

# IDENTIFYING AND MINIMIZING UNINTENTIONAL (“unconscious”) BIAS IN SCIENTIFIC PEER REVIEW

## Health Research Alliance

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**CENTER FOR WOMEN'S HEALTH RESEARCH  
SCHOOL OF MEDICINE AND PUBLIC HEALTH  
UNIVERSITY OF WISCONSIN-MADISON**



# Acknowledgements.



National Institutes of Health  
*Turning Discovery Into Health*

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National Science Foundation

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1760092



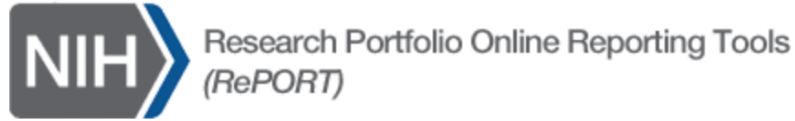
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# Project Information

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## DESCRIPTION

**Project Number:** 1R01GM111002-01 **Former Number:** 1R01OD016764-01

**Contact PI / Project Leader:** [CARNES, MOLLY L.](#) (Contact)  
DEVINE, PATRICIA G  
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**Title:** EXPLORING THE SCIENCE OF SCIENTIFIC REVIEW

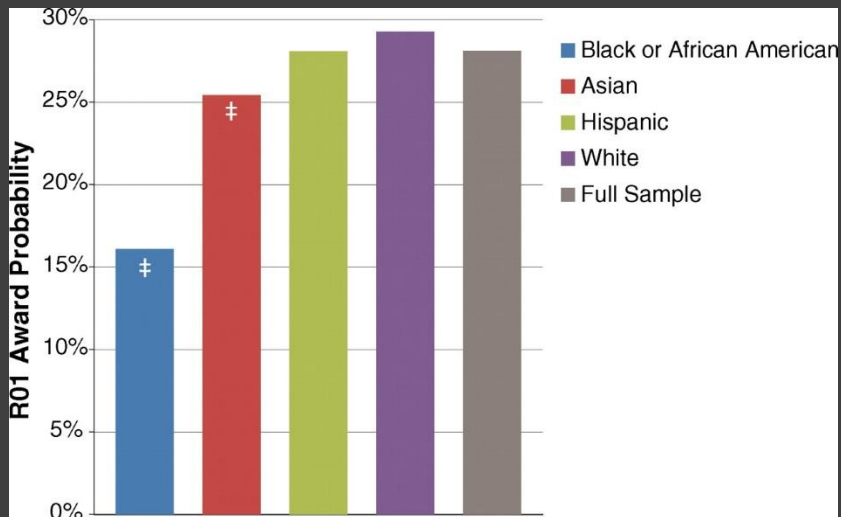
**Awardee Organization:** UNIVERSITY OF WISCONSIN-MADISON

### Abstract Text:

DESCRIPTION (provided by applicant): All humans-no matter how intelligent, egalitarian, or well-intentioned-are susceptible to cognitive biases in the way they make decisions and judge others. Although these biases can operate unintentionally in opposition to one's conscious intentions, personal beliefs, and objective data, they may unwittingly perpetuate social inequalities. Unexplained disparities in R01 funding outcomes by race and gender have raised concern about bias in NIH peer review. This Transformative R01 will examine if and how implicit (i.e., unintentional) bias might occur in R01 peer review through the following three Specific Aims: Specific Aim #1. Identify the extent to which investigator characteristics influence the words and descriptors chosen by R01 peer-reviewers and how text relates to assigned scores. We will validate positive and negative grant evaluation word categories, analyze the text of a national sample of R01 reviews, and compare the grant review text for different investigator characteristics. We hypothesize that categories of words and descriptors will differ in ways that suggest implicitly different evaluation standards by applicant race and gender, even when application scores and funding outcomes are similar. Specific Aim #2. Determine whether investigator race, gender, or institution causally influences the review of identical proposals. We will conduct a randomized, controlled study in which we manipulate characteristics of a grant principal investigator (PI) to assess their influence on grant review outcomes. We will request donations of actual funded R01s and, within each grant, manipulate the PI's gender, race, or home institution. We will then invite reviewers in the appropriate discipline to review the proposals, and we will analyze written reviews and scores. We hypothesize that investigator variables will significantly influence scores and review text such that grants attributed to higher status groups (male, White, prestigious institution) will obtain better scores and text will support implicitly different standards of excellence. Specific Aim #3. Examine how interactional patterns among study section members promote receptivity and resistance to discussion topics and associated grant applicants. In audio- and videotapes of constructed study sections, we will investigate the real-time social interactional processes in the discussions of R01 proposals. We will employ conversation analysis to examine the delivery of initial rankings and their rationales, topic development, and the processes through which final rankings are negotiated. This research is innovative because it examines for the first time the complexities of potential bias in NIH peer review. The potential impact is threefold; this research will 1) discover whether certain forms of cognitive bias are or are not consequential in R01 peer review, 2) determine whether quantitative text analysis is a useful measure of implicit bias, and 3) describe and label real-time grant reviewer interactional patterns. Taken together, the results of our research could set the stage for transformation in peer review throughout NIH.

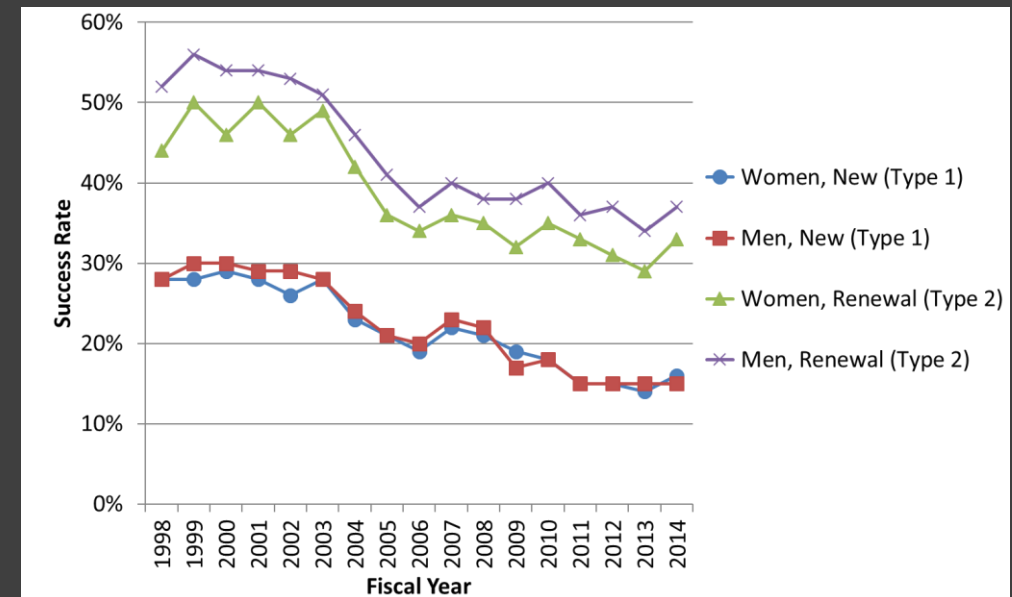
# Race and Gender Disparities in R01 Award Rates.

## Black PIs Have Lower R01 Award Probabilities Than White PIs



Probability of NIH R01 award by race and ethnicity, FY 2000 to FY 2006 (N = 83,188). Based on data from NIH IMPAC II, DRF, and AAMC Faculty Roster. ‡, P < .001; \*\*, P < .01; \*, P < .05; Ginther et al., Science, 2011.

## Female PIs Have Lower R01 Renewal (Type 2) Award Rates Than Male PIs



Success Rates for Male and Female Investigators of NIH Type 1 or Type 2 R01 or Equivalent Awards: 1998-2014; NIH, 2015.

# Aim 1

## Specific Aim #1

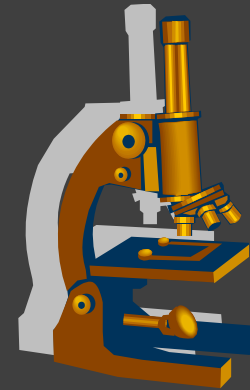
- Identify the extent to which investigator characteristics influence the words and descriptors chosen by R01 peer-reviewers and how text relates to assigned scores



- Analysis of R01 Grant critiques and scores from 2010-2014

Impact	Score	Descriptor	Strengths/Weaknesses
High Impact	1	Exceptional	
	2	Outstanding	
	3	Excellent	
Moderate Impact	4	Very Good	
	5	Good	
	6	Satisfactory	
Low Impact	7	Fair	
	8	Marginal	
	9	Poor	

# Aim 2



## Specific Aim #2

- The first randomized controlled experimental study of the influence of applicant characteristics and application quality on R01 peer review outcomes.



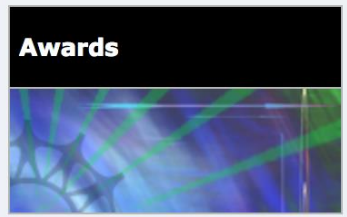
# Aim 3



- **Specific Aim #3**  
The first study of NIH peer reviewers' interactional patterns during R01 study section meetings.

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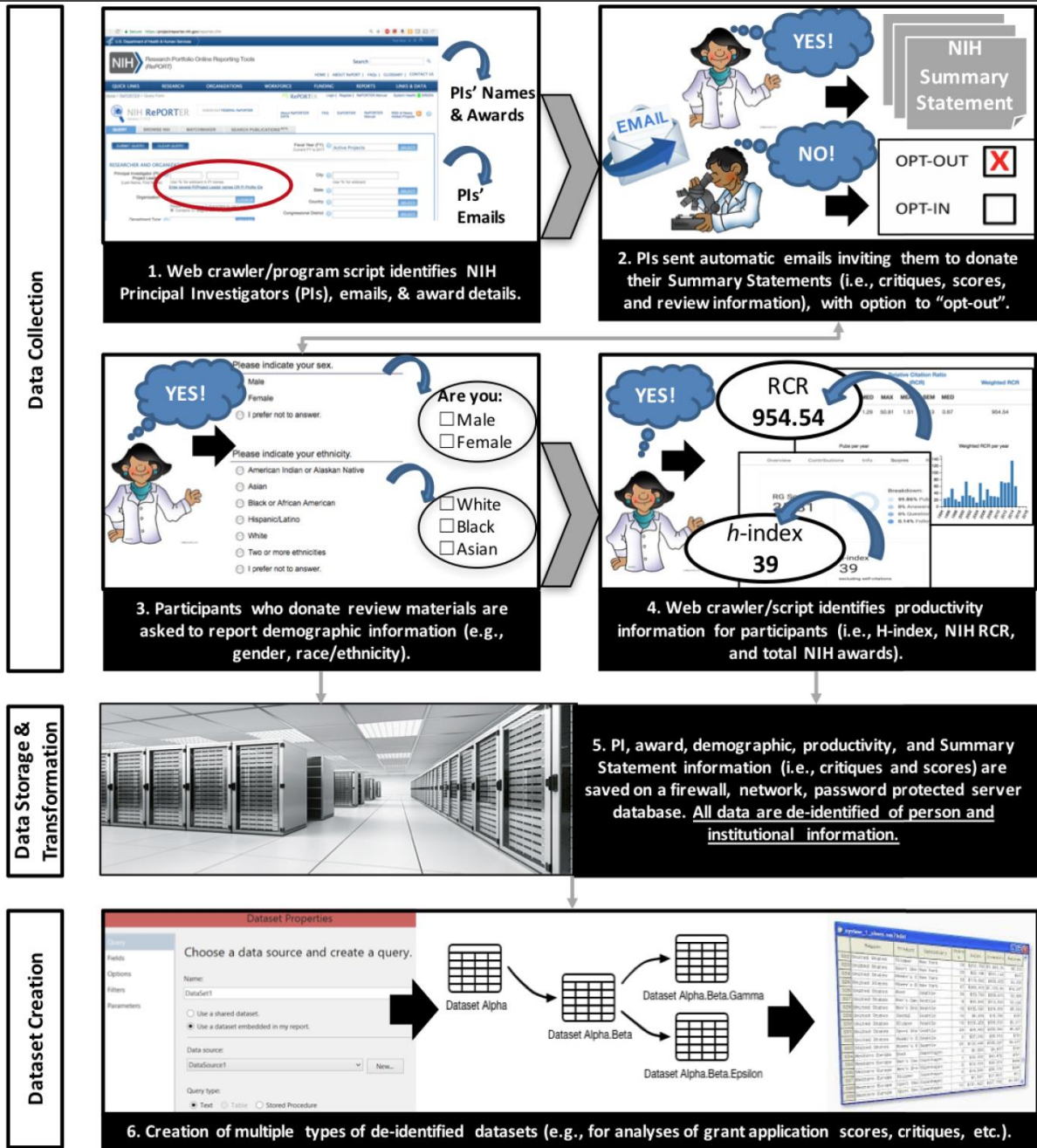


**Award Abstract #1747445**

**EAGER: Can Data Mining and Crowd Sourcing Revolutionize the Study of Scientific Peer Review? Generating a National, Open Depository of Grant Review Outcomes from Federal Agencies**

<b>NSF Org:</b>	<a href="#">SMA</a> <a href="#">SBE Off Of Multidisciplinary Activities</a>
<b>Initial Amendment Date:</b>	July 28, 2017
<b>Latest Amendment Date:</b>	July 28, 2017
<b>Award Number:</b>	1747445
<b>Award Instrument:</b>	Standard Grant
<b>Program Manager:</b>	Mark K. Fiegner SMA SBE Off Of Multidisciplinary Activities SBE Direct For Social, Behav & Economic Scie
<b>Start Date:</b>	August 1, 2017
<b>End Date:</b>	July 31, 2018 (Estimated)
<b>Awarded Amount to Date:</b>	\$149,844.00
<b>Investigator(s):</b>	Anna Kaatz akaatz@wisc.edu (Principal Investigator) You-Geon Lee (Co-Principal Investigator)





