## How computational neuroscience can help untangle relationships between culture, brain, \& health



Dr. Elizabeth Reynolds Losin Department of Psychology University of Miami

How is culture acquired?

How does culture shape the brain?

How is culture acquired?


## How does culture shape the brain?

How does culture influence health(care)?

## Why pain?

- Part of most major disorders

- Most common reason for seeking medical care

- Costly



## Why pain?

- Ecological validity

- It really hurts!


## What is Pain?


"an unpleasant sensory and emotional experience associated with actual or potential tissue damage, or described in terms of such damage"

$$
\text { --IASP, } 1979
$$

## Pain is not the same for everyone

- Differences in Pain: Minorities report greater pain for the same medical condition or stimulation
- Differences in Treatment: Minorities receive lower doses of analgesics
- Causes of pain disparities remain unclear



## Measurement of pain



## Neurocultural Model of Pain



## Computation is key!



## An example study

## Neural and sociocultural mediators of ethnic differences in pain

Elizabeth A. Reynolds Losin ( ${ }^{1 *}$, Choong-Wan Woo ${ }^{(2,3}$, Natalia A. Medina ${ }^{1}$, Jessica R. Andrews-Hanna ${ }^{4}$, Hedwig Eisenbarth ${ }^{-5}$ and Tor D. Wager ${ }^{\text {© }}{ }^{6 \star}$


30 Hispanic, 30 Non-Hispanic white, 28 African Americans

## African American participants reported feeling more pain



Replicated prior findings. But why?

## Traditional brain imaging analysis



## African Americans have greater frontostriatal responses to pain



FDR $q<.05$
$p_{\text {unc }}<.0005$
$p_{\text {unc }}<.001$

## African Americans have greater frontostriatal responses to pain

a Regions where African Americans are more responsive to painful heat


FDR q < . 05
punc < . 0005
punc $<.001$
b Region activity to painful heat across groups





## Traditional Brain Imaging Analysis

## Psychological Task

Heat On
Heat On


Heat Off
Heat Off


# New Computational Approaches to the Rescue! 



## Machine Learning: MVPA



## Machine Learning Approach to Creating Neural Signatures LASSO - PCR

| Predictors: Brain Data | Data Reduction: PCA | Model Estimation: LASSO Regression | Weight Reconstruction | Thresholding: <br> Bootstrap |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  | Prediction: Apply to new subjects |
| Voxels | Components | Pain Rating | Voxel Weights | Signature |  |

## Neural Signature Example: Pain

Neurologic Pain Signature (NPS)


NPS Response vs. Pain Report


## No ethnic differences in NPS




Temperature

# Pain-specific neural processes are similar across ethnic groups 

## Another NPS Example: Doctor Trustworthiness decreases pain



Anderson, Gianola, Medina, Perry, Wager, \& Losin (in prep)

## Doctor trustworthiness decreases NPS response during pain



Trust Level
Low
High

Anderson, Gianola, Medina, Perry, Wager, \& Losin (in prep)

## Brain Mediation



## Mediators of higher pain in African Americans

a
Multi-level mediation effects moderated by ethnicity


C
NPS mediation of stimulus-pain relationship


## NAc more responsive to pain in those who report more discrimination




Discrimination frequency
History of discrimination may sensitize frontostriatal regions to pain, similar to effects in chronic pain

## Brain Mediation



## Whole-brain mediation example

## Imitative learning



## Medial frontal cortex differentiates ideology during imitation

Imitate Political Outgroup > Imitate Political Ingroup



## Whole-brain mediation example



Medial prefrontal cortex mediates relationship between political ideology and imitation accuracy

## Multivariate Mediation



Geuter, Losin, et al. (2020)

## Multivariate mediator of pain cortical network profile



Geuter, Losin, et al. (2020)

## Test in new data and comparison with other pain signatures



C



D


## " 1eta-analysis

## Attention

## Pain (heat)



Tal Yarkoni, UT Austin

# Meta-Analytic Mind Reading 

Brain Region from Analysis
Associated Psychological Functions


## Take home points

- Traditional brain imaging analyses: brain as outcome limited by reverse inference
- Machine learning can be used to create brain based biomarkers
- Univariate and multivariate brain mediation can be used to find brain mediators of known behavioral relationships
- Automated brain meta-analyses can provide a quantitative approach to reverse inference

