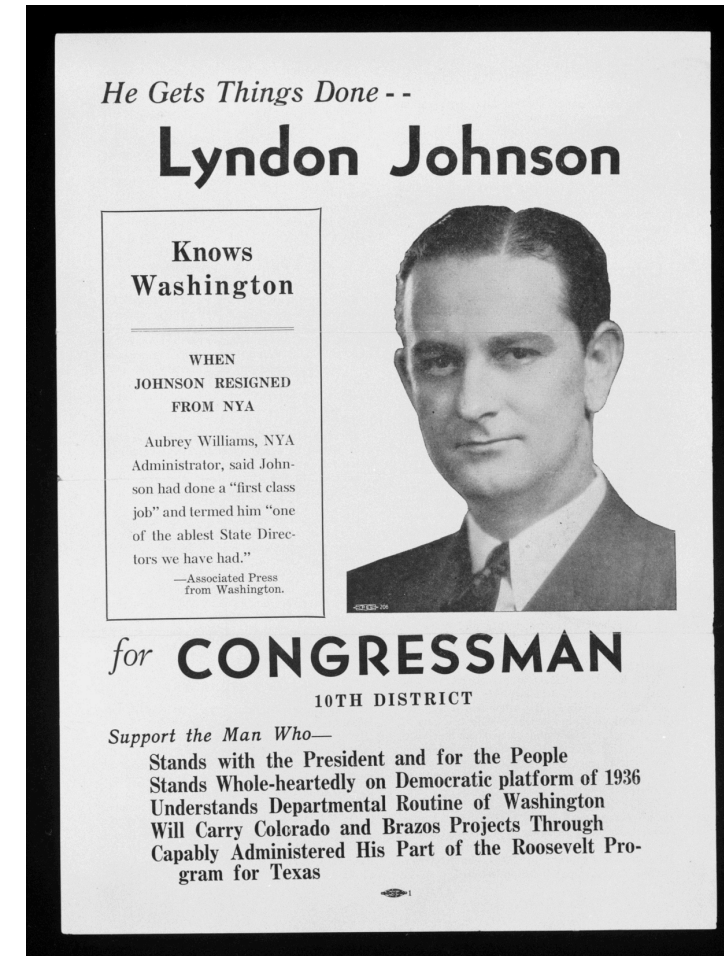


# Photographic home styles in Congress: a computer vision approach

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# Lyndon Johnson in Congress: Anti-Civil Rights Crusader

- LBJ spent 24 years in Congress.
- 12 years in the House, 12 years in the Senate
- Voted against every pro-civil rights bill.



# President Lyndon Johnson: Civil Rights Hero

- After signing the Civil Rights Act of 1964, soon becomes known as a civil rights hero.
- Due in no small part to ability to manipulate how he was perceived by the public.



*Source: Lyndon Baines Johnson Library and Museum. Photo by Yoichi Okamoto.*

# President Lyndon Johnson: Civil Rights Hero

- After signing the Civil Rights Act of 1964, soon becomes known as a civil rights hero.
- Due in no small part to ability to manipulate how he was perceived by the public.



*Source: PBS. Photo by Yoichi Okamoto.*



# Yoichi Okamoto - White House Photographer Under LBJ 1963-1969

- Hired Yoichi Okamoto, the first “White House photographer”.
- Known as the “godfather” of White House photography.



*Source: New York Times. Photo by Yoichi Okamoto.*

# Okamoto's Juxtapositions

- Okamoto a master of “juxtaposition.”
- Worked tirelessly to shape how LBJ was perceived through his photographs.



*In June 1963, Mays and then-Vice President Lyndon Johnson confer while en route to the state funeral of Pope John XIII.*

*Photo by Yoichi Okamoto. Source: LBJ Presidential Library*

# Okamoto's Juxtapositions

- Okamoto a master of “juxtaposition.”
- Worked tirelessly to shape how LBJ was perceived through his photographs.



At the signing of the Voting Rights Act in the Capitol Rotunda, President Lyndon Johnson moves to shake hands with the Rev. Martin Luther King, right. (Yoichi R. Okamoto/LBJ Library)

# Juxtapositions

- Juxtapositions with symbols, objects and people.
- Common technique used by photographers to create visual metaphors and influence opinion.



*Source: Associated Press*



# Juxtapositions

- Juxtapositions with symbols, objects and people.
- Common technique used by photographers to create visual metaphors and influence opinion.



Paul Ryan speaking to military personnel. Source <https://www.facebook.com/paulryanwi/>

# Juxtapositions and Image Analysis

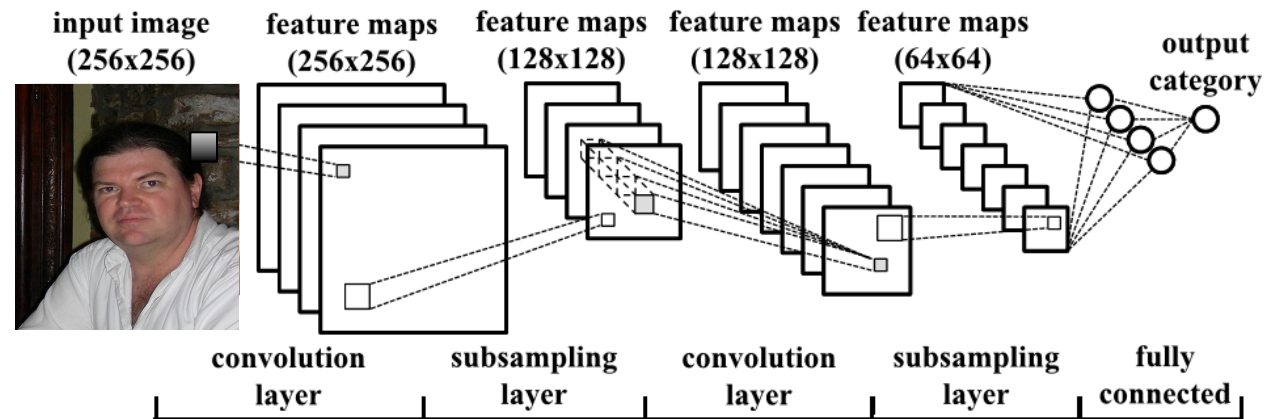
- Little evidence that juxtapositions or other techniques used by photographers have psychological/political effects.

# Few large scale image analysis projects...

- Computational limitations have prevented large scale analyses of images and image features.

# New computer vision/machine learning techniques now make this possible...

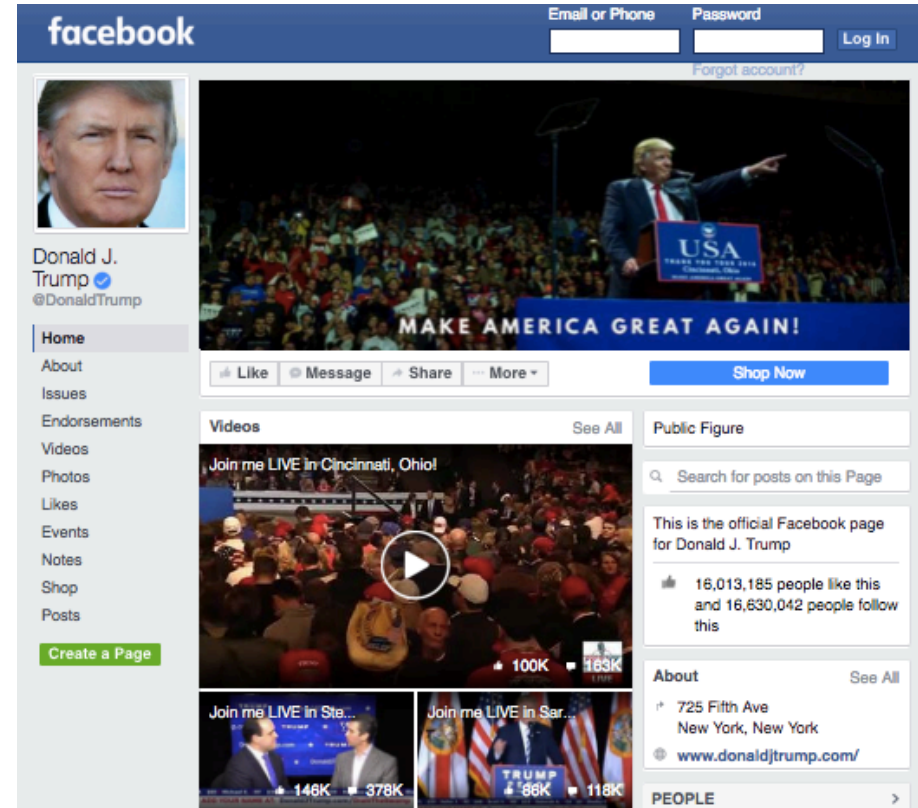
- Backpropagation, stochastic gradient descent and other fast optimization techniques.
- Massively parallel GPU computing.
- Availability of image data for training.
- **Convolutional neural networks** make large-scale image feature classification possible.