# Harnessing machine learning algorithms to study scientific grant peer review.

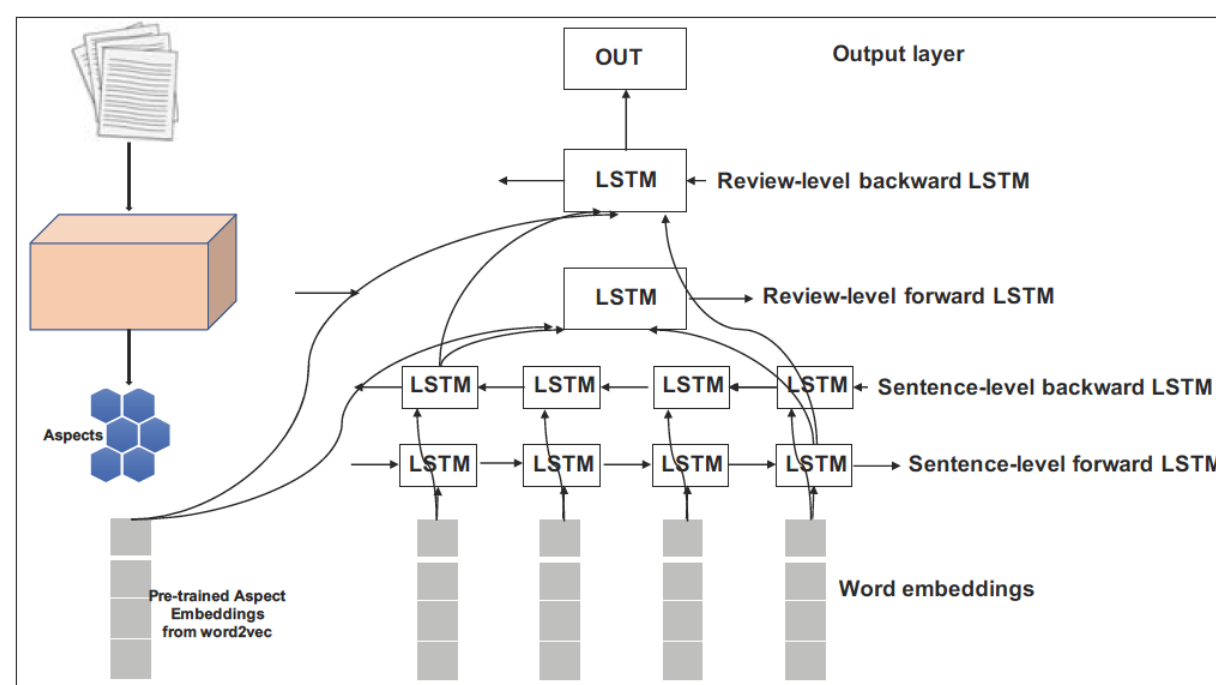


Figure 6. Hierarchical bidirectional LSTM for aspect-based sentiment analysis

Figure 1. Automated pipeline for collection of review outcomes from applications submitted to the National Institutes of Health (NIH).

# Harnessing machine learning algorithms to study scientific grant peer review.

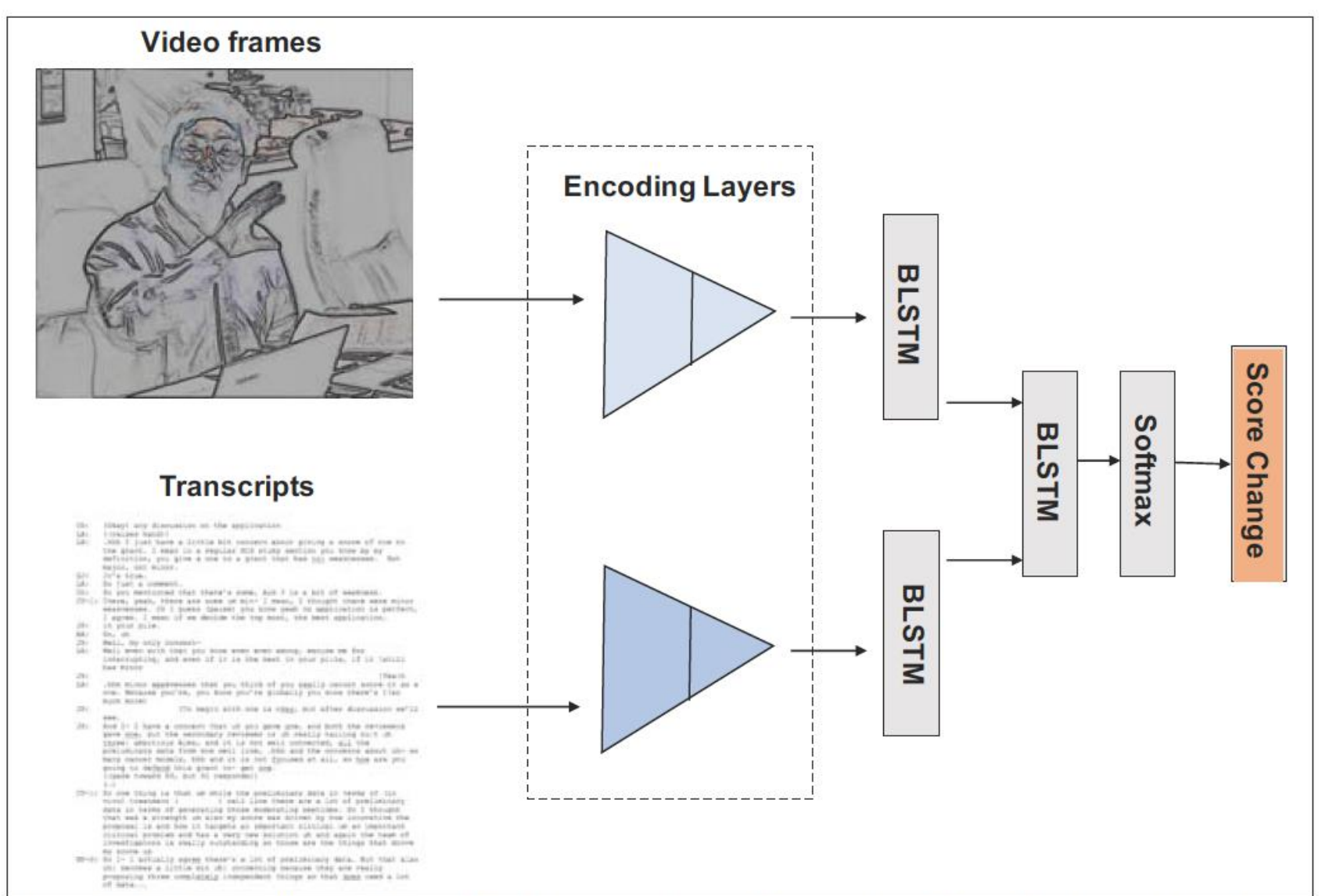


Figure 7. Audiovisual Fusion System to study score change dynamics based on video frame data and transcripts from the study section (Aim 2)





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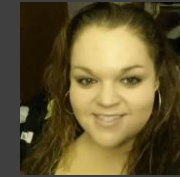
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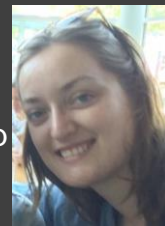
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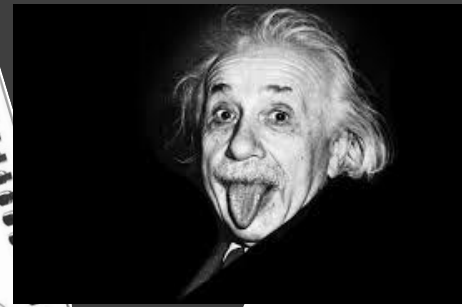
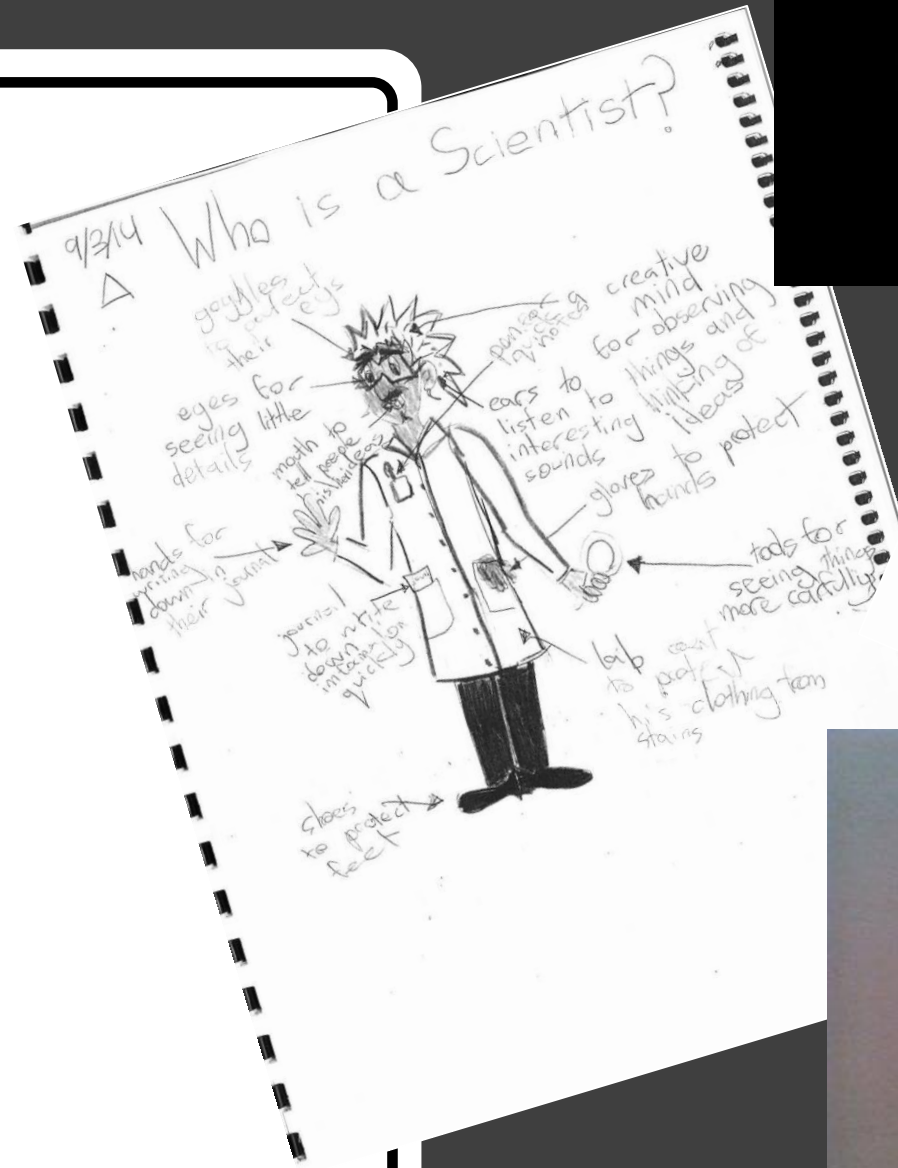
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Draw a scientist

---



# Draw a scientist



Why do you think it is important to have a diverse workforce in science, technology, engineering, mathematics, and medicine (STEMM) fields?

to have better representation of women and minorities in STEMM?

# Why diversity?

---

Diverse working groups are more productive, creative, and innovative than homogeneous groups (Herring 2009; Page 2007; van Knippenberg & Michaela 2007; Chang et al., 2003).

---

Diverse groups engage in a higher level of critical analysis than do homogeneous groups (Sommers 2006; Antonio 2004; Nemeth 1986, 1995).

---

Diverse scholars and professionals can invigorate and expand disciplines and fields (Schiebinger et al. 2013; Catalyst, 2013).

---

Mentors and role models for all (Nat. Acad. Sci. 2007).

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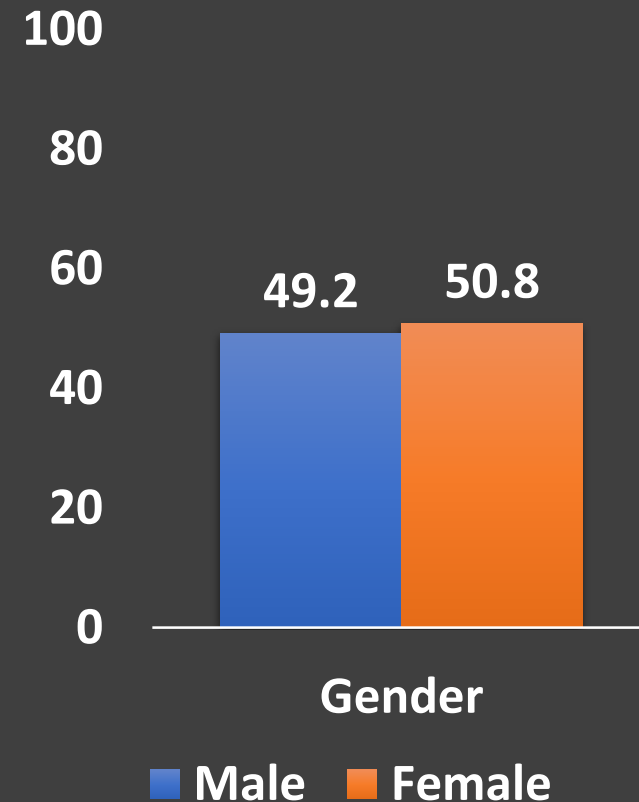
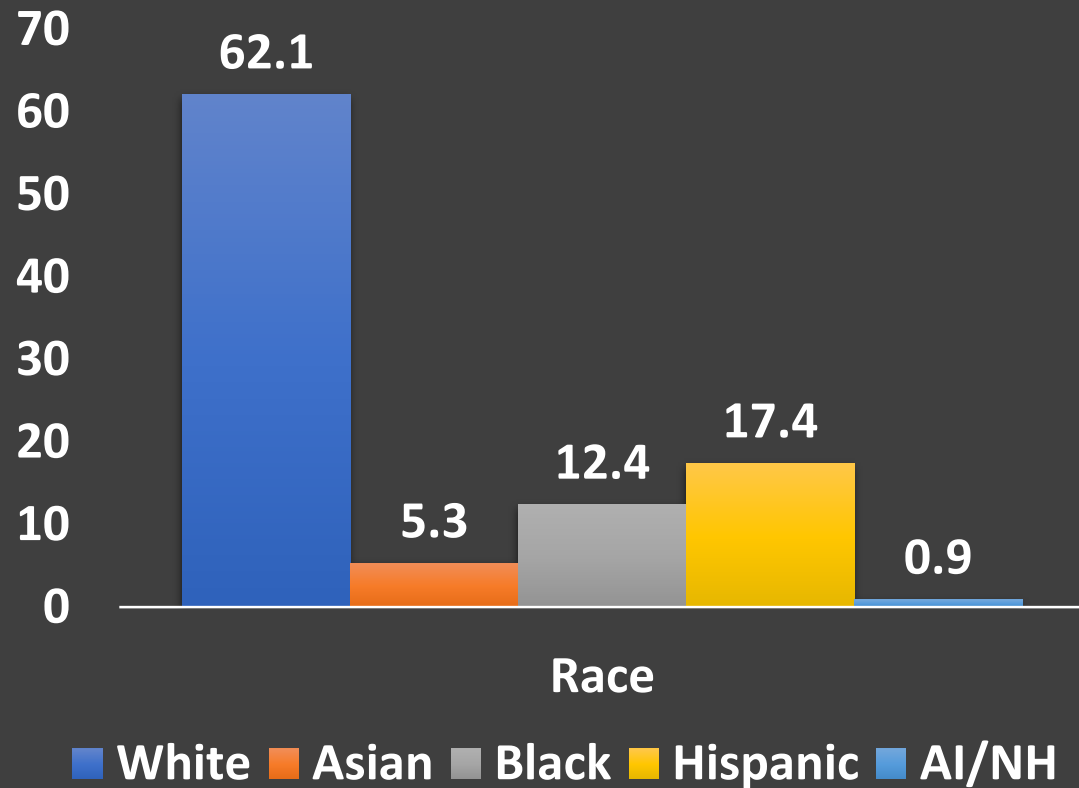
Fairness and equity (Nat. Acad. Sci. 2007).

