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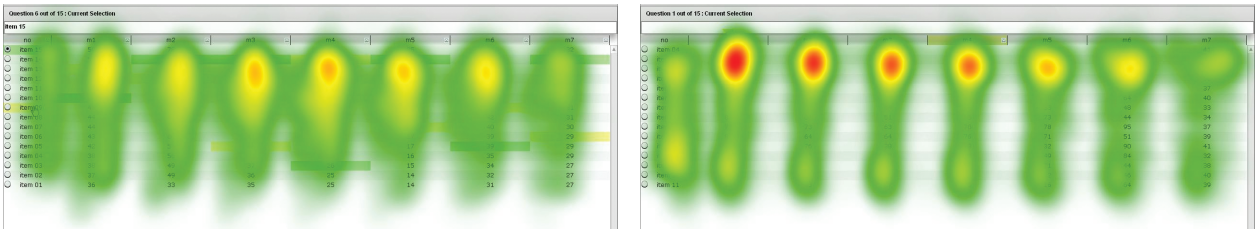

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Index Terms Visualized decision making, eye tracking, crowdsourcing, quantitative empirical study, limitations, peripheral vision.

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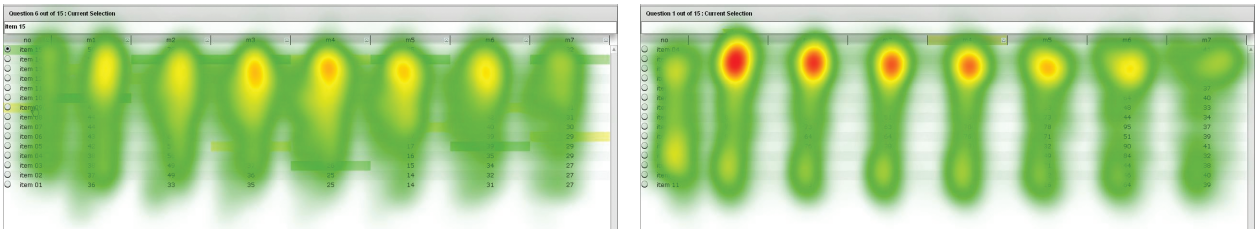

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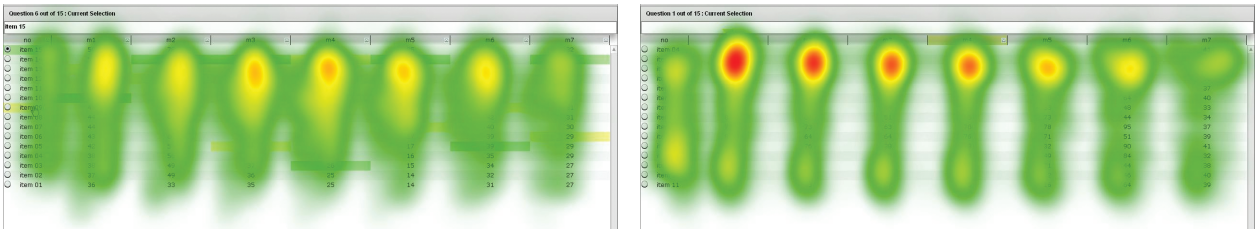

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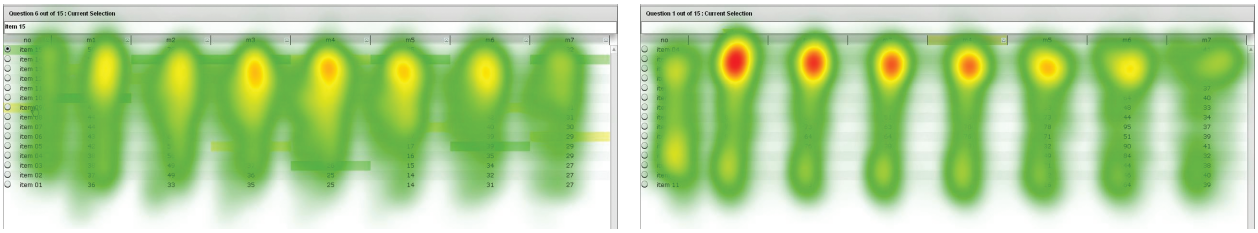

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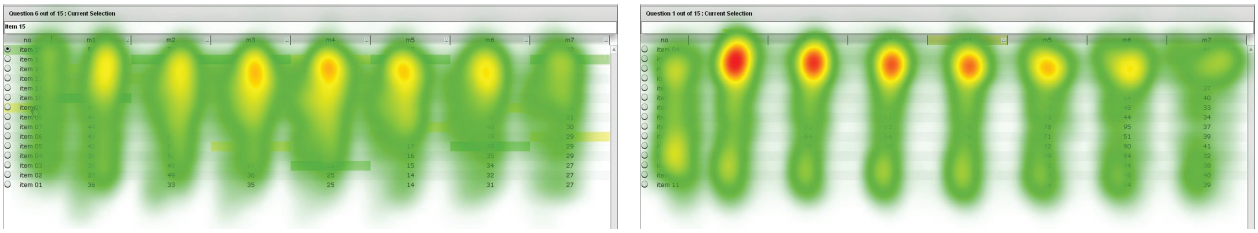