# Developing an empirical basis for the study of political images more important now than ever...

- Image saturated political landscape.
- Daily communication between politicians and constituents through photos common.



President-elect Donald J. Trump's Facebook profile.

# Study goals

- Develop a framework for understanding how **politicians** communicate with **constituents** through images.
- Demonstrate that image features identified as part of our theory causally affect how politicians are perceived.
- Apply the framework to an analysis of the use of images by members of the U.S. House and Senate on Facebook.

# A framework for political image analysis

- Democratically elected politicians behavior can be understood by their desire to get re-elected. (Mayhew 1974)
- Major goal of political image analysis is then understanding *how* politicians use images to further their re-election goals or advance careers.
- Fenno's (1978) theory of "home style" provides guidance.

# A framework for political image analysis: fundamentals

Three major politically relevant features of images.

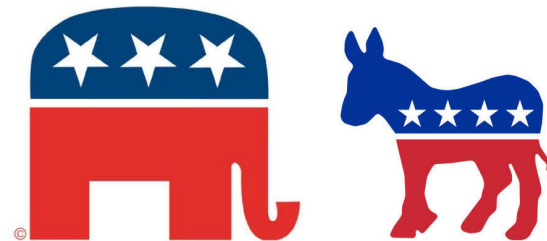
① **Objects.**

② **People.**

③ **Poses.**

# Objects

- Objects and symbols contain political meaning when juxtaposed with a political figure or by themselves.
- Tend to contain abstract information about the personal qualities of politicians and/or their policy positions.



*Symbols of the Republican and Democratic parties.*

# Objects

- Objects and symbols contain political meaning when juxtaposed with a political figure or by themselves.
- Tend to contain abstract information about the personal qualities of politicians and/or their policy positions.



Former Texas Governor Rick Perry posing with rifles in a gun shop.  
Source <http://www.politico.com/gallery/politicians-with-guns>

# People

- Politically relevant to the extent that they can convey information to constituents.
- Well known people.
- Unknown people.



New Jersey governor Chris Christie embraces President Obama during his visit to the state after Hurricane Sandy in 2013.  
*Source: Breitbart*



# People

- Politically relevant to the extent that they can convey information to constituents.
- **Well known people** – may be used to signal ideology/bipartisanship.
- Unknown people.

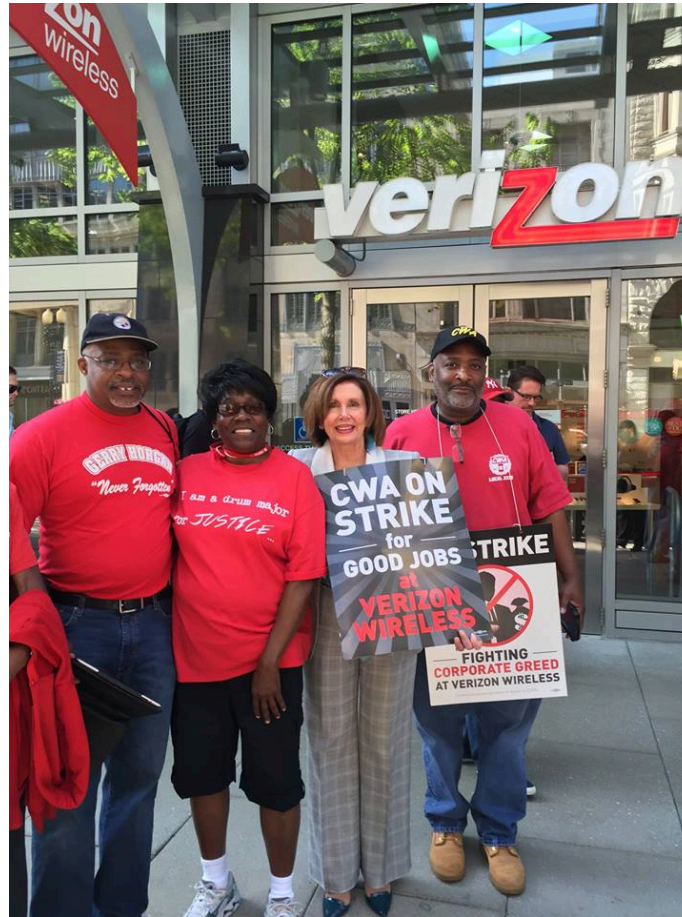


New Jersey governor Chris Christie embraces President Obama during his visit to the state after Hurricane Sandy in 2013.  
*Source: Breitbart*



# People

- Politically relevant to the extent that they can convey information to constituents.
- Well known people.
- **Unknown people** – Visible group qualities (age, race, gender) may signal identification/concern with constituency group.



Nancy Pelosi posing next to union members on strike in her district

# Poses

- Gestures, facial expressions etc. convey wide ranges of emotions.



Images from Google search of “John Boehner”, former Republican House speaker.

# Home style (Fenno 1978)

- Fenno's (1978) theory of home style developed through following around several members of Congress over a number of years.
- Gaining and maintaining trust among constituents fundamental to reelection goals.
- Idiosyncratic sets of behaviors developed among members of Congress as they attempted to gain trust among constituents.

# Home style (Fenno 1978)

- Main components:

- ① **Resource allocation** – how she allocates scarce resources.
- ② **Washington activities** – what she is doing when outside of their district.
- ③ **Presentation of self** – how she presents herself to constituents.

# “Photographic” home style

- Those elements of home style that can be readily communicated through images.

**① Washington activities.**

**② Presentation of self.**

# Both can be communicated through image features

Image Attributes	Elements of Home Style			
	Empathy	Identification	Qualification	Washington Activities
	Poses	People	Objects	
Poses				
People				
Objects				

