

## Let's Agree to Disagree: A Meta-Analysis of Disagreement Among Crowdworkers During Visual Question Answering

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Granularity

Granularity

Insufficient Visual Evidence Synonym

User Interface: Radio Button

Question: What color is the man's jacket?

Task Difficulty Ambiguity

**Ouestion:** What does this can say?

3. Bag of Hall's Cough Drops

**User Interface: Checkbox** 

Answer Choices:

1. beige

2. tan

4. tan

6. tan

7. tan

8. tan

9. tan

10. tan

Subjectivity

**Answer Choices:** 

1. unanswerable

2. Unanswerable

4. unanswerable

5. Unaswerable

6. unanswerable

8. unsuitable image

9. STORE ROOM

10. unsuitable image

Subjectivity

Task Difficulty Ambiguity

7. Halls

3. beige

5. khaki



## Visual Question Answering (VQA)







?
The state of the s

## Who threw the frisbee?

- 1. man on right 2. man in green shirt
- 3. man in green shirt
- 4. man on right
- 5. man in green vest 6. man in green shirt
- 7. man in neon shirt
- 8. man with green shirt
- 9. cannot tell
- 10. man on right

- 1. Old person 2. man
- 3. man
- 4. man 5. Old person
- 6. man
- 7. man
- 8. man 9. man
- 10. grandpa

- 1. yes
- 2. yes 3. yes
- 4. no
- 5. yes
- 6. yes
- 7. yes
- 8. no
- 9. yes 10. yes

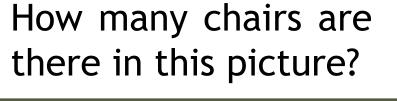
Status Quo: Train machines to predict a single answer.

**Problem:** Crowd disagrees over the answers to a visual question.

### **Datasets**

**VQA Real Images 48 Visual Questions** 





## VizWiz Images



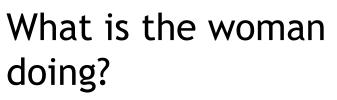
## **VQA Abstract Scenes**



plates?

## **Entropy of Answers**





- 1. Smiling
- 2. watching
- 3. watching boy
- 4. standing
- 5. laughing
- 6. watching boy
- 7. standing
- 8. laughing 9. standing
- 10.watching

**High Entropy Answers** 

## 48 Visual Questions



What item is this?

What color are the

Does the woman

have curly hair?

1. yes

2. yes

3. yes

4. yes

5. yes

7. no

8. yes

9. no

# What color is the

- carpet?
- 1. beige 2. beige
- 3. beige
- 4. brown
- 5. tan 6. beige
- 7. tan
- 8. tan
- 9. brown 10.cream
  - 10.yes **Low Entropy Answers**

# 48 Visual Questions



## Reasons of disagreement [1]

Task Difficulty • Granularity • Insufficient Visual Evidence (IVE)

■ Insufficient Visual Evidence ■ Synonym

 Subjectivity
Synonym Ambiguity

### References

[1] D. Gurari and K. Grauman. "CrowdVerge: Predicting If People Will Agree on the Answer to a Visual Question." ACM Conference on Human Factors in Computing Systems (CHI), Denver, CO, May, 2017.

### Results: Radio Button Interface

	0.5 to 1.0	1.0 to 1.5	more than 1.5
VQA Real Images	Subjectivity	Subjectivity	Subjectivity
VQA Abstract Images	Subjectivity	Subjectivity	Subjectivity
VizBiz Images	IVE	Synonym; IVE	Synonym

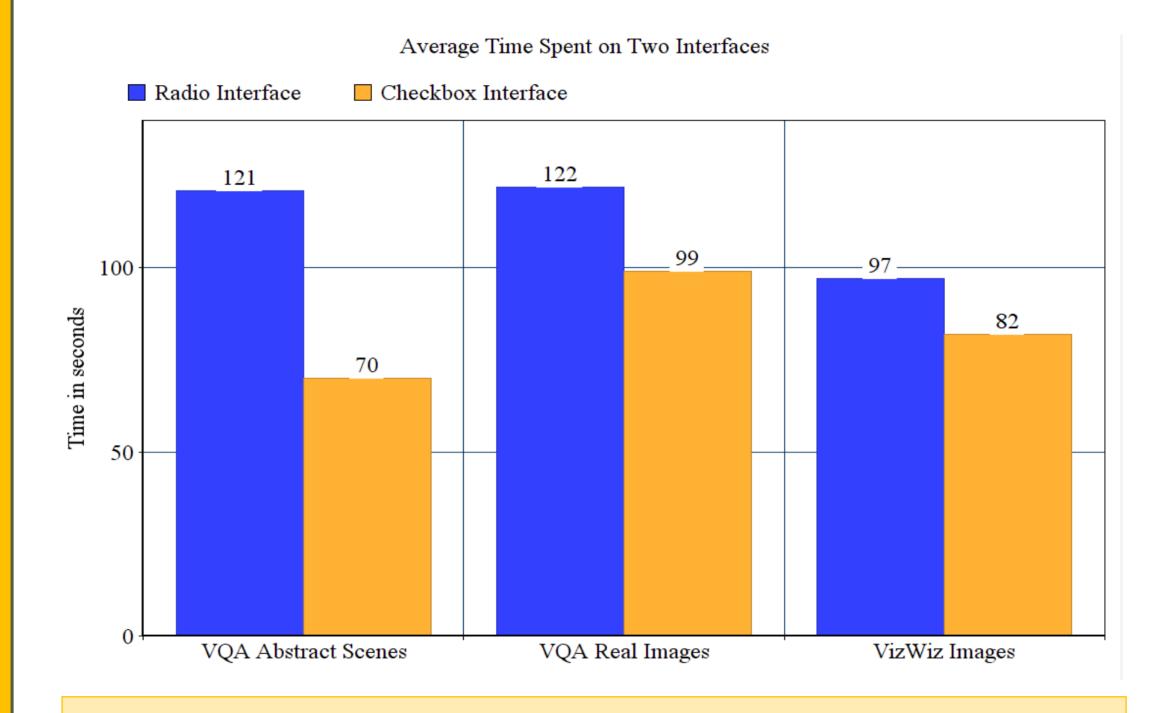
Subjectivity is the major reason of disagreement for VQA Real and Abstract Images.

Insufficient Visual Evidence (IVE) is the major reason of disagreement for VizWiz Images.

### Results: Checkbox Interface

	0.5 to 1.0	1.0 to 1.5	more than 1.5
VQA Real Images	Subjectivity	Subjectivity	Subjectivity
VQA Abstract Images	Subjectivity	Subjectivity	Subjectivity
VizBiz Images	IVE	IVE	Synonym

Checkbox interface produces similar results as that of the radio button interface.



The crowd provides results faster on a checkbox interface than a radio button interface.