

Seasonal Adjustment Post-Pandemic

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U.S. Census Bureau seasonal adjustment, usual practice

- Program areas have reviewers who set the seasonal adjustment options once a year
- Most program areas review settings once a year and use those settings for the next year
 - “Concurrent” seasonal adjustment
 - Only changes allowed are new outliers

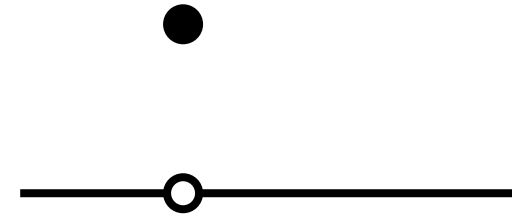
Scenes from a grocery store, March 2020



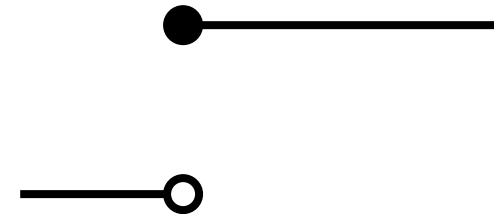
- Photos are courtesy of Suzanne Dorinski, U.S. Census Bureau

Primary outlier types

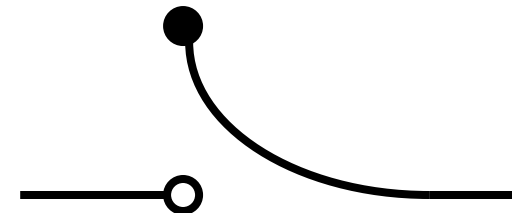
Additive Outlier (AO)



Level Shift (LS)



Temporary Change (TC)



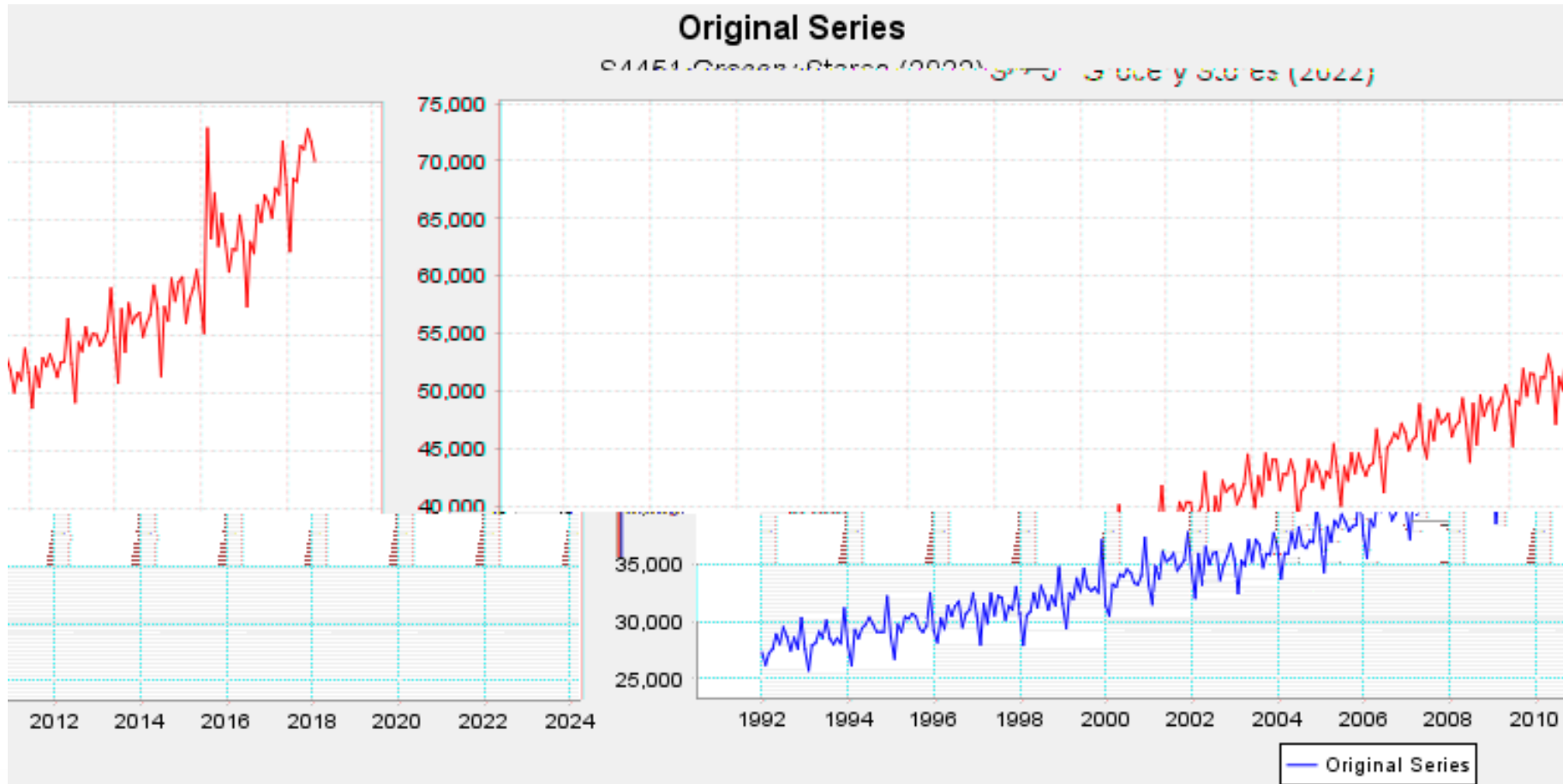
U.S. Census Bureau surveys

- Time series in this presentation are estimates from surveys and are subject to sampling and nonsampling error
- Information about the data collection and estimation is online at:
 - Quarterly Services Survey (QSS)
[census.gov/services/qss/how_the_data_are_collected.html](https://www.census.gov/services/qss/how_the_data_are_collected.html)
 - Monthly Retail Trade and Food Services (MRTS)
[census.gov/retail/how_surveys_are_collected.html](https://www.census.gov/retail/how_surveys_are_collected.html)
 - Monthly Wholesale Trade Survey (MWTS)
[census.gov/wholesale/www/how_surveys_are_collected/monthly_methodology.html](https://www.census.gov/wholesale/www/how_surveys_are_collected/monthly_methodology.html)
 - Construction Spending [census.gov/construction/c30/meth.html](https://www.census.gov/construction/c30/meth.html)

Brief example from Monthly Retail Trade and Food Services Report, U.S. Census Bureau

- Grocery Store Sales, NAICS 4451
 - Original, not seasonally adjusted time series is published
 - Forecasts are not official projections or estimates

