# **ZHIHAO ZHANG**

## Curriculum Vitae February 2023

## **Contact Information**

Darden School of Business, University of Virginia

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### **Academic Positions**

Darden School of Business, Marketing Area **Assistant Professor** 

> University of Virginia 2022-present

Assistant Professor (by courtesy)

Department of Psychology 2022-present

University of Virginia

Postdoctoral Scholar Haas School of Business

Social Science Matrix

University of California, Berkeley 2016-2022

Department of Neurology

University of California, San Francisco 2016-2017

#### **Education**

Ph.D.	Yale University	Neuroscience	2016
M.Phil.	Yale University	Neuroscience	2013
B.Sc.	Tsinghua University	Biological Sciences (with Distinction)	2010

## **Awards and Fellowships**

Best Talk Award The 18th Annual Meeting of Society for Neuroeconomics	2020
Best Poster Award The 145th Annual Meeting of the American Neurological Association	2020
Career Transition Award Scientific Research Network for Decision Neuroscience & Aging	2019
Award for Best Poster Presentation The 7th Annual Interdisciplinary Symposium on Decision Neuroscience	2017

Trainee Professional Development Award Society for Neuroscience	2015
Neuroeconomics Summer School Full Scholarship New York University Shanghai	2015
Conference Travel Fellowship Yale Graduate Student Assembly	2014, 2015
Kavli Graduate Fellowship in Neuroscience The Kavli Foundation	2012-2013
China Scholarship Council-Yale World Scholars Fellowship The China Scholarship Council	2010-2012
National Scholarship The Ministry of Education, P. R. China	2009
First-Class Scholarship Tsinghua University	2005-2007, 2009

### **Research Interests**

#### General Areas

Consumer Research

Marketing

Neuroeconomics

Cognitive Neuroscience

**Natural Language Processing** 

Law and Neuroscience

#### *Techniques*

Computational modeling Functional neuroimaging Vector semantics Neuropharmacology

## **Publications**

#denotes corresponding author(s) \*denotes equal contribution §denotes mentee Google Scholar profile: <a href="https://scholar.google.com/citations?user=4qKYm5AAAAAJ&hl=en">https://scholar.google.com/citations?user=4qKYm5AAAAAJ&hl=en</a>

#### Articles in revision or under review

**Zhang**, **Z**., Kayser A. S., & Hsu, M. Automated inference of consumer brand recall from large-scale text corpora.

§Sundaresan, A., Hsu, M., & **Zhang**, **Z**. Eliciting complex relational knowledge from masked language models.

## Journal Articles

- **Zhang, Z.**#, §Good, M., §Kulikov, V., van Horen, F., Bartholomew, M., Kayser A. S.#, & Hsu, M.# (2023) From scanner to court: Toward a neuroscientifically informed "reasonable person" test of trademark infringement. *Science Advances*, 9(6), abo1095.
  - Media coverage: Fortune, Fast Company, Big Think, Law360, World Trademark Review, The Daily Californian
- §Maboudian, S., Hsu, M., & **Zhang, Z.**# (2022). Visualizing and quantifying longitudinal changes in verbal fluency using recurrence plots. *Frontiers in Aging Neuroscience*, 14.
- **Zhang, Z.**#, §Wang, S., §Good, M., §Hristova, S., Kayser A. S.#, & Hsu, M.# (2021). Retrieval-constrained valuation: Toward prediction of open-ended decisions. *Proceedings of the National Academy of Sciences*, 118(20).
  - Media coverage: The Hill, Medical XPress, Guokr
- Furman, D. J., **Zhang, Z.**, Chatham, C., §Good, M., Badre, D., Hsu, M., & Kayser A. S. (2021). Augmenting frontal dopamine tone enhances maintenance over gating processes in working memory. **Journal of Cognitive Neuroscience**, 33(9), 1753-1765.
- **Zhang**, **Z.**, Chandra, S., Kayser, A. S., Hsu, M., & Warren, J. (2020). A hierarchical Bayesian implementation of the experience-weighted attraction model. *Computational Psychiatry*, 4, 40-60.
- **Zhang**, **Z**\*., Coppin, G\*. (2018). To what extent memory could contribute to impaired food valuation and choices in obesity? *Frontiers in Psychology*, 9, 2523.
- **Zhang**, **Z.**, Fanning, J., §Ehrlich, D. B., §Chen, W., Lee, D., & Levy, I. (2017). Distributed neural representation of saliency controlled value and category during anticipation of rewards and punishments. *Nature Communications*, 8, 1907.
- **Zhang, Z.**, Mendelsohn, A., Manson, K. F., Schiller, D., & Levy, I. (2015). Dissociating value representation and inhibition of inappropriate affective response during reversal learning in the ventromedial prefrontal cortex. *eNeuro*, 2(6), ENEURO-0072.
  - Featured in Viewpoints Q&A at Nature Neuroscience
- **Zhang, Z.**, Manson, K. F., Schiller, D., & Levy, I. (2014). Impaired associative learning with food rewards in obese women. *Current Biology*, 24(15), 1731-1736.
  - Media coverage: BBC, Los Angeles Times, The Baltimore Sun, The Orlando Sentinel, Capital Gazette, ScienceDaily, The Times of India, Guokr, Canadian Broadcasting Corp., China National Radio, News Ghana
  - Featured in commentary by neuroscientists Terry Davidson and Ashley Martin and in News & Comment at *Nature Reviews Neuroscience*

