Measuring U.S. Core Inflation: The Stress Test of COVID-19 Laurence Ball, Daniel Leigh, Prachi Mishra, and Antonio Spilimbergo* April 2024 JEL No. E31, E58

ABSTRACT

Large price changes in industries affected by the COVID-19 pandemic caused erratic fluctuations in the U.S. headline inflation rate. This paper compares alternative approaches to filtering out the transitory effects of these industry price changes and measuring the underlying or core level of inflation over 2020-2021, the height of the pandemic. The Federal Reserve's preferred measure of core, the inflation rate excluding food and energy prices, performed poorly over that period: it was almost as volatile as headline inflation. Measures of core that exclude a fixed set of additional industries, such as the Atlanta Fed's sticky-price inflation rate, were less volatile, but the least volatile were measures that filter out large price changes in any industry, such as the Cleveland Fed's median inflation rate and the Dallas Fed's trimmed mean inflation rate. These core measures followed smooth paths, drifting down when the economy was weak in 2020 and then rising as the economy rebounded.

Laurence M. Ball Department of Economics Johns Hopkins University Baltimore, MD 21218 and NBER Iball@jhu.edu Prachi Mishra Research Department International Monetary Fund Washington, DC 20431 pmishra@imf.org

Daniel Leigh Research Department International Monetary Fund Washington, DC 20431 dleigh@imf.org Antonio Splimbergo Research Department International Monetary Fund and CEPR Washington, DC 20431 antoniospilimbergo@imf.org

This paper is a revised version of IMF Working Paper 21/291. The views expressed herein are those of the authors and should not be attributed to the IMF, its Executive Board, or its management.

We thank Mattia Coppo, Minju Jeong, Sultan Orazbayev, and Liangliang Zhu for excellent research assistance, Randal Verbrugge for providing historical component tables necessary for constructing the Cleveland Federal Reserve's weighted median inflation data, and Jane Haizel for excellent administrative support.

I. Introduction

The headline inflation rate often fluctuates because of large price changes in certain sectors of the economy that are not correlated with broader economic conditions. For decades, economists have sought a measure of core or underlying inflation that filters out the transitory effects of such shocks and is therefore less volatile than headline inflation and more closely related to macroeconomic conditions. Central bankers often say that they base their actions on movements in core rather than headline inflation (e.g., Mishkin, 2007).

The most common measure of core inflation is the inflation rate excluding the prices of food and energy (XFE inflation.) This measure reflects the fact that changes in food and energy prices caused large fluctuations in headline inflation during the 1970s, when the concept of core was developed (Gordon, 1975). Reflecting this legacy, statements by Fed officials often treat XFE inflation and core inflation as synonyms, and forecasts of XFE inflation are central to policy analysis by the Federal Open Market Committee (FOMC) and Fed staff.

Many researchers, however, have pointed out that volatility in headline inflation can arise from price changes in industries other than food and energy. Dolmas (2005), for example, reports that large price changes are common in industries such as computers and software, televisions, clothing, airline services, financial services, and auto insurance. An example that attracted policymakers' attention was the 84 percent annualized fall in cell phone service prices that occurred in March 2017, when unlimited data plans were introduced (Yellen 2017.)

Such experiences have led researchers to develop alternatives to XFE inflation as measures of core inflation. Some of these measures, such as the Atlanta Fed's sticky-price inflation rate, exclude not only food and energy but also a set of other industries that typically have volatile prices. Other measures, such as the Cleveland Fed's weighted median inflation rate and the Dallas Fed's trimmed mean inflation rate, exclude outliers in each month's distribution of industry price changes, regardless of which industries they are. We will use the terms "fixed-exclusion" and "outlier-exclusion" for these two classes of core measures, respectively.¹

Economists have analyzed the performance of various core measures since alternatives to XFE inflation were first introduced in the 1990s. This paper contributes to this debate with a case study of 2020 and 2021, the height of the COVID-19 pandemic. We examine this period because the economic disruptions during the pandemic caused extreme price movements in many industries—examples include air travel, hotels and motels, used cars, clothing, spectator sports, and financial services—and these price changes produced erratic movements in headline inflation. If a core measure is meant to filter out transitory inflation movements arising from sectoral shocks, the COVID-19 experience was a stress test with very large shocks.

The data yield some clear rankings of core measures in their effectiveness at filtering out the COVID-era shocks. The traditional XFE measure does quite poorly: for most of 2020-2021, it was almost as volatile as headline inflation, because most of the large industry price changes occurred outside of food and energy. Fixed-exclusion measures of core that filter out more industries fare better than XFE, but the most successful are outlier-exclusion measures such as those developed by the Cleveland and Dallas Feds. These measures were relatively stable because they filtered out large price changes in industries that are not excluded from other measures because their prices were not volatile before COVID-19.

A good measure of core inflation should move in the opposite direction from economic slack, in accord with the Phillips curve (for example, Schembri, 2017