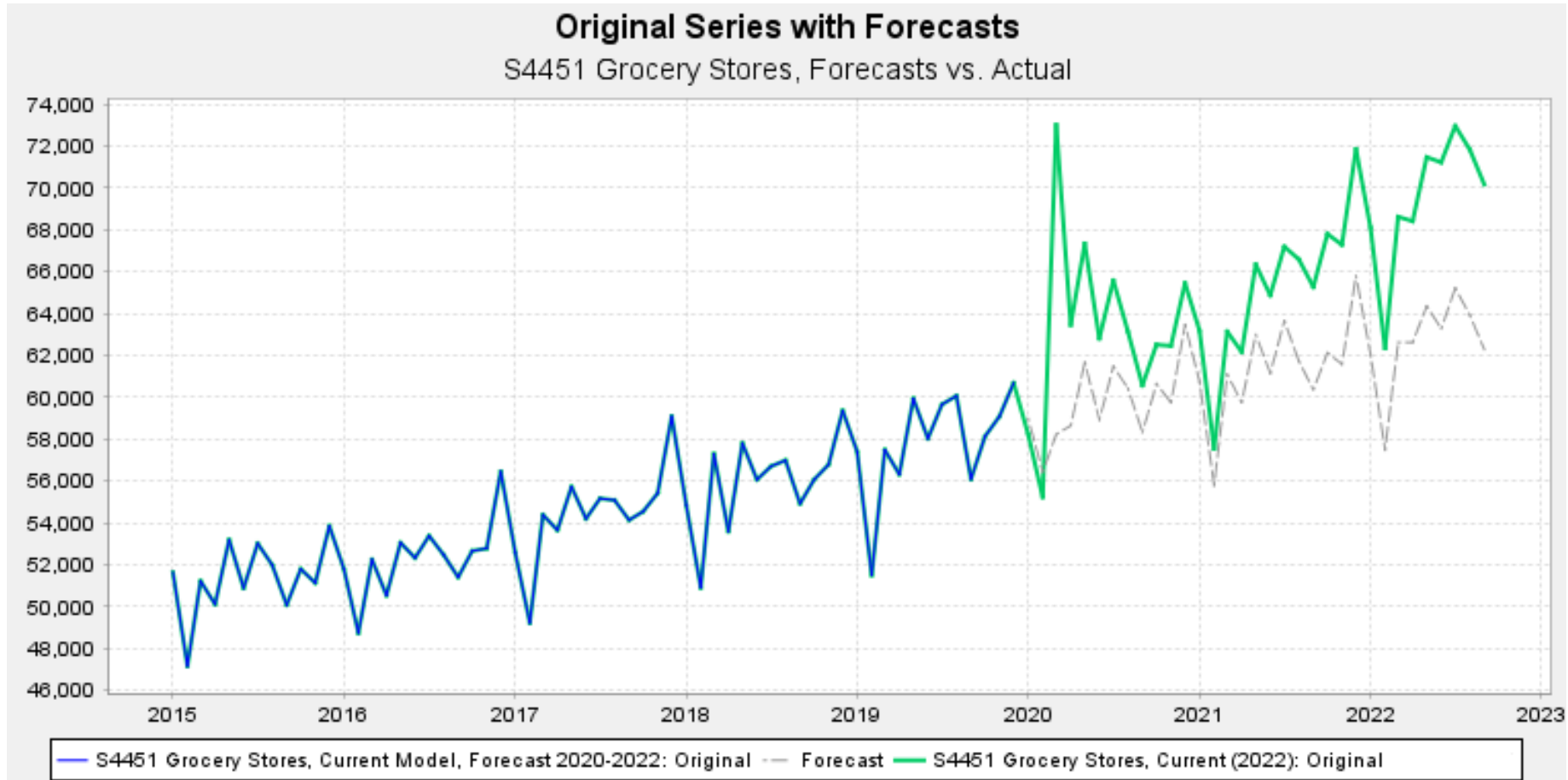
Seasonal adjustment, post-pandemic Grocery stores, very consistent



Source: Original time series from [census.gov/retail](https://www.census.gov/retail)

Seasonal adjustment post-pandemic

Forecasts from 2019 compared to actual estimates



Overview of 2020-2022 seasonal adjustment of major Census Bureau surveys

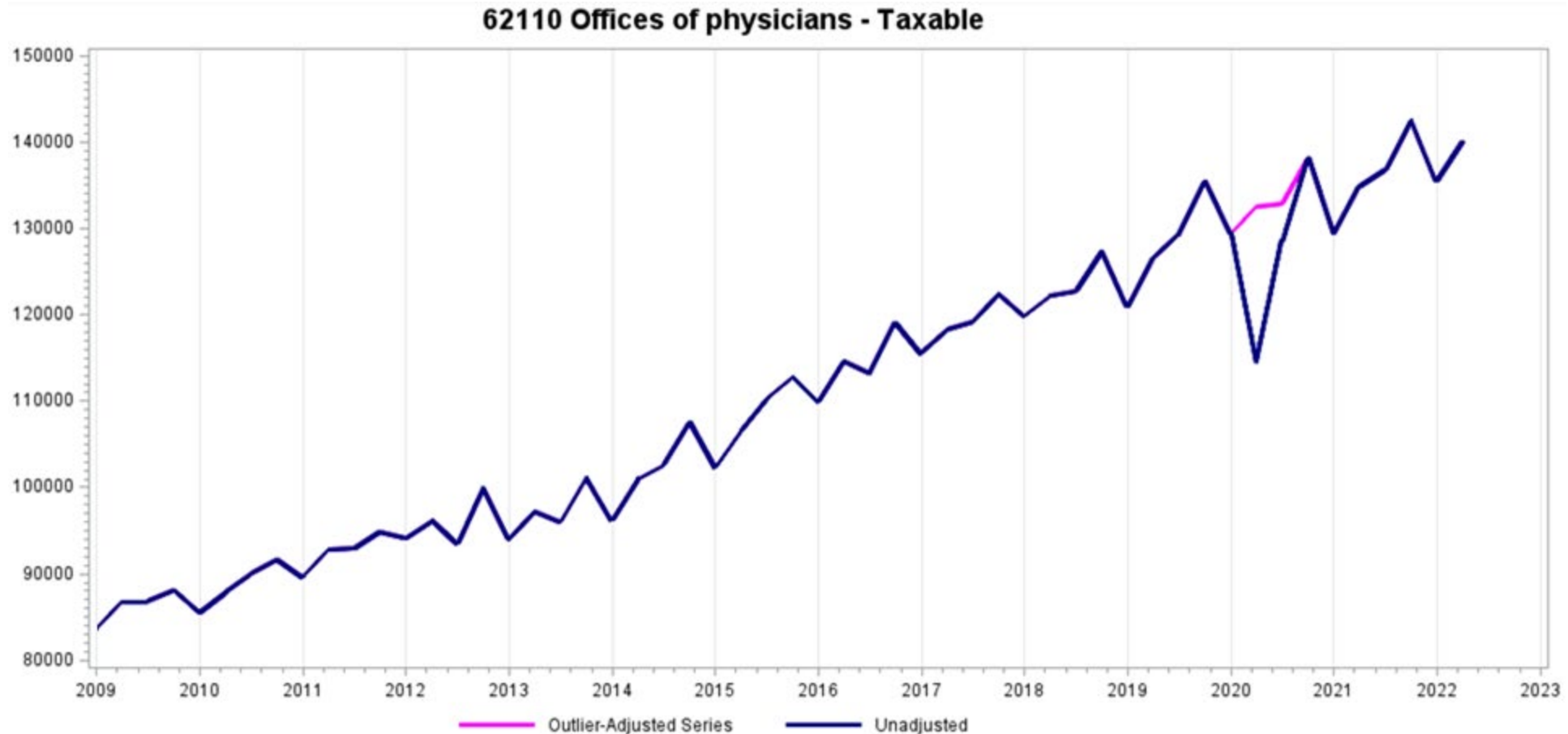
Quarterly Services Survey (QSS)

