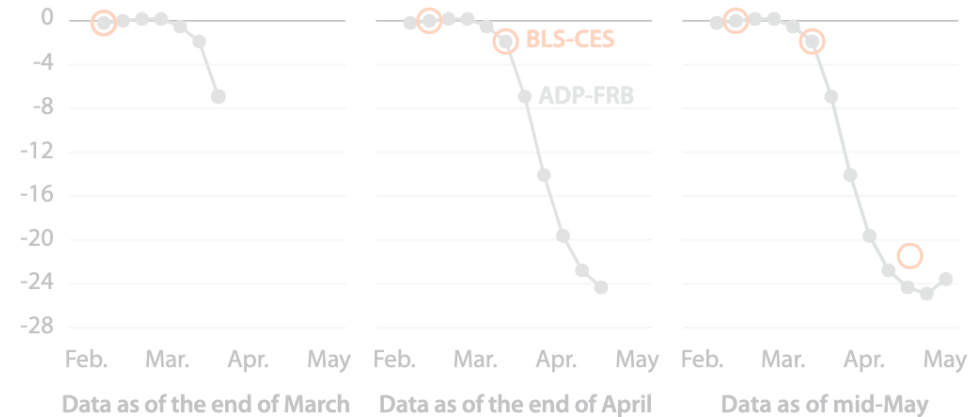


# Using Data to Make Better Economic Policy in the 21st Century



**Karen Dynan**  
Harvard University

MDI Distinguished Lecture  
Georgetown Massive Data Institute  
March 23, 2023

*For decades, as the primary collectors, processors, and curators of the raw information underlying economic statistics, government statistical offices were near monopoly providers of [the source information for economic measurement].*

*Today, in contrast, staggering volumes of digital information relevant to measuring and understanding the economy are generated each second by an increasing array of devices that monitor transactions and business processes as well as track the activities of workers and consumers.*

[Abraham, Jarmin, Moyer, and Shapiro](#) (2022)

# Policymakers use economic data in many ways

To set key provisions of government programs

To evaluate whether new interventions are effective

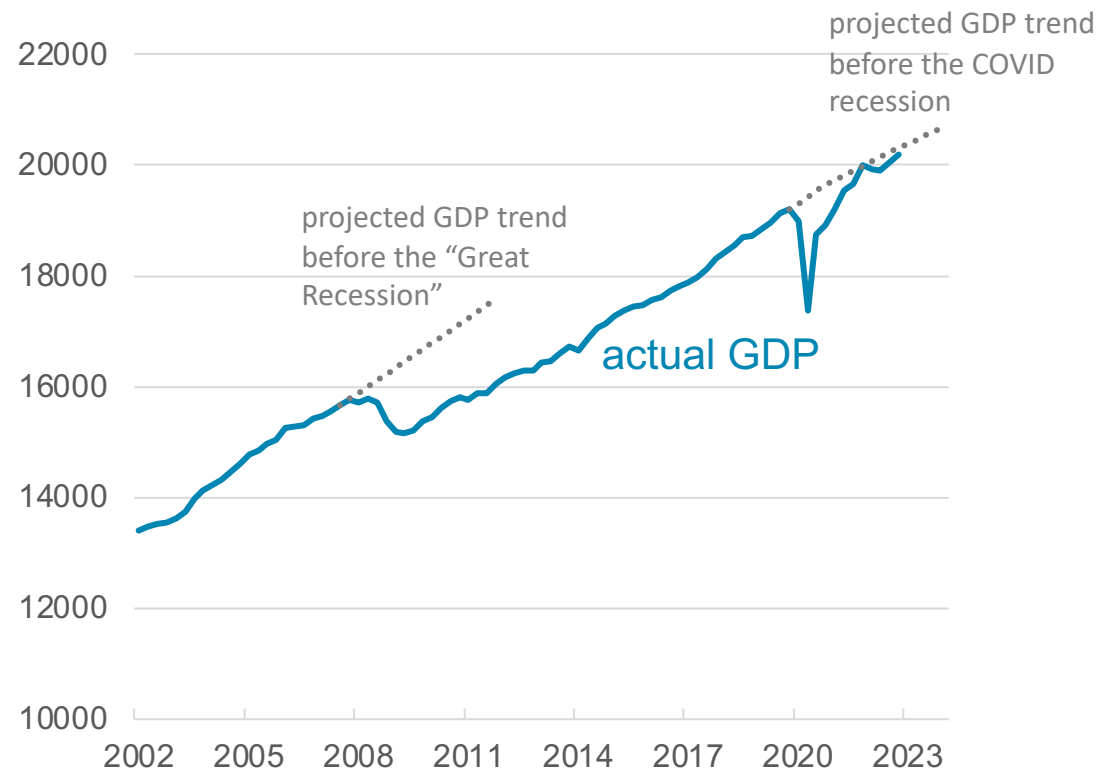
To do cost-benefit analysis for regulations

To track economic developments and support policies that stabilize the economy and help individuals in the face of economic disruption

focus of today's talk

# The stakes are high with macroeconomic stabilization policy

*At the national level*



Real GDP in 2012 dollars from the Bureau of Economic Analysis via [FRED](#), last data point 2022:Q4; projected trends from the [Congressional Budget Office](#)

*And at the individual level*



**The traditional data toolkit for economic policymakers**

**Important new additions to the economic data toolkit**

**Challenges associated with the new tools**

**Constructive next steps**

# **The traditional data toolkit for economic policymakers**

Important new additions to the economic data toolkit

Challenges associated with the new tools

Constructive next steps

# Data has long been the cornerstone of good economic policymaking

Key decisions about monetary and fiscal policy have been informed by a set of **high quality traditional indicators**, mostly produced **by experienced statistical experts at government agencies**

