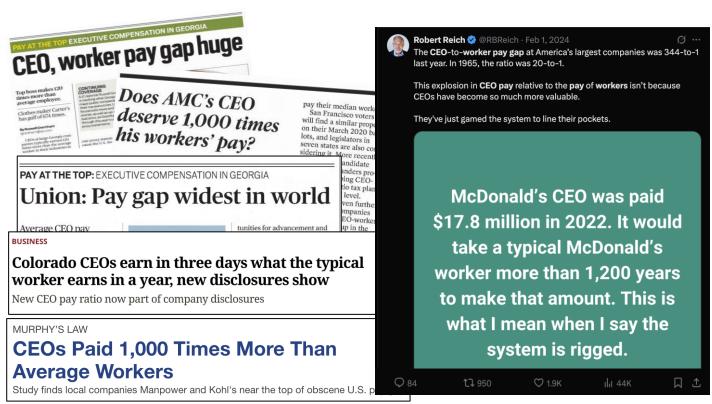


# Do Consumers Care about Pay Inequality? Evidence from Household Purchase Data

Konstantinos Bozos a, Jie Chen a, Yang Gao b, Xuan Tian c, Jiayi Yuan a

- <sup>a</sup> University of Leeds, United Kingdom
- <sup>b</sup> University of Exeter, United Kingdom
  - <sup>c</sup> Tsinghua University, China

## Anecdotal evidence: CEO-worker pay disparity



## Anecdotal evidence: Consumers' reaction to high CEO-worker pay disparity





Large CEO-worker wage gaps are a major consumer turnoff

### THE WALL STREET JOURNAL.

# **Consumers Care About CEO-Employee Pay Ratios**

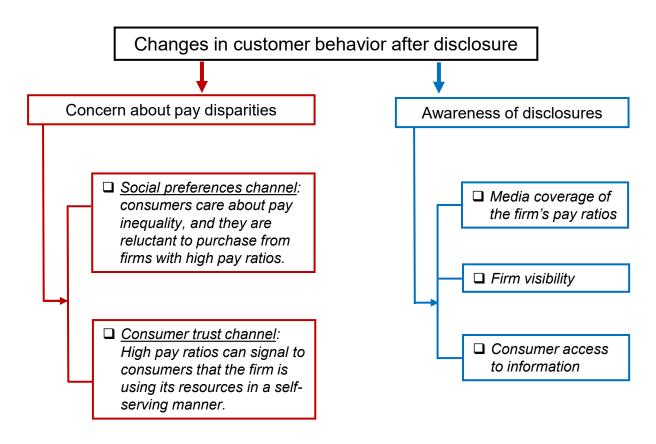
Companies with big pay gaps could see their business affected as new SEC disclosure requirement takes effect



## Unique setting: The disclosure mandate and salience of CEO-worker pay ratio

- Most public firms listed in the U.S. are required to disclose their CEO-worker pay ratio from the first fiscal year that began on or after *January 1, 2017*.
  - Thus, the first pay ratio disclosures were made in calendar year 2018, based on fiscal year 2017 data, typically reported in the proxy statement (SEC Form DEF 14A).
- Under the new rule, firms must disclose:
  - 1. Median annual total compensation of all employees (excluding the CEO)
  - 2. Annual total compensation of the CEO
  - 3. Ratio between these two numbers
- The first rule in the history of the SEC disclosure regime to require firms to disclose any information about how they pay their workers (Bank and Georgiev, 2019).

We examine consumer responses to the first disclosure of CEO-worker pay ratios.



## CEO-worker pay ratio disclosure and treatment definition

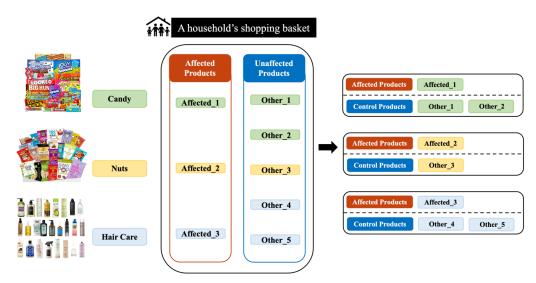
- Sample: 2,285 U.S. firms disclosing pay ratios for the first time in 2018 proxy statements (SEC filings)
- Disclosure month t: First proxy filing date per firm (Pan et al., 2022)
- Treatment timing: Staggered, based on month t
- High pay ratio: Top quartile among all disclosures up to month t
  - Rationale: Consumers assess pay disparities using cumulative information available at time of disclosure.

