b) Response times recorded for each technique.

Conclusion

- User study to compare effectiveness of 4 uncertainty visualization techniques on 1D and 2D datasets.
- Accuracy of responses on 1D tasks was higher than 2D.
- Effectiveness of uncertainty Visualization depend on task at hand.
- Method to create synthetic data with uncertainty.

THANK YOU