#### **Opinion Editorials**

- **Zhang**, **Z.** (February 13, 2023). A less biased way to determine trademark infringement? Asking the brain directly. *The Conversation*.
- Hsu, M., **Zhang, Z.**, & Kayser, A. S. (2021). What marketers often miss when measuring the value of being top of mind. *INsights Consumer Neuroscience in Business*, 34, 14-17.

*Invited Commentaries and Book Reviews* 

**Zhang**, **Z.** (2012). Book review for The Age of Insight: The Quest to Understand the Unconscious in Art, Mind, and Brain, From Vienna 1900 to the Present. *The Yale Journal of Biology and Medicine*, 85(4), 564.

## **Selected Work in Progress**

\*denotes equal contribution §denotes mentee

**Zhang, Z**. Toward financially accountable brand awareness building: Connecting models of brand memory and consumer choice.

**Zhang**, **Z.**, §Wang, S., Kayser A. S., & Hsu, M. I am not fickle, but my memory might be: Choice switches driven by imperfect memory recall.

**Zhang, Z.**, §Maboudian, S., Jackson A., Ngo, S., Manivannan, M., Kayser, A. S., Hsu, M., & Chiong, W. Mechanistic contributions of memory to decision-making impairments in Alzheimer's disease.

§Chen, P.\*, Hsu, M.\* & Zhang, Z.\* Mapping 25 years of brand knowledge evolution with vector semantics.

<sub>§</sub>Wu, Q., **Zhang**, **Z.**, Kayser A. S., & Hsu, M. Flexible reconfigurations of large-scale brain networks in decisions with predefined vs. self-generated options.

#### **Research Grants**

UC Berkeley Fisher Center of Business Analytics Research Grant 2019-2020 Predicting Brand Equity and Top-of-Mind Awareness using Large-Scale Text Corpora \$10,000

This proposal applies insights from cutting-edge big data methods, grounded in validated cognitive processes, to capture consumer awareness across segments and inform managerial actions.

Role: Co-Investigator (with Hsu)

Scientific Research Network for Decision Neurosci. & Aging Pilot Grant 2018–2019

Age-related changes in memory-based choices and its neural basis \$47,100

This proposal aims to understand the quantitative relationship between semantic memory, valuation, and choices and to characterize its changes across the lifespan.

Role: Subaward PI (from Samanez-Larkin parent award NIH/NIA R24-AG054355)

UC Berkeley Fisher Center of Business Analytics Research Grant 2018-2019

Big Data Approaches to Understanding Brand Memory \$10,000

This proposal aims to leverage recent advances in machine learning, natural language processing, and consumer neuroscience to improve predictive models of memory-based consumer choice.