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**Diversity  
leads to  
innovation.**

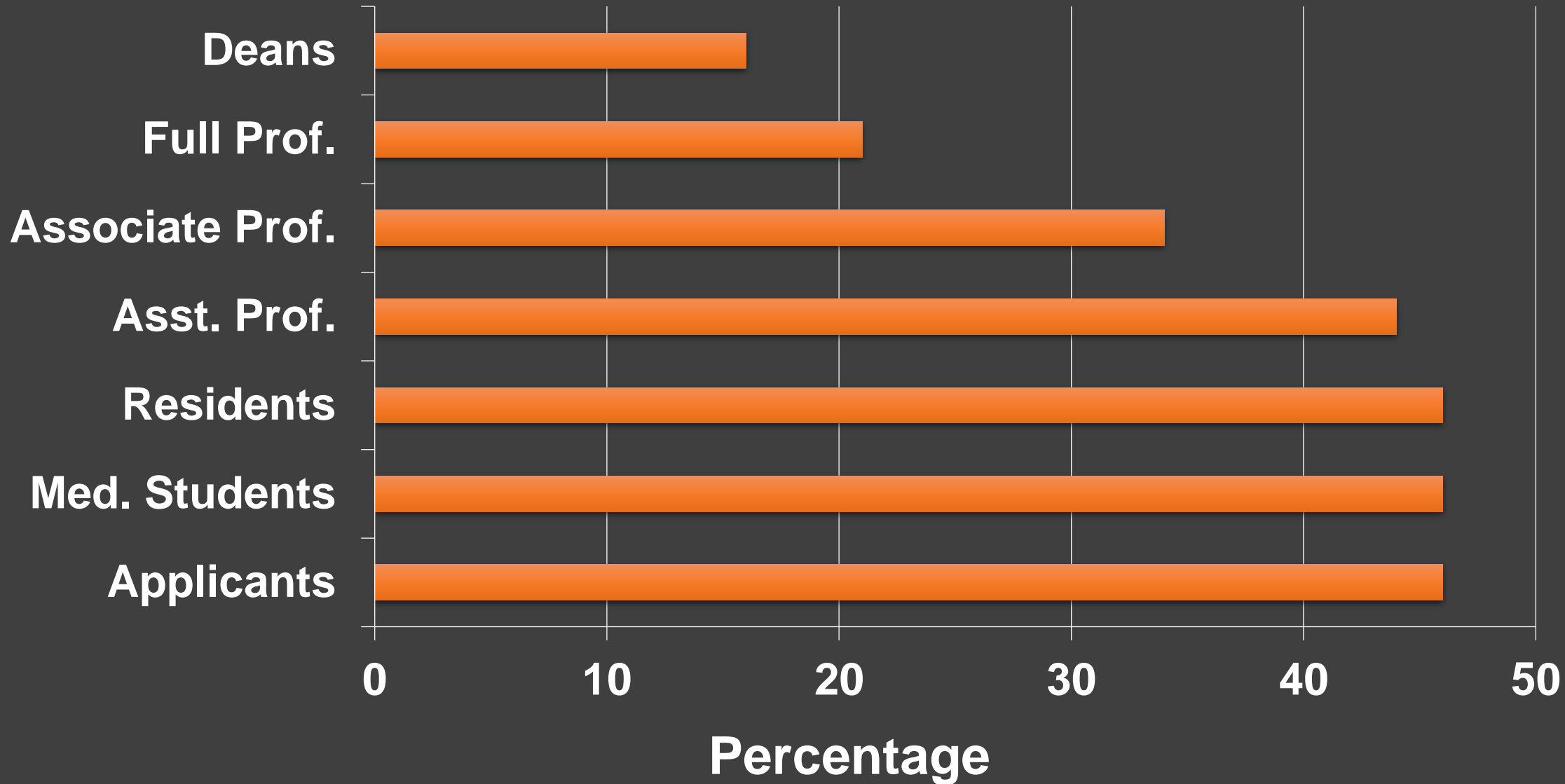
- **Advancing women and racial/ethnic minorities in STEMM is critical for ensuring the future competitiveness of U.S. science and technology.**
  - Research conducted by racial/ethnic minorities and women is linked to technological innovation and is known to address costly education, economic, and health disparities. (National Acad. of Sciences, 2007; 2010; Carnes et al., 2008; Guevara et al., 2013; Roberts et al., 2014)

# U.S. Demographics.

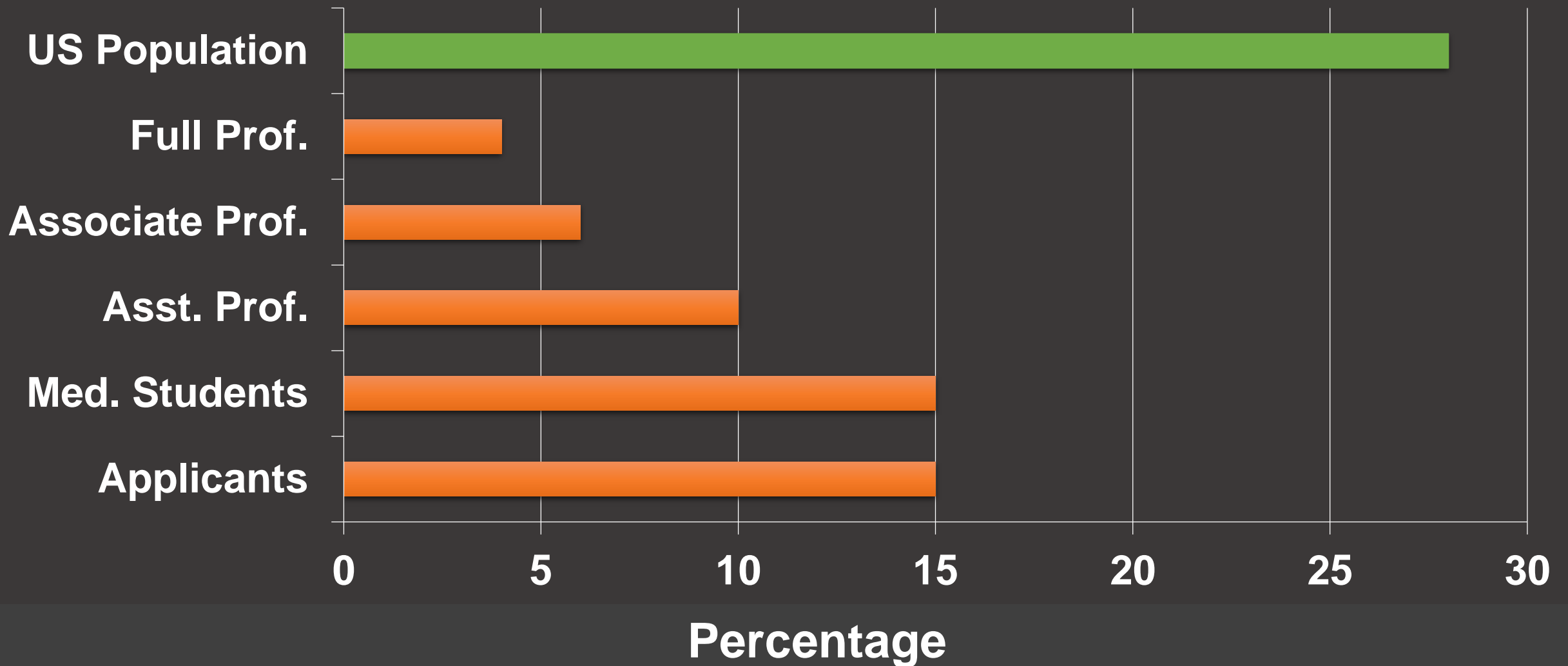




# Women's representation in U.S. med. schools by rank (AAMC Benchmarking Report, 2014).



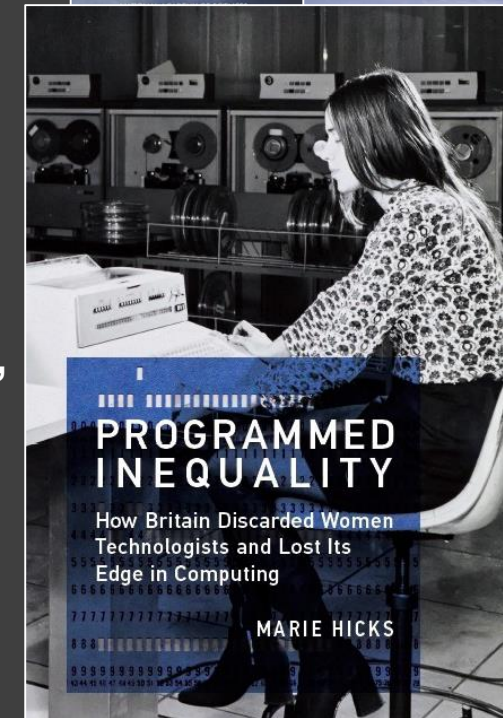
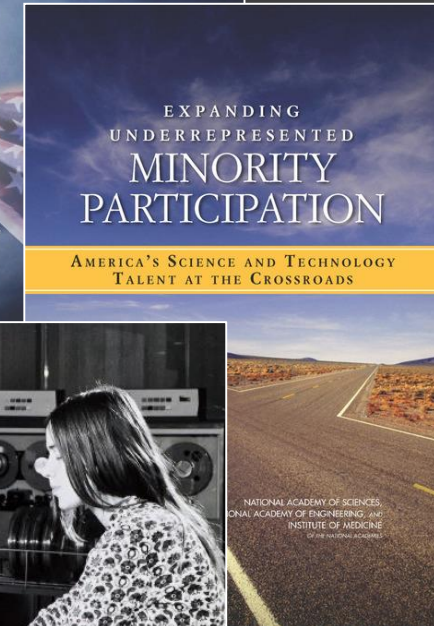
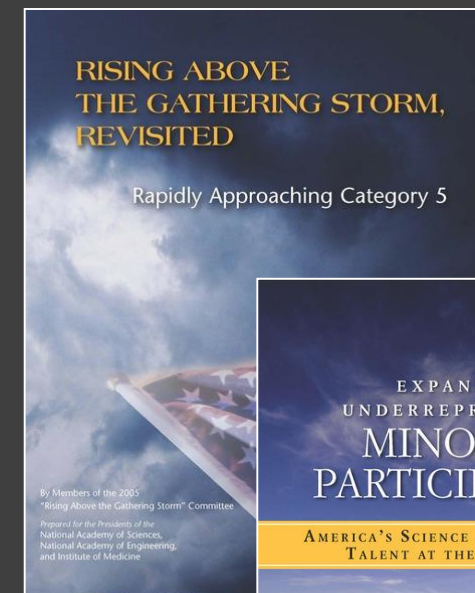
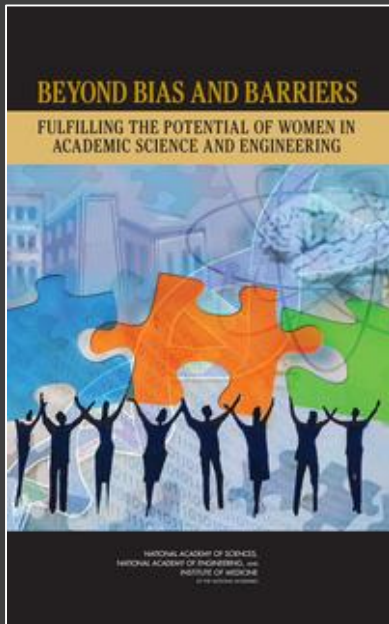
**Racial/ethnic minorities (Blk, Hisp, NA)  
representation in U.S. med. schools by rank (AAMC,  
2014, Guevara et al., 2013; Roberts et al., 2014).**



