

# Explaining Why Fake Photos are Fake: Does it Work?

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<https://mruffin.github.io>

## ***Worries Grow That TikTok Is New Home for Manipulated Video and Photos***

Misleading edits, fake news stories and deepfake images of politicians are starting to warp reality on the popular video platform.



Manipulated media is spreading before the midterms on TikTok, whose policies prohibit digital forgeries “that mislead users by distorting the truth.” Kiichiro Sato/Associated Press

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Misleading edits, fake news stories and deepfake images of politicians are starting to warp reality on the popular video platform.



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yahoo!

### Photo of Joe Biden groping child is digitally altered

648

BILL MCCARTHY, AFP USA

Fri, December 30, 2022 at 3:48 PM CST · 2 min read



Social media users are sharing an image that purports to show Joe Biden touching a child inappropriately below the waist. But the photo has been digitally manipulated; the original shows the child stretching a T-shirt out to show the US president, who points in return.

"Is this a photo of Biden fondling a small child's genitalia?" said far-right radio host Stew Peters, who has previously spread Covid-19 misinformation, in December 30, 2022 posts, sharing the picture to Twitter, Telegram and Truth Social.

The same image spread across Twitter, Facebook and other social media platforms, using manipulated images as part of a baseless narrative -- fueled by the QAnon conspiracy theory and, in some instances, former president Donald Trump -- suggesting inappropriate conduct by the US president.

But the photo has been altered to change the position of Biden's hands. A White House spokesperson confirmed to AFP that the version circulating online is "not real."



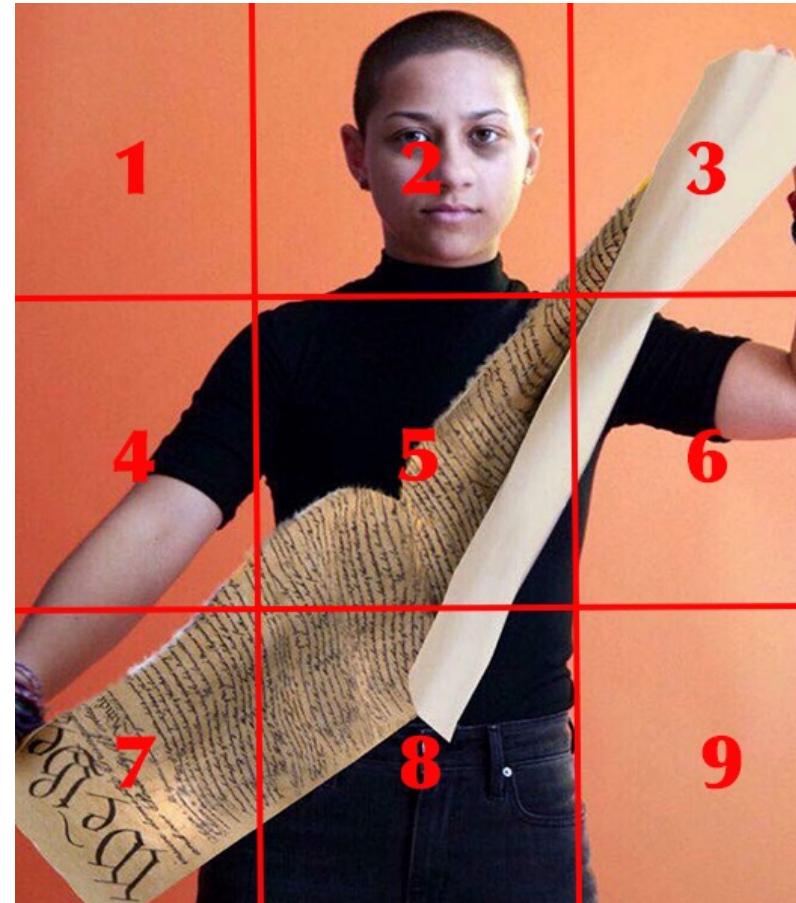
# We Ask the Following Questions...

R1: Can viewers detect manipulated images?



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R2: Are viewers' opinions influenced by manipulated images?

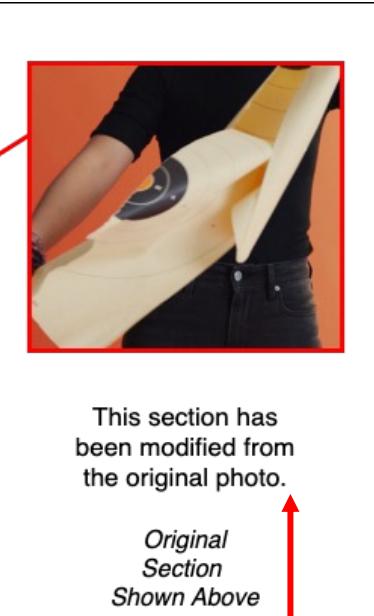
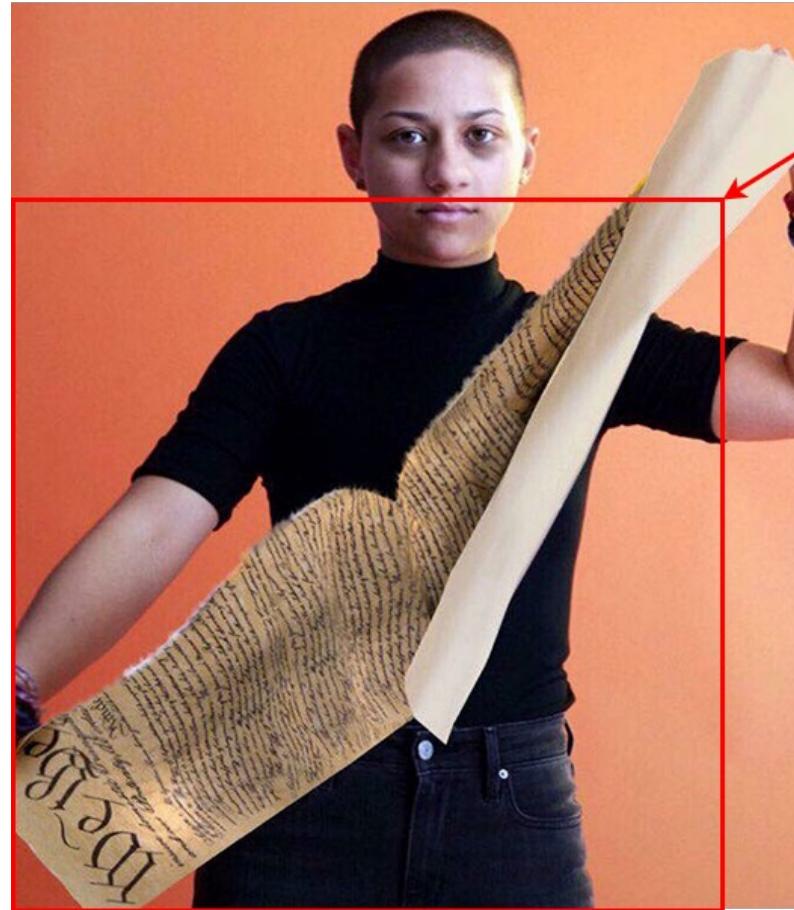


# We Ask the Following Questions...

R1: Can viewers detect manipulated images?