Role: Co-Investigator (with Hsu)

#### **Invited Talks**

2023

Centre for Res. in the Behav. Sci.

University of Nottingham

2022

Department of Neurology Department of Psychology School of Management

School of Psychology and Cog. Sci.

Anderson School of Management

University of Virginia University of Virginia **Fudan University** 

East China Normal Univ.

**UCLA** 

2021

School of Management

Department of Industrial Engineering

Darden School of Business

Department of Marketing, Business

Economics, and Law

The Shansby Marketing Seminar Behavioral Science Seminar

Univ. Sci. Tech. of China University of Chile

University of Virginia University of Alberta

**UC** Berkeley **UC** Berkeley

2019 and before

Neuroeconomics Forum

The Business and Marketing Program

School of Management

The Shansby Marketing Seminar Psychology and Economics Lunch

College of Psychology

McGovern Institute for Brain Research

Rotman School of Management

Yale University

New York Univ. Shanghai

**Zhejiang University** 

**UC** Berkeley **UC** Berkeley

Shenzhen University

**Peking University** 

**University of Toronto** 

#### **Select Conference Presentations**

#### Association for Consumer Research (ACR)

- (Oct, 2022) Isolating representations from processes: An application for quantifying product imitation without self-report
- (Oct, 2022) Forecasting consumer brand perception using large-scale text analysis
- (Oct, 2021) Mapping 25 years of consumer knowledge from text corpora
- (Oct, 2019) Predicting consumer brand memory across demographic segments
- (Oct, 2018) Predicting memory-based consumer choice from recall and preferences
- (Oct, 2018) Predicting consumer brand recall and choice using large-scale text corpora

### Theory + Practice in Marketing Conference (TPM)

- (Jun, 2021) Mapping 25 years of consumer knowledge from text corpora
- (May, 2019) Large-scale inference of brand memory from text corpora

#### Society for Consumer Psychology (SCP)

- (Mar, 2020) Predicting consumer brand memory across demographic segments

#### **Future of Brands Conference**

- (Dec, 2019) Predicting consumer brand recall using large-scale text corpora

## **Behavioral Insights from Text Conference**

- (Jan, 2019) Predicting consumer brand recall and choice using large-scale text corpora

## Society for Neuroeconomics & Consumer Neuroscience Satellite Symposium

- (Oct, 2021) Mechanistic contributions of memory to decision-making impairments in Alzheimer's disease
- (Oct, 2020) Retrieval-constrained valuation: Toward prediction of open-ended decisions
- (Oct, 2018) Predicting memory-based decisions

#### **Economic Science Association (ESA)**

- (Oct, 2019) Predicting memory-based choices

### Interdisciplinary Symposium on Decision Neuroscience (ISDN)

- (Jun, 2019) Mnemonic constraints on value-based decision making
- (Jun, 2017) Distributed neural representation of value, saliency, and category during anticipation of rewards and punishments

#### Text Analysis Across Domains Conference (TextXD)

- (Dec, 2022) Did consumers perceive Microsoft as more innovative than Apple in 2005? Recovering how consumers perceived brands in the past using diachronic text analysis
- (Dec, 2019) Predicting consumer brand recall and choice using large-scale text corpora

## **Teaching Experience**

Core Marketing (MBA)

Darden School of Business, University of Virginia

2022

#### Guest lecturer

Intellectual Property: Current Controversies (J.D.; instructor: Mira T. Sundara Rajan) School of Law, UC Davis 2020

Marketing Research (MBA; instructor: Ming Hsu) 2019

Haas School of Business, UC Berkeley

Neuromarketing (undergraduate; instructor: Ming Hsu) 2019

Haas School of Business, UC Berkeley

Empirical Research Seminar (J.D.; instructor: Tom R. Tyler) 2016

Yale Law School

## Teaching Fellow

Neuroeconomics for Economists (instructor: Ifat Levy) 2016

Department of Economics, Yale University

The Human Brain (instructor: Gregory McCarthy) 2014

Department of Psychology, Yale University

Introduction to the Human Brain: Brain and Thought (instructor: Amy Arnsten)

2011, 2012

Department of Psychology & Cognitive Science Program, Yale University

#### **Patent**

Hsu, M., Kayser, A., and **Zhang**, **Z**. System for determining trademark similarity. U.S. patent pending.