- GDP and its components, along with source data

- Labor statistics

- Financial flows

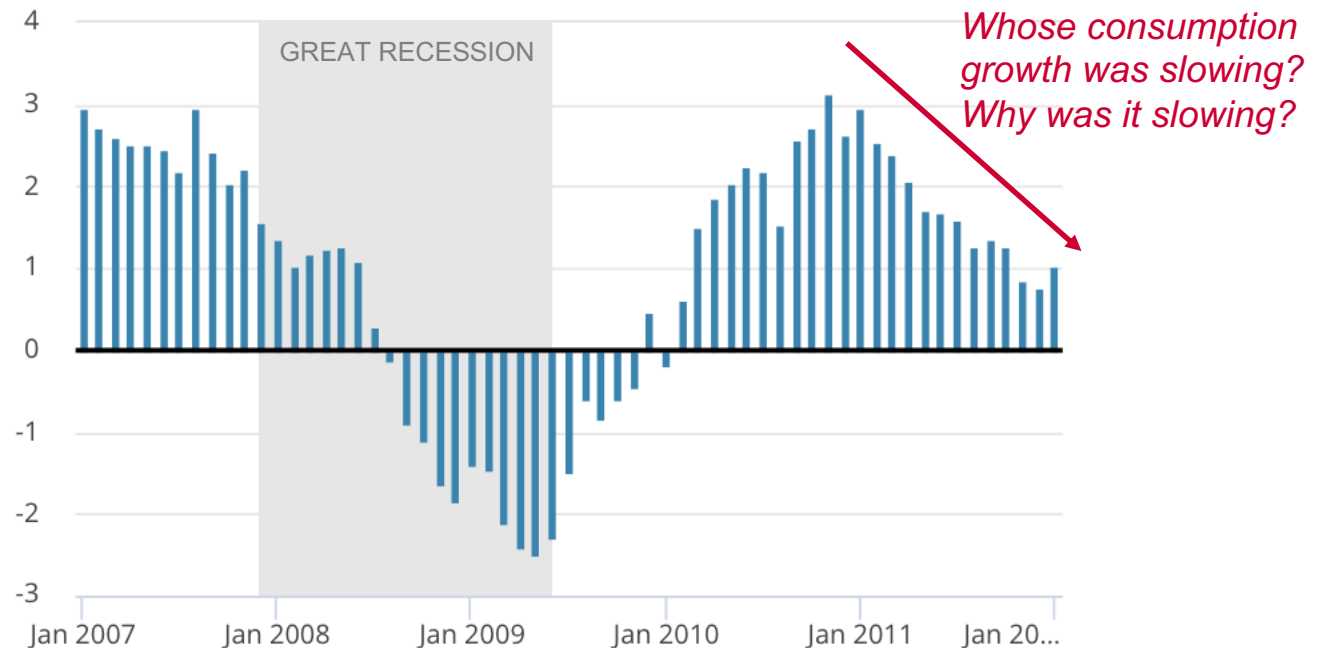
- [With a lag] some individual-, household-, and firm-level data sets

But this traditional data toolkit **also had its limitations**

# It was often hard to know what was going on “under the hood” with just the traditional data toolkit

Aggregate data only speaks to what is happening **on average in the economy**

Consumer Spending Growth around the Time of the Great Recession

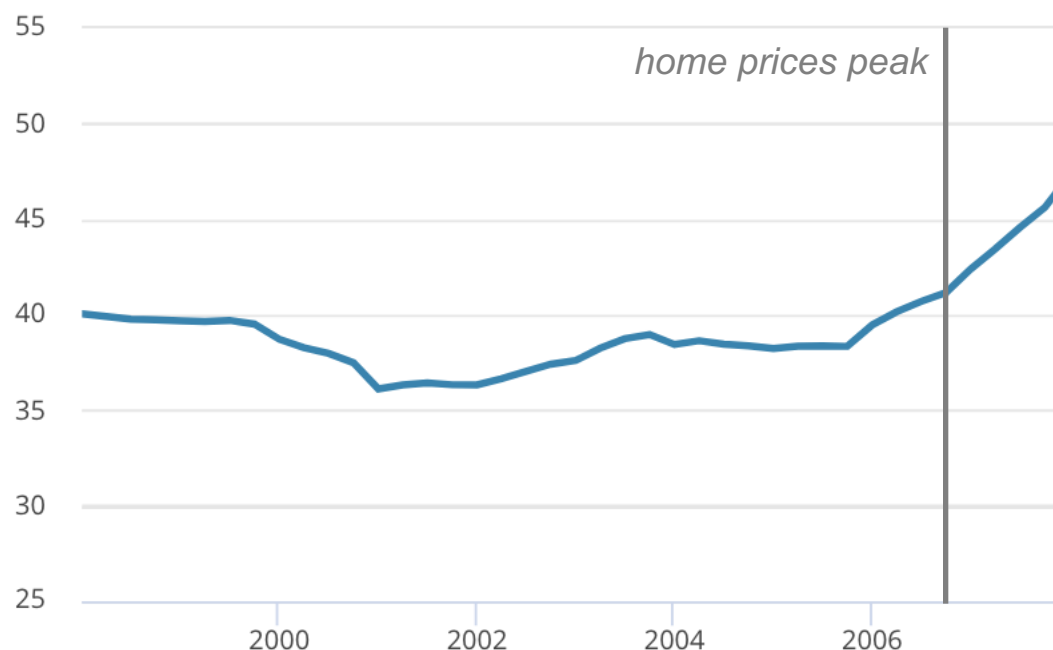


12-month change in real PCE from the Bureau of Labor Statistics via [FRED](#)



# The traditional data toolkit missed important developments in the tails of the distribution

Aggregate Mortgage Loan-to-Value Ratio  
before the Financial Crisis



100 minus owners' equity as a percentage of household real estate from US Financial Accounts via [FRED](#)

Aggregate mortgage leverage rose during the housing bubble, but at <50%, **it looked like there was plenty of room for home prices to fall** without putting homeowners underwater

Analysis done since then using more granular data shows that the median subprime borrower in 2006 had an LTV of 100%

# Traditional data can be noisy and subject to revision

[Cajner, Feiveson, Kurz, and Tevlin](#) (2022) discuss **the significant downward revisions to data for the period preceding the Great Recession**:

*Had the revised data, or an expansive set of nontraditional data, been in policymakers' hands at the time of the August [2007] meeting, a better picture of a less robust state of the economy might have assisted policymakers.*

**Accurately capturing business cycle turning points is essential** to make good macroeconomic policy, but they can be obscured by provisional estimates of traditional indicators if prior trends are used to fill in still-missing source data

# Traditional data may not be available if the government closes



## NEWS RELEASE



Transmission of material in this release is embargoed until  
8:30 a.m. (EDT) Tuesday, October 22, 2013