- 135 seasonally adjusted series
 - 125 with at least one 2020-2022 outlier; 10 with no outliers
 - 30 with outliers covering a 1-2 quarter period
 - 85 with outliers covering 3+ quarters
 - ~15-20 which visually still look unusual
 - Many sectors had a large jump in value in 2021-2022, including education, truck transportation, some information
 - 63 with at least one 2020-2022 outlier with $|t| > 10$

Number of QSS outliers

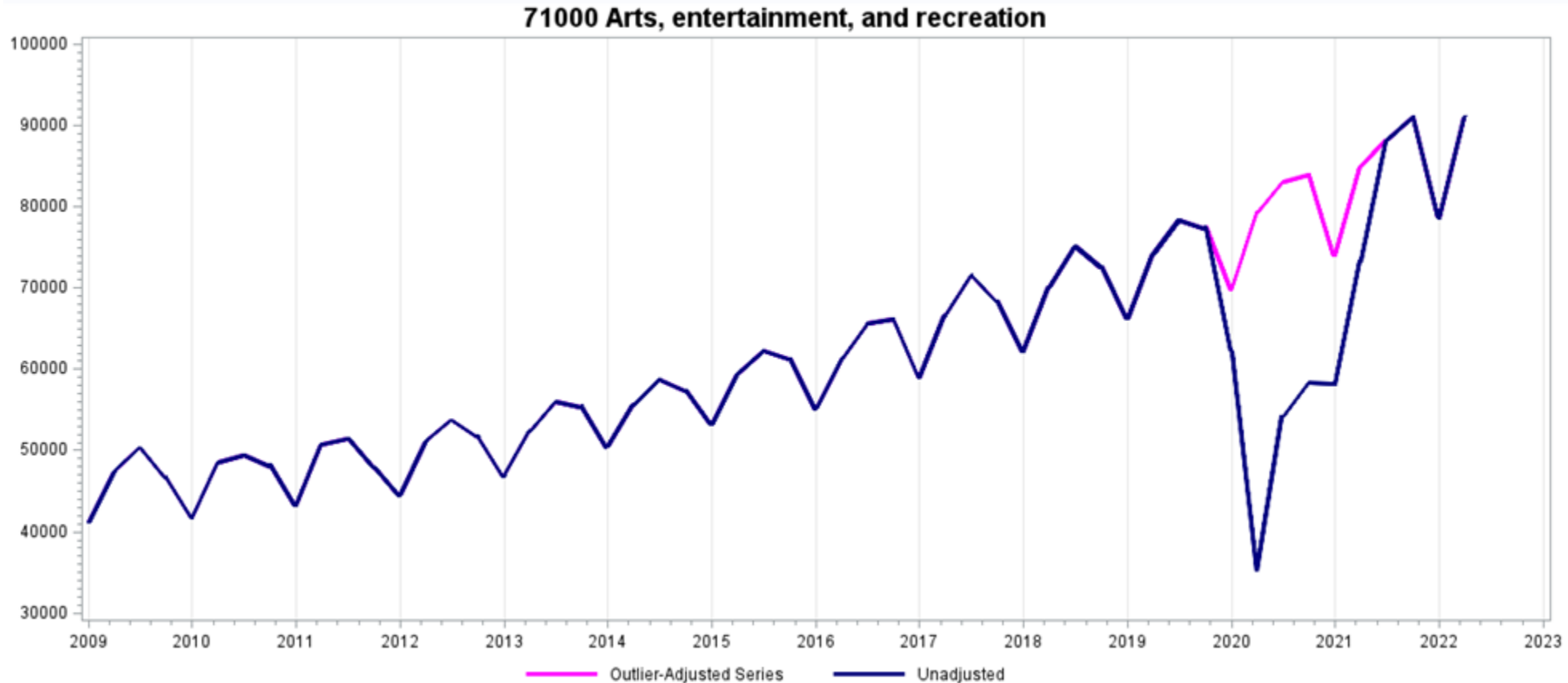
| Quarter | AO | LS | TC |
|---------|-----|----|----|
| 2020.1 | 48 | | |
| 2020.2 | 116 | 2 | 2 |
| 2020.3 | 100 | | |
| 2020.4 | 75 | | |
| 2021.1 | 73 | | |
| 2021.2 | 50 | | |
| 2021.3 | 18 | | |
| 2021.4 | 10 | | |
| 2022.1 | 12 | | |
| 2022.2 | 13 | | |