## **Industry Experience**

Instructor for corporate training programs <u>Data Wise Academy</u>	2019
Contributor to the <u>Neuromarketing Yearbook 2018</u> <u>Neuromarketing Science &amp; Business Association</u>	2018
External consultant on behavioral nudging and analytics <u>Ecometricx</u>	2017
Project consultant on strategy and marketing <u>US-Brazil Connect</u> & <u>National Confederation of Industry of Brazil</u>	2014

## **Select Undergraduate Mentees**

Pei-Ming (Vincent) Chen (National Taiwan Univ. '19; visiting student at UCB; currently Ph.D. student in marketing at UCB)

Peter (Shichun) Wang (UC Berkeley '19; currently Ph.D. student in operations research and financial engineering at Princeton)

Samira Maboudian (UC Berkeley '20; honors thesis mentee; currently Ph.D. student in neuroscience at UCB)

Qianying Wu (Univ. of Sci. & Tech of China '20; visiting student at UCB; currently Ph.D. student in behavioral and social neuroscience at Caltech)

#### **Professional Activities**

Ad Hoc Reviewer - Journals

Appetite; Cerebral Cortex; Cognitive, Affective, and Behavioral Neuroscience; Communications Biology; eNeuro; Frontiers in Neuroscience; Heliyon; Journal of Alzheimer's Disease; Journal of Behavioral Decision Making; Journal of Business Research; Journal of Interactive Marketing; Journal of Neuroscience; Journal of Neuroscience, Psychology, and Economics; Journal of the Association for Consumer Research; Molecular Psychiatry; NeuroImage; Neuropsychologia; PLoS Computational Biology; PLoS One; PNAS; Progress in Neurobiology; Psychonomic Bulletin and Review; Psychophysiology; Scientific Reports; Yale Journal of Biology and Medicine

## Ad Hoc Reviewer - Conferences

Association for Consumer Research (2022-present); Society for Consumer Psychology (2018-present); American Marketing Association Academic Conference (2022-present); Multidisciplinary Conference on Reinforcement Learning and Decision Making (2019, 2022); European Association for Consumer Research (2023-present)

## Conference Planning

The Association of Consumer Research Conference, 2022

Co-Chair, Special Session "Mapping Consumer Mental Processes and Representations Across Diverse Marketplaces"

The Society for Neuroeconomics annual meeting, 2021

Chair, Symposium "The Diverse and Critical Roles of Memory Retrieval Processes in Decision Making"

Multidisciplinary Conference on Reinforcement Learning and Decision Making, 2019 Member, *Program Committee* 

The Association of Consumer Research Conference, 2019 Co-Chair, Special Session "Extracting Behavioral Insights from Big Data: Novel AI and NLP Approaches"

#### Grant Reviewer

Scientific Research Network for Decision Neuroscience & Aging Pilot Grant (2019)

### **Professional Society Memberships**

Association for Consumer Research

**Economic Science Association** 

Society for NeuroEconomics

Society for Neuroscience

Society for Consumer Psychology

Cognitive Neuroscience Society

New York Academy of Science

American Association for the Advancement of Science

National Postdoctoral Association

#### **Services**

Darden School of Business, University of Virginia

Member, Faculty Recruitment Committee (Marketing Area)

## University of California, Berkeley

Co-President, Berkeley Postdoctoral Association 2019-2020 Member, Advisory Committee for Postdoc Housing 2018

## Interdepartmental Neuroscience Program, Yale University

Member & PhD Student Representative, Executive committee2011-2016Member, NeuroDay organizing committee2014Member, Graduate curriculum committee2012

## Yale University

Alumni Interviewer, Yale College Admissions Office 2019-present Departmental representative, Graduate Student Assembly 2012-2013