## Consumer purchase data: NielsenIQ consumer panel (NCP)

- NCP records detailed trip-level purchases and store visits.
- Product hierarchy consists of three levels of aggregation: 10 departments → 120 groups → 1,500 modules.
- Sample period: Sept 2017–Apr 2019 (±4 months around 2018).
- Manually matched firms with high pay ratio disclosures to product producers.
- Final sample: 63,619 households and 198,506 products, of which 35,092 are treated products manufactured by 64 high-pay-ratio firms.

## Treatment vs. control groups

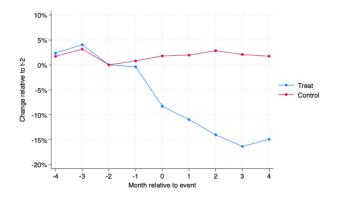
Figure 1. Conceptual framework of empirical strategy



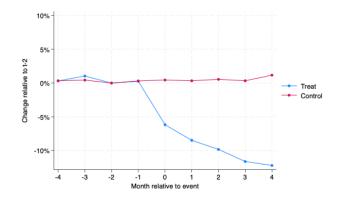
- Treatment and control products drawn from the same household's shopping basket.
- Analysis conducted within household and within product group.
- Control group: never-treated products from the same product group, within the same household's shopping basket.
- Price-matched: ±20% of treated product's unit price.

Figure 2. Trends in consumption for treated and control products

#### A. Consumption in terms of total spending



#### B. Consumption in terms of quantity purchased



□ Baseline analyses(1): Baseline regression model

LN Total spending<sub>i,j,p,t</sub> = 
$$\beta_1 Treat_{j,p} \times Post_{i,t} + \alpha_{i,j,p,t} + \epsilon_{i,j,p,t}$$

- where *i* refers to surveyed households, *j* indicates events pertaining to the disclosure of high pay ratios, *p* denotes products, and *t* stands for calendar month-years.
- The **dependent variable** is the natural logarithm of one plus the total amount a household spends on a specific product in a given month.
- *Treat* is set to one for products whose manufacturers disclose high pay ratios, and zero otherwise.
- **Post** is set to one for each month during the five-month period following the disclosure (including the event month), and zero otherwise.
- α<sub>i,j,p,t</sub>, represents a set of high-dimensional fixed effects, namely Cohort × Month-year and Cohort × Household × Product, that account for unobservable heterogeneity across event cohorts, households, and products.

#### Panel A. Baseline results

Motivation

Dependent variable	LN Total spending	LN Total spending
	[t-4, t+4]	[t-4, t-1] & [t+1, t+4]
	(1)	(2)
$Treat \times Post$	-0.049***	-0.048***
	(0.003)	(0.003)
Cohort × Month-year FE	Yes	Yes
Cohort × Household × Product FE	Yes	Yes
Cluster by Product	Yes	Yes
Cluster by Household × Month-year	Yes	Yes
Observations	19,709,658	17,519,696
Adjusted R <sup>2</sup>	0.205	0.182

We find that consumers **react negatively** to high pay ratios.

## Baseline analyses(2): Dynamic effects

Panel B. Time-series dynamics of consumer reaction

Motivation

Dependent variable	LN Total spending	LN Units	LN Price
	(1)	(2)	(3)
$Treat \times Pre_{t-4}$	0.006	0.002	-0.002
	(0.005)	(0.004)	(0.005)
$Treat \times Pre_{t-3}$	0.007	0.003	-0.000
	(0.007)	(0.004)	(0.005)
$Treat \times Pre_{t-2}$	-0.003	-0.002	0.005
	(0.004)	(0.002)	(0.004)
$Treat \times Post_t$	-0.049***	-0.018***	-0.006
	(0.004)	(0.002)	(0.005)
$Treat \times Post_{t+1}$	-0.049***	-0.017***	-0.003
	(0.004)	(0.002)	(0.005)
$Treat \times Post_{t+2}$	-0.045***	-0.014***	-0.003
	(0.004)	(0.002)	(0.005)
$Treat \times Post_{t+3}$	-0.044***	-0.012***	-0.008
	(0.004)	(0.003)	(0.005)
$Treat \times Post_{t+4}$	-0.044***	-0.012***	-0.001
	(0.004)	(0.002)	(0.005)
Cohort × Month-year FE	Yes	Yes	Yes
Cohort × Household × Product FE	Yes	Yes	Yes
Cluster by Product	Yes	Yes	Yes
Cluster by Household × Month-year	Yes	Yes	Yes
Observations	19,709,658	19,709,658	19,662,202
Adjusted R <sup>2</sup>	0.205	0.231	0.909