A QSS series with a short effect



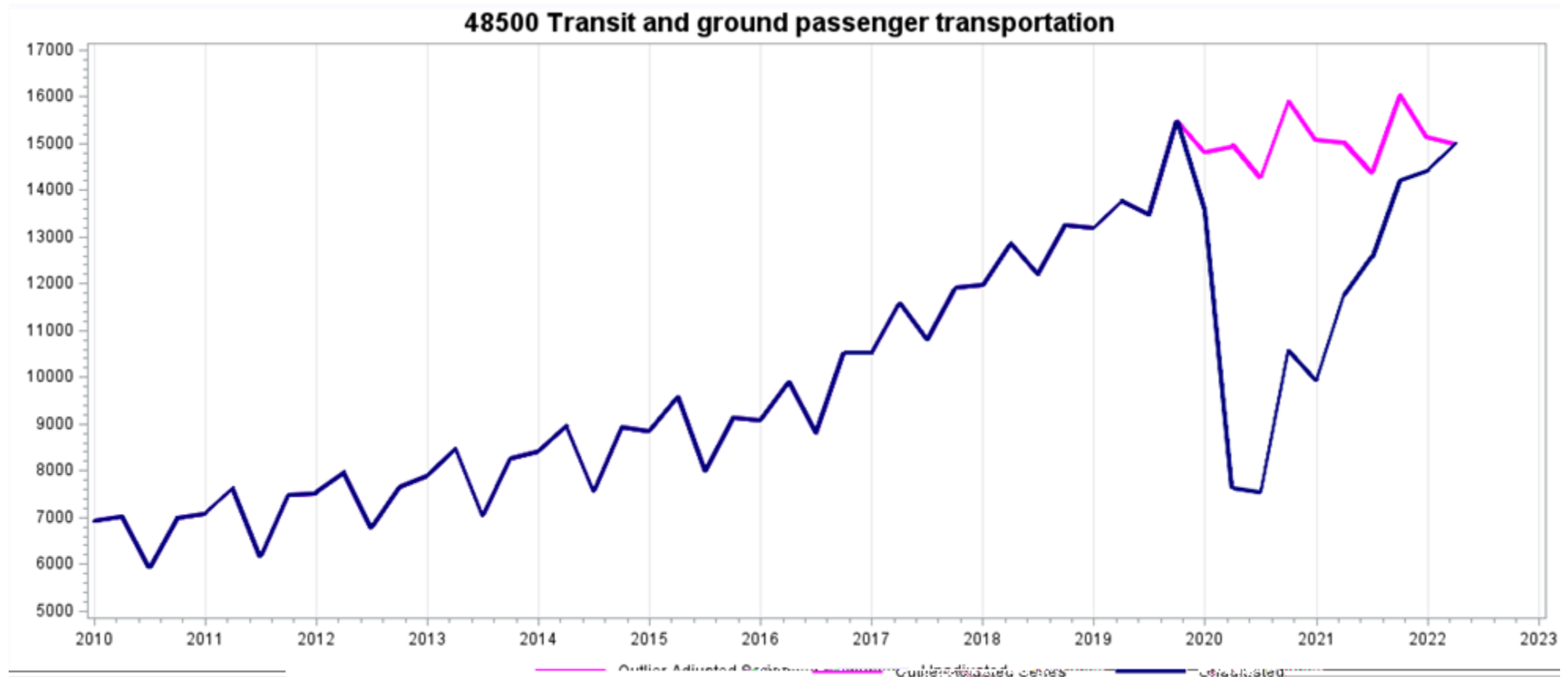
Source: Original time series from [census.gov/services](https://www.census.gov/services), adjusted series generated from modeling

A QSS series with a long effect

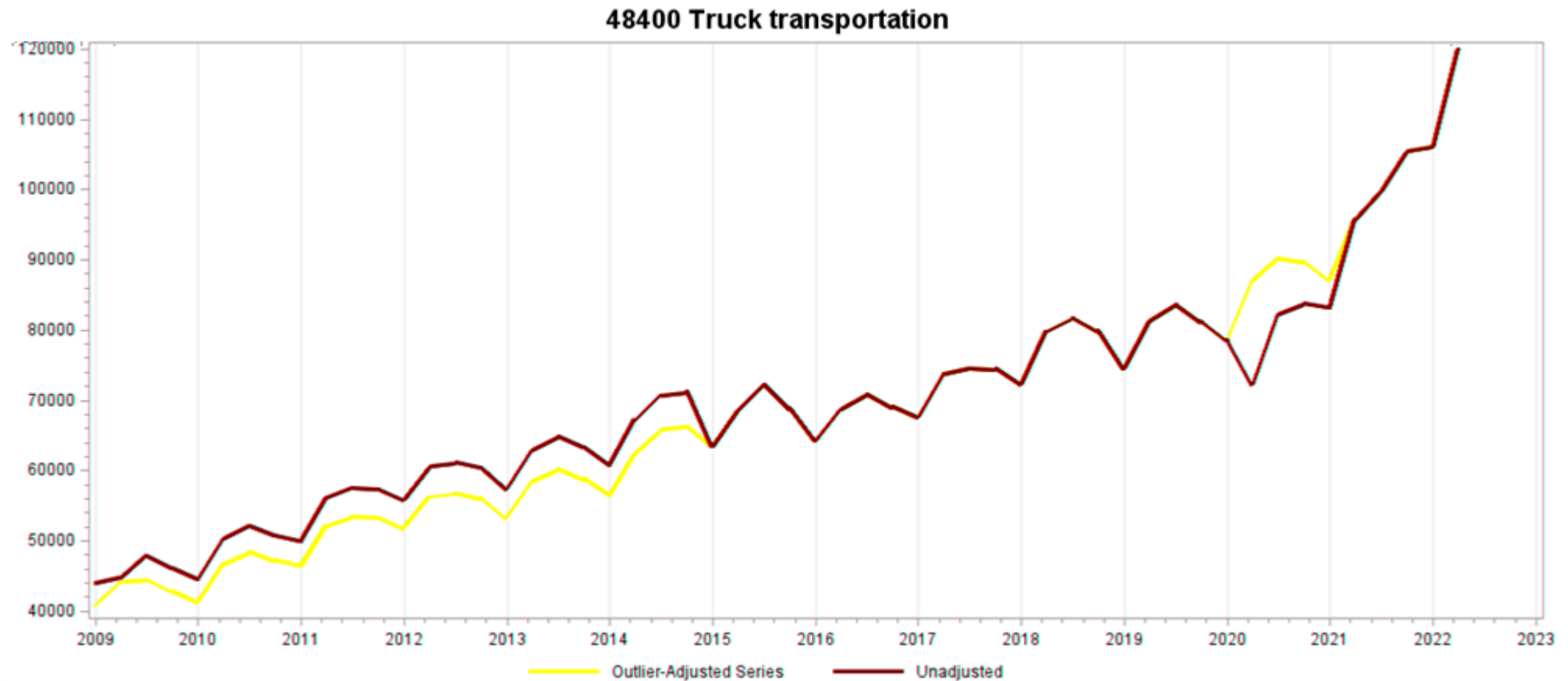


Source: Original time series from census.gov/services, adjusted series generated from modeling

A QSS series with an effect that may still be continuing



A QSS series exhibiting a rapid 2021-2022 value increase



Source: Original time series from [census.gov/services](https://www.census.gov/services), adjusted series generated from modeling

Monthly Retail Trade Survey (MRTS)

- 63 seasonally adjusted series, 17 inventory and 46 sales.
- Inventories: 8 had a longer effect and 9 no or a short 2020 effect. Many are now showing a strong increase in value; 12 are affected by 2022 outliers.
- Sales: Most series (41) had an effect >6 months in 2020. They've largely returned to normal; only 3 have any 2022 outliers.
- 41 series with $|t| > 10$.