USDL-13-2035

### Technical information:

Household data: (202) 691-6378 • cpsinfo@bls.gov • www.bls.gov/cps

Establishment data: (202) 691-6555 • cesinfo@bls.gov • www.bls.gov/ces

Media contact: (202) 691-5902 • PressOffice@bls.gov

### THE EMPLOYMENT SITUATION — SEPTEMBER 2013

#### Federal Government Shutdown

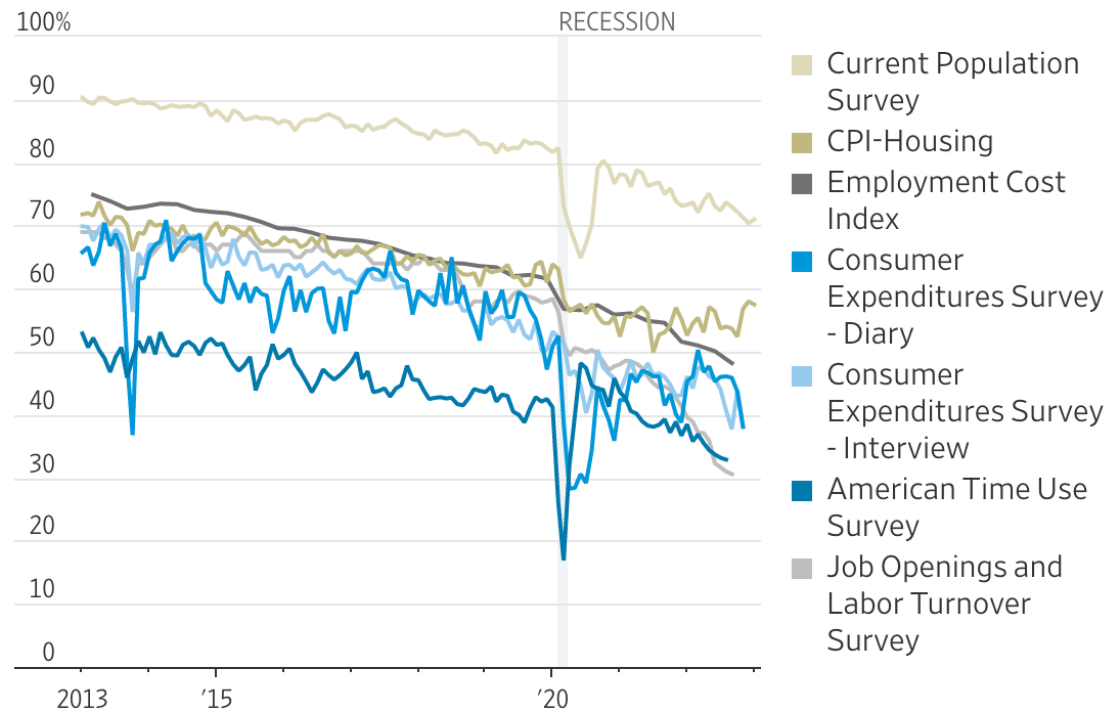
The release of these data occurs about 2 weeks later than originally scheduled because of the recent partial Federal government shutdown. Data collection for the estimates in this release had been completed prior to the shutdown in accordance with our normal schedule. However, the processing of some estimates and the production of the Employment Situation news release were delayed due to the shutdown.

This is a real issue!

The 16-day federal government shutdown that began on October 1, 2013 delayed the release of the September employment report and [affected collection](#) for October

# The producers of traditional data have hurdles in front of them

## *Falling survey response rates*



Screenshot from [Wall Street Journal](#)

## *The need to protect the privacy of government survey respondents*

Tweetorial: formal privacy for social scientists. If you collect, publish or analyze data, understand the revolution happening in safe data publication. Stat agencies, @Google, @Apple, @Microsoft, @Facebook, @LinkedIn are all struggling with the same problem.

#dataprivacy

2. What is formal privacy? Mathematical definitions and theorems that translate concepts from cryptography into algorithms that provably bound the worst-case information leakage due to the publication of a collection of statistics using confidential data.

#differentialprivacy

3. What is information leakage? Think of the confidential data as an encryption. Published statistics are clues to the encryption (deliberately, they describe properties of the data). The more statistics published, the closer one gets to full knowledge of the confidential data.

4. This is called #databasereconstruction. Original paper: Dinur and Nissim 2003

<http://www.cse.psu.edu/~ads22/privacy598/papers/dn03.pdf>.

5. Easier read: @xchatty Garfinkel et al. 2018. (<https://queue.acm.org/detail.cfm?id=3295691>).

6. There is an unavoidable tension between publishing statistics and protecting confidentiality.

Crypto lesson 1: publishing too many statistics, too accurately, leaks all the confidential data with near certainty. (<https://arxiv.org/abs/1701.00752>)

7. What's the harm? Data are collected to be analyzed. #databasereconstruction rebuilds a record-level image of the confidential data outside the data curator's firewall. Can individual records be re-identified from this image? Does the re-identification harm those individuals?

Start of [a 46-part "tweetorial"](#) from John Abowd, Chief Scientist at the Census Bureau

The traditional data toolkit for economic policymakers

**Important new additions to the economic data toolkit**

Challenges associated with the new tools

Constructive next steps

# Recent years have seen important new additions to the economic policy data tool kit

Policymaking has been enhanced by a wave of innovation in several categories:

**New “trackers” based on administrative records** (and, in some cases, the underlying micro data)

**“Mash-ups”** of existing (and sometimes newly available) data

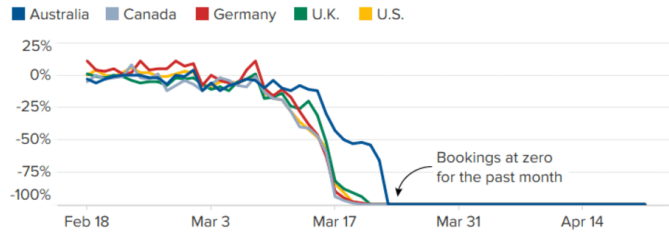
**New data collections**

Facilitated by advances in private-sector practices, technology, and (relatedly) the capacity and willingness to disseminate data

# A wide range of new economic activity trackers based on administrative records have been developed

## Restaurant bookings steady at zero

Year-over-year change in seated diners at restaurants on the OpenTable network. Includes select countries provided by OpenTable.

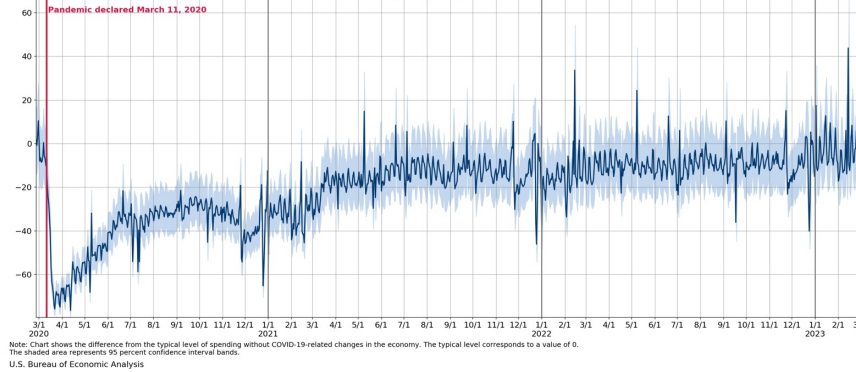


SOURCE: OpenTable. For year-over-year comparisons by day, OpenTable compares to the same day of the week from the same week in the previous year.