# Washington activities

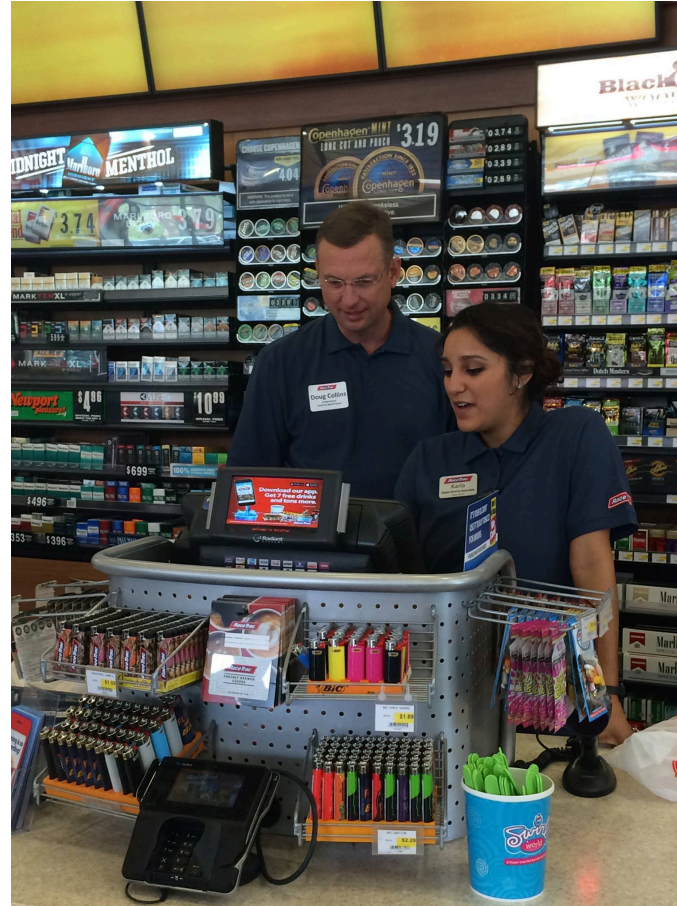
- Demonstrating they are fighting for constituents in DC.
- Demonstrating they are “different from” other members of Congress.



# Just another “average Joe” ...

Rep. Doug Collins (R-GA 9, right) posing as a convenience store clerk in his district.

Source: Rep. Collins' Facebook page: <https://www.facebook.com/RepresentativeDougCollins/photos/>





# Tirelessly fighting for constituents...



Rep. John Lewis (D-GA 5, left) being arrested for blocking traffic during an immigration rally in Washington DC in 2012.

# Presentation of self

- Trust gained through presentation of self involves three elements:

① **Qualification** – “I’m qualified for the job.”

② **Identification** – “I’m one of you.”

③ **Empathy** – “I feel your pain.”

# Presentation of self demonstrated through poses, people and objects in photos

Image Attributes	Poses	Empathy	Identification	Qualification	Washington Activities

The table displays the relationship between Image Attributes and Elements of Home Style. The rows represent Image Attributes: Poses, People, and Objects. The columns represent Elements of Home Style: Empathy, Identification, Qualification, and Washington Activities. The cells are colored blue or white, indicating a specific relationship or presence.

Image Attributes	Empathy	Identification	Qualification	Washington Activities
Poses	Blue	White	Blue	Blue
People	Blue	Blue	White	Blue
Objects	White	Blue	White	Blue

# Qualification

Rep. Joe Kennedy III (D-MA 4) giving a speech on behalf of the Energy and Commerce Committee.

Source: Joe Kennedy III  
Facebook page: <https://www.facebook.com/CongressmanJoeKennedyIII/>





# Identification and empathy

House Speaker Paul Ryan Poses with a Vietnam Veteran.

Source: <https://www.facebook.com/paulryanwi/>.



# Identification and empathy

A photo collage posted on Rep. Louise Slaughter's (D-NY 25) Facebook profile.

Source: <https://www.facebook.com/RepLouiseSlaughter/>



# The people you pose with experiment

- Focus on presentation of self.
- Do group qualities (gender and race) causally affect how politicians are perceived?
- Focus on Rep. Lou Barletta (R, PA-11).

# Image treatments

Alone



Man



Woman



Af. American





# Questions related to home style

Survey Questions	What is your best guess of this politician's ideological orientation?		
	What is your best guess of the political party that this politician belongs to?		
	Does the politician seem like someone who shares my values?		
	Does the politician seem like a strong and decisive leader?		
	Does the politician seem knowledgeable about the issues?		
	Does the politician seem honest and trustworthy?		
		Empathy	Identification
		Qualification	
		Elements of Home Style	

1,100 respondents recruited through Amazon MTurk

# “What is your best guess of the political party that this politician belongs to?”

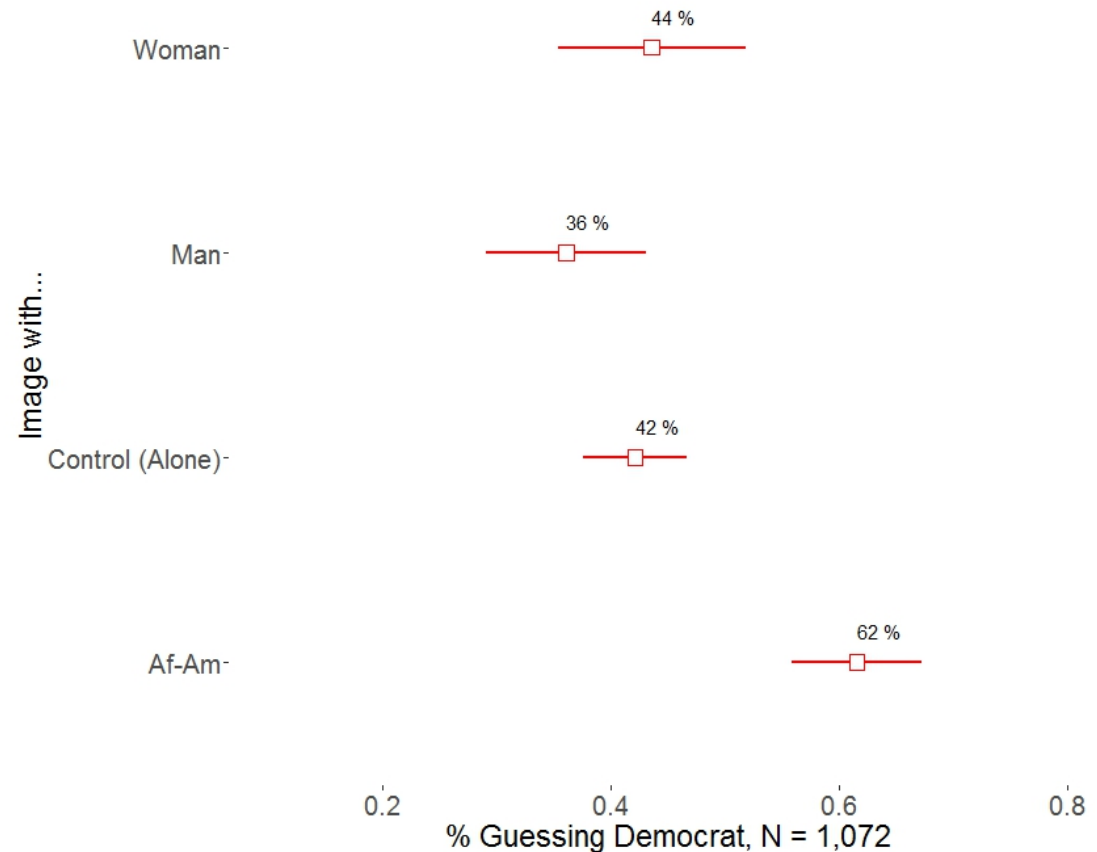
Beliefs about Barletta's party ID vary significantly by image shown.