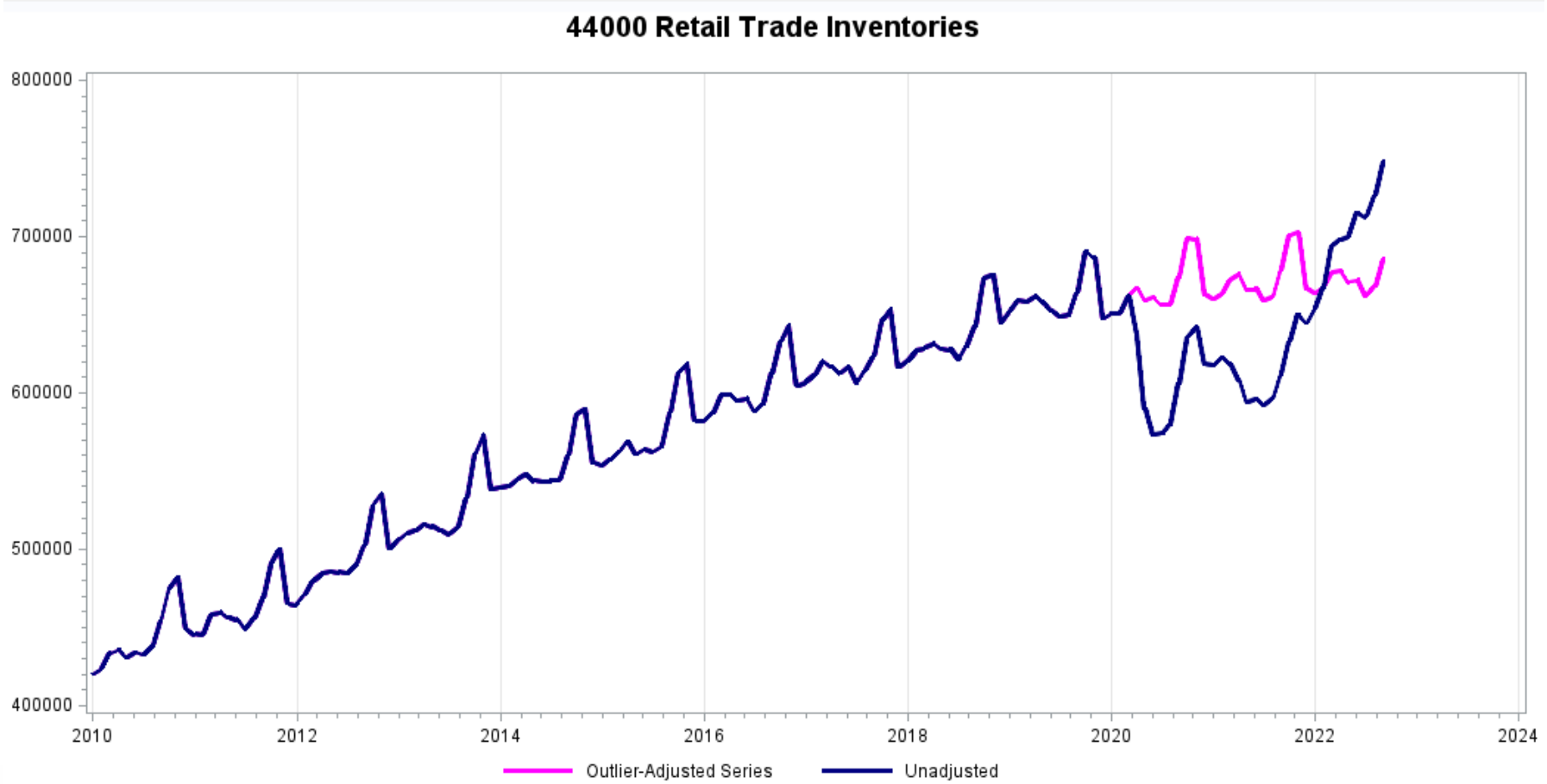
Number of MRTS outliers

| Month | Number AO | | | Number LS | | | Number TC | | |
|--------------|------------|------------|------------|-----------|-----------|----------|-----------|----------|----------|
| | 2020 | 2021 | 2022 | 2020 | 2021 | 2022 | 2020 | 2021 | 2022 |
| Jan | 0 | 26 | 10 | 0 | 0 | 0 | 0 | 0 | 0 |
| Feb | 0 | 16 | 11 | 0 | 0 | 0 | 0 | 0 | 0 |
| Mar | 42 | 22 | 14 | 3 | 13 | 0 | 0 | 0 | 0 |
| Apr | 46 | 19 | 13 | 0 | 0 | 0 | 1 | 0 | 0 |
| May | 41 | 20 | 13 | 3 | 3 | 0 | 0 | 0 | 0 |
| Jun | 31 | 9 | 13 | 2 | 0 | 0 | 2 | 0 | 0 |
| Jul | 26 | 6 | 13 | 1 | 0 | 0 | 0 | 0 | 0 |
| Aug | 21 | 6 | 13 | 2 | 0 | 0 | 0 | 0 | 0 |
| Sep | 21 | 5 | 13 | 0 | 0 | 0 | 0 | 0 | 0 |
| Oct | 17 | 5 | 2 | 1 | 0 | | 0 | 0 | |
| Nov | 16 | 5 | | 0 | 0 | | 0 | 0 | |
| Dec | 18 | 17 | | 0 | 0 | | 0 | 0 | |
| Total | 279 | 156 | 115 | 12 | 16 | 0 | 3 | 0 | 0 |