The post-disclosure reduction in product consumption is driven by a decrease in the number of units purchased demand-side interpretation.

We find that reductions in consumer spending become statistically significant only after the disclosure of high pay ratios -- supports the *parallel trend assumption*.

## ☐ Enhancing identification(1): Pay disparity versus pay levels

Dependent variable	LN Total spending
——————————————————————————————————————	(1)
Treat with high CEO pay × Post	-0.050***
	(0.004)
Treat with low CEO pay × Post	-0.048***
40 € 10 € 10 € 10 € 10 € 10 € 10 € 10 €	(0.003)
Equal treatment effects (p-value)?	
(Treat with high CEO pay - Treat with low CEO pay) × Post	0.751
Cohort × Month-year FE	Yes
Cohort × Household × Product FE	Yes
Cluster by Product	Yes
Cluster by Household × Month-year	Yes
Observations	19,709,658
Adjusted R <sup>2</sup>	0.205
Panel B. Consumer reaction and median worker pay	
Dependent variable	LN Total spending
Total Section (Control of Control	(1)
Treat with high worker pay × Post	-0.045***
	(0.004)
Treat with low worker pay $\times$ Post	-0.052***
• • • • • • • • • • • • • • • • • • • •	(0.004)
Equal treatment effects (p-value)?	
Equal treatment effects (p-value)? (Treat with high worker pay - Treat with low worker pay) × Post	0.241
1 4	0.241 Yes
(Treat with high worker pay - Treat with low worker pay) × Post  Cohort × Month-year FE	
(Treat with high worker pay - Treat with low worker pay) × Post	Yes
(Treat with high worker pay - Treat with low worker pay) × Post  Cohort × Month-year FE  Cohort × Household × Product FE	Yes Yes
(Treat with high worker pay - Treat with low worker pay) × Post  Cohort × Month-year FE  Cohort × Household × Product FE  Cluster by Product	Yes Yes Yes

• We find that the adverse impact of pay disparity does not vary with CEO or worker pay levels, suggesting that the observed decline in consumer purchases is driven by pay disparity itself, rather than solely by the levels of CEO or worker pay.

## □ Enhancing identification(2): The effect of firm-brand name similarity

This table investigates whether firm-brand name similarity affects consumer reaction to high pay ratio disclosures. The sample spans from four months before to four months after the disclosure event. The dependent variable, *LN Total spending*, is the natural logarithm of one plus the total amount a household spends on a specific product in a given month. *Treat* is set to one for products whose manufacturers disclose high pay ratios, and zero otherwise. *Post* is set to one for each month during the five-month period following the disclosure (including the event month *t*), and zero otherwise. *High name similarity* is an indicator variable that equals one if the similarity score between the firm and brand names is in the top quintile among treated firms in our sample, and zero otherwise, where the similarity score is calculated using a fuzzy string-matching algorithm. We include *Cohort* × *Month-year* and *Cohort* × *Household* × *Product* fixed effects to account for unobservable heterogeneity across event cohorts, households, and products. The standard errors reported in parentheses are heteroscedasticity-robust and clustered at the product and household × month-year levels. \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

Dependent variable	LN Total spending
The mount of the same	(1)
Treat $\times$ Post $\times$ High name similarity	-0.017**
	(0.008)
$Treat \times Post$	-0.047***
	(0.003)
Cohort × Month-year FE	Yes
Cohort × Household × Product FE	Yes
Cluster by Product	Yes
Cluster by Household × Month-year	Yes
Observations	19,709,658
Adjusted R <sup>2</sup>	0.205

 We find that the negative reaction is more *pronounced* for products with brands that share a *similar name* with their manufacturing firms.