**Woman:** 44% guessed Democrat  
54% guessed Republican

**Man:** 36% guessed Democrat  
64% guessed Republican

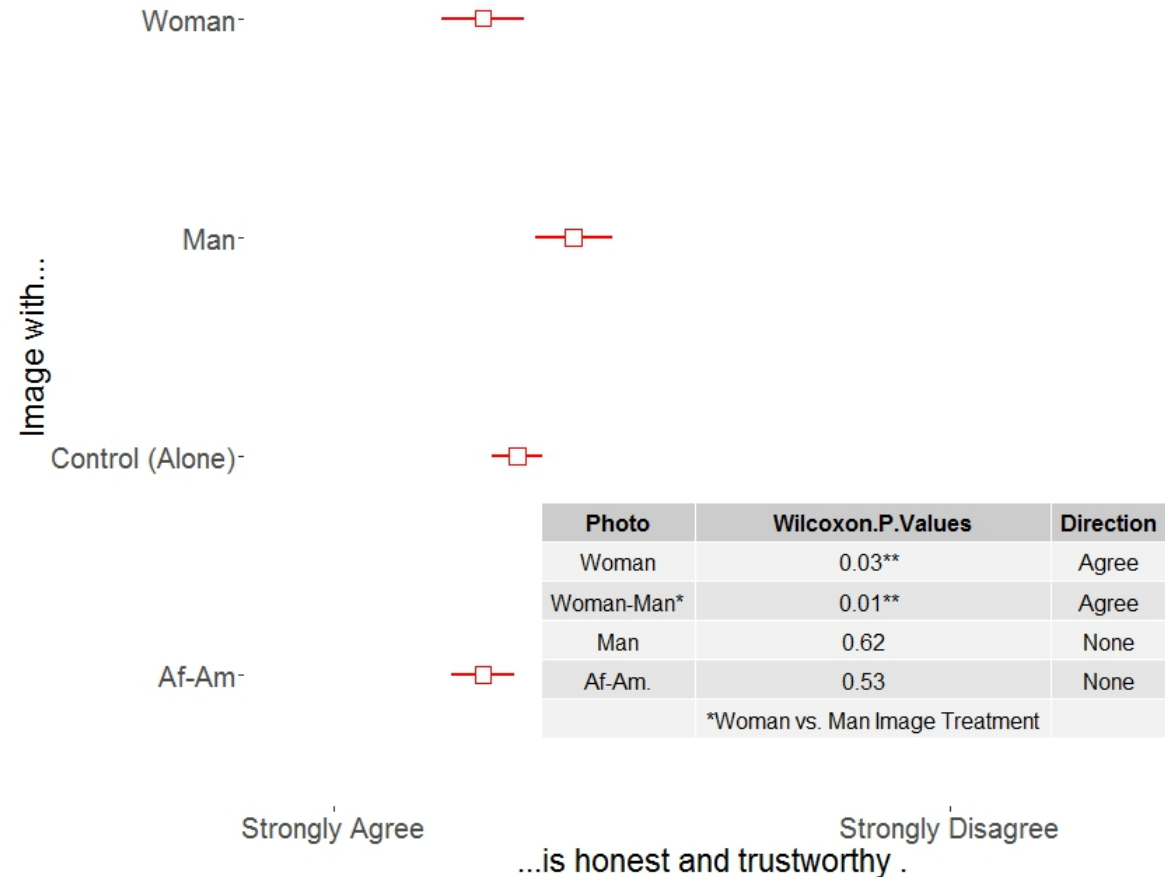
**Alone:** 42% guessed Democrat  
58% guessed Republican

**Af. Am:** 62% guessed Democrat  
38% guessed Republican



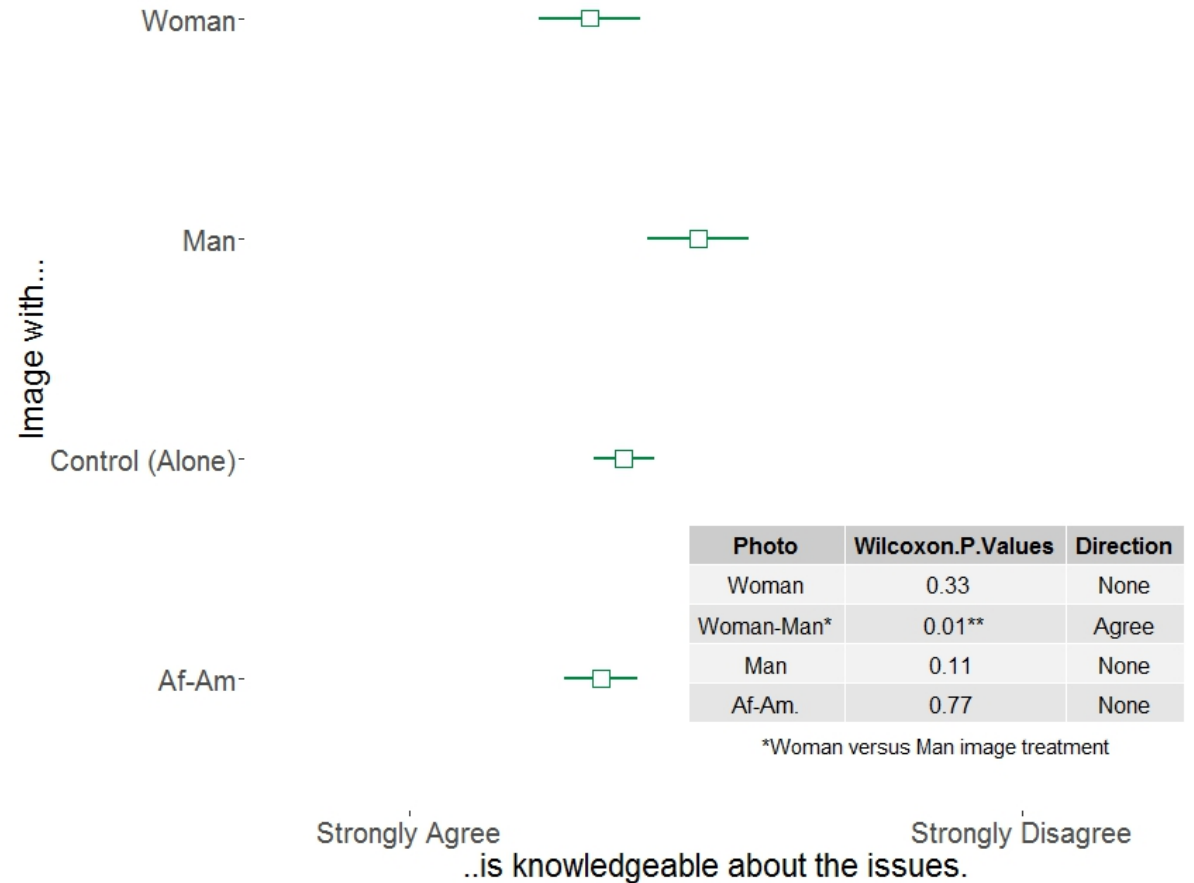
# “Does this politician seem...honest and trustworthy?”

Perceived to be *more trustworthy* when pictured next to a woman.



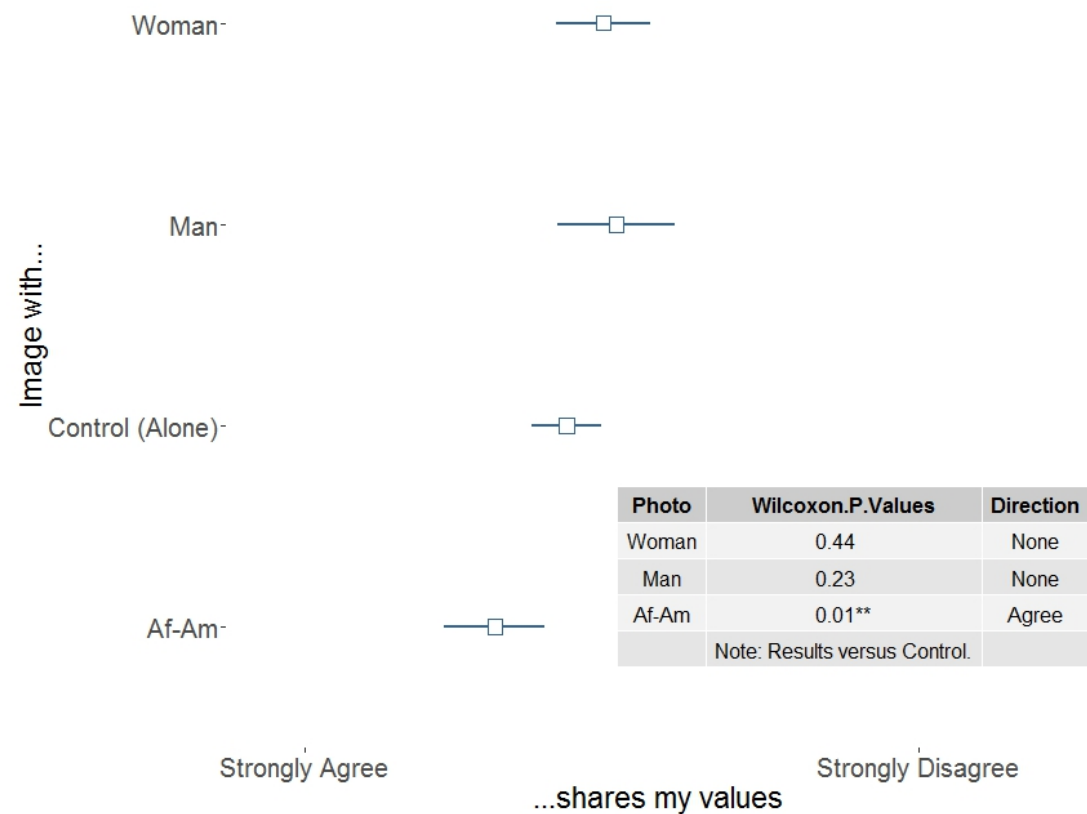
# “Does the politician seem...knowledgeable about the issues?”