Additionally, 2 series have ramps, 2020.feb-may

MRTS inventory series with an ongoing effect



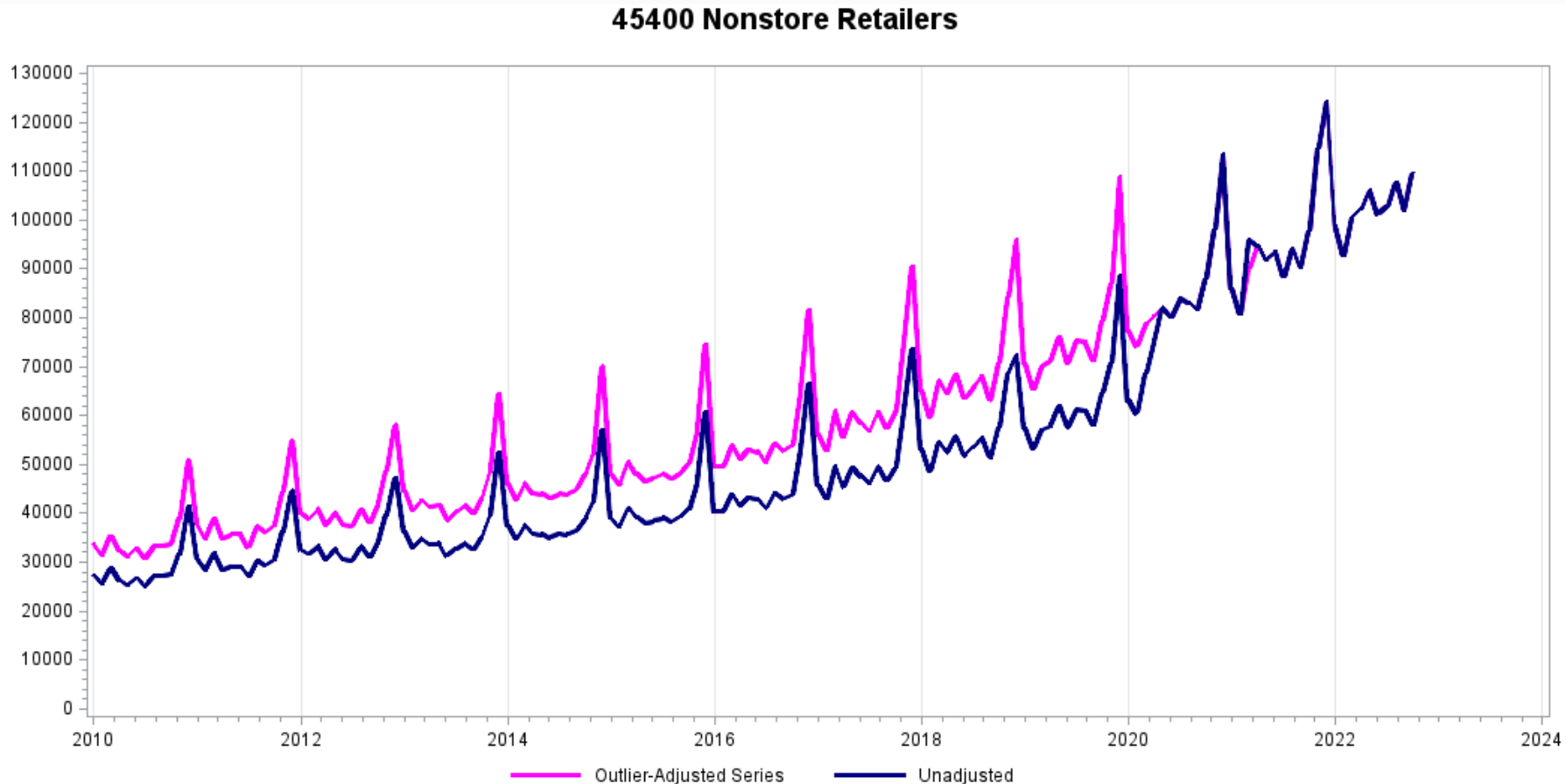
Source: Original time series from [census.gov/retail](https://www.census.gov/retail), adjusted series generated from modeling

MRTS sales series that has returned to normal



Source: Original time series from [census.gov/retail](https://www.census.gov/retail), adjusted series generated from modeling

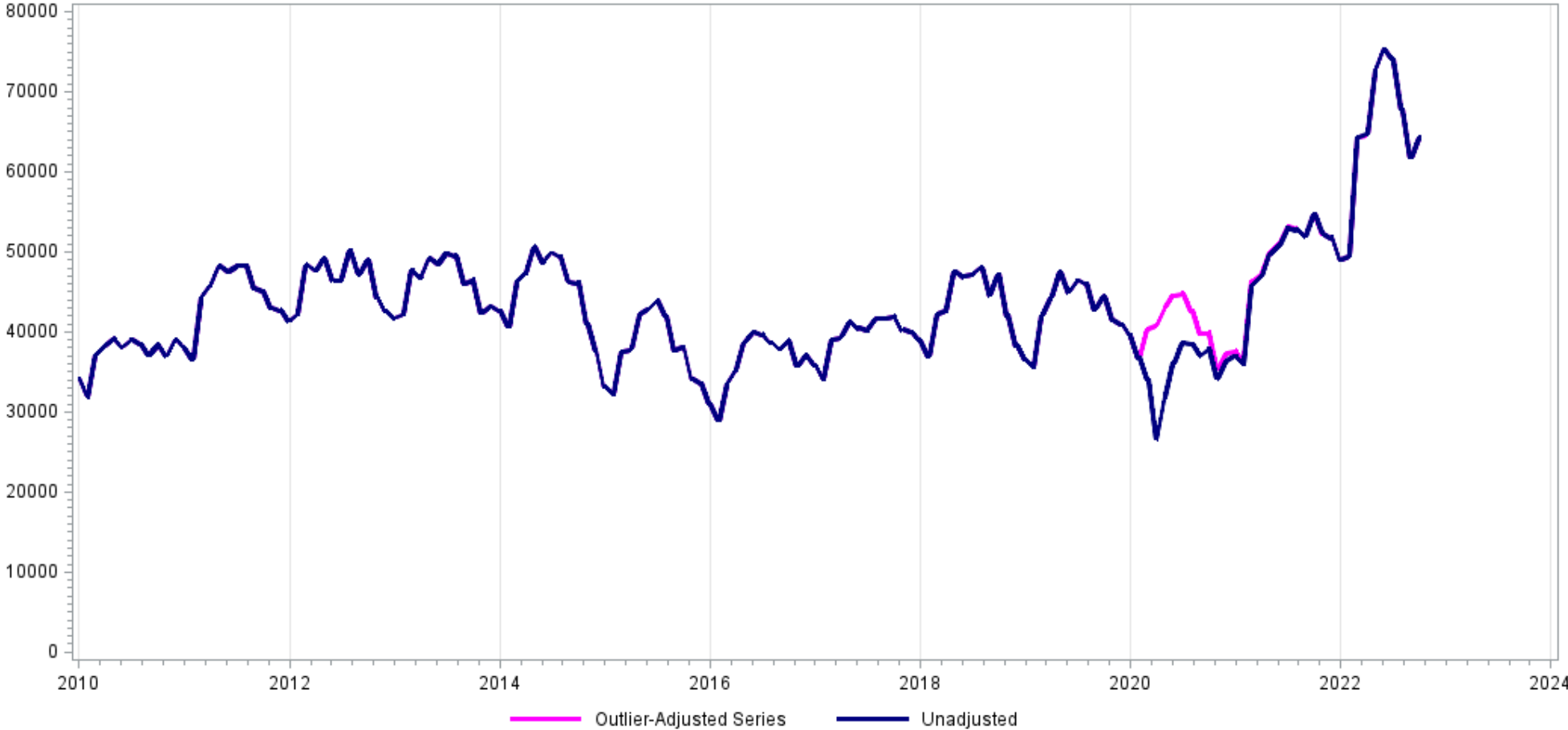
MRTS sales series with an early 2020 level shift



Source: Original time series from [census.gov/retail](https://www.census.gov/retail), adjusted series generated from modeling

MRTS sales series with unusual 2022

44700 Gasoline Stations



Source: Original time series from [census.gov/retail](https://www.census.gov/retail), adjusted series generated from modeling