# Why haven't we solved this already?

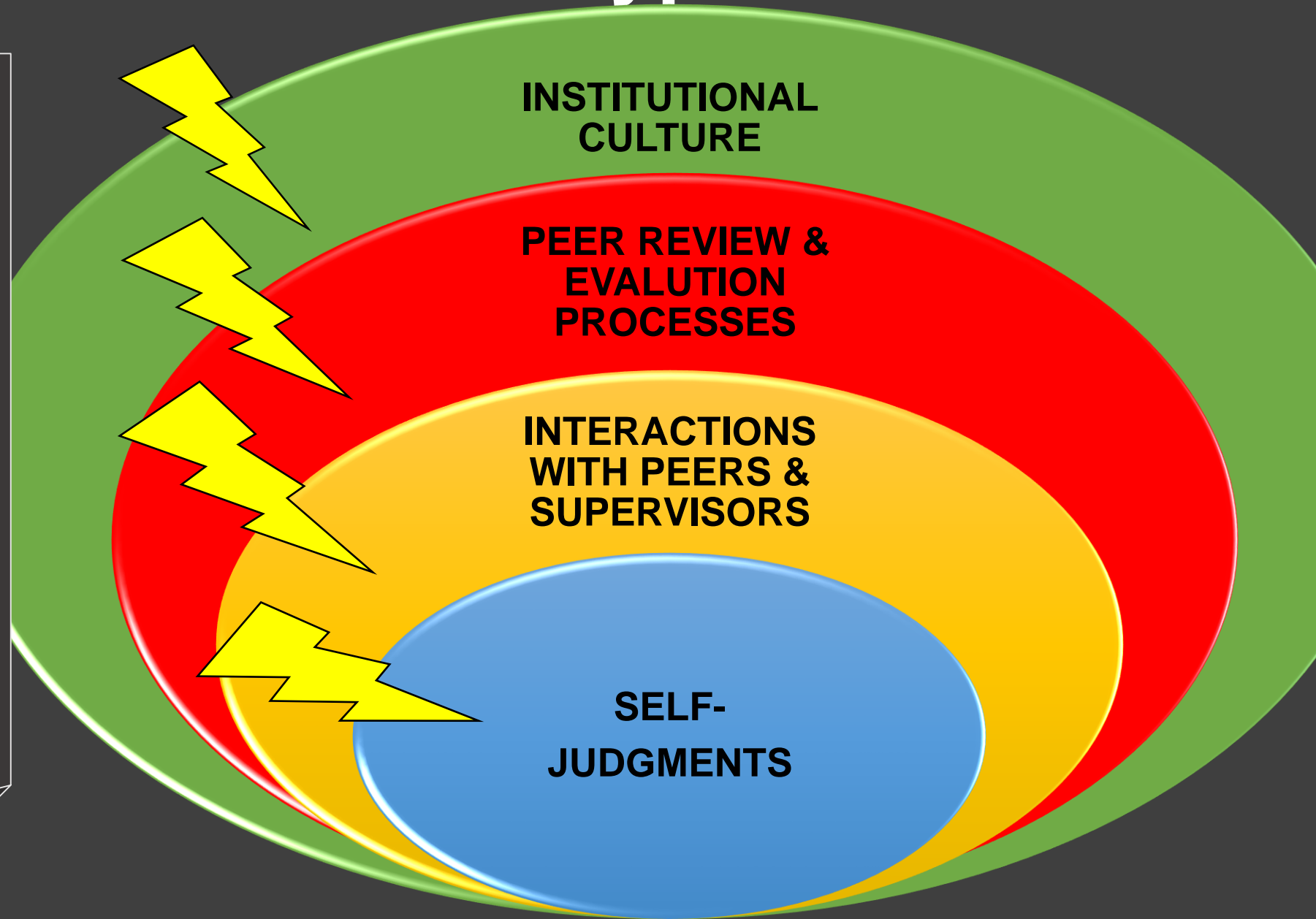
- Title VI (1964) and IX (1972).
- Multiple calls for gender and racial equity for > 40 years.
- National Academy of Sciences concluded that major barriers were:

- ❑ Women and racial/ethnic minorities are equally interested, capable and committed to careers in science and medicine.
- ❑ Stereotypes about gender and race operate to influence self-perception, personal interactions, evaluative processes, and departmental cultures to subtly yet systematically impede women's & racial/ethnic minorities' career advancement.

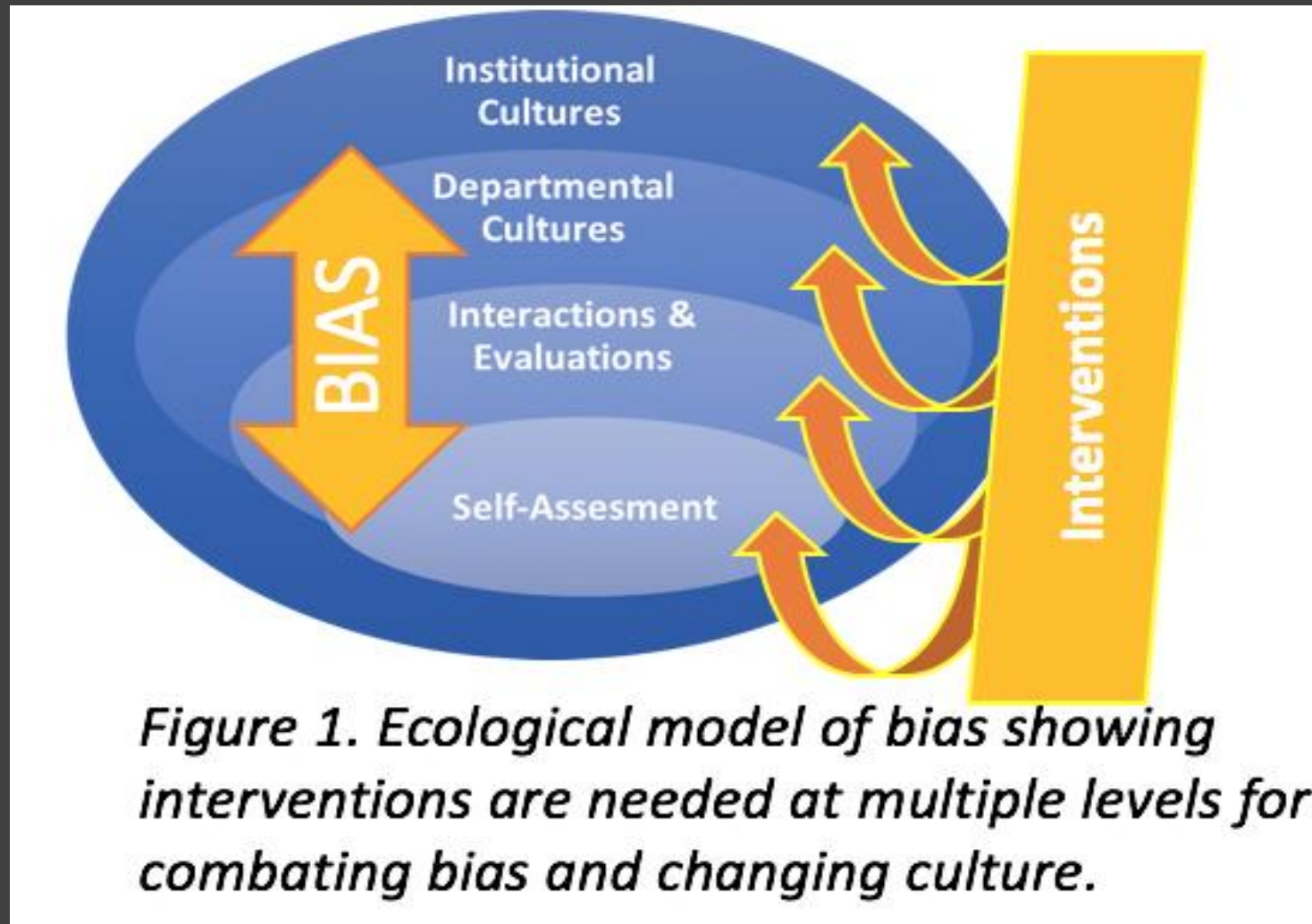


# Ecological model of stereotype-based bias.

Stereotype-based bias impacts self perception, personal interactions, evaluation processes, and institutional cultures to subtly, yet systematically impede the participation and advancement of members of historically underrepresented groups (e.g., women, racial/ethnic minorities, first generation) in science, technology, engineering, mathematics, and medicine (STEMM) fields (National Academies of Sciences, 2004, 2007, 2010, 2014).



# How to address stereotype-based bias? Multilevel Interventions.





What is a  
stereotype?

## ster·e·o·type

/ˈsterēəˌtīp/ 

*noun*

plural noun: **stereotypes**

1. a widely held but fixed and oversimplified image or idea of a particular type of person or thing.  
"the stereotype of the woman as the carer"  
*synonyms:* standard/conventional image, received idea, **cliché**, hackneyed idea, **formula**  
"the stereotype of the rancher"
- a person or thing that conforms to a stereotypical image.  
"don't treat anyone as a stereotype"

- Brain observes patterns, over and over...
- Takes mental short-cuts to reserve brainpower for higher order thinking.

# Stereotypes can lead to unconscious bias.

- What is unconscious bias?
  - Derives from cultural stereotypes that inform us about what someone is like, what their skills and abilities are, and how they should behave based on their group membership (Nosek et al., 2011).
    - Gender.
    - Race/Ethnicity.
    - Sexual Orientation.
    - Weight.
    - Age.

## Group exercise.

---

What traits or behaviors do you think most people associate with being male or “masculine”?

---

What traits or behaviors do you think most people associate with being female or “feminine”?

# Group exercise.

- What traits do you associate with being a scientist?

# Bias arises from stereotypes: Gender.

## Women<sup>1</sup>

Aware of the feelings of others  
Cheerful  
Courteous  
Desires to avoid controversy  
Desire for friendship  
Generous  
Grateful  
Helpful  
Humanitarian  
Kind  
Need for social acceptance  
Need for security  
Sentimental  
Sociable  
Sympathetic  
Tactful  
Talkative

## Men<sup>1</sup>

Able to separate feelings from ideas  
Adventurous  
Ambitious  
Analytical ability  
Authoritative  
Comfort with aggression  
Competitive  
Consistent  
Curious  
Decisive  
Desires responsibility  
Direct  
Dominant  
Feelings not easily hurt  
Firm  
Frank  
High self-regard  
Independent

Industrious  
Intelligent  
Knowledgeable about science  
Knows the ways of the world  
Leadership ability  
Logical  
Mathematical  
Need for achievement  
Need for autonomy  
Need for recognition  
Objective  
Persistent  
Prompt  
Risk-taking  
Self-confident  
Self-reliant  
Steady  
Technically skilled  
Vigorous  
Well-informed

1. Carli et al., 2016.



# Role-congruity for White/male & science.

Scientist: Intelligent, Logical, Rationale, Analytical, Independent, Focused, Persistent, Objective, Knowledgeable, Curious, Industrious.

**Incongruent**

**Congruent**

## Female

Cheerful  
Courteous  
Generous  
Helpful  
Kind  
Sentimental  
Sympathetic  
Tactful  
Talkative

## Male

Ambitious  
Intelligent  
Logical  
Analytical  
Decisive  
Leadership ability  
Objective  
Persistent  
Technically Skilled

1. Carli et al., 2016.

# Role-congruity for White/male & LEADERSHIP.

**Leader: Intelligent, Logical, Rationale, Analytical, Independent, Focused, Persistent, Objective, Knowledgeable, Curious, Industrious.**

**Incongruent**

## **Female**

Cheerful  
Courteous  
Generous  
Helpful  
Kind  
Sentimental  
Sympathetic  
Tactful  
Talkative

## **Male**

Ambitious  
Intelligent  
Logical  
Analytical  
Decisive  
Leadership ability  
Objective  
Persistent  
Technically Skilled

**Congruent**

# Bias arises from stereotypes: Race/ethnicity.

## **African Americans<sup>1</sup>**

Athletic  
Rhythmic  
Low in intelligence  
Lazy  
Poor  
Loud  
Criminal  
Hostile  
Ignorant

## **Asian Americans<sup>2</sup>**

Intelligent  
Bad drivers  
Good at math  
Nerdy  
Shy  
Skinny  
Small eyes  
Education  
Quiet

## **Latinos<sup>2</sup>**

Poor  
Have many children  
Illegal immigrants  
Dark-skinned  
Uneducated  
Family-oriented  
Lazy  
Day laborers  
Unintelligent  
Loud  
Gangsters

## **Whites<sup>2</sup>**

High status  
Rich  
Intelligent  
Arrogant  
Privileged  
Blond  
Racist  
All-American  
Ignorant

1. Devine and Elliot, 1995.

2. Ghavami and Peplau., 2015.

# Role-congruity for White/male & science.

Scientist: Intelligent, Logical, Rationale, Analytical, Independent, Focused, Persistent, Objective, Knowledgeable, Curious, Industrious.

Incongruent

Incongruent

Semi-congruent

Congruent

**African Americans<sup>1</sup>**

Athletic  
Low in intelligence  
Ignorant

**Latinos<sup>2</sup>**

Uneducated  
Family-oriented  
Lazy  
Day laborers  
Unintelligent

**Asian Americans<sup>2</sup>**

Intelligent  
Good at math  
Nerdy  
Education  
Unsocial

**Whites<sup>2</sup>**

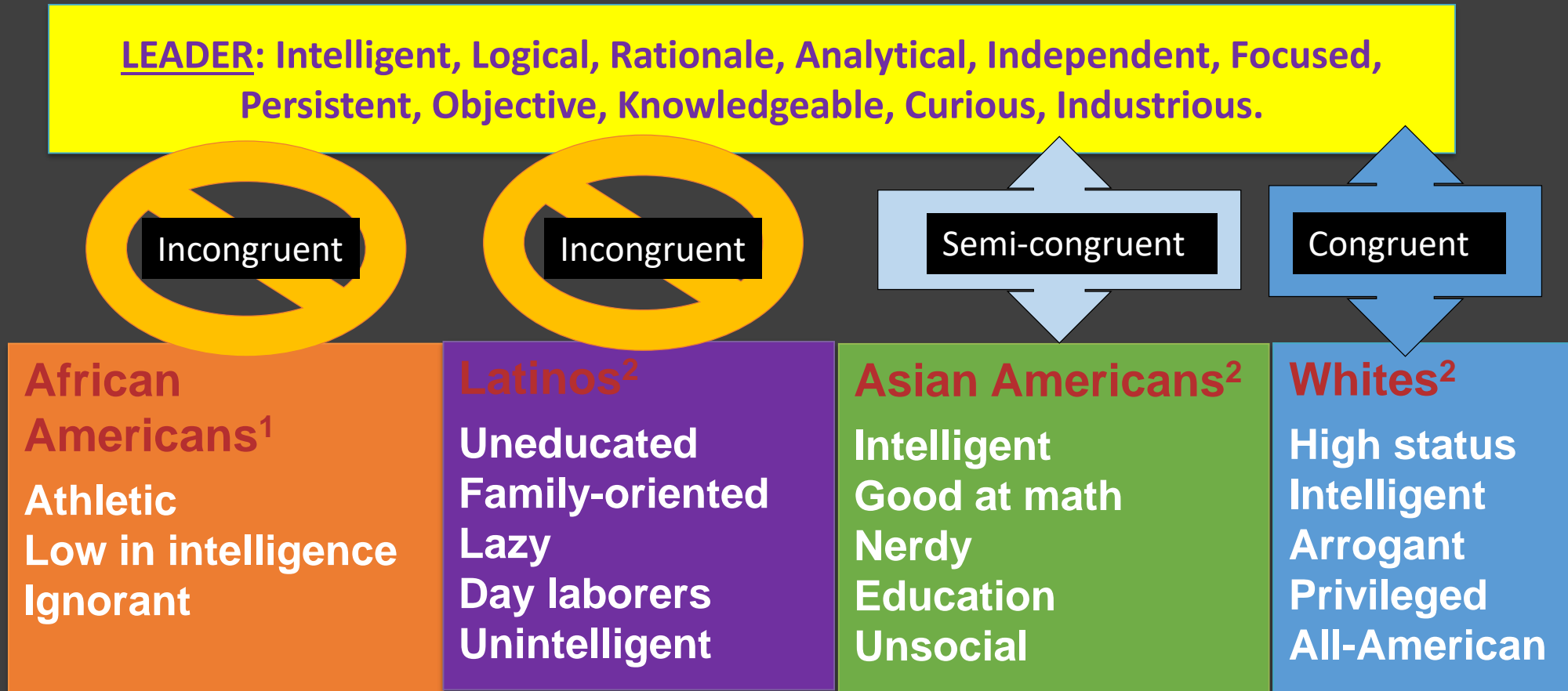
High status  
Intelligent  
Arrogant  
Privileged  
All-American