R2: Are viewers' opinions influenced by manipulated images?

R3: Does explaining how an image has been altered protect against the effects of image manipulation?



This section has  
been modified from  
the original photo.

*Original  
Section  
Shown Above*

This section has been  
modified from the  
original photo.

# Data Collection + Processing



Fact-checking Site



Image Datasets from Prior Work



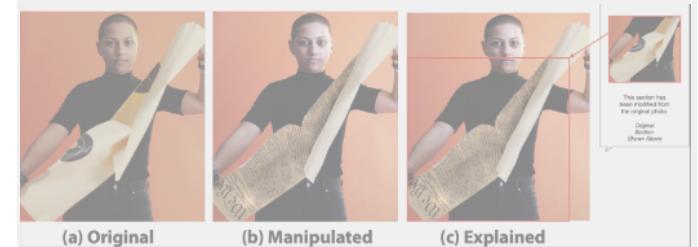
Social Media



## R1 Detecting Manipulation 18 Image Sets



## R2 & R3 Mitigating Manipulation 8 Image Sets



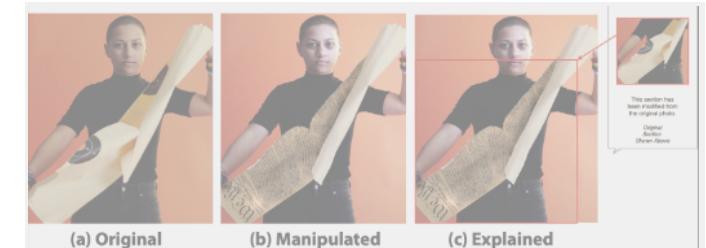
## Data Collection + Processing



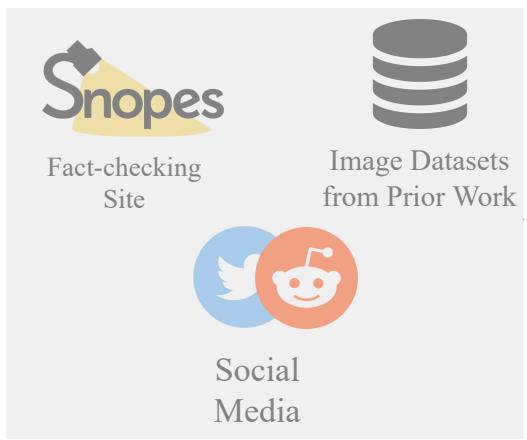
## R1 Detecting Manipulation 18 Image Sets



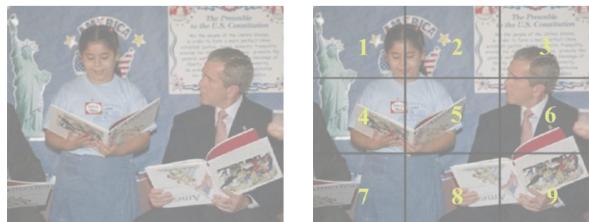
## R2 & R3 Mitigating Manipulation 8 Image Sets



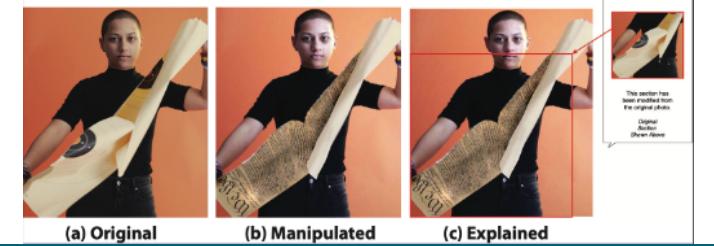
# Data Collection + Processing



## R1 Detecting Manipulation 18 Image Sets



## R2 & R3 Mitigating Manipulation 8 Image Sets



# Presentation Overview



Detecting  
Manipulation  
Survey

Mitigating  
Manipulation  
Survey

Summary of  
Findings

# Presentation Overview

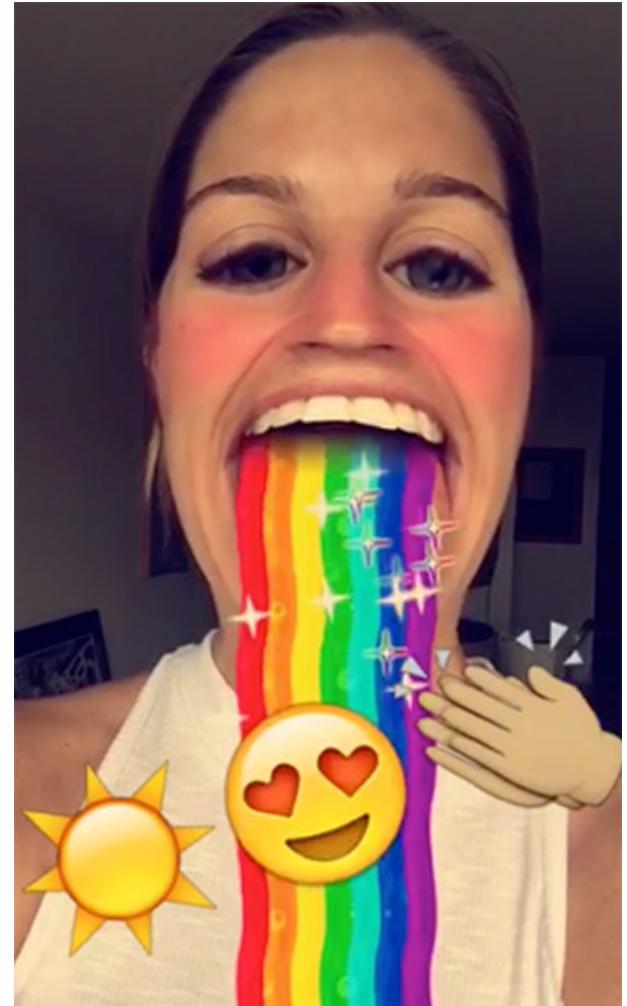


# Detecting Manipulation

- 3 batches of survey w/ different images
  - Collected 18 image sets (original and manipulated)
  - Dataset split into 3 batches of 6 image sets

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- **Each participant was shown**
  - 6 images, 3 manipulated & 3 original
  - 1 control image



# Detecting Manipulation

- 3 batches of survey w/ different images
  - Collected 18 image sets (original and manipulated)
  - Dataset split into 3 batches of 6 image sets
- Each participant was shown
  - 6 images, 3 manipulated & 3 original
  - 1 control image
- Participants were asked to detect and locate manipulation



Does this photo appear  
digitally manipulated?