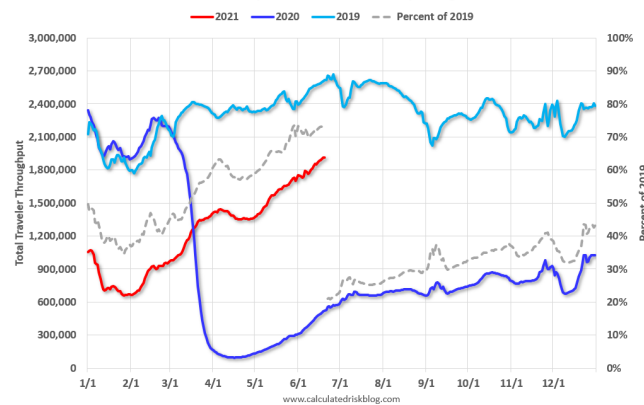


## Spending on Food Services and Drinking Places

An Event Study Based on Payment Card Transactions



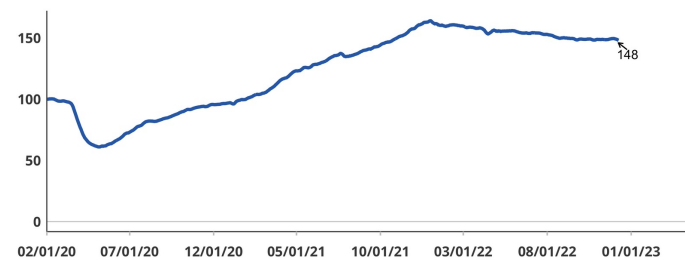
## TSA Checkpoint Travel Numbers, 7 Day Average



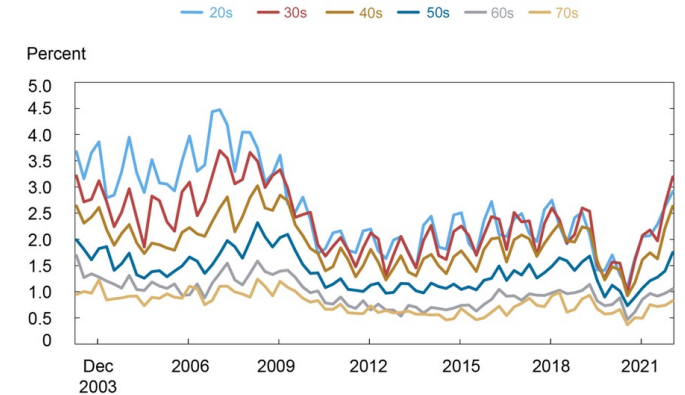
www.calculatedriskblog.com

## US job postings down 7.7% year-over-year

Indeed Job Postings Index, Feb 01 2020 = 100, seasonally adjusted, to Dec 09 2022



## Share of credit card borrowers transitioning to 90 days past due by age group

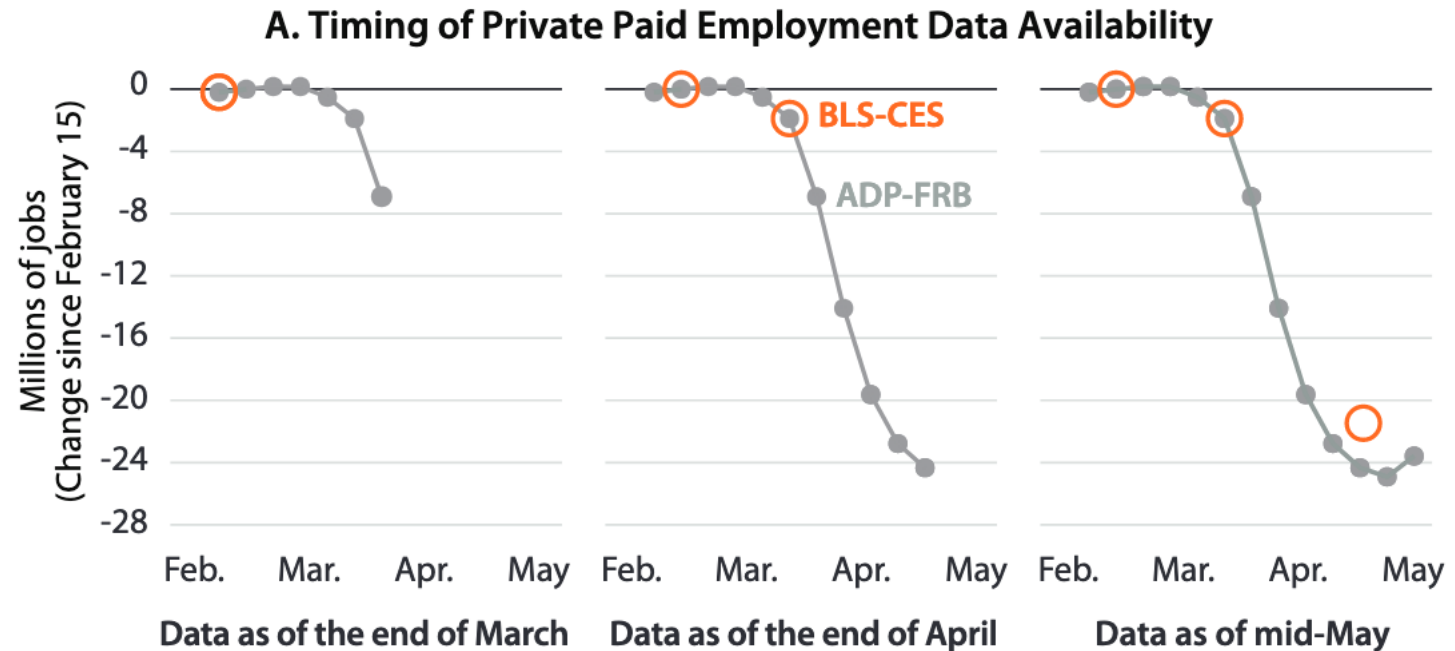


Source: New York Fed Consumer Credit Panel / Equifax.

# New trackers shed light on the 2020 economic collapse well ahead of traditional indicators

Many trackers are released weeks before traditional data and are available at a higher frequency

*Using traditional data, policymakers would not have seen the degree of job loss in 2020 until mid May (the plunge in GDP would not be seen in government data until July)*