1. Devine and Elliot, 1995.

2. Ghavami and Peplau., 2015.

3. Carli et al., 2016.

# Role-congruity for White/male & LEADERSHIP.



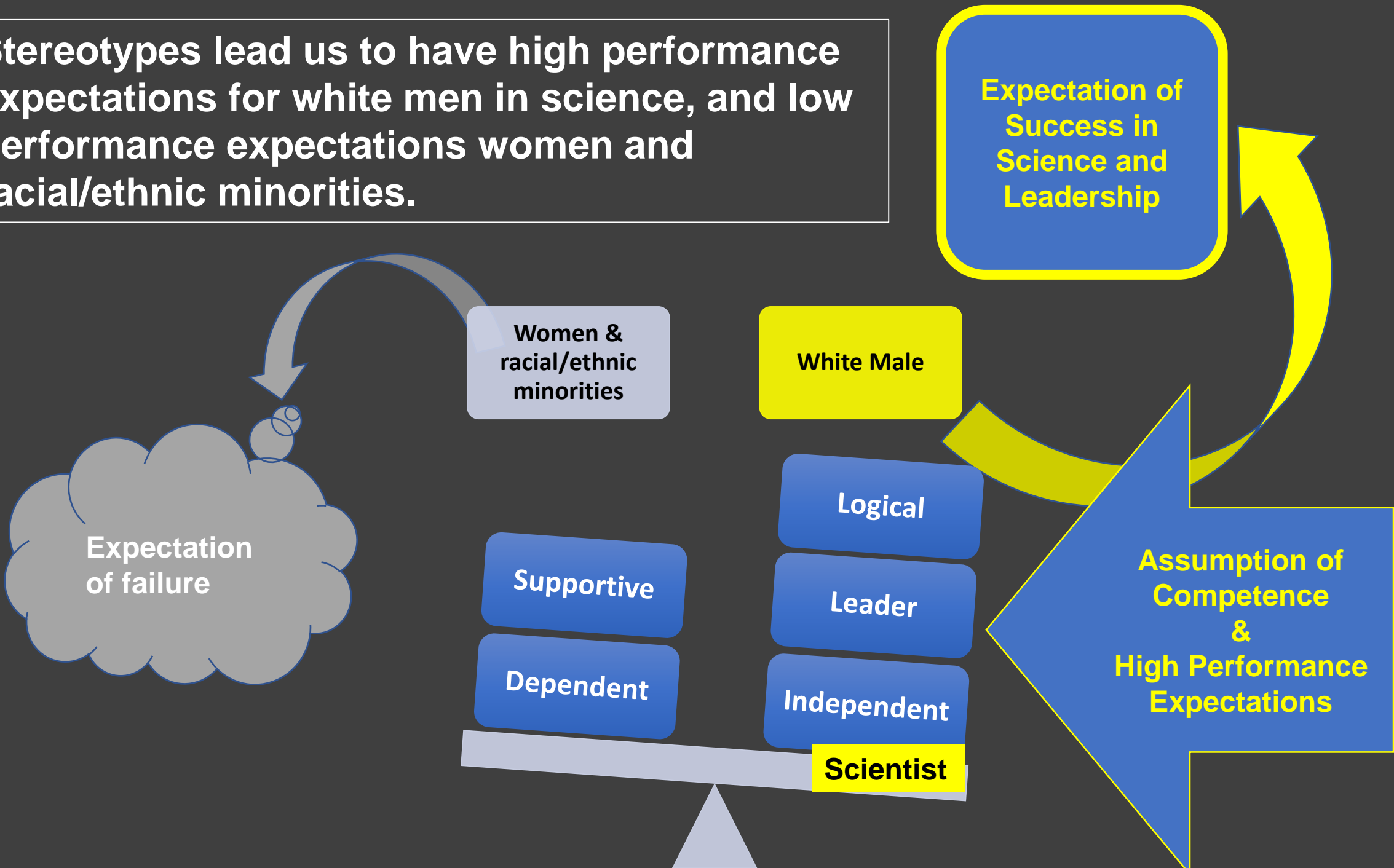
1. Devine and Elliot, 1995.

2. Ghavami and Peplau., 2015.

3. Carli et al., 2016.



- Stereotypes lead us to have high performance expectations for white men in science, and low performance expectations women and racial/ethnic minorities.



**Stereotype-  
based bias  
disadvantages  
women and  
racial/ethnic  
minorities in  
peer review.**

Semantic “linguistic” priming.

Competency bias.

# Scientific Peer Review



# Scientific Peer Review



Remember to CHECK:

1. Participation

2. Criteria

4. Feedback

**Requests for applications**

**Review of applications**

**Funding decisions**

**STEP 1. PARTICIPATION**

- Who is getting access to your RFAs?
- Where are you advertising?
- How do you know you are reaching your target applicant pool?
- Do your “ideal” or target applicants have appropriate resources to apply?
- Is it easy to find information about your programs?
- What are the demographics of your applicants? Who are you missing?

What data could you be collecting here to learn more about if you are reaching your target applicant pool?



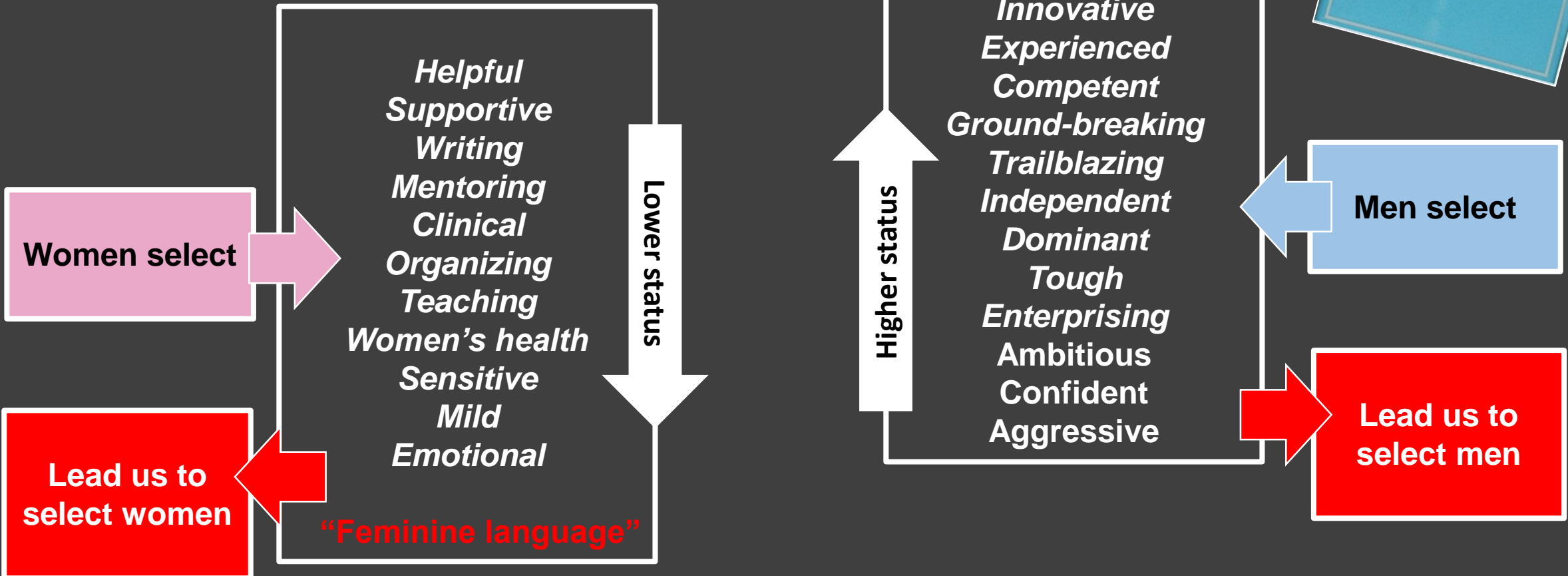
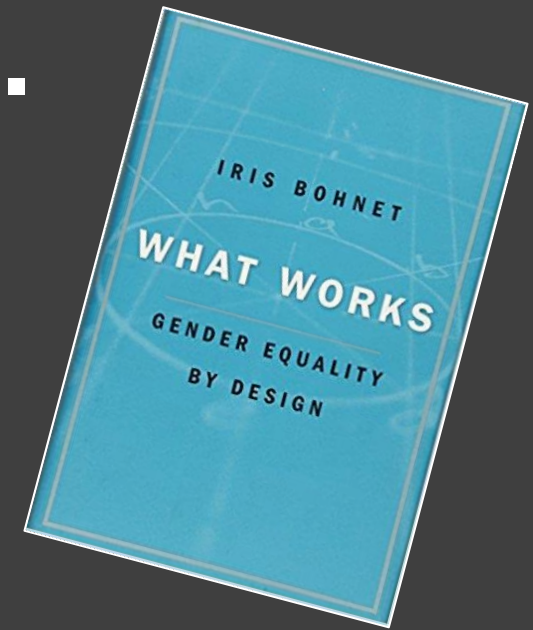


### STEP 2. CRITERIA LANGUAGE

- Language used to describe the type of research, qualifications and experience of applicants, and evaluation criteria can lead women and racial/ethnic minorities to not apply, or to underperform in the application process.

# Semantic “linguistic” priming.

- Stereotypic-language causes readers to more easily and effortlessly “call to mind” people who align with those descriptors.
  - This is called “*priming*”.



# NIH Director's Pioneer Awards

## Awards to women scientists

- 2004 = 0/9
- 2005 = 6/13 = 43%
- 2006 = 4/13 = 31%
- 2007 = 4/12 = 33%
- 2008 = 4/16 = 25%
- 2009 = 7/18 = 39%

## Semantic Priming in NIH Director's Pioneer Award?

**2004**

**≥ 2005**

### *Characteristics of target scientist and research*

#### Risk-taking emphasized:

- “exceptional minds willing and able to explore ideas that were considered risky”
- “take...risks”
- “aggressive risk-taking”
- “high risk/high impact research”
- “take intellectual risks”
- application URL included “highrisk”

#### Emphasis on risk removed:

- “pioneering approaches”
- “potential to produce an unusually high impact”
- “ideas that have the potential for high impact”
- “highly innovative”
- URL no longer includes “risk”

Carnes et al. *J Womens Health*, 2005

**Carnes, M, Geller, S, Fine, E, Sheridan, J and J Handelsman (2005). “NIH Director’s Pioneer awards: Could the selection process Be biased against women.” J Womens Health 14(8): 684-691**

**2004 (0/9)**

-“High risk”, “aggressive”

-Potential for scientific leadership

-Testimony of intrinsic motivation, enthusiasm, and intellectual energy

**2005 (96/14=43%) 2006 (4/13=31%)**

-No use of risk language.

-Relevance of the research and impact on the scientific field and on the NIH mission.

Motivation/enthusiasm/intellectual energy to pursue a challenging problem.

**Marchant, A, Bhattacharya, A, and M Carnes (2007). “Can the language of tenure criteria influence women’s academic advancement?” J Womens Health 16(7): 998-1003**

**Methods:** We used a retrospective, descriptive design to study 24 academic medical centers top-ranked in both NIH funding and Carnegie classification. The main outcome measure was the slope of regression fit to 7-year annual data on percent faculty who are tenured women (1998–2004) relative to the median slope of all 24 institutions.

**Results:** Medical schools with the word “leader” in tenure criteria were more likely to have slopes below the median slope than schools without the word “leader” (OR = 6.0; CI = 1.02, 35.37;  $p = 0.04$ ).



## STEP 2. CRITERIA LANGUAGE

**Common stereotype-based bias can, however unintentionally and inadvertently, lead reviewers to hold women and racial/ethnic minorities to higher performance standards, or penalize them for role-incongruence.**



**Stereotype-  
based bias  
disadvantages  
women and  
racial/ethnic  
minorities in  
peer review.**

Semantic “linguistic” priming.

Competency bias.

## Consequences of stereotype- based bias.

- **Stereotypes lead to assumptions that women and URM's lack competence, so we may:**
  - **Doubt their ability (Trix and Psenka, 2003; Heilman, 2007).**
  - **Require more proof (i.e., more accomplishments) to confirm their competence (Biernat, 1997, 2012; Heilman 2004, 2007; Kaatz, 2015).**
  - **Attribute their accomplishments to others or devalue accomplishments (Heilman, 2007).**
  - **Require a higher quality of work (Biernat, 1997, 2012; Heilman, 2007; Kaatz, 2015).**

# Competency bias impacts how we value men and women's ability, work, and accomplishments.

➤ **Moss-Racusin, C. et al. (2012). "Science faculty's subtle gender biases favor male students." PNAS 109: 16474-16479.**

- ❑ 127 Faculty from Biology, Chemistry and Physics departments participated.
- ❑ Evaluated application randomly assigned male or female name for:
  - Competence, hireability, likeability, starting salary, and willingness to provide mentoring.