Perceived to be *less knowledgeable* when pictured next to an older, white man.



# “Does the politician seem...like someone who shares my values? (non-white respondents)”

Perceived by **non-white respondents** to **share their values** when pictured next to African-American men.



# Exploring photographic home styles with convolutional neural networks

- Do members of the House and Senate use the race of people that they pose with strategically? i.e. to manipulate their presentation of self?

# Hypotheses

**H1:** *Republican members of Congress do not rely on votes from minority constituents and thus will not strategically use race in the photos they post.*

**H2:** *Democrats rely heavily on votes from minority groups and thus will strategically use race in the photos they post.*

**H3:** *As a consequence of **H1** and **H2**, we expect to find a strong relationship between Congressional district or state demographics and the racial composition of Facebook photos among Democrats in Congress and not Republicans.*

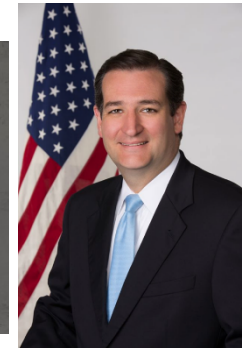


# Methods

- Collect photos from the Facebook profiles of members of Congress.
- Train a convolutional neural network race classifier to identify the race of individuals in photographs.
- Compare Facebook profile “demographics” with district or state demographics.

# Data

~192,000  
Facebook images  
with text posts  
for accounts of:  
**230 US House  
members.**  
**53 US Senate  
members.**

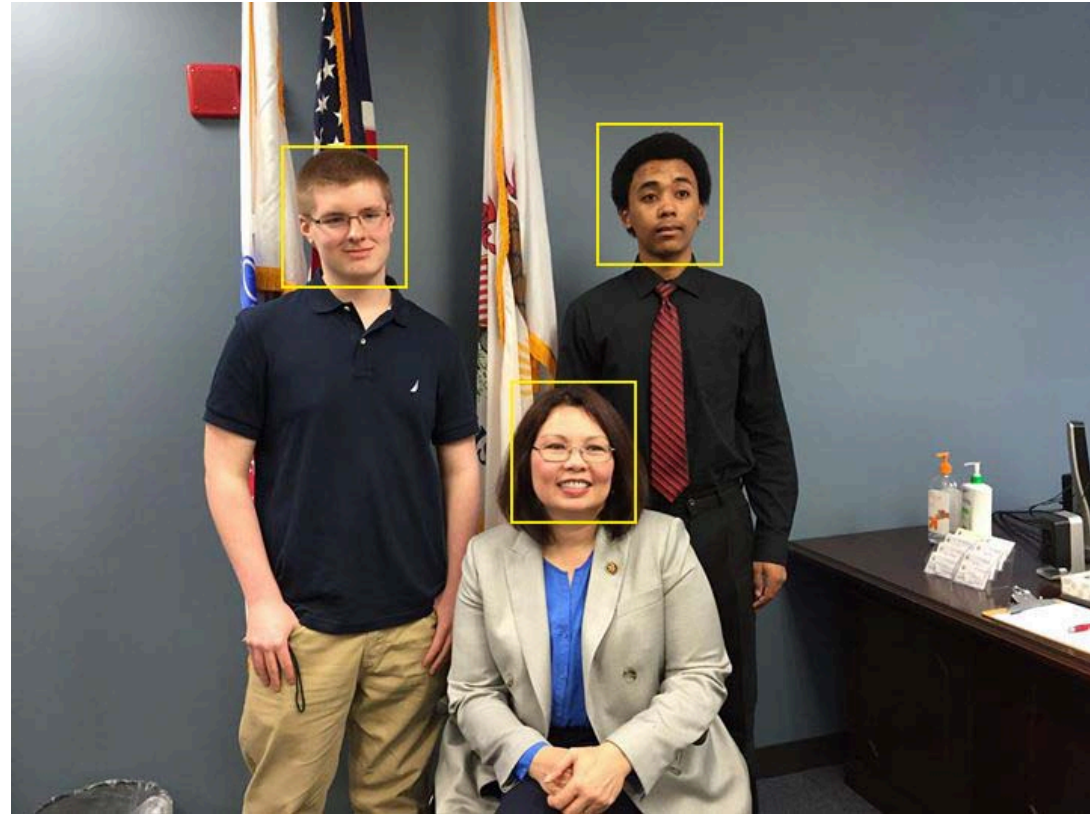


# Convolutional neural network: building a race classifier

- 16-layer convolutional neural network (“VGG”, Simonyan and Zisserman, 2014).
- Fine tuned using 17,500 PubFig (Kumar et al. 2009) training images with the following annotations as ground truth: African-American, white, hispanic and asian.
- 44,000 annotated portraits of American high school seniors also included in training set (Ginosar et al. 2015).

# Convolutional neural network: building a race classifier

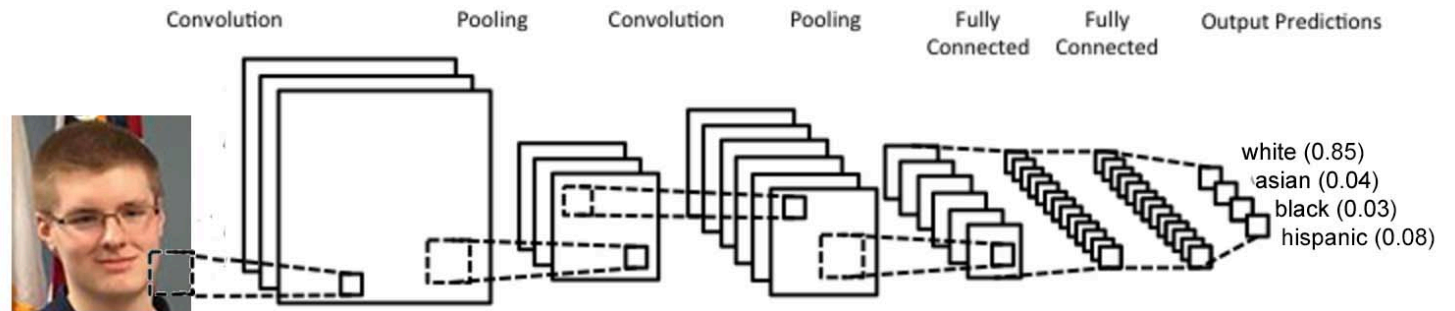
- Faces in Facebook images identified with haarcascades, cropped to match training set.