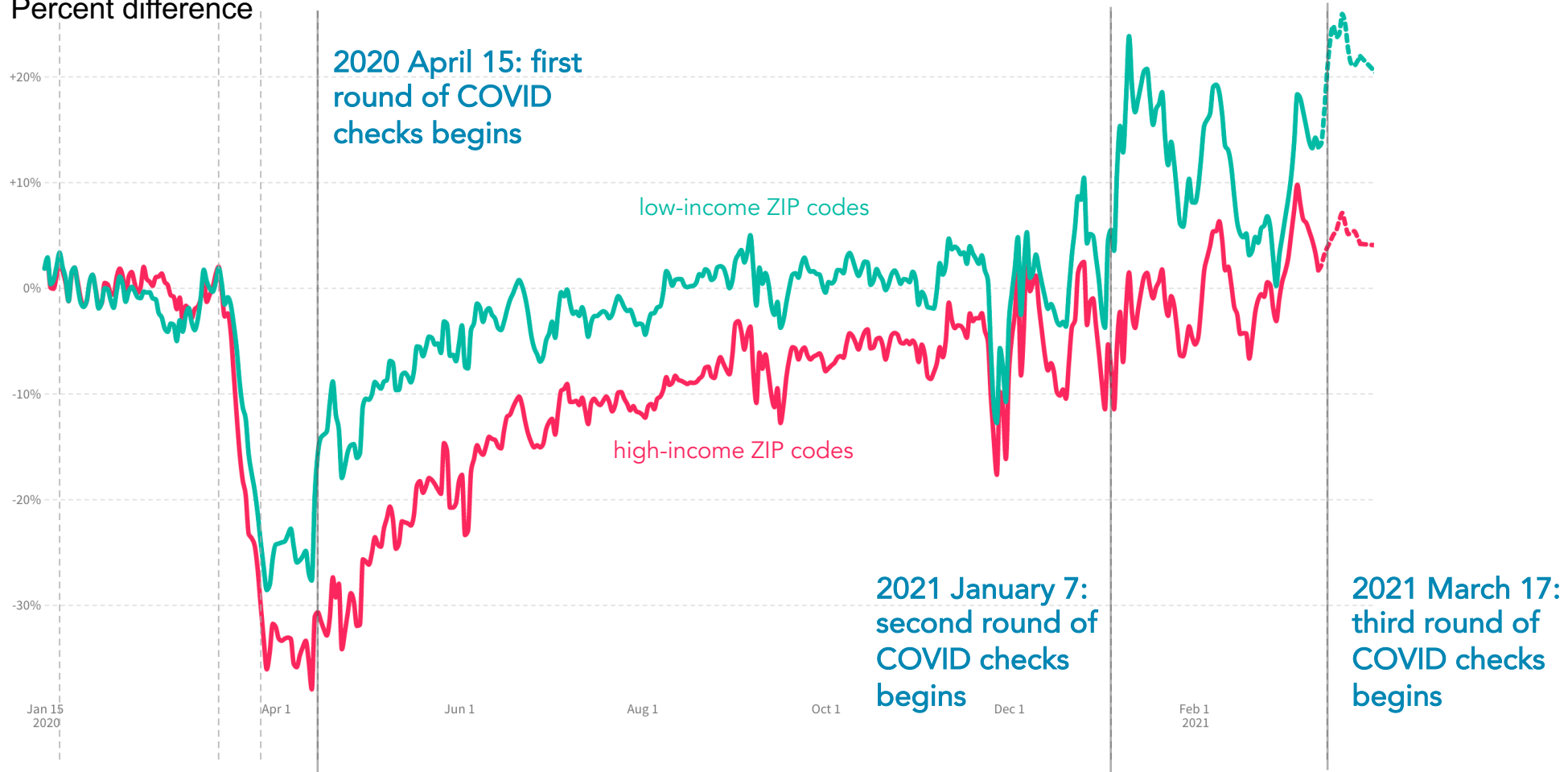
Screenshot from [Cajner et al \(2022\)](#)



# Many new trackers are more granular => visibility into the different experiences of different groups

## Consumer Spending Relative to January 2020

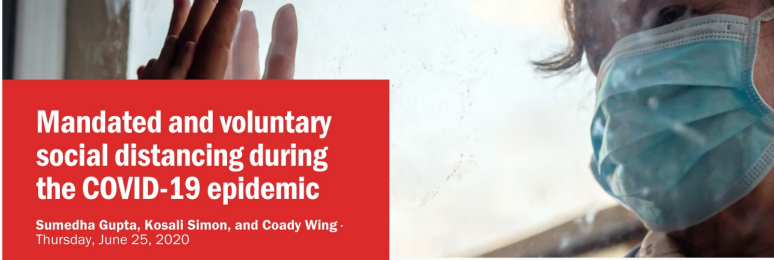
Percent difference



Data from  
tracktherecovery.org;  
based on credit and  
debt card data

# The underlying administrative records allowed for quick analysis of the policies deployed

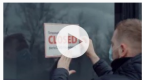
On June 25, 2020, the Brookings Papers on Economic Activity held [a special conference](#) featuring 8 new academic papers evaluating the COVID shock and policies to mitigate the economic damage



**Mandated and voluntary social distancing during the COVID-19 epidemic**  
Sumedha Gupta, Kosali Simon, and Coady Wing · Thursday, June 25, 2020



**COVID-19 is also a reallocation shock**  
Jose Maria Barrero, Nicholas Bloom, and Steven J. Davis · Thursday, June 25, 2020



**COVID-19 and labor markets**  
Alexander W. Bartik, Marianne Bertrand, Feng Lin, Jesse Rothstein, Matthew Unrath, Tomaz Cajner, Leland D. Crane, Ryan A. Decker, John Grigsby, Adrian Hamins-Puertolas, Erik Hurst, Christopher J. Kurz, and Ahu Yildirmaz · Thursday, June 25, 2020



**Corporate debt overhang and credit policy**  
Markus Brunnermeier and Arvind Krishnamurthy · Thursday, June 25, 2020



**Safety net programs and poverty during the COVID-19 crisis**  
Jeehoon Han, Bruce D. Meyer, James X. Sullivan, Marianne Bitler, Hilary W. Hoynes, and Diane Whitmore Schanzenbach · Thursday, June 25, 2020



## Policies for a second wave

David Baqaee, Emmanuel Farhi, Michael J. Mina, and James Stock · Thursday, June 25, 2020



## The effects of the coronavirus pandemic in emerging market and developing economies

Pinelopi K. Goldberg and Tristan Reed · Thursday, June 25, 2020



## Initial impacts of the pandemic on consumer behavior

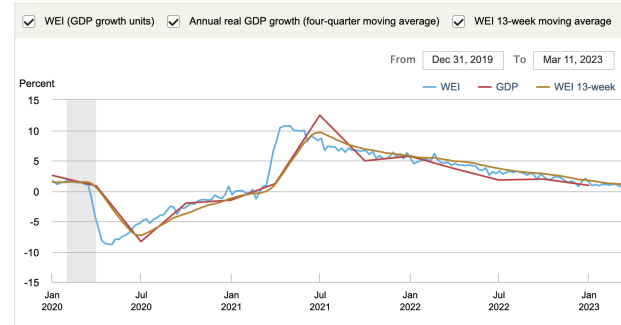
Natalie Cox, Peter Ganong, Pascal Noel, Joseph Vavra, Arlene Wong, Diana Farrell, Fiona Greig, and Erica Deadman · Thursday, June 25, 2020

# Statistical advances have led to “mash-ups” that have yielded additional insight into developments

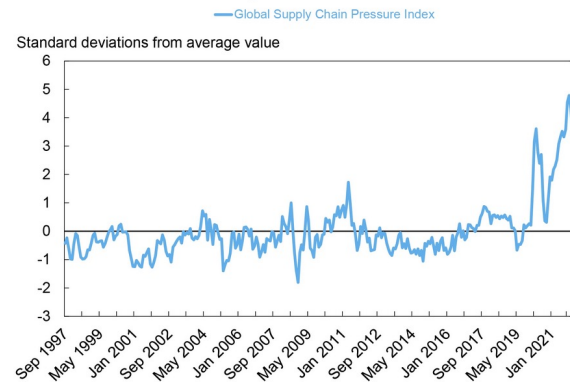
The Weekly Economic Index (WEI) is an index of ten daily and weekly indicators of real economic activity, scaled to align with the four-quarter GDP growth rate.