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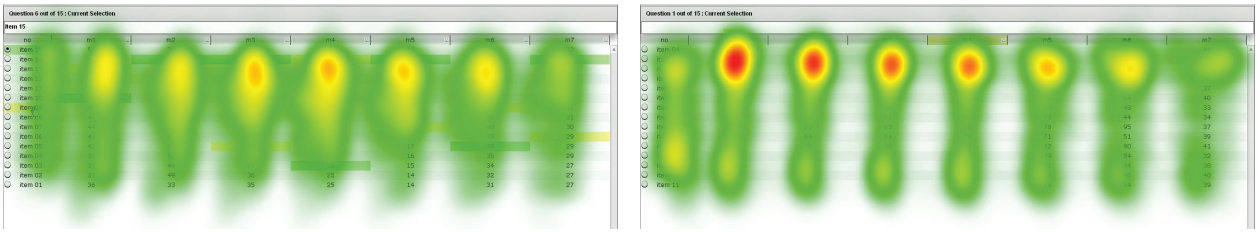

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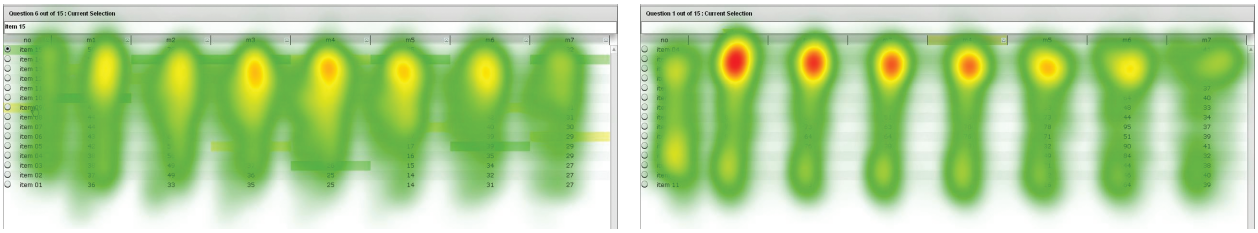

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Index Terms Visualized decision making, eye tracking, crowdsourcing, quantitative empirical study, limitations, peripheral vision.

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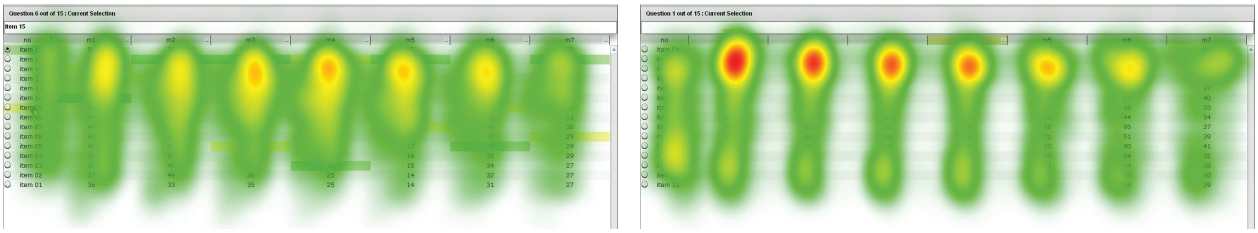
Does an Eye Tracker Tell the Truth about Visualizations?: Findings while Investigating Visualizations for Decision Making

Sung-Hee Kim, Zhihua Dong, Hanjun Xian, Benjavan Upatising, and Ji Soo Yi, IEEE Member



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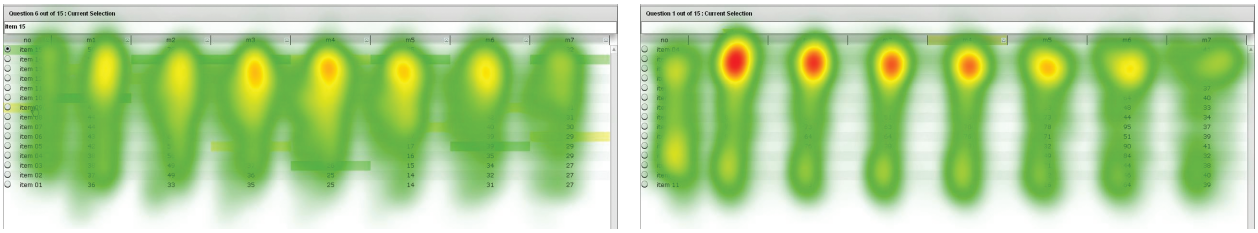

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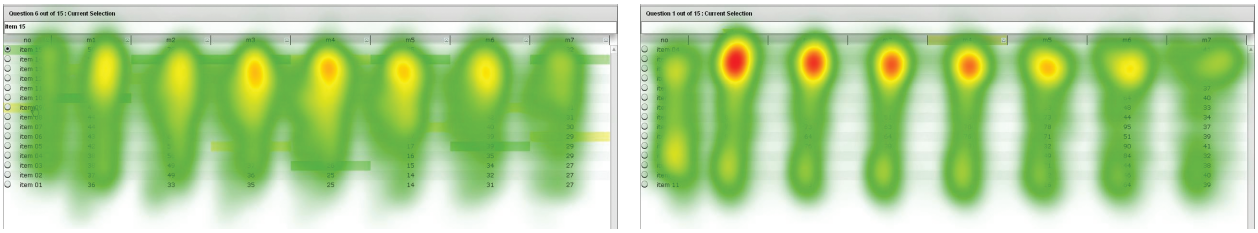

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