A Facebook photo from Representative Tammy Duckworth's (D-IL) profile.

# Convolutional neural network: building a race classifier

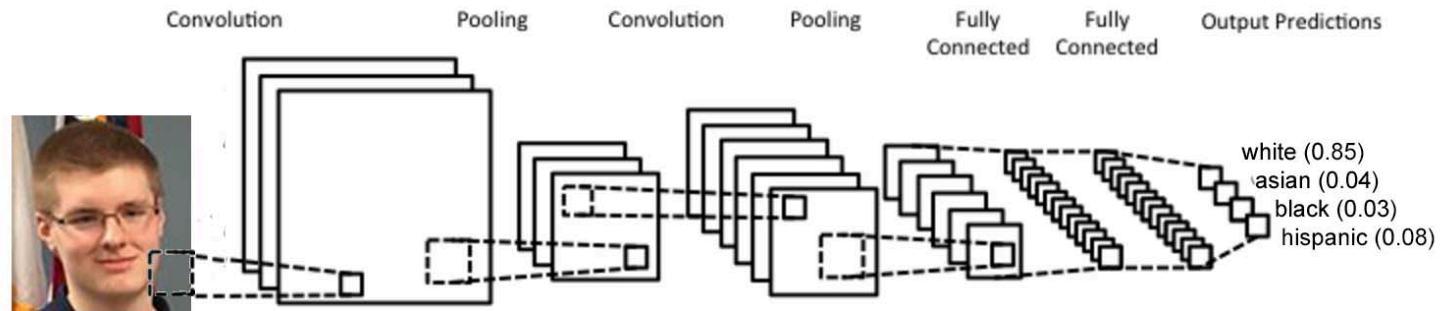
- 16-layer VGG CNN trained on original 61,000 annotated images.
- 17,000 Facebook images used for validation.
- Classifier fine-tuned over 100,000 iterations.



Representation of a convolutional neural network race classifier.

# Convolutional neural network: building a race classifier

- Accuracy improved by manual verification of high confidence classifications and adding them to the training data.

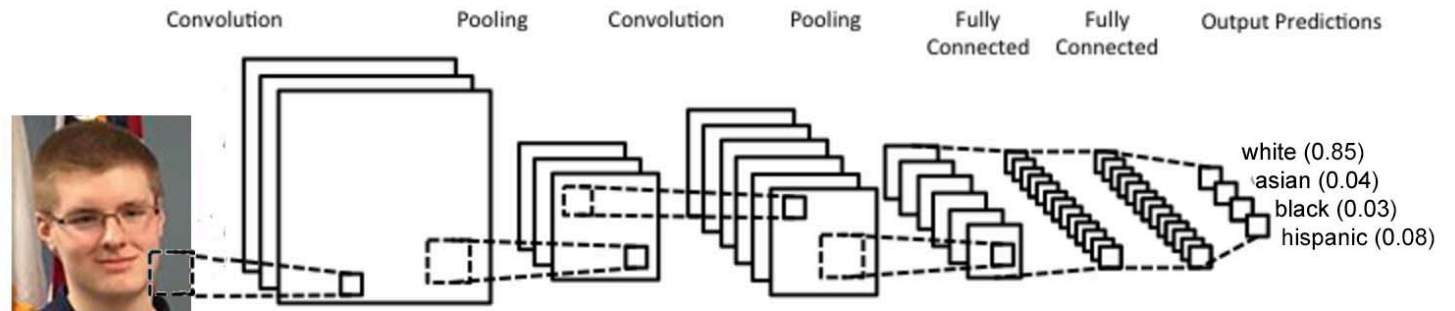


Representation of a convolutional neural network race classifier.



# Convolutional neural network: building a race classifier

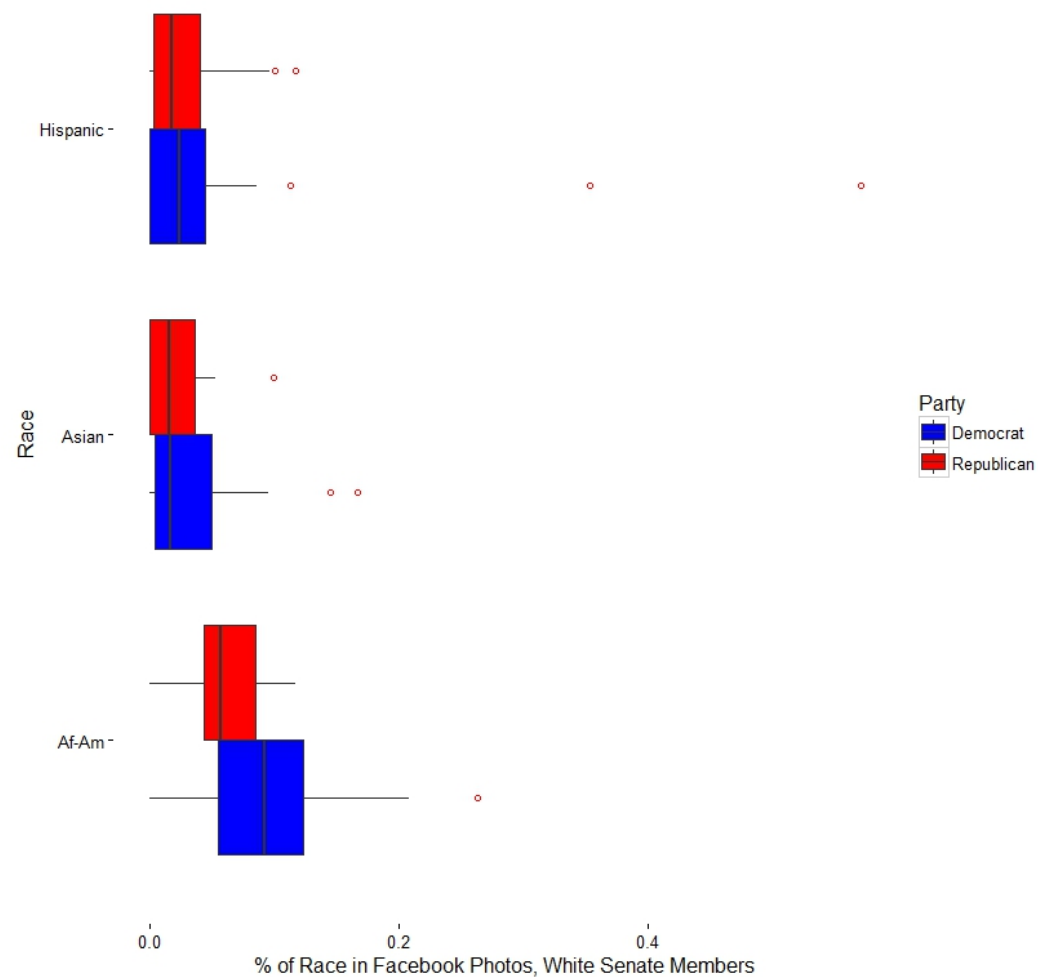
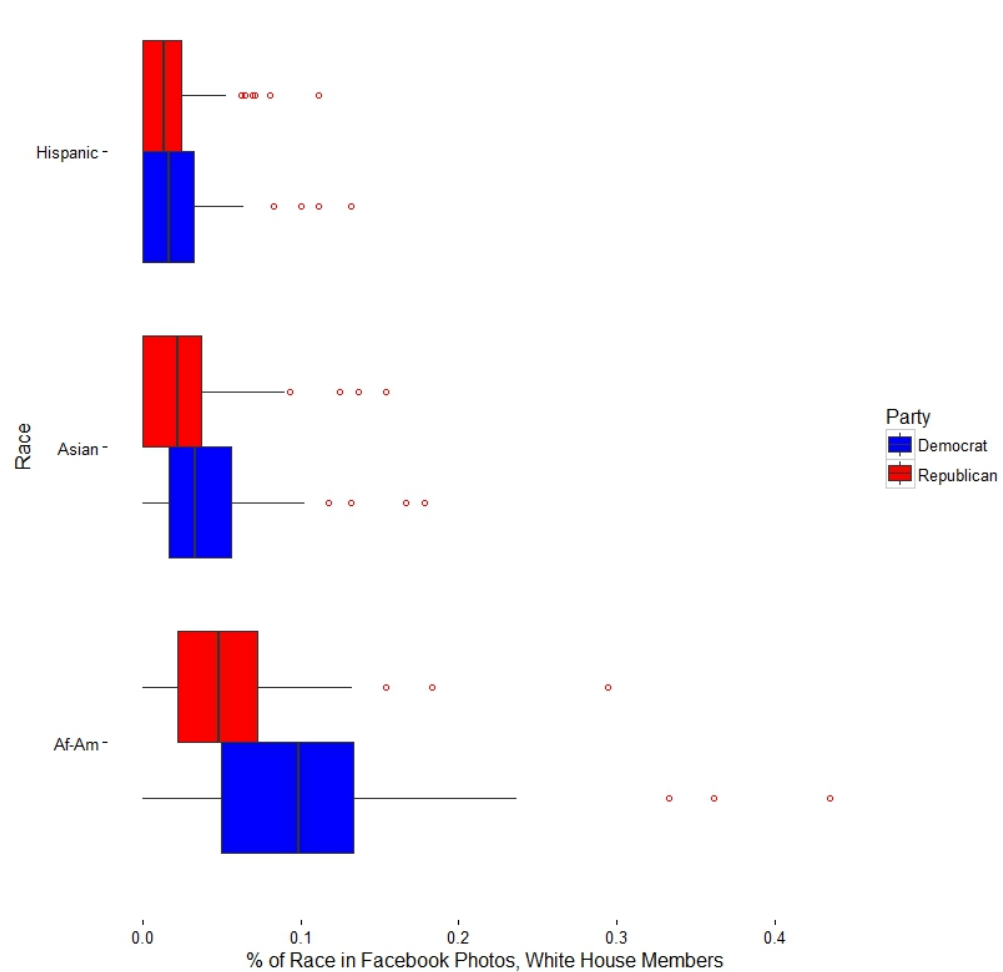
- Augmented dataset trained over 20,000 iterations.
- Avg. cross-validated accuracy rates of **90%** for whites, **85%** for African-American, **75%** for Asian, **65%** for Hispanic.