## Weekly Economic Index (WEI)

Latest Release 11:30 a.m. March 16, 2023



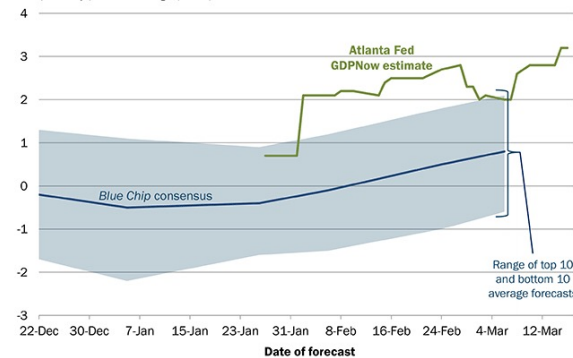
## While Global Supply Chain Pressures Are Decreasing, Pressure Still Remains High



Sources: Bureau of Labor Statistics; Harper Petersen Holding GmbH; Baltic Exchange; IHS Markit; Institute for Supply Management; Haver Analytics; Bloomberg L.P.; authors' calculations.

Note: Each index is scaled by its standard deviation.

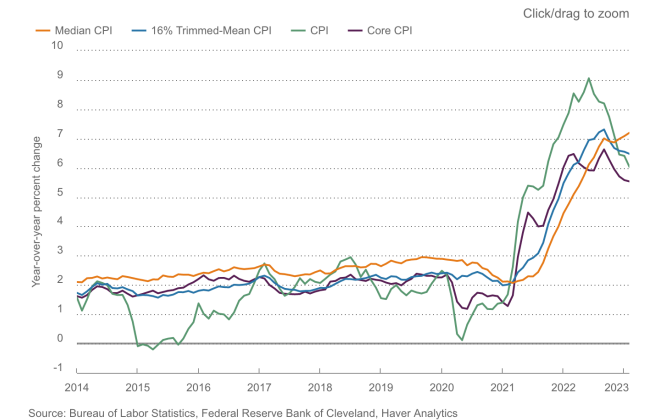
## Evolution of Atlanta Fed GDPNow real GDP estimate for 2023: Q1



Sources: Blue Chip Economic Indicators and Blue Chip Financial Forecasts

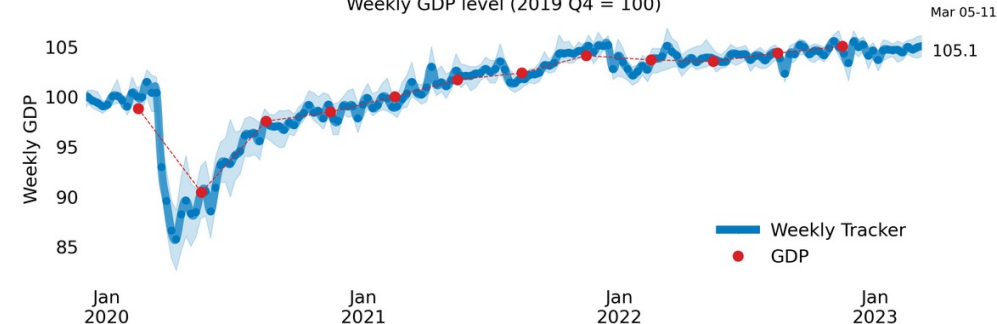
Note: The top (bottom) 10 average forecast is an average of the highest (lowest) 10 forecasts in the Blue Chip survey.

## Median Consumer Price Index



## OECD Weekly Tracker: United States

Weekly GDP level (2019 Q4 = 100)

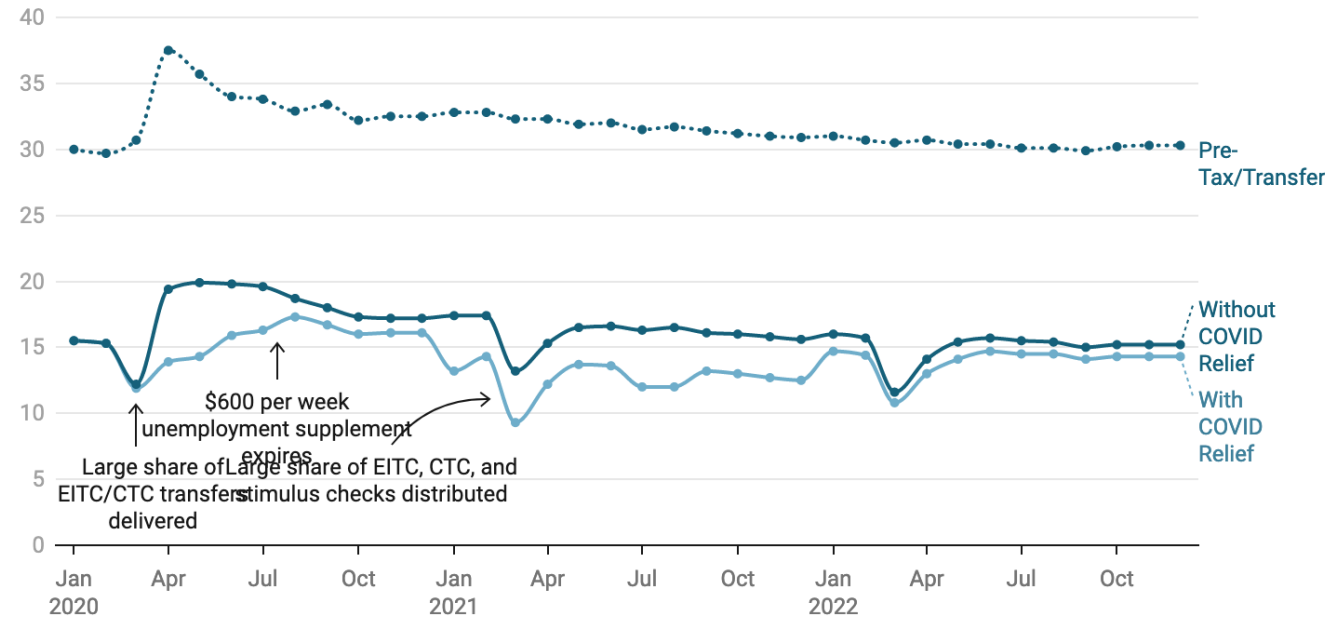


Note: The Weekly Tracker provides an estimate of weekly GDP based on Google Trends search data and machine learning.