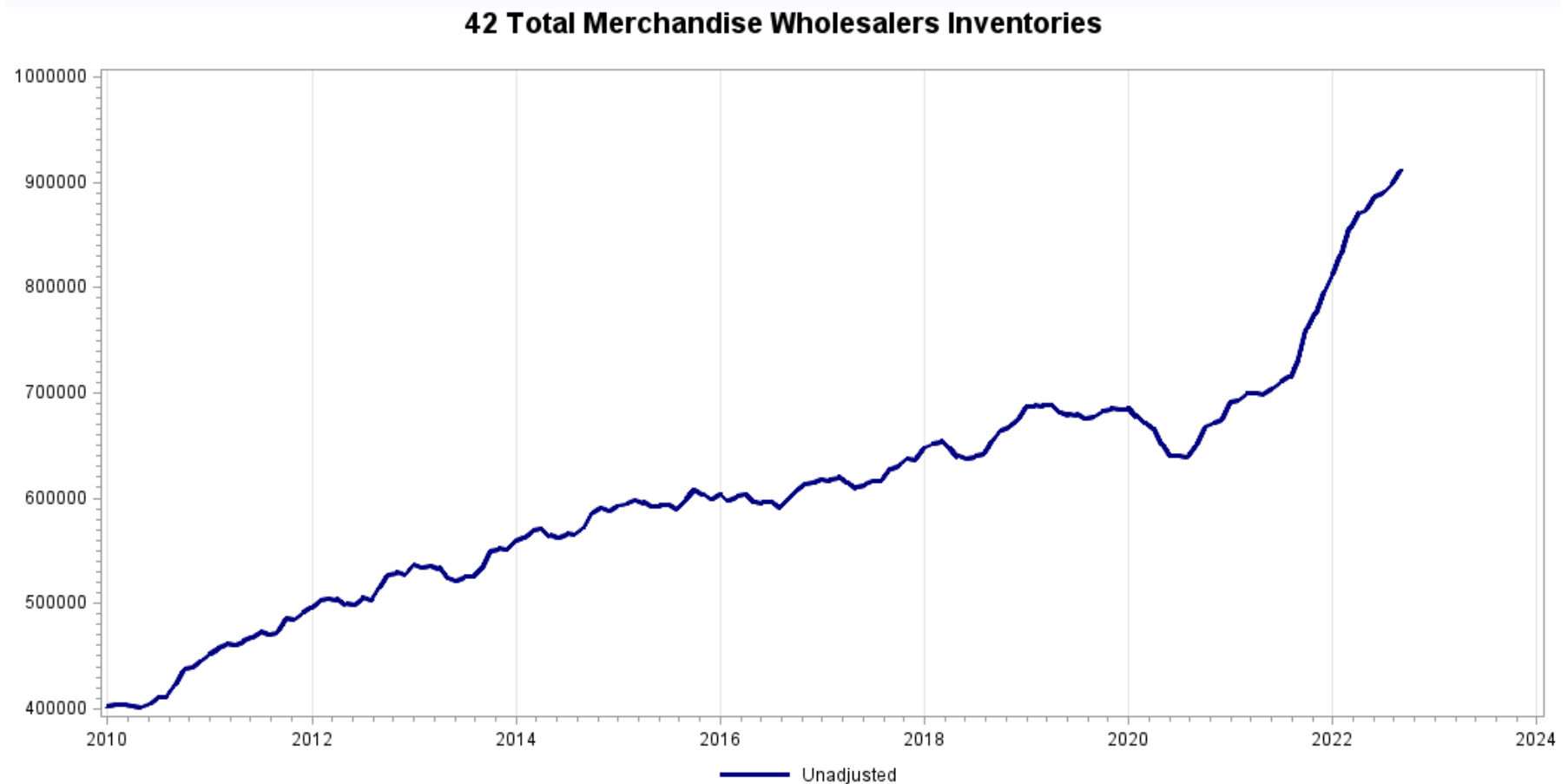
Monthly Wholesale Trade Survey (MWTs)

- 22 sales and 22 inventories series
 - Inventories mostly had no or a short effect in 2020, but almost all series had a rapid increase in value in 2021-2022
 - Most sales series (~15) had an effect less than six months in 2020; 4 had a longer effect. 9 have a visible level change in 2021-2022.
 - 7 series had a $|t| > 10$ – all sales series