### □ Enhancing identification(3)-(5): Summary of results

#### 3) Confirming the salience of the pay ratio

- Pre-2018 disclosures of aggregate labor costs enabled rough estimates of average employee pay, potentially reducing the salience of initial pay ratio disclosures.
- Consumer reactions were similarly negative regardless of prior wage information, suggesting limited consumer sensitivity to prior staff cost information.

#### 4) Pay disparity and product recalls

- High pay ratios may harm employee morale and productivity, leading to product quality issues and negative consumer reactions.
- We find that pay ratios do not significantly influence subsequent product recalls, indicating recalls do not explain our findings.

#### 5) Falsification tests

- We shift the true event month one year earlier (*Post*<sub>pseudo</sub>) and randomly assign treated products (*Treat*<sub>pseudo</sub>).
- The results confirm that our findings are not driven by omitted variables or random chance.

Motivation

## Underlying mechanisms(1): Social preferences

The table investigates how consumers' aversion to inequality affects their responses to high pay ratio disclosures. The sample spans from four months before to four months after the disclosure event. The dependent variable, LN Total spending, is the natural logarithm of one plus the total amount a household spends on a specific product in a given month. Treat is set to one for products whose manufacturers disclose high pay ratios, and zero otherwise. Post is set to one for each month during the five-month period following the disclosure (including the event month t), and zero otherwise. We use four measures to capture local inequality aversion. Minimum wage refers to the minimum hourly wage (in dollars) in the state where the household is located. Tax diff represents the difference between the state's maximum and minimum personal income tax rates. Democratic denotes the percentage of votes the Democratic Party received in the 2016 Presidential Election in the county where the household is located. Social capital is the social capital index constructed following Hasan et al. (2017) and Hoi et al. (2019). We include Cohort × Month-year and Cohort × Household × Product fixed effects to account for unobservable heterogeneity across event cohorts, households, and products. The standard errors reported in parentheses are heteroscedasticity-robust and clustered at the product and household × month-year levels. \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

Dependent variable	LN Total spending				
	(1)	(2)	(3)	(4)	
Treat $\times$ Post $\times$ Minimum wage	-0.003***				
	(0.000)				
$Treat \times Post \times Tax diff$		-0.092***			
-		(0.018)			
$Treat \times Post \times Democratic$			-0.021***		
			(0.004)		
Treat × Post × Social capital				-0.004***	
-				(0.001)	
Treat × Post	-0.023***	-0.047***	-0.041***	-0.050***	
	(0.005)	(0.003)	(0.003)	(0.003)	
Cohort × Month-year FE	Yes	Yes	Yes	Yes	
Cohort × Household × Product FE	Yes	Yes	Yes	Yes	
Cluster by Product	Yes	Yes	Yes	Yes	
Cluster by Household × Month-year	Yes	Yes	Yes	Yes	
Observations	19,255,833	19,255,833	19,255,833	19,241,869	
Adjusted R <sup>2</sup>	0.211	0.211	0.211	0.211	

We examine whether consumer responses to high pay ratios vary according to local attitudes toward income inequality.

We find that the negative consumer reaction to high pay ratios is **stronger** in areas with *greater* aversion to inequality

Motivation

This table explores the role of consumer trust by examining whether consumer reaction is stronger for high-value purchases and products with unobservable attributes. The sample spans from four months before to four months after the disclosure event. The dependent variable, *LN Total spending*, is the natural logarithm of one plus the total amount a household spends on a specific product in a given month. *Treat* is set to one for products whose manufacturers disclose high pay ratios, and zero otherwise. *Post* is set to one for each month during the five-month period following the disclosure (including the event month *t*), and zero otherwise. *High value products* is an indicator variable that equals one if the product price exceeds the sample median and zero otherwise. *Experience products* is an indicator variable that equals one if the product belongs to the following product departments: health and beauty aids, frozen foods, packaged meat, non-food grocery, and general merchandise; otherwise, it equals zero. We include *Cohort × Month-year* and *Cohort × Household × Product* fixed effects to account for unobservable heterogeneity across event cohorts, households, and products. The standard errors reported in parentheses are heteroscedasticity-robust and clustered at the product and household × month-year levels. \*\*\*, \*\*, and \* indicate significance at the 1%, 5%, and 10% levels, respectively.