- **Results:**

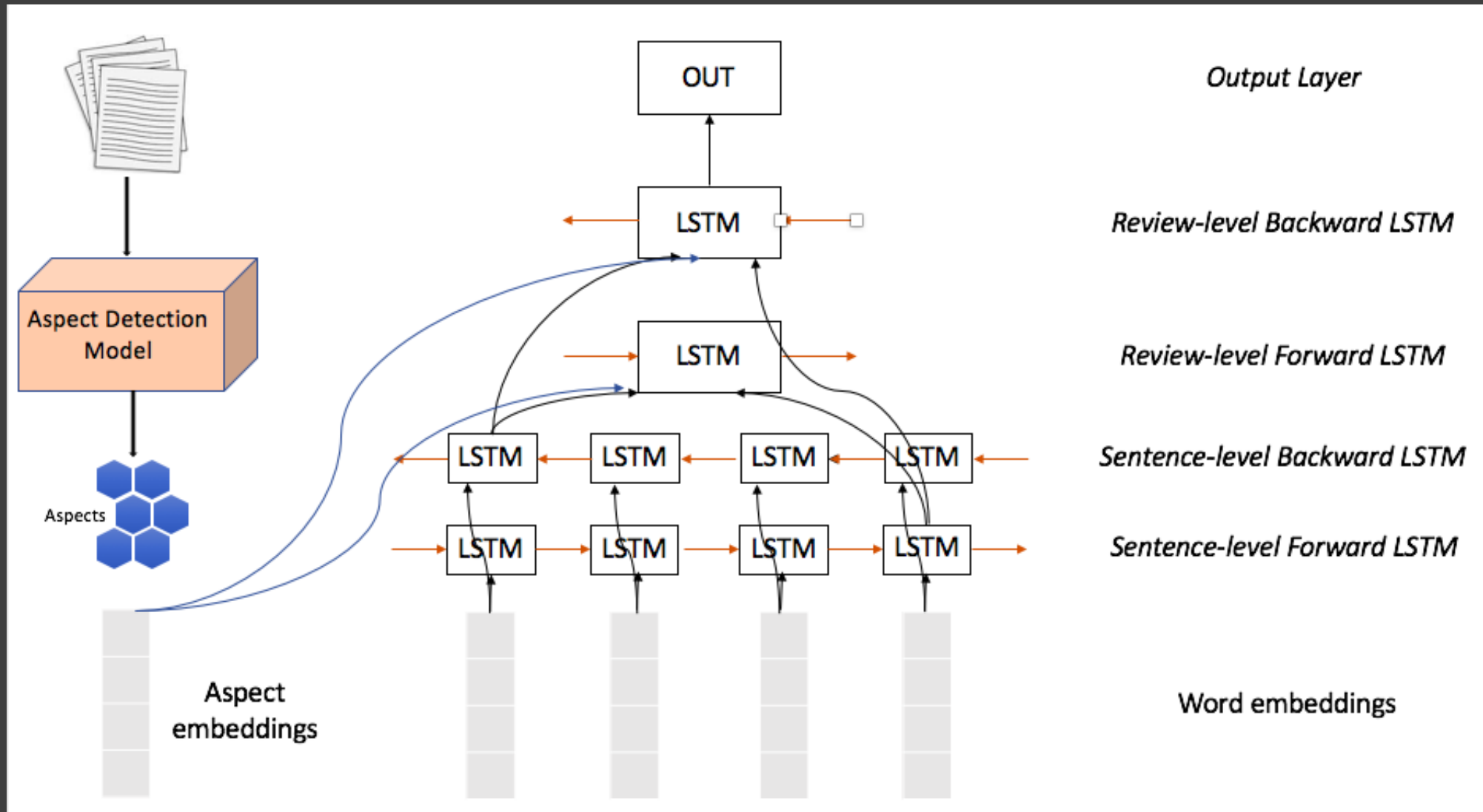
- Male applicant rated significantly more competent and hireable than female applicant and was granted a higher starting salary and offered more mentoring.



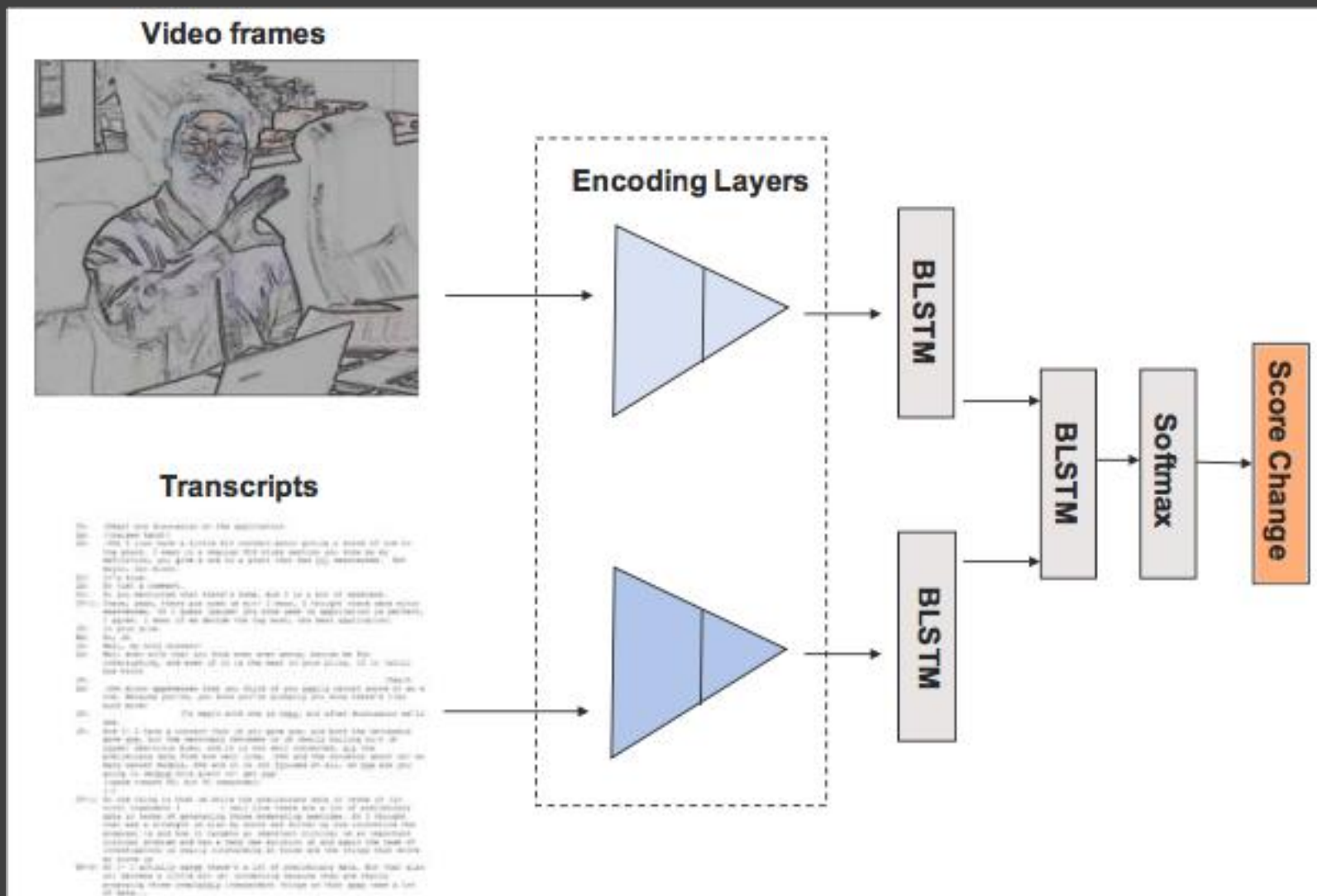
**Competency bias impacts evaluation of CVs, content of rec letters, and peer review for research funding.**

- **Male scientists rated as more hireable, competent, & qualified than female scientists for faculty position despite same CV (Goldberg Design; Steinpreis et al., 1999).**
- **Letters of recommendation for women in science and med are shorter, have more references to personal life, and contain fewer “outstanding” descriptors (Trix & Psenka, Discourse & Soc, 2003; Schmader et al., 2007).**
- **Women, and Black physicians and scientists who submit R01 proposals to NIH are significantly less likely than men, and Whites, respectively, to be funded. And text analysis of grant critiques suggests that women may be held to higher standards than men to earn fundable application scores (Ley & Hamilton Science, 2008; Pohlhaus et al., 2011; NIH ,2015; Kaatz et al., 2015; 2016).**

# Hierarchical LSTMs

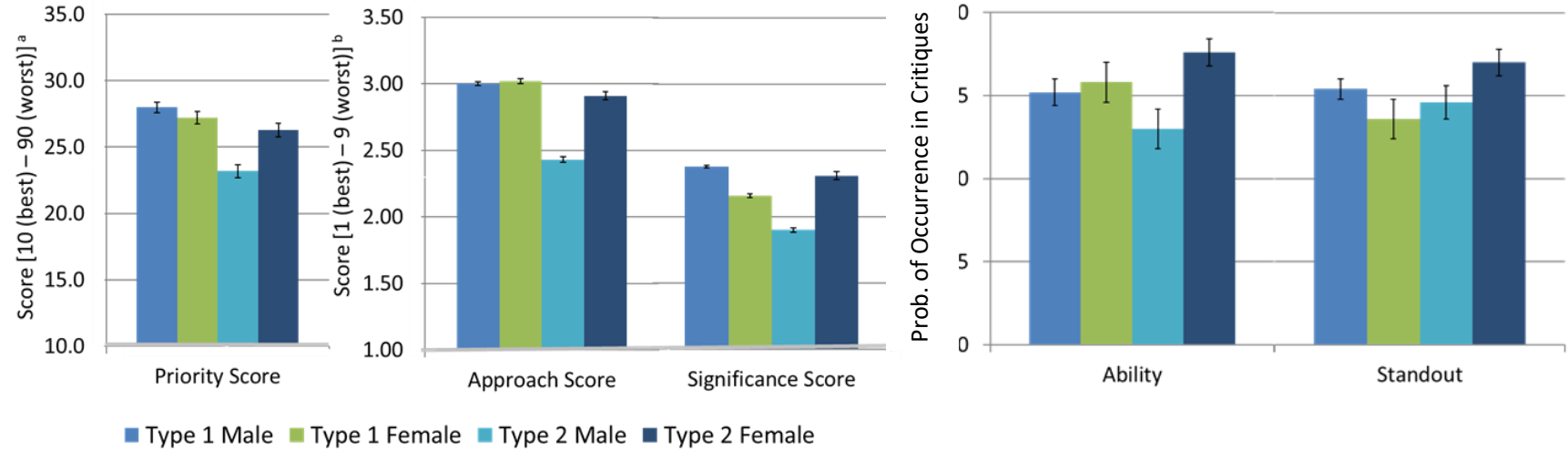


# Fusion LSTMs



**Kaatz A, Lee Y-G, Potvien A, et al. Analysis of National Institutes of Health R01 Application Critiques, Impact, and Criteria Scores: Does the Sex of the PI Make a Difference? Acad Med. 2016;91(8):1080-1088.**

**Study of 739 R01 Grant Critiques and Scores, University of Wisconsin-Madison (125 PIs): 2010-2014.**

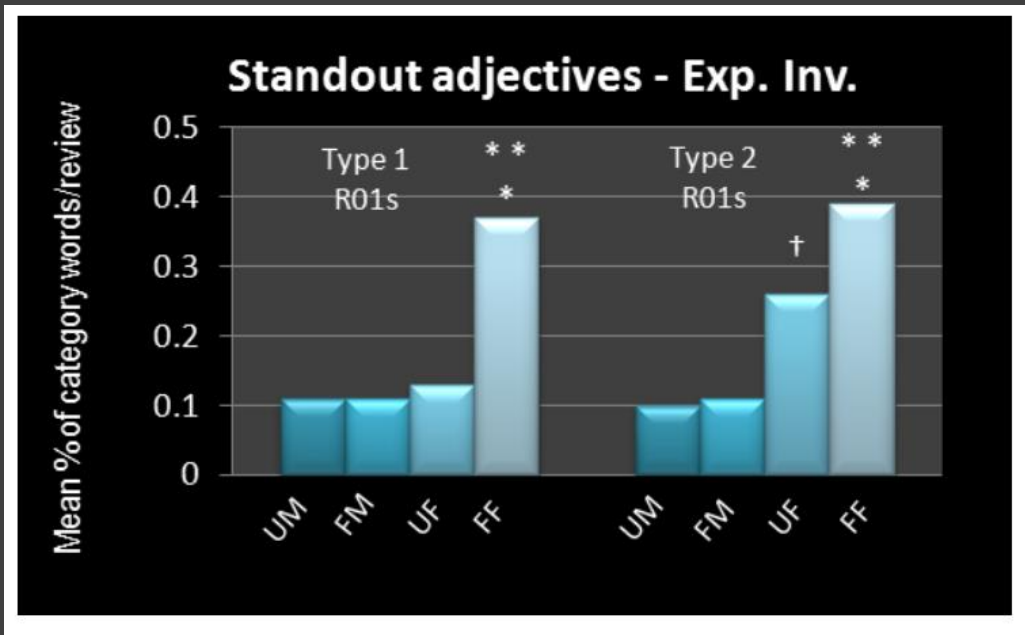
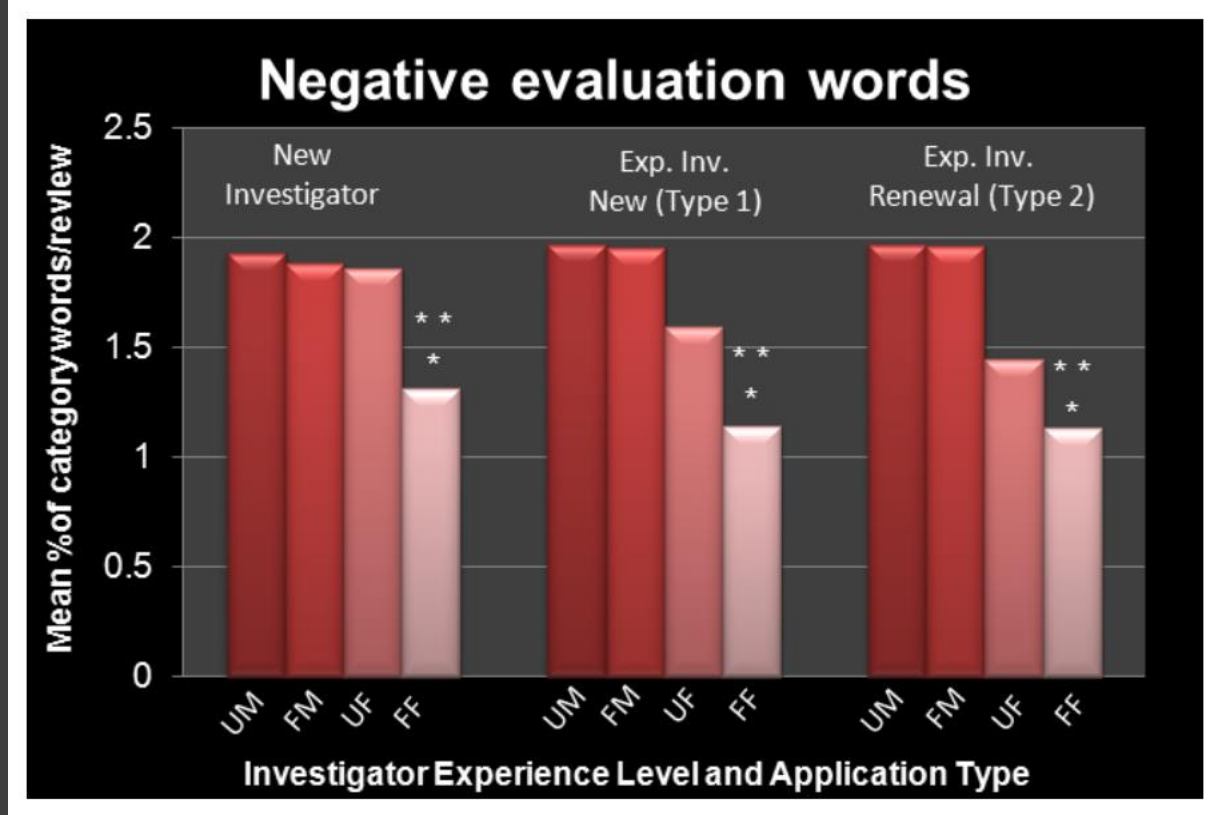
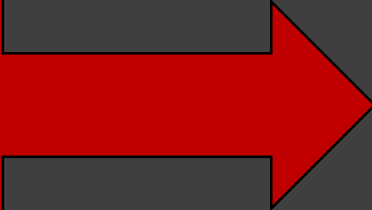