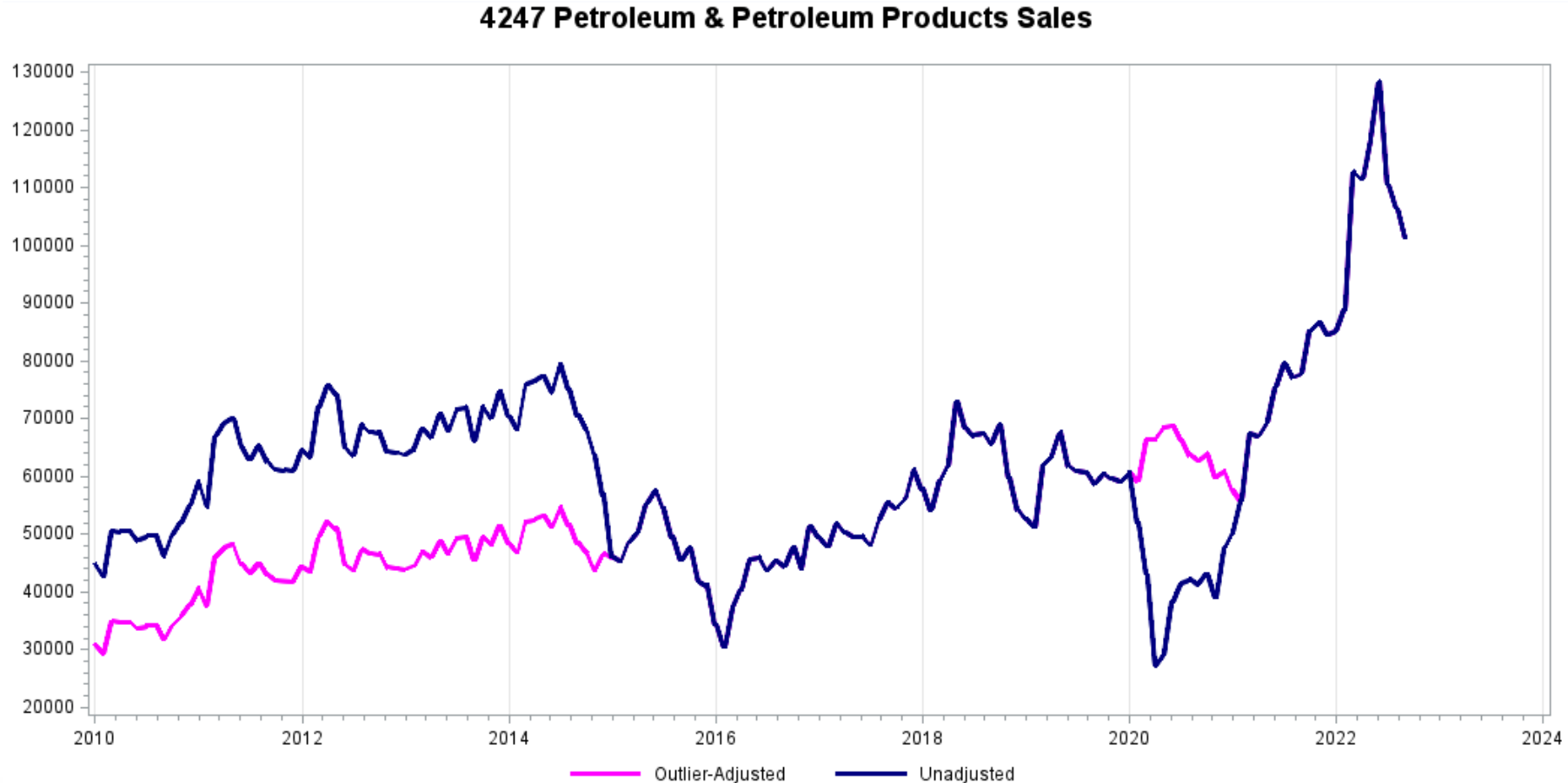
Number of MWTS outliers

| Month | Additive Outliers | | | Level Shifts | | |
|--------------|-------------------|-----------|-----------|--------------|----------|----------|
| | 2020 | 2021 | 2022 | 2020 | 2021 | 2022 |
| Jan | 0 | 2 | 5 | 0 | 0 | 0 |
| Feb | 1 | 1 | 4 | 0 | 0 | 0 |
| Mar | 17 | 1 | 4 | 0 | 3 | 0 |
| Apr | 25 | 1 | 4 | 0 | 0 | 0 |
| May | 26 | 2 | 4 | 0 | 0 | 0 |
| Jun | 23 | 2 | 4 | 1 | 0 | 0 |
| Jul | 16 | 2 | 4 | 1 | 0 | 0 |
| Aug | 12 | 2 | 4 | 0 | 0 | 0 |
| Sep | 8 | 2 | 4 | 0 | 0 | 0 |
| Oct | 7 | 3 | | 0 | 0 | |
| Nov | 6 | 4 | | 0 | 0 | |
| Dec | 6 | 4 | | 0 | 0 | |
| Total | 147 | 26 | 37 | 2 | 3 | 0 |

MWTS inventory series with 2021-2022 value increase



MWTS sales series with long initial effect and a 2021-2022 increase



Source: Original time series from [census.gov/wholesale](https://www.census.gov/wholesale), adjusted series generated from modeling

Construction Spending

- 124 seasonally adjusted series
- Series are generally more volatile than those of other surveys and weren't treated as vigorously with outliers. 6 series had outliers in 2020-2022.

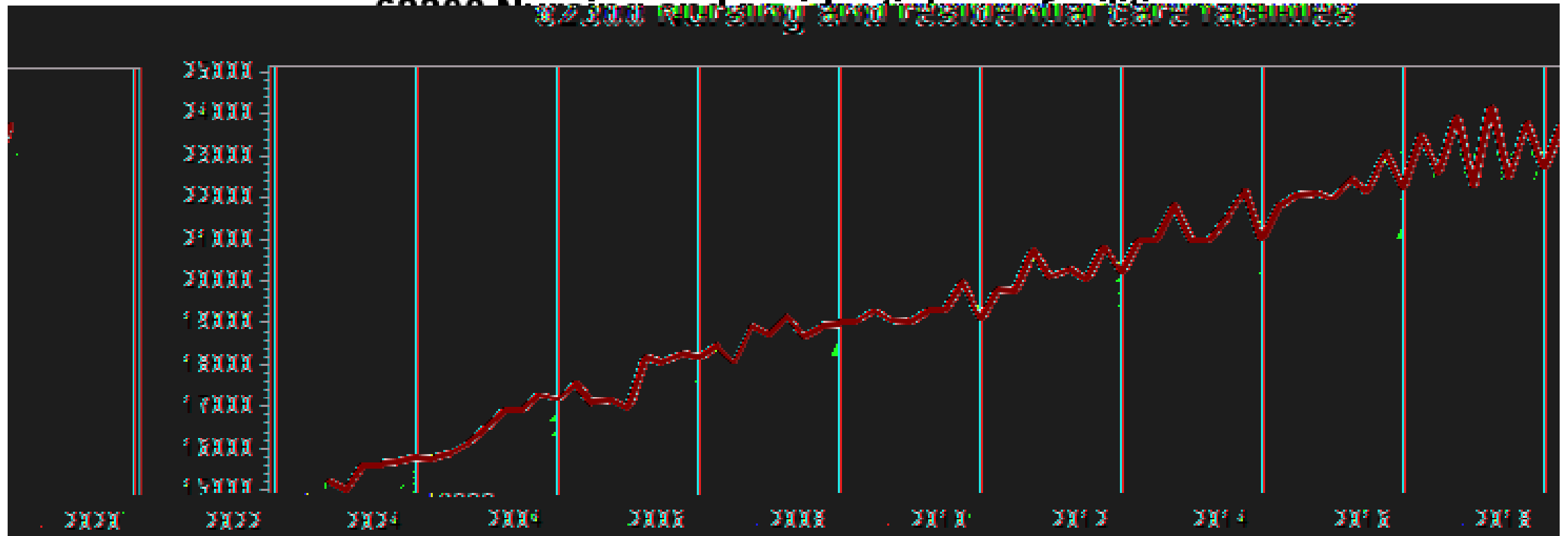
New research and methods development since the start of the pandemic

- Demetra Lytras wrote new code to collect model diagnostics and information to aid in annual review
- Eric Valentine wrote new code to generate temporary change regressors of different rates (how quickly the regressor returns to normal); in addition, preliminary results of his research suggest that for retail sales time series, a quicker rate might fit better than the default

Is the seasonal pattern changing?

- We can add change-of-regime seasonal dummy variables to the model to test for a change in seasonal pattern.
 - Because 2020 is generally messy and outliers will interfere with the results, we add them to series with 0 or 1 2021-22 outliers and start them in 2021
 - QSS: In 52 series, 11 have $p < 0.05$.
 - MRTS: In 22 series, 10 had $p < 0.05$
 - MWTS: In 40 series, 5 had $p \leq 0.05$ (all sales)
- These are very preliminary results; tested on just 1.5 years of data, it's impossible to tell whether it's a true pattern change or just the test reacting to an unusual 2021-2022.
- Visually, only a few series look like they might have a true seasonal pattern change.

QSS series with a potential seasonal pattern change



Source: Original time series from [census.gov/services](https://www.census.gov/services)

Thank you!

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