Dependent variable	LN Total spending			
	(1)	(2)		
Treat × Post× High value products	-0.165***			
	(0.004)			
Treat × Post × Experience products		-0.077***		
		(0.003)		
Treat × Post	-0.013***	-0.025***		
	(0.003)	(0.003)		
Cohort × Month-year FE	Yes	Yes		
Cohort × Household × Product FE	Yes	Yes		
Cluster by Product	Yes	Yes		
Cluster by Household × Month-year	Yes	Yes		
Observations	19,709,658	19,709,658		
Adjusted R <sup>2</sup>	0.206	0.205		

We examine whether negative consumer responses to high pay ratios varies with different product characteristics.

We find that the reported pay ratio is more relevant for *high-value* or *experience products,* where *trust* plays a particularly important role in purchasing decisions.

-0.011\*\*\* (0.002)

Motivation

#### □ Condition: Consumer awareness

age				
Dependent variable LN Total spe			ding	
	(1)		(2)	
	-0.034*	**		
	(0.005	)		
			-0.042**	
			(0.017)	
y				
	LN Total spending			
(1)	(2)	(3)	(4)	
-0.033***		1		
(0.005)				
	-0.031***			
	(0.005)			
		-0.018***		
		(0.005)		
			-0.009*	
			(0.005)	
access				
	L	N Total spen	ding	
	(1)		(2)	
	-0.002	*		
	(0.001)	)		
	(1) -0.033*** (0.005)	(1) -0.034* (0.005)  LN Total (1) (2) -0.033*** (0.005) -0.031*** (0.005)  access  L (1) -0.002	-0.034*** (0.005)  LN Total spending (1) (2) (3)  -0.033*** (0.005)  -0.031*** (0.005)  -0.018*** (0.005)  access  LN Total spen (1)  -0.002*	

We find that the negative reaction is more pronounced when a firm's pay ratio is covered in the *media*, when the firm is more *prominent and visible*, and when consumers have *better access* to information.

 $Treat \times Post \times Household$  with internet access

Results

We examine whether consumers care about pay inequality within firms.



Our study presents two key takeaways:

- Firms disclosing high pay ratios experience a significant decline in consumer purchases.
- Consumers are concerned about high within-firm pay disparity, driven by their social preferences and a loss of trust, to the extent that they are aware of this information.

## Thank you! Q&As

### Appendix A-Product categorization structure in NielsenIQ Homescan Consumer Panel

Panel	A	List	of a	lepartments

Description	Number of product groups	Distribution of products
Health and beauty	18 (e.g., baby needs, cosmetics, cough and cold	5.90%
care	remedies, deodorant)	
Dry grocery	38 (e.g., baby food, baking mixes, candy, cereal, coffee, condiments, crackers)	56.16%
Frozen foods	10 (e.g., ice, frozen baked goods, frozen vegetables)	7.19%
Dairy	10 (e.g., cheese, eggs, yogurt)	6.40%
Deli	1	2.02%
Packaged meat	2 (fresh meat and packaged meats)	4.71%
Fresh produce	1	6.05%
Non-food grocery	12 (e.g., detergent, disposable diapers, fresheners, and household cleaners)	9.63%
Alcoholic beverages	3 (beer, wine, liquor)	0.18%
General merchandise	22 (e.g., batteries and flashlights, cookware, shoes care)	1.77%

 The tables provide an overview of the product categorization structure in the NielsenIQ Homescan Consumer Panel

#### Panel B. Example of product modules within the "Candy" group

#### Module name

**BREATH SWEETENERS** 

CANDY - CHOCOLATE

CANDY - CHOCOLATE - MINIATURES

CANDY - CHOCOLATE - SPECIAL

CANDY - DIETETIC - CHOCOLATE

CANDY - DIETETIC - NON - CHOCOLATE

CANDY - HARD ROLLED

CANDY - KITS

CANDY - LOLLIPOPS

CANDY - NON - CHOCOLATE

CANDY – NON – CHOCOLATE – MINIATURES

CONFECTIONERY PASTE

GIFT PACKAGE WITH CANDY OR GUM

MARSHMALLOWS

PERISHABLE CHOCOLATE CANDY

PERISHABLE MARSHMALLOW

PERISHABLE NONCHOCOLATE CANDY

Panel A lists the number of product groups in each department and the distribution of products purchased by surveyed households in our sample.

 Panel B details the product modules within the "Candy" group of the "Dry Grocery" department.