Representation of a convolutional neural network race classifier.

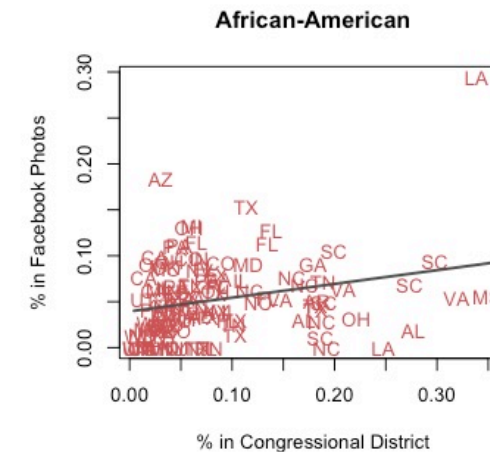
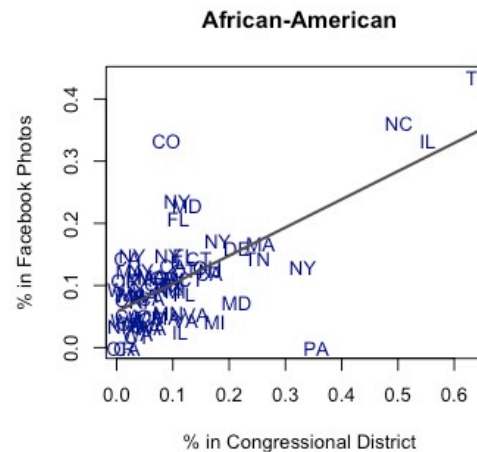
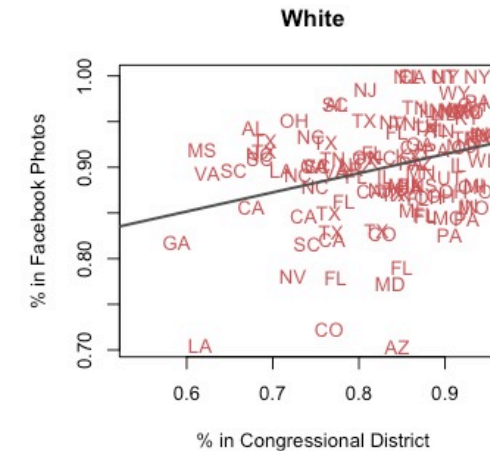
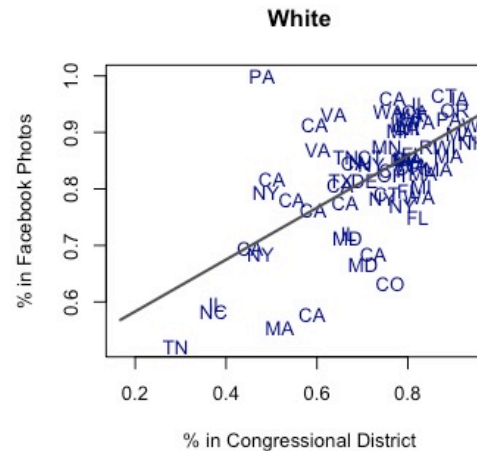


# Results: white House and Senate members



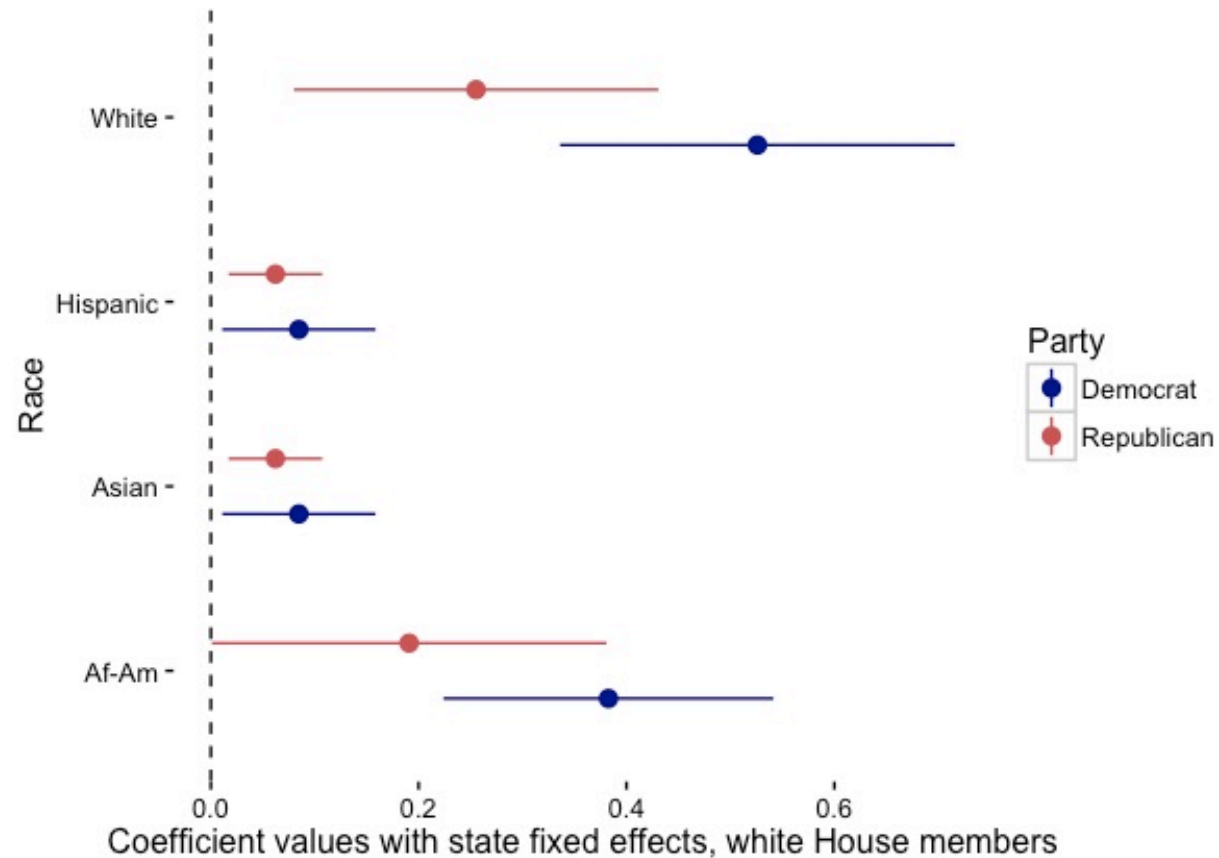
# House: district v. Facebook racial demographics, white members.