Source: OECD Weekly Tracker (Woloszko, 2020), <https://www.oecd.org/economy/weekly-tracker-of-gdp-growth/>; OECD Quarterly National Accounts.

**For example, we now have a timely understanding of how macro conditions and policy are affecting hardship because of real-time estimates of poverty**

**Monthly Poverty Rates, U.S.**

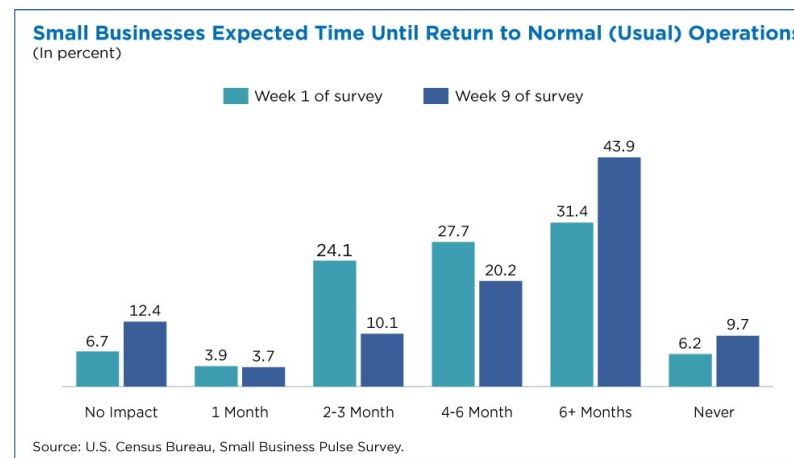
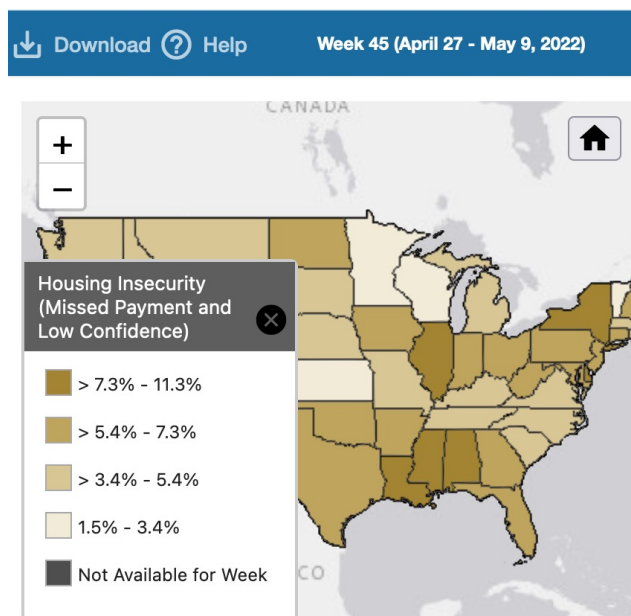


Based on methodology introduced in Parolin, Curran, Matsudaira, Waldfogel, and Wimer (2020).

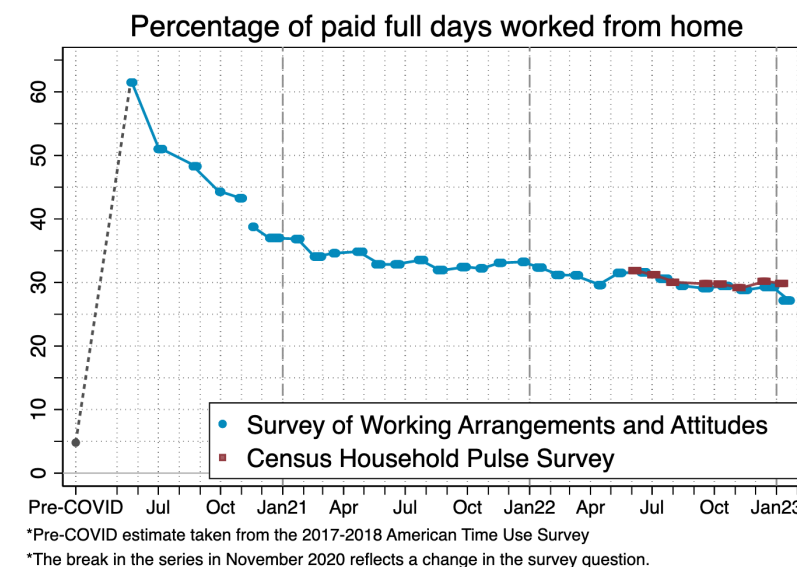
Source: Estimates from Center on Poverty & Social Policy at Columbia University • [Get the data](#) • Created with [Datawrapper](#)

Screenshot from [Columbia University Center on Poverty](#)

# New data collections have been similarly valuable



Census [Small Business Pulse](#)



[WFH Research](#)

# The New York Fed's Survey of Consumer Expectations is yielding important insights about the risk of an inflationary spiral

## Inflation expectations

Median one-, three-, and five-year ahead expected inflation rate



Screenshot from [New York Fed](#)

The traditional data toolkit for economic policymakers

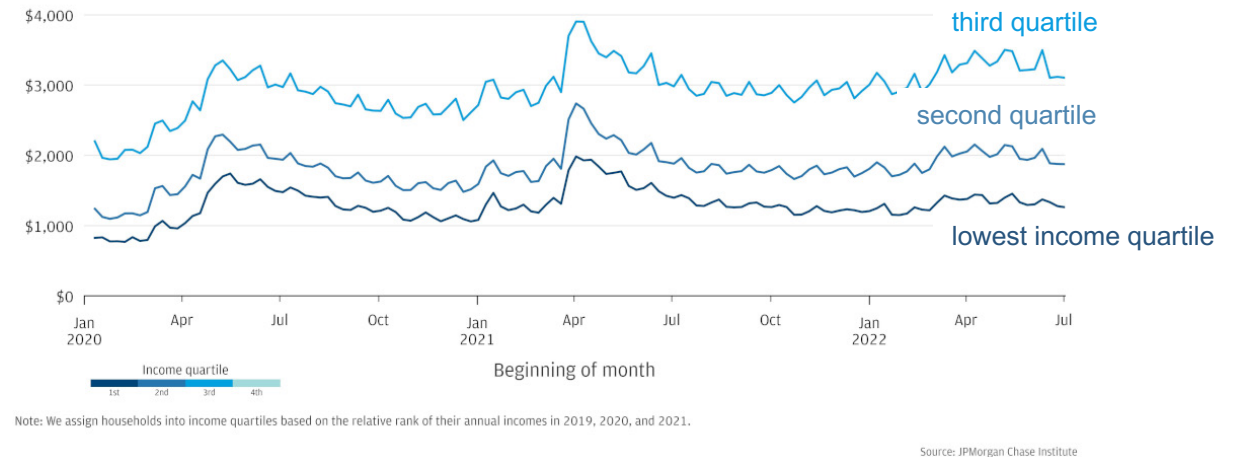
Important new additions to the economic data toolkit