**Female PIs' R01 Renewals Assigned Worse Priority, Approach, and Significance Scores, Despite More Praise in the Critiques**

**NOTE: PIs in sample had similar levels of productivity and background qualifications.**



**Men's R01 applications funded despite significantly more negative eval words (e.g., illogical, wrong, unclear) in critiques.**



**To be funded, women's critiques had to contain significantly more standout adjectives (e.g., outstanding, exceptional, excellent).**

# Text analysis of NIH grant critiques provides a window in to reviewers' cognitive processing.

## STUDIES OF NIH REVIEWERS' CRITIQUES

Kaatz, A., W. Magua, D. R. Zimmerman and M. Carnes (2015). "A quantitative linguistic analysis of National Institutes of Health R01 application critiques from investigators at one institution." Acad Med 90(1): 69-75.

Kaatz, A., Y. G. Lee, a. Potvien, W. Magua, A. Filut, A. Bhattacharya, R. Leatherberry, X. Zhu and M. Carnes (2016). "Analysis of National Institutes of Health R01 application critiques, impact, and criteria scores: Does sex of the principal investigator make a difference?" Acad Med 91(8): 1080-1088.

Kaatz, A., M. Dattalo, C. Regner, A. Filut and M. Carnes (2016). "Patterns of feedback on the bridge to independence: A qualitative thematic analysis of NIH mentored career development award application critiques." J Womens Health 25(1): 78-90.

Magua, W., X. Zhu, A. Bhattacharya, A. Filut, A. Potvien, R. Leatherberry, Y. G. Lee, M. Jens, D. Malikireddy, M. Carnes and A. Kaatz (2017). "Are female applicants disadvantaged in National Institutes of Health peer review? Combining Algorithmic Text mining and qualitative methods to detect evaluative differences in R01 reviewers' critiques." J Womens Health (Larchmt) 26(5): 560-570.



#### 4. FEEDBACK

**Reviewer feedback can lead women and racial/ethnic minorities to choose to leave biomedical research careers.**

# Candidate.

**Female Invest.**

**Candidate.**

*Low  
Productivity.*

“Of particular concern are XX’s relative lack of peer reviewed publications or other contributions to research... At the moment this application seems to lack a great deal of evidence for the candidate’s promise as a future independent investigator, other than very positive comments by [her] prospective mentors.”  
(Female, K08)

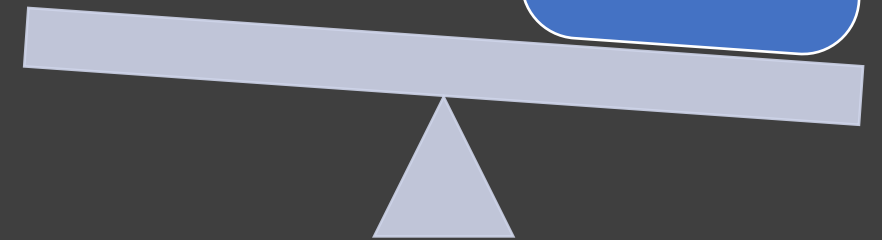
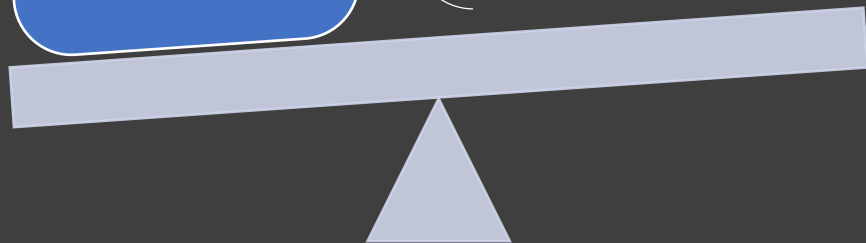
“... there is confidence that the applicant will develop into a first-rate physician-scientist ... XX’s publication record is not overwhelming, but it does show some publication skills and it should improve ...”  
(Male, K08)

**Male Invest.**

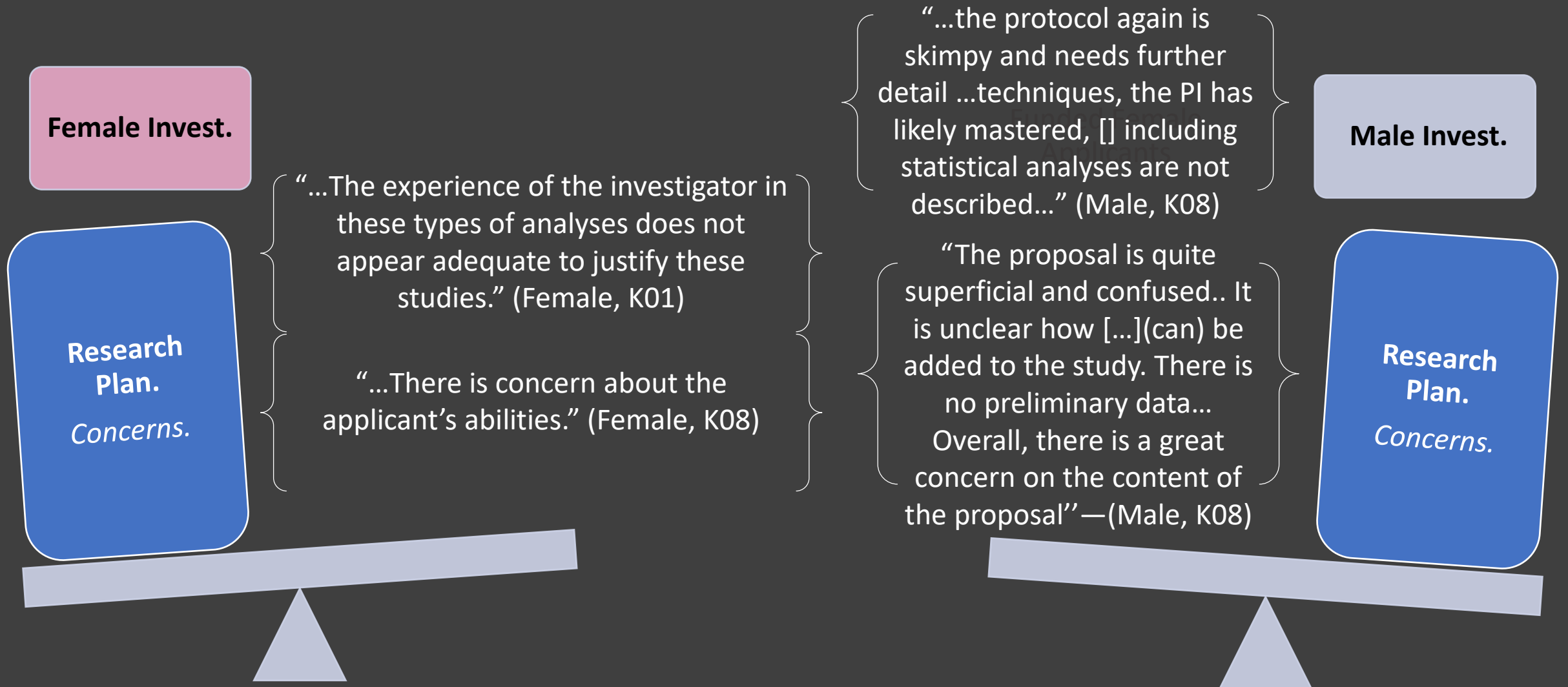
**Candidate.**

*Concerns.*

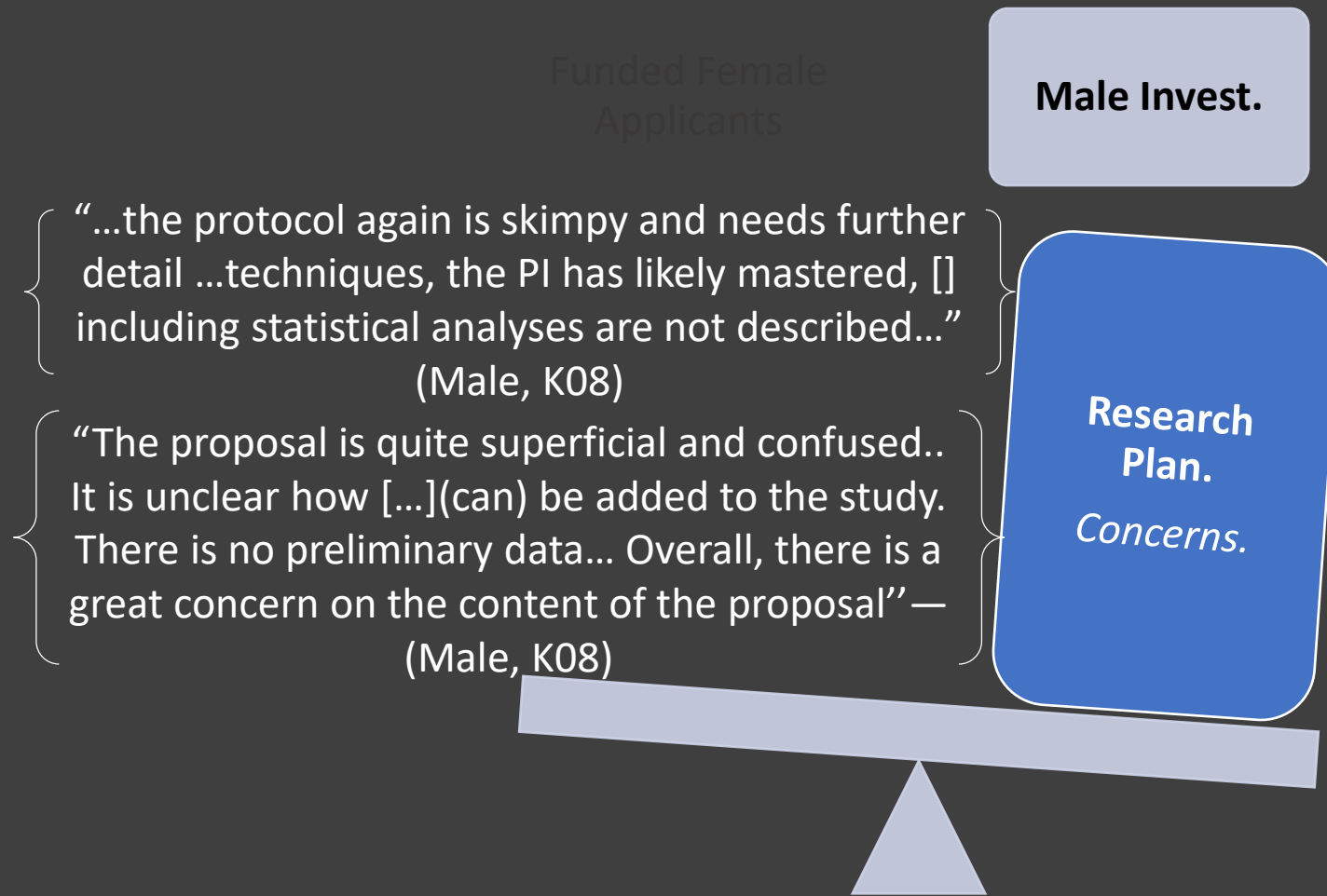
“The Principal Investigator has no publication record, so future productivity is hard to predict.”  
(Male, K01)



# Research Plan. Assumption of competence for men



# Research Plan: Assumption of competence for men.



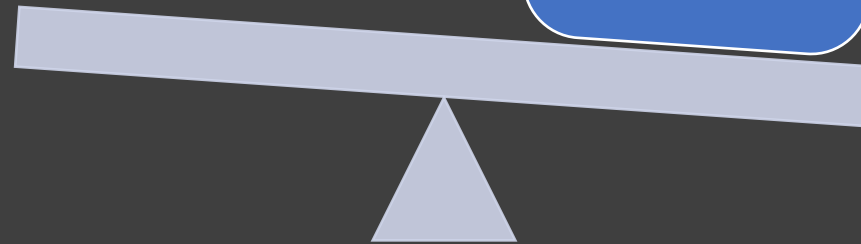
# Research Plan.