Democratic MCs (blue)  
Republican MCs (red)



# House: district v. Facebook racial demographics, white members

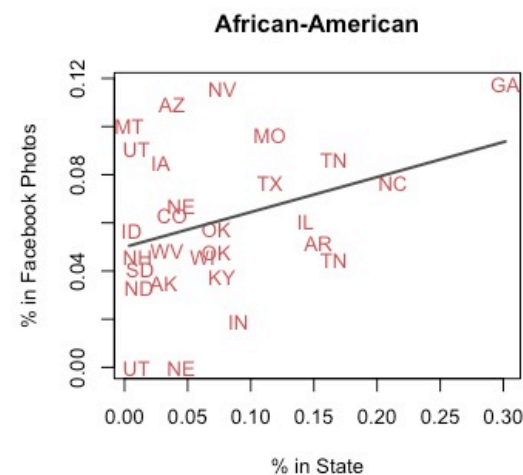
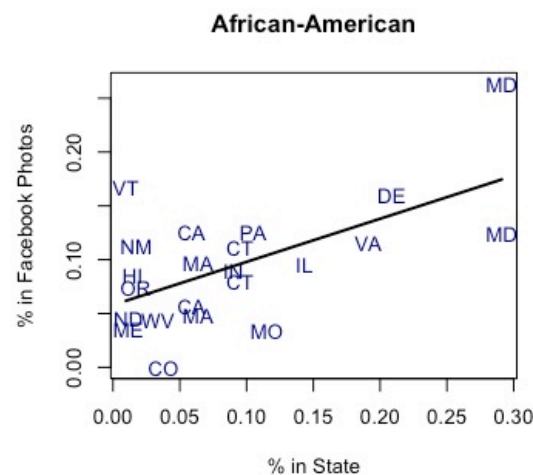
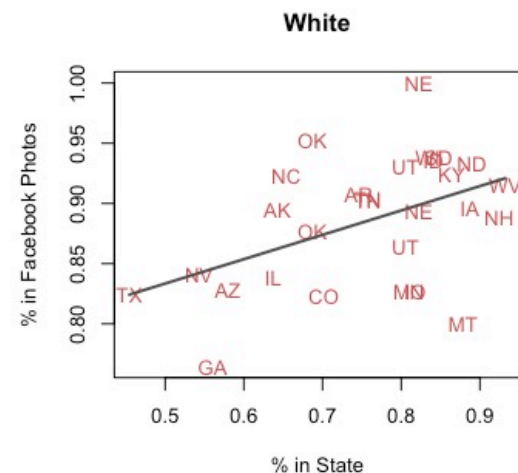
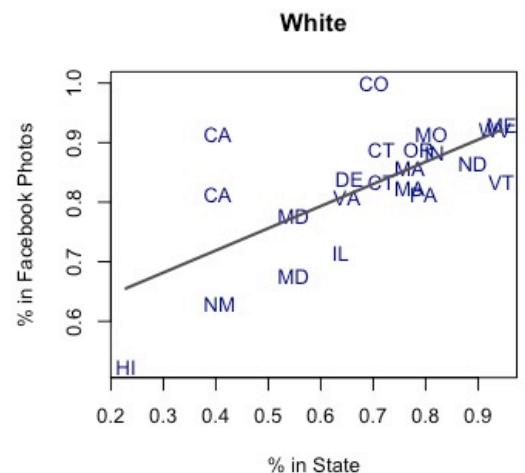
Differences hold when state fixed effects are included.



# Similar patterns in the Senate...

Democratic MCs (blue)  
Republican MCs (red)

State demographics v.  
Facebook profile  
demographics.



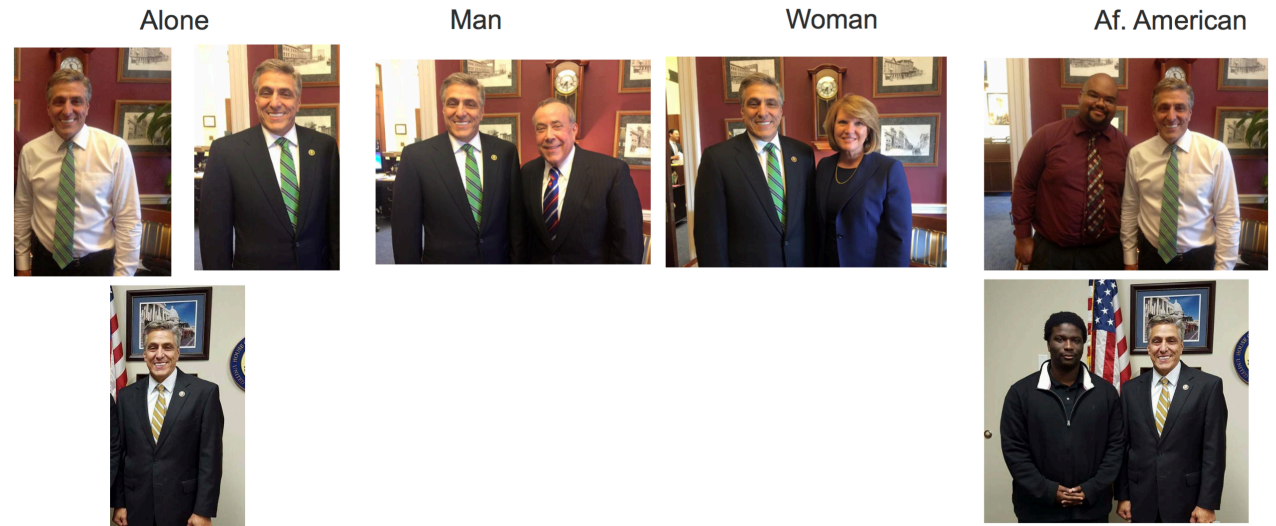
# Questions?

# Framework for understanding how politicians communicate with constituents through images.

- **Mayhew (1974)** “The Electoral Connection” – politician’s behavior can be understood by re-election motivations.
- **Fenno (1978)** “Home Style: House Members in their Districts” – idiosyncratic means of gaining trust (and advancing re-election goals) among constituents.

# Demonstrate that image features identified causally affect how politicians are perceived

- Image manipulation experiment with Rep. Lou Barletta (R, PA-11)
- Assesses how people politicians pose with affects **trustworthiness, identification, empathy** and **competence**.





# Analysis of image use by members of the U.S. House and Senate on Facebook.

- ~192,000 Facebook images of 230 House members and 52 Senate members.
- Train 16-layer convolutional neural network race classifier.
- Explore use of race by Democrats and Republicans in Congress