**Challenges associated with the new tools**

Constructive next steps

# Administrative sources are typically not designed to be representative

*Data from [the JPMorgan Chase Institute](#), show that median checking account balances were well above pre-COVID levels through mid-2022, even for the lowest income quartile (in this dataset)*



To properly interpret, one needs to recognize that the lower-income customers of a large mainstream bank **are not the poorest Americans**

(According to [the FDIC](#), about 5% of American households do not even have a bank account)



# Administrative sources are typically not designed to capture economic concepts

Users of credit card records sometimes refer to new charges as “consumption”

But:

People don’t typically buy cars or pay rent with credit cards

Card charges may capture cash taken out; and the transfer of balances across accounts

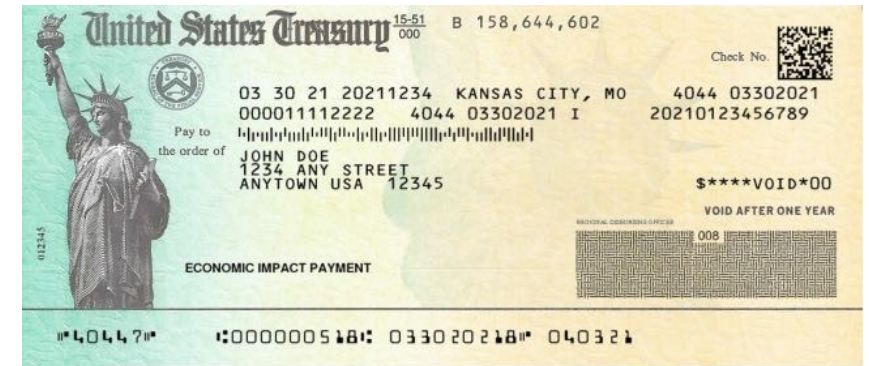
Health care consumption goes well beyond the out-of-pocket costs one might put on a card

<b>Personal consumption expenditures</b>	<b>17,360.4</b>
<b>Goods</b>	<b>5,939.6</b>
Durable goods	2,184.7
Motor vehicles and parts	723.0
Furnishings and durable household equipment	525.5
Recreational goods and vehicles	645.2
Other durable goods	291.0
Nondurable goods	3,754.9
Food and beverages purchased for off-premises consumption	1,277.4
Clothing and footwear	491.2
Gasoline and other energy goods	492.8
Other nondurable goods	1,493.6
<b>Services</b>	<b>11,420.8</b>
Household consumption expenditures (for services)	10,890.4
Housing and utilities	2,995.9
Health care	2,724.7
Transportation services	548.5
Recreation services	614.9
Food services and accommodations	1,253.3
Financial services and insurance	1,318.8
Other services	1,434.4

*Components of personal consumption expenditures from [the last GDP release](#)*

# Representative issues and other issues lead to different studies yielding very different results

New data sources allowed for a burst of research exploring the effects of the Economic Impact Payments (“COVID checks”) on consumer spending—[Gelman and Stephens](#) (2022) cite **10 important academic studies**



**But the findings vary widely**—from 75% of households saying they will use the EIPs to “mostly pay for expenses” to an estimated consumption response of about 10 cents for every dollar received

It is thus **unclear how informative the literature will be** to policy debates over future use of this type of support  $\_ \backslash ( \text{ツ} ) \_ / -$

# Other issues

Administrative data sets **may not be designed for longitudinal consistency**

For privately produced indicators, **the methodology used is often not transparent**

Some private providers **lack the training/experience** of staff at statistical agencies

Dealing with seasonal pattern and other holiday issues, breaks in the sample, other types of data irregularities (e.g., a blip related to the move of Amazon Prime day) is complicated business!

Expense/legal restrictions/reputational risk means **unequal access** to (sometimes) indicators based on proprietary data and often the micro data

“the ADP-FRB data have done a terrific job of tracking the employment gains seen in the BLS employment report,”

“the ADP-FRB data are available on an ongoing basis *only to policymakers in the Federal Reserve System*”

[Cajner et al](#) (2021)

# More generally ...

The **new abundance of indicators** based on different underlying populations, concepts, and methodologies raises the risk of **more confusion**

It also raises the risk of **more selective highlighting** of just the results that support the policy changes desired based on one's priors or self interest

**Cherry picking, suppressing evidence**, or the **fallacy of incomplete evidence** is the act of pointing to individual cases or data that seem to confirm a particular position while ignoring a significant portion of related and similar cases or data that may **contradict** that position. Cherry picking may be committed intentionally or unintentionally.<sup>[2]</sup>

WIKIPEDIA  
The Free Encyclopedia



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**Constructive next steps**

# A constructive next step for everyone

Increase the attention given to **interpretation, reconciliation, and accurate portrayal of new economic indicators and data sources** relative to that given to simply producing and casually disseminating them



# Constructive next step for private actors

Private data producers can:

- Offer **more transparency** about what methods they are using

- Offer more **guidance about the limitations** of their measures

Those funding the production of new data and indicators (e.g., foundations supporting academic efforts) can:

- Ask producers to **adopt the high standards used by government statistical agencies** around transparency, methodologies, and other practices

- Ask producers to **release more data**

# Constructive next steps for public actors (1)

Congress can pass **legislation ensuring that the statistical agencies have adequate funding** to maintain the quality of their existing statistics and innovate using new sources of data:

More data production will require more staff

Addressing falling response rates and privacy issues will require resources

Proprietary administrative records can be very expensive

Other types of changes to the law would also be constructive—for example, passing [a “data sync” proposal](#) would enhance statistics by increasing the access of some agencies to tax data



# Constructive next steps for public actors (2)

Statistical agencies considering changes that would restrict access (for example, to protect privacy) can **foster a constructive dialogue with users** about the costs and benefits of different approaches

Regulatory agencies and other policymakers that have developed useful internal indicators to inform policymaking should **consider ongoing releases of the indicators they find important** to the public so as to foster a robust public conversation about policy decisions

For example, the ADP-FRB product mentioned earlier

# Improving the economic data tool kit is a high priority

Going into the 21<sup>st</sup> century, macroeconomic policymakers thought the economy had entered a “Great Moderation” and that financial crises only occurred in poorly run countries

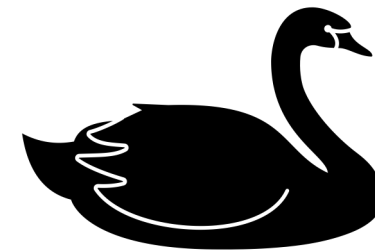
The past two decades have proved them wrong with 3 “[Black Swan](#)” crises:



*The 2007-2009 financial crisis and Great Recession*



*The 2020 COVID and its economic fallout*



*The 2021 resurgence of inflation*

Good economic data is **essential to informing policy that will reduce the odds of future crises** and **mitigate the damage** when they occur

**Thank you!**