Funded Female Applicants

**Male Invest.**

“...A general concern is lack of integration of the research plan. Specifically, it could be more effective to present, for example, a diagram that illustrates the proposed causal pathways and has all four specific aims embedded within it.” (Male, K01)

**Research Plan.**  
*Advice.*





# Research Plan.

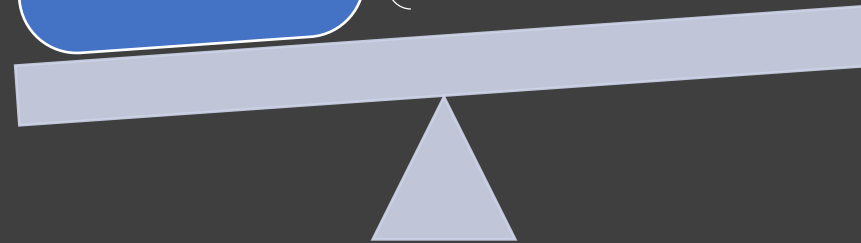
**Female  
Invest.**

Funded Male  
Applicants

**Research  
Plan.**  
*Low Sig.  
&  
Too  
Ambitious.*

“The issues being addressed are of moderate significance ... Nevertheless, they will provide a vehicle for excellent training and generation of some useful information. The research plan is considered excellent.” (Female, K08)

“There is concern that this may be overly ambitious given the 2-year time-line proposed and the candidate’s other training- and clinical-related activities.” (Female, K23)



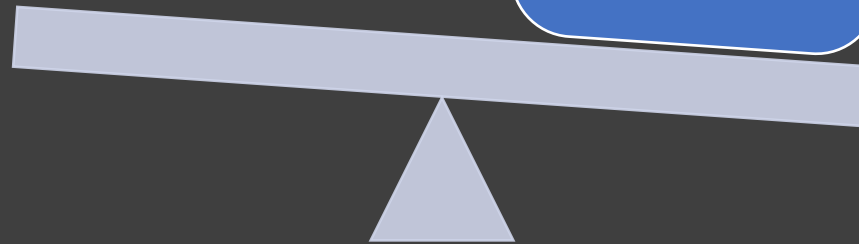
# Research Plan.

Funded Female Applicants

“The field of XX needs young physician-scientists, particularly, those working on [disease]... The focus of work is important and doable and could lead to a lifetime of studies... It is highly expected that the proposed courses and research will not only further XX training to become an independent physician scientist but will allow XX to make significant contributions in the field.” (Male, K08)

Male Invest.

**Research Plan.**  
*High Sig.  
& Solid  
Platform for  
Independence.*



# Discussion.

## **Three major “take-aways:”**

- 1. Male and female K awardees may receive different feedback from NIH peer reviewers.**
- 2. Only the female K awardees who were not exposed to critical feedback (i.e., who were “outstanding”) went on to obtain a subsequent R-level award.**
- 3. Peer reviewers appear to assign different value to the research proposed by male and female K award applicants.**

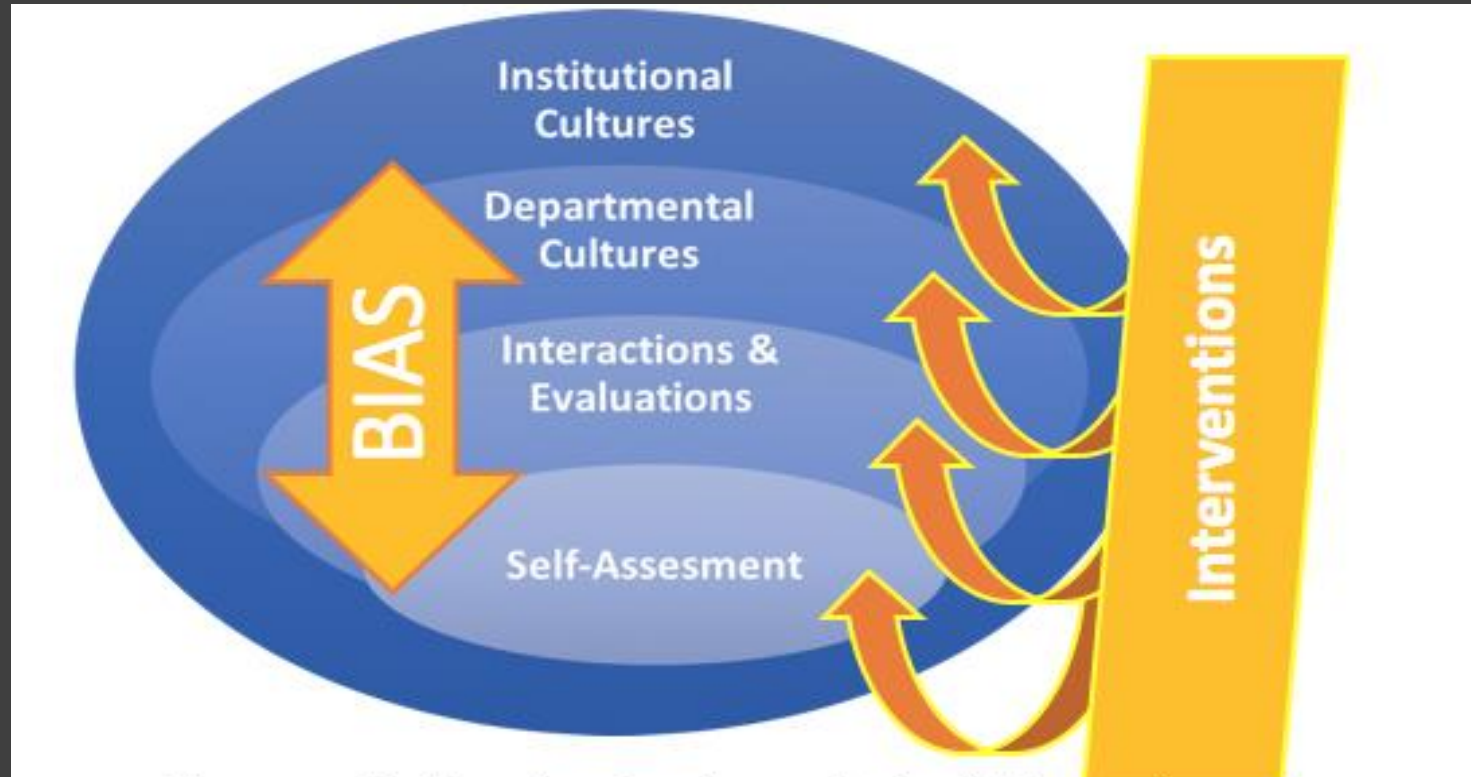
# Follow-up studies.

## Testing generalizability of study results and the impact of K award reviewer feedback on research career interest and persistence.

- **Study 1:** Quantitative text analysis of a large national sample of K award application critiques to examine the extent to which results from this study generalize.
- **Study 2:** Experiment testing the impact of NIH peer reviewers' feedback (different types of critical remarks) on NIH K awardees' interest in research and decisions to apply for subsequent research awards (Biernat & Danaher, 2012).

Think of a time when someone has made an incorrect assumption about you based on your membership in a group (e.g., gender, race, age, etc.)  
OR when you have made an incorrect assumption about someone (e.g., patient, colleague, etc. ) based on their membership in a group.

# How to address stereotype-based bias? Multilevel Interventions.



# What can we do? Acknowledge bias.

## Shift in Conceptual Framework

### Old Framework:

Bias/Prejudice is bad so if I think or act with bias, I am a bad person.

### New Framework:

Prejudiced thoughts and actions are habits that we all have and breaking these habits requires more than good intentions.



# Implement evaluation practices that minimize bias.

## Evidence-based practices.

- **Establish and prioritize clear and specific evaluation criteria prior to evaluation.** (Uhlman & Cohen, 2005,2007)
- **Avoid abstract descriptors that promote stereotype assumptions.** (Rubini & Menegatti, 2008; Wigboldus, Semin, & Spears, 2000)
- **Where possible, consider removing identifiers from application materials, e.g., name, address, institution.** (Goldin & Rouse, 2000)
- **Spend sufficient time and attention on assessing each individual on the established criteria.** (Martell, 1991)
- **Justify decisions on the basis of established criteria and evidence from the evaluation materials.**

# What can institutions do to mitigate bias against women in hiring settings?

At least 1 RCT = level 1 evidence

---

- Infuse environment with statements that research evidence shows equivalent gender competence in relevant roles
- Encourage raters to take adequate time
- Allow applicants to provide individuating evidence of job-relevant competency
- Work for applicant pool to have at least 25% women
- Do not ask about parenthood status
- Use structured vs. unstructured interview questions
- Avoid man-suffix job titles (e.g. use chair rather than chairman)
- Use inclusion vs. exclusion strategy for selection from final list
- Implement training workshops for personnel decision-makers

*Isaac, Lee, & Carnes. Acad Med, 84:1440-46, 2009*

# What can we do?

- Become “bias literate.”
  - Defined by Sevo and Chubin as learning a vocabulary about bias and a skill set to recognize, understand, converse about, and intentionally practice cognitive and behavioral strategies to mitigate the impact of group stereotypes on judgment and decision making (**Sevo and Chubin, 2008**).
  - Used by Devine *et al.* to successfully reduce implicit race bias in students (**Devine, Forscher, Austin and Cox, 2012**) and by Carnes *et al.* to reduce biased behavior and improve department climate for faculty (**Carnes *et al.*, 2015**) in academic science fields.

# What can we do? Two strategies that don't work.

Stereotype suppression (i.e., attempting to be “gender blind”).

- Monteith MJ, Sherman JW, Devine PG. Suppression as a stereotype control strategy. *Pers Soc Psychol Rev.* 1998;2:63–82.

Strong belief in one's ability to make objective judgments.

- Uhlmann EL, Cohen GL. “I think it, therefore it's true”: Effects of self perceived objectivity on hiring discrimination. *Organ Behav Hum Decision Proc.* 2007;104:207–223.

**Both of these have been shown to enhance the influence of stereotype-based bias on judgment.**

# Breaking the “bias habit.”

- **Strategies that work:**

- **question your own objectivity.**

Uhlmann and Cohen, “I think it, therefore it is true: Effects of self-perceived objectivity on hiring discrimination,” *Organizational Behavior and Human Decision Processes*, 104;2 (2007): 207-223

- **stereotype replacement** (e.g., if girls are being portrayed as bad at math, identify this as a gender stereotype and consciously replace it with accurate information).

Devine PG, Forscher PS, Austin AJ, Cox 32 WTL. Long-term reduction in implicit race prejudice: A prejudice habit-breaking intervention. *J Exp Soc Psychol.* 33 2012;48:1267–1278.

- **positive counterstereotype imaging** (e.g., before evaluating job applicants for a position traditionally held by men, imagine in detail an effective woman leader or scientist).

Blair IV, Ma JE, Lenton AP. Imagining stereotypes away: The moderation of implicit stereotypes through mental imagery. *J Pers Soc Psychol.* 2001;81:828–841.

- **perspective taking** (e.g., imagine in detail what it is like to be a person in a stereotyped group).

Galinsky AD, Moskowitz GB. Perspective-taking: Decreasing stereotype expression, stereotype accessibility, and in-group favoritism. *J Pers Soc Psychol.* 2000;78:708–724.

- **individuation** (e.g., gather specific information about a student or applicant to prevent group stereotypes from leading to potentially inaccurate assumptions).

Heilman ME. Information as a deterrent against sex discrimination: The effects of applicant sex and information type on preliminary employment decisions. *Organ Behav Hum Perform.* 1984;33:174–186.

- increasing opportunities for contact with **counterstereotypic exemplars** (e.g., meet with senior women faculty to discuss their ideas and vision).

Allport GW. *The Nature of Prejudice.* Reading, Mass: Addison-Wesley Publishing Company; 1979.

# Practice the right message.

## **Recite this mantra:**

“The vast majority of people try to overcome their stereotypic preconceptions.”

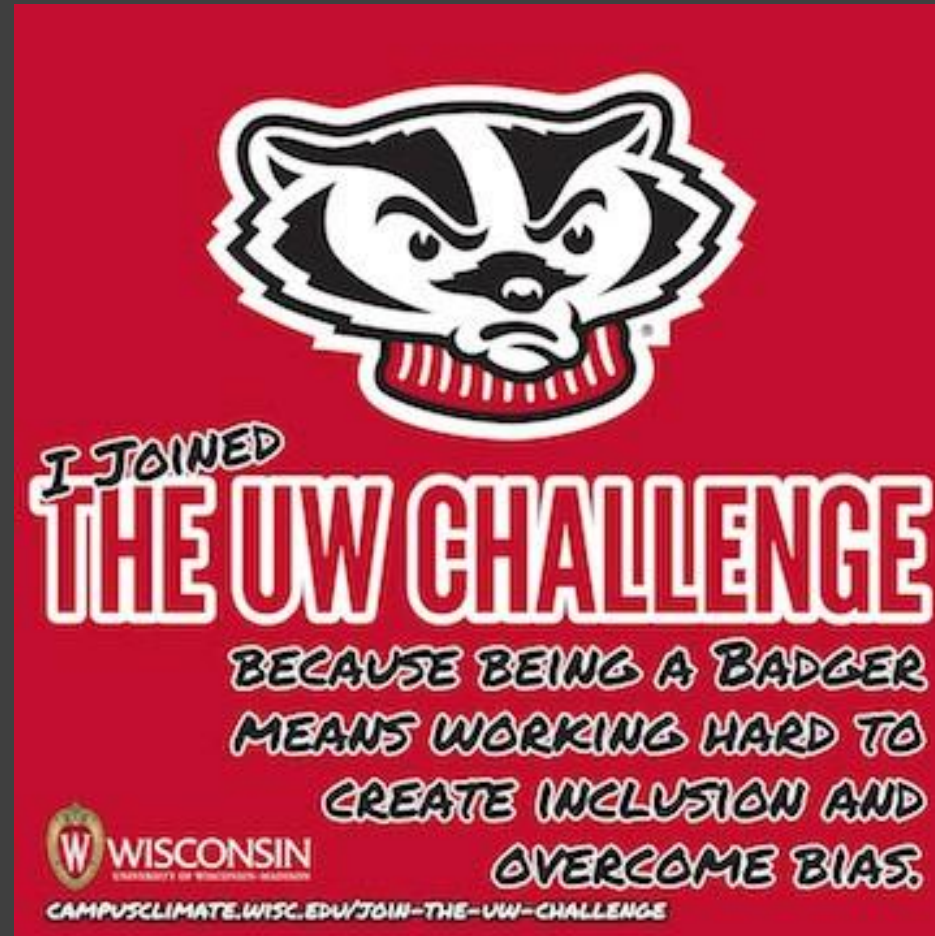
This message reduced weight, age, and gender bias vs. a message that we all have bias.

# UW-Madison fosters growth mindsets

“Everyone has bias”

Vs.

“We are all working to  
reduce bias”







▲ Fatima, 21 years  
**doesn't stand up  
for herself**

▲ Samir, 34 years  
**too chatty**

◀ Ilham, 18 years  
**chess champion**

◀ Yamina, 59 years  
**optimistic**

▲ Aïcha, 30 years  
**stingy**

▲ Hamza, 23 years  
**screen addict**

▶ Abdel, 28 years  
**wants to become  
an actor**

◀ Saïd, 42 years  
**excellent  
handyman**

**What makes us the same...is that we are all different**