- Yes
- No
- I'm not sure



Does this photo appear  
digitally manipulated?

- Yes
- No
- I'm not sure



In which region is the  
alteration? Select all that  
apply.

- 1
- 2
- 3
- 4
- 5
- 6
- 7
- 8
- 9

- I don't think it's manipulated  
or I'm not sure



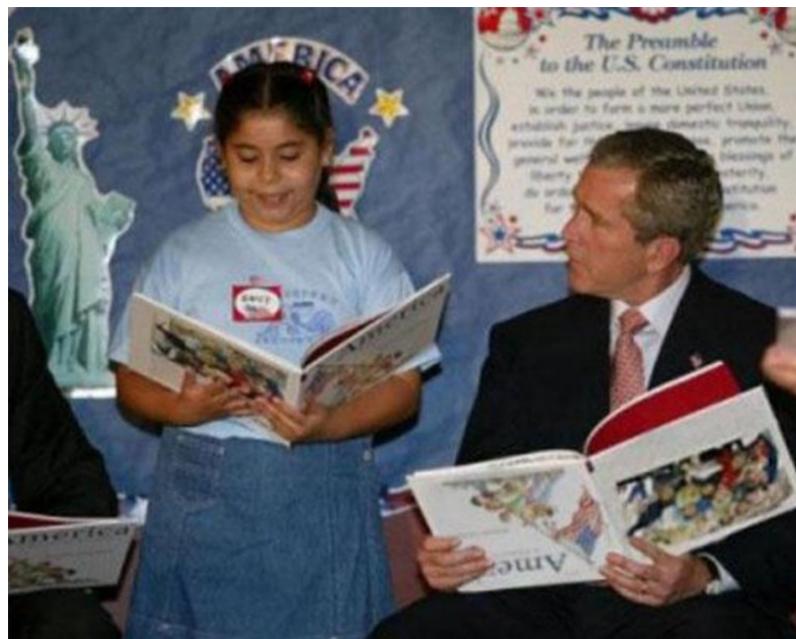
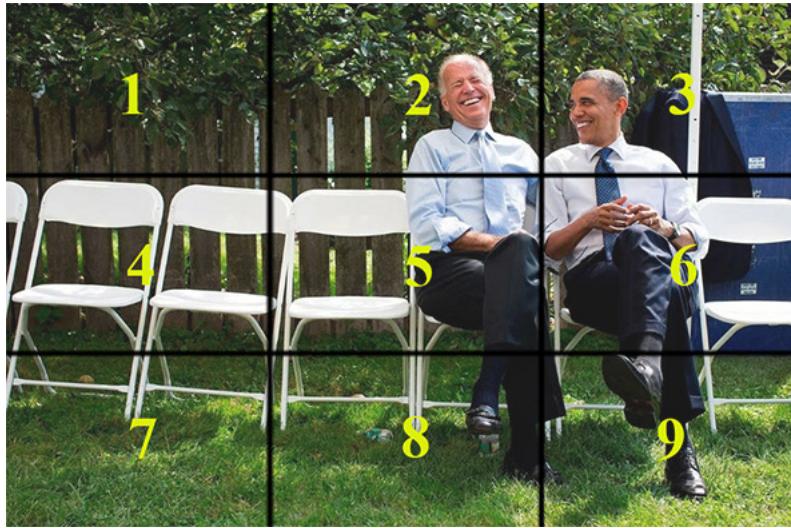
Does this photo appear  
digitally manipulated?

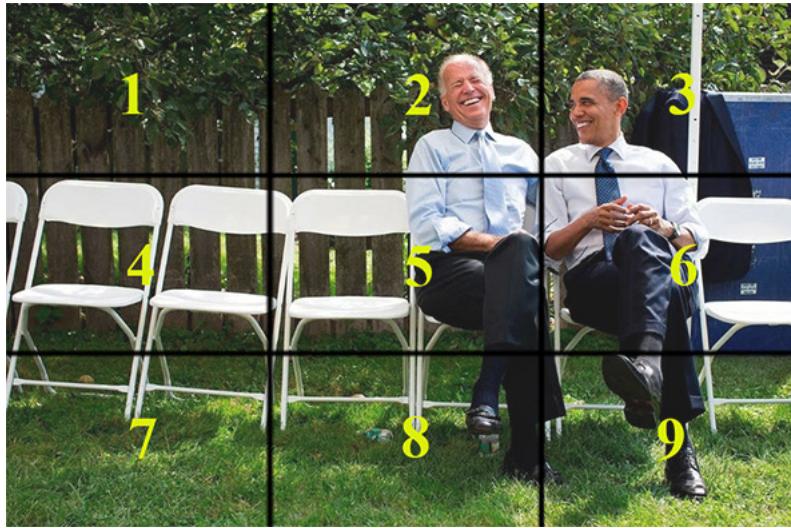
- Yes
- No
- I'm not sure



In which region is the  
alteration? Select all that  
apply.

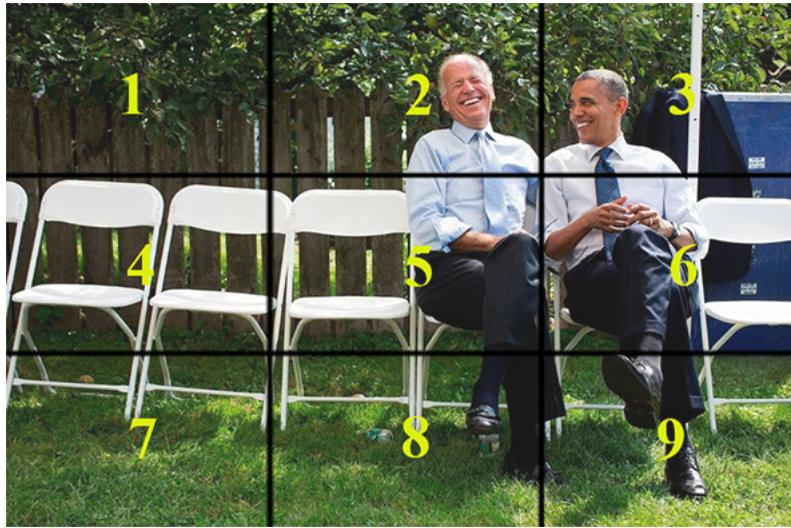
- 1       6       I don't think it's manipulated or I'm not sure
- 2       7
- 3       8
- 4       9
- 5





Answer: Not  
Manipulated





Answer: Not  
Manipulated



Answer:  
Manipulated



# Are people good at it?

Manipulated Image?		
Yes	No	
Yes	241	150
No	98	189

Identification Precision = 62%

Identification Recall = 71%

## Identification Accuracy

60%

mean accuracy

## Location Accuracy

38%

mean accuracy

# Presentation Overview



Detecting  
Manipulation  
Survey

Mitigating  
Manipulation  
Survey

Summary of  
Findings

# Mitigating Manipulation

- 3 Survey Groups

- Original
- Manipulated
- Explained

**Original**



Participants are shown  
original images

Original



Manipulated



Participants are shown  
original images

Participants are shown  
manipulated versions  
of the images

## Original



Participants are shown  
original images

## Manipulated



Participants are shown  
manipulated versions  
of the images

## Explained



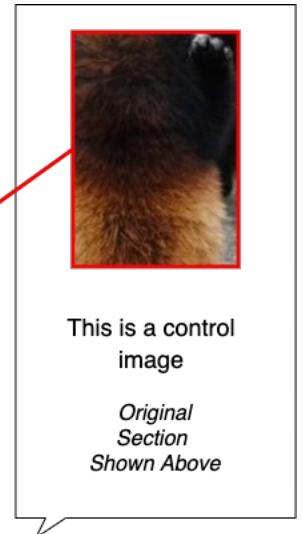
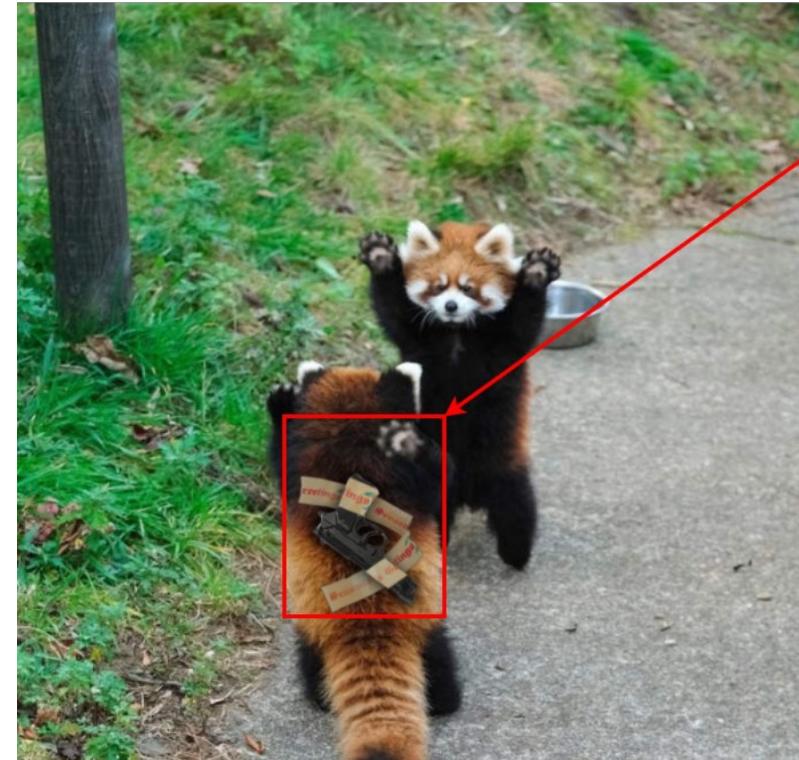
The appearance of  
clothing has been modified  
from the original photo.

Original  
Section  
Shown Above

Participants are shown an image  
explaining how the manipulated  
image was produced

# Mitigating Manipulation

- 3 Survey Groups
  - Original
  - Manipulated
  - Explained
- Each participant was shown
  - 4 images out of our 8 image sets
  - 1 control image



This is a control image

*Original  
Section  
Shown Above*

# Mitigating Manipulation

- 3 Survey Groups
  - Original
  - Manipulated
  - Explained
- Each participant was shown
  - 4 images out of our 8 sets
  - 1 control image
- **Each image was shown with a caption**
  - Caption identifies the person or people pictured
  - Same caption used across images in set

# Notable Survey Questions

## Q1: Message Agreement

*Do you believe that Democratic lawmakers—Ilhan Omar of Minnesota, Alexandria Ocasio-Cortez of New York, Rashida Tlaib of Michigan, and Ayanna Pressley of Massachusetts, also known as The Squad—hold extreme views?*



# Notable Survey Questions

## Q1: Message Agreement

*Do you believe that Democratic lawmakers—Ilhan Omar of Minnesota, Alexandria Ocasio-Cortez of New York, Rashida Tlaib of Michigan, and Ayanna Pressley of Massachusetts, also known as The Squad—hold extreme views?*

## Q2: Subject Sentiment

*From negative to positive, what is your opinion of the person(s) in this photo?*



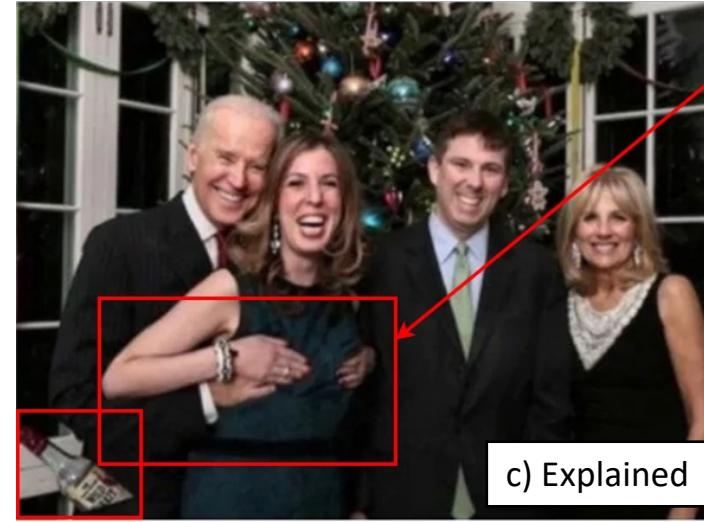
# Do Explanations Work?



a) Original



b) Manipulated



c) Explained



The appearance of Joseph Biden and Amy Parnes have been modified from the original photo.

*Original  
Section  
Shown Above*

Do you believe United States President Joe Biden inappropriately touches women?

From negative to positive, what is your opinion of United States President Joe Biden in this photo?

#### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.20	0.28
Explained	-0.57	<b>0.01**</b>

#### Subject Sentiment

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	0.03	0.86
Explained	-0.53	<b>0.01**</b>



a) Original



b) Manipulated



c) Explained



The appearance of Joseph Biden and Amy Parnes have been modified from the original photo.

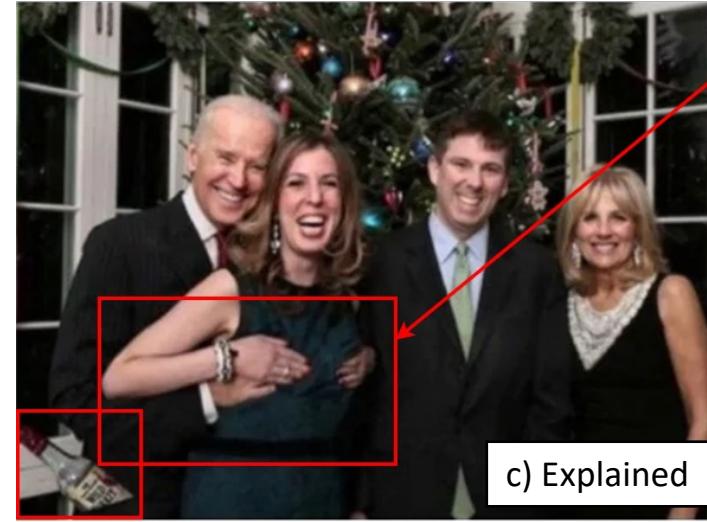
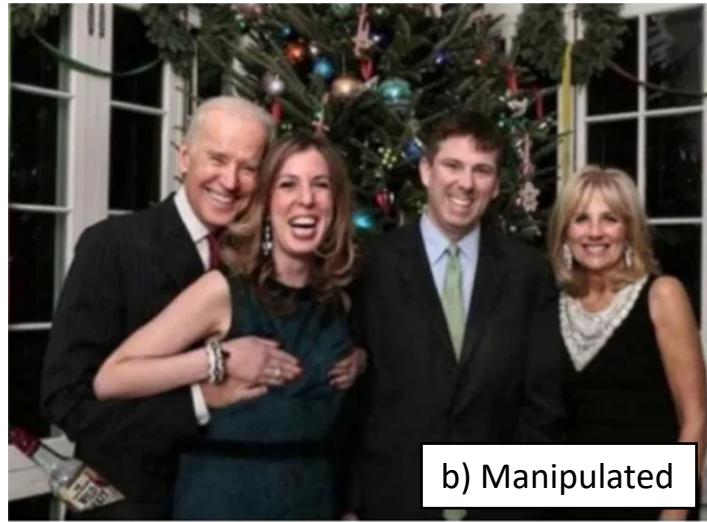
Original Section Shown Above

Do you believe United States President Joe Biden  
inappropriately touches women?

Message Agreement		
Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.20	0.28
Explained	-0.57	0.01**

Viewers who saw Explained image were **LESS AGREEING** with the above statement.

Explained | -0.53 | 0.01\*\*



The appearance of Joseph Biden and Amy Parnes have been modified from the original photo.

Original Section Shown Above

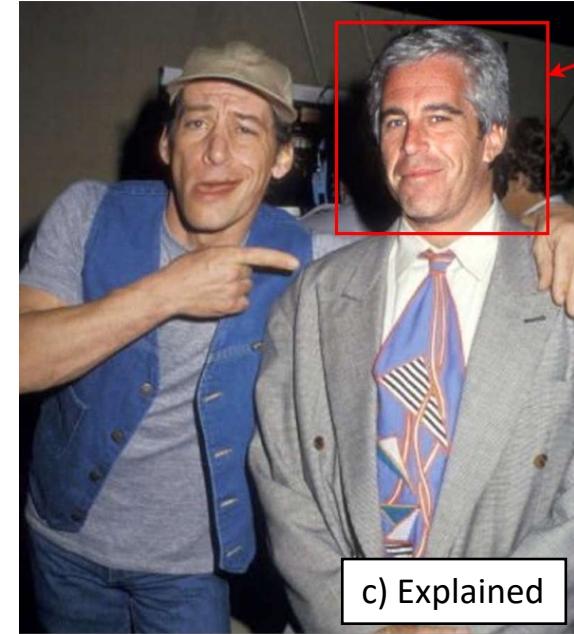
Do you

However, those who saw the Explained image held a stronger **NEGATIVE** feeling about the subject.

Explained -0.57 0.01\*\*

From negative to positive, what is your opinion of United States President Joe Biden in this photo?

Subject Sentiment		
Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	0.03	0.86
Explained	-0.53	0.01**



The head of  
Jeffrey Epstein has  
been added to the  
original photo.

Original  
Section  
Shown Above

Do you believe that actor Jim Varney may be guilty of the sex trafficking of minors?

From negative to positive, what is your opinion of the person on the left in this photo?

### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.44	0.02*
Explained	-0.58	0.01**

### Subject Sentiment

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	0.21	0.10
Explained	-0.40	0.01**



a) Original



b) Manipulated



c) Explained



The appearance of clothing has been modified from the original photo.

Original  
Section  
Shown Above

Do you believe that Democratic lawmakers ... known as the squad, hold extreme views?

From negative to positive, what is your opinion of the person(s) in this photo?

### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	0.12	0.53
Explained	-0.09	0.60

### Subject Sentiment

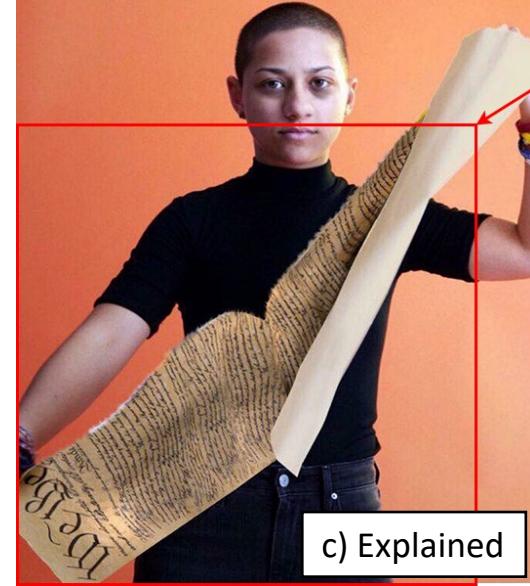
Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.06	0.64
Explained	-0.27	0.03*



a) Original



b) Manipulated



c) Explained

This section has been modified from the original photo.  
*Original Section Shown Above*

Do you believe that those who campaign against guns do not respect the Constitution of the United States?

From negative to positive, what is your opinion of the person in this photo?

#### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.62	0.01**
Explained	-0.44	0.02*

#### Subject Sentiment

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	0.20	0.14
Explained	0.01	0.93

# Presentation Overview



Detecting  
Manipulation  
Survey

Mitigating  
Manipulation  
Survey

**Summary of  
Findings**

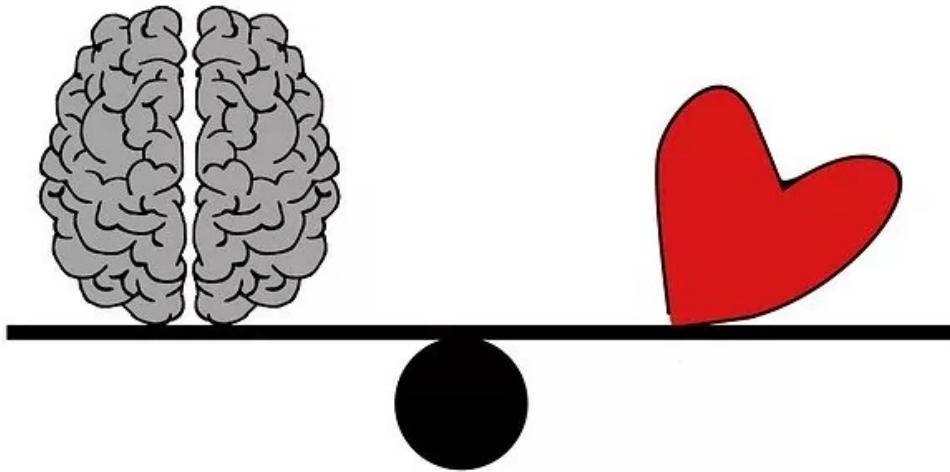
# Embracing the Expected and Unexpected

## Detecting and Locating Manipulation

- Confirmed prior research:  
Users are not effective at determining whether an image was manipulated or not  
  
They are even worse when it comes to locating the manipulation

## Attempting to Mitigate Manipulation

- Attempting to explain the effect of misinformation is trickier than we thought
- Showing a manipulated image with an explanation may still produce its intended negative effect



## System 2: Slow

Conscious Reasoning | Slow | Effortful

Message Agreement Questions invoked  
***critical thinking***

## System 1: Fast

Subconscious Emotion | Impulsive

Sentiment Questions invoked ***feelings***

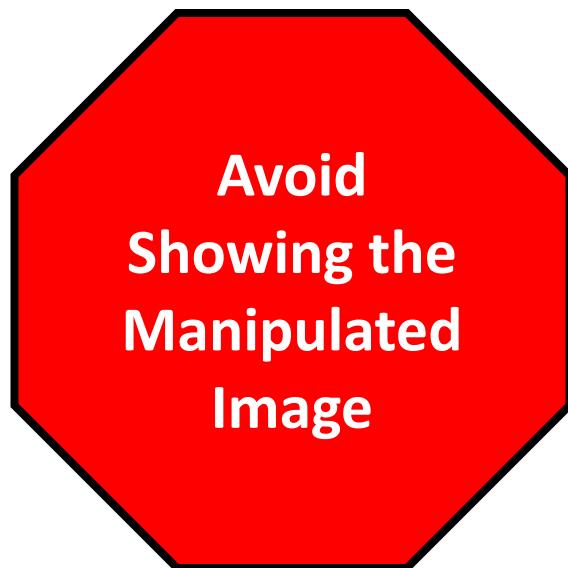
### Exploration Question:

*Can we counteract the influence of manipulated images more effectively by nudging users to perform more deliberate thinking and reasoning? If so, how to facilitate this process?*

# What does all this mean?

Attempting to explain how an image was manipulated should be done with caution

Showing a manipulated image, even in the context of an explanation, may still produce a negative effect



# Thank You!



## Summary:

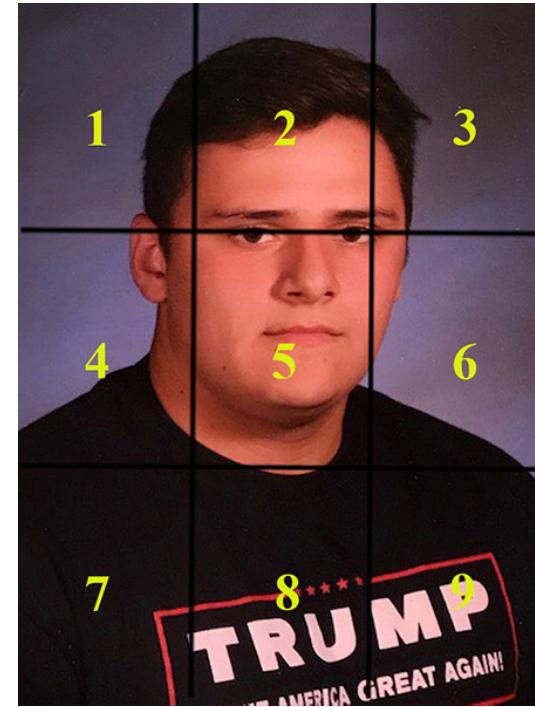
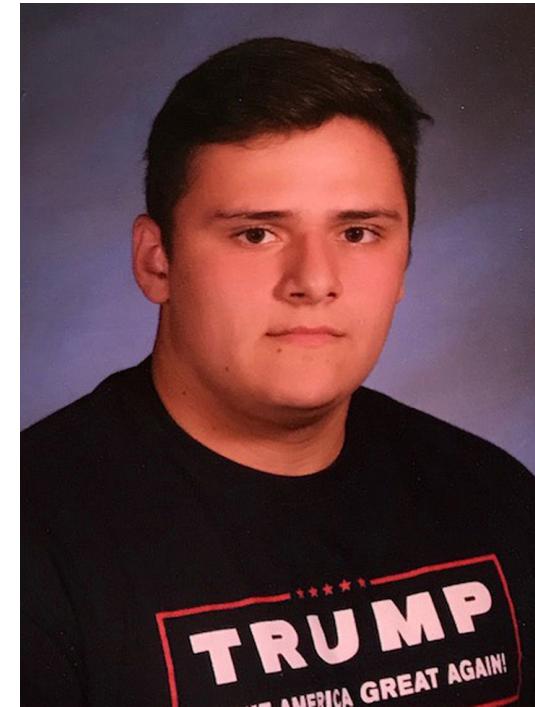
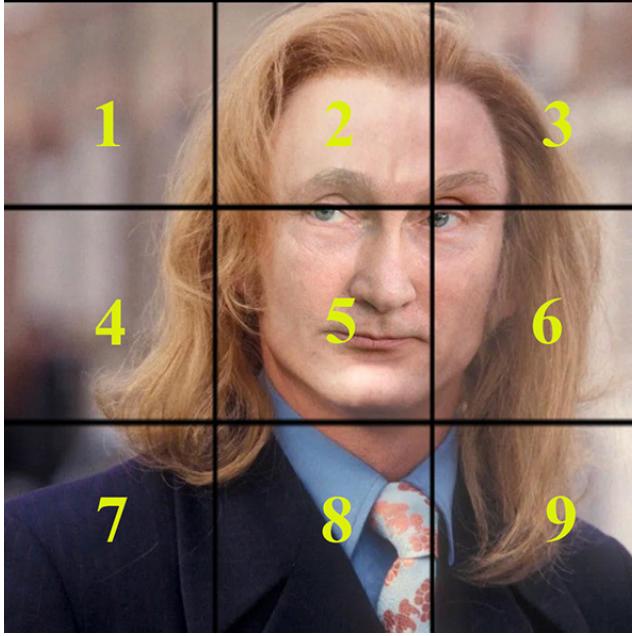
- Users generally are not good at identifying manipulated images
  - They are even worse at locating the manipulated regions
- Simply highlighting and explaining the manipulation to users was not always effective
- Highlighting and explanation led viewers to hold less favorable opinions about the subjects pictured

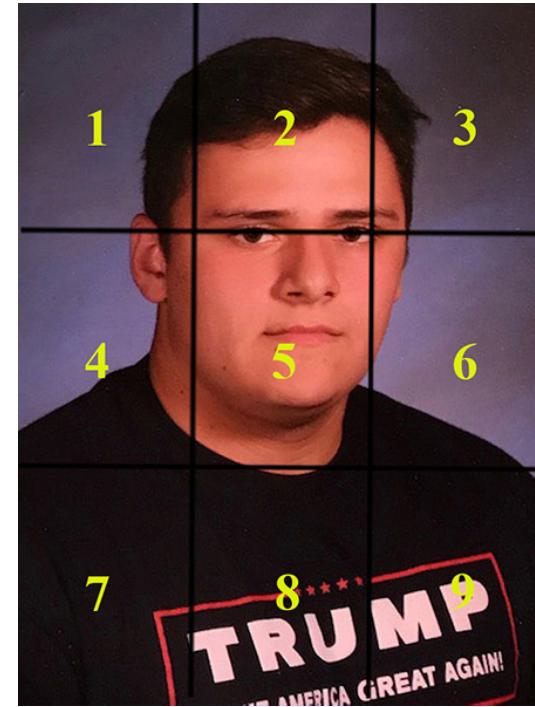
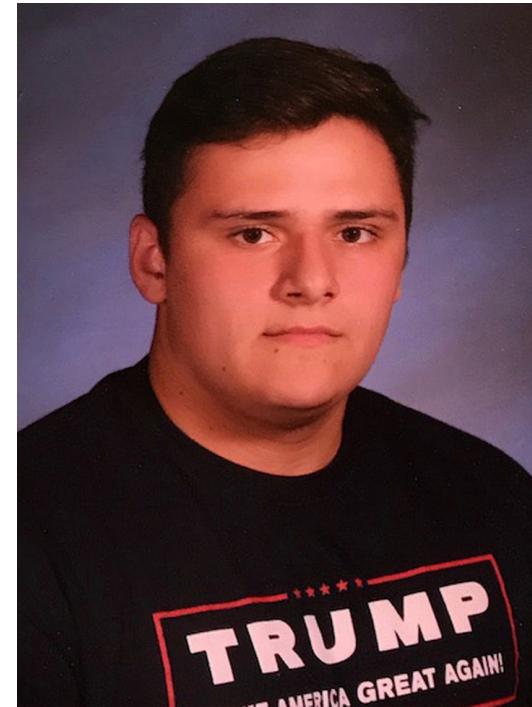
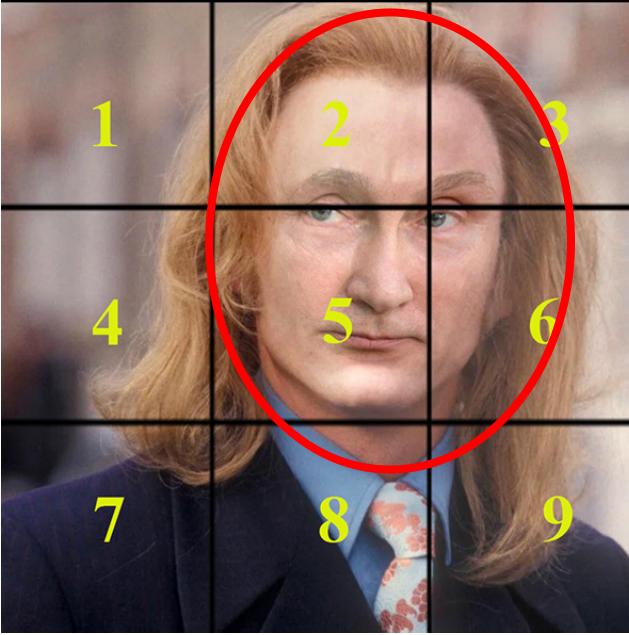
# Thank You

**Table 1. Demographics—**  
 We show the demographics information of participants of Survey 1 (Detecting Manipulation) and Survey 2 (Mitigating Manipulation).

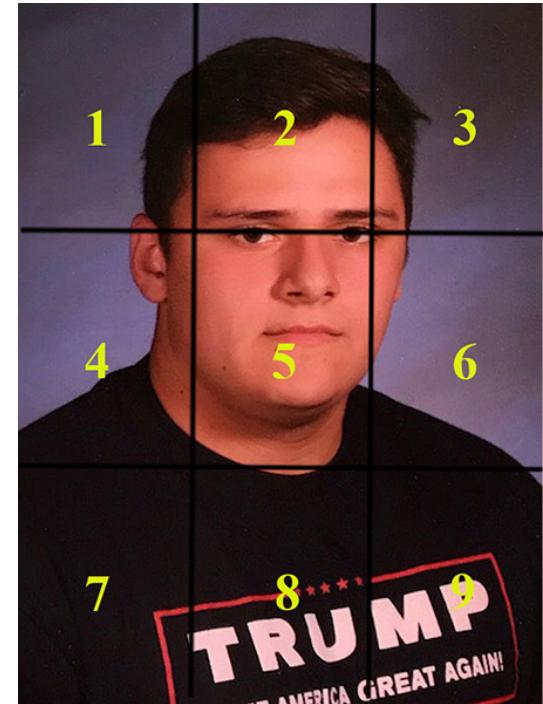
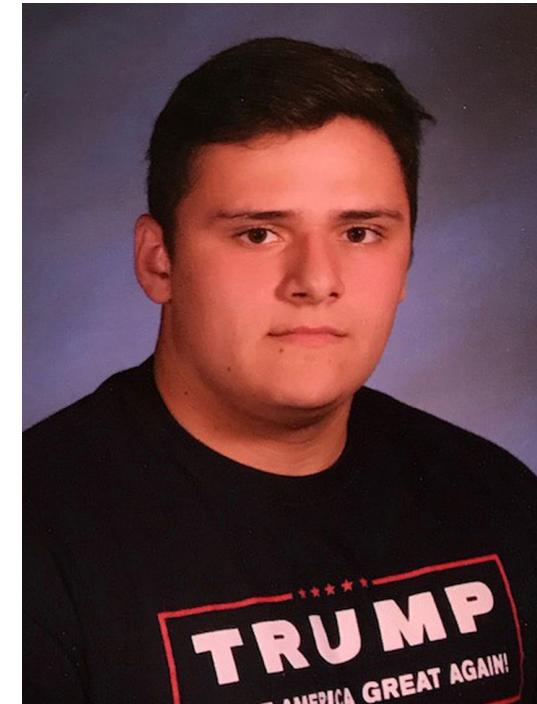
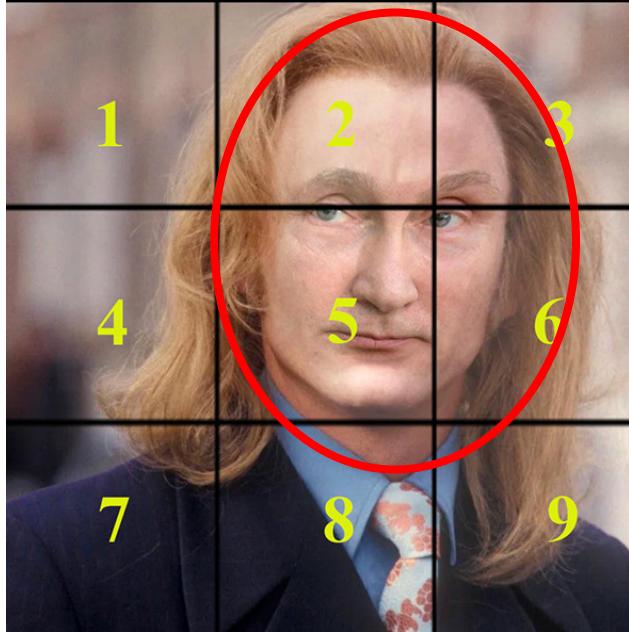
<b>Attributes</b>	<b>Survey 1</b>		<b>Survey 2</b>		
	<b>Total</b>	<b>Original</b>	<b>Manipulated</b>	<b>Explained</b>	<b>Total</b>
<b>Gender</b>					
Male	76	114	115	111	340
Female	37	58	71	68	197
Other	0	1	4	1	6
<b>Age</b>					
Under 18	0	0	0	0	0
18-24	9	17	16	4	37
25-34	16	83	83	69	235
35-44	7	46	57	62	165
45-54	62	15	6	20	41
55-64	19	9	17	18	44
65+	0	2	1	7	10
Not Disclosed	0	1	0	0	1
<b>Education</b>					
< High school	0	2	0	0	2
High school	5	12	8	15	35
Some college	54	12	9	9	30
Associate	30	9	15	10	34
Bachelor	13	114	118	117	349
Graduate	9	22	40	29	91
Not Disclosed	2	2	0	0	2
<b>Total</b>	<b>113</b>	<b>173</b>	<b>190</b>	<b>180</b>	<b>543</b>

# Detecting Manipulation Examples





**Answer:**  
**Manipulated**



**Answer:**  
**Manipulated**

**Answer:**  
**Not Manipulated**

# Mitigating Manipulation Examples



a) Original



b) Manipulated



c) Explained



The Antifa symbol has been added to the original photo.

Original Section  
Shown Above

Do you believe Antifa protesters are violent?

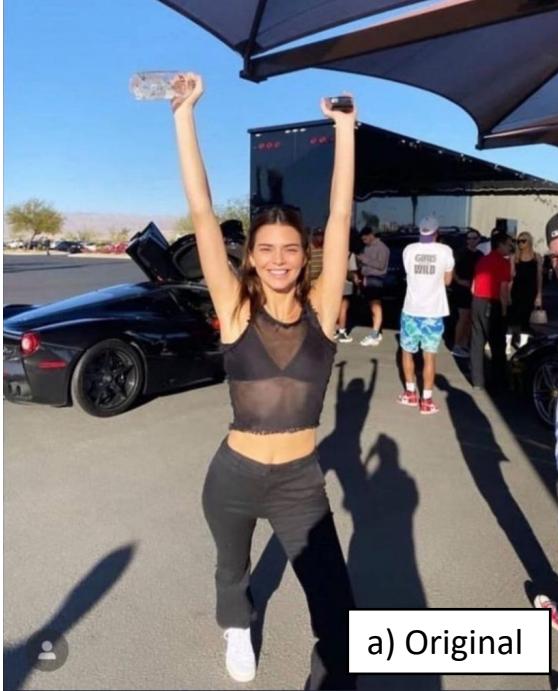
From negative to positive, what is your opinion of the person assaulting law enforcement in this photo?

#### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.19	0.26
Explained	-0.25	0.14

#### Subject Sentiment

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.20	0.22
Explained	0.13	0.42



a) Original



b) Manipulated



c) Explained



Do you believe that Kendall Jenner supports wearing protective face masks and supports the Black Lives Matter Movement?

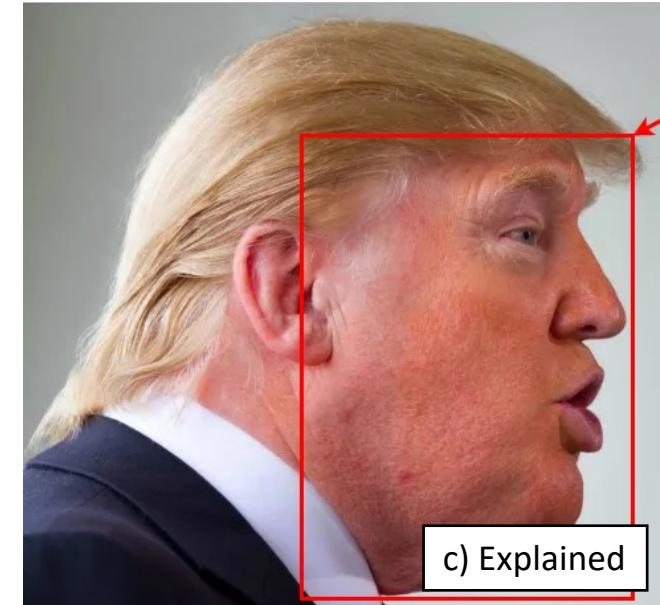
#### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.50	<b>0.001***</b>
Explained	-0.15	0.31

From negative to positive, what is your opinion of the person in this photo?

#### Subject Sentiment

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.02	0.90
Explained	-0.21	0.10



Do you believe that former United States President Donald Trump is an unattractive person?

From negative to positive, what is your opinion of the person in this photo?

---

### Message Agreement

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	-0.04	0.85
Explained	-0.08	0.65

---

### Subject Sentiment

Variable	$\beta$	$p$
Image (Reference = Manipulated)		
Original	0.17	0.30
Explained	-0.08	0.62



a) Original



b) Manipulated



c) Explained



The appearance of Donald Trump has been modified from the original.

*Original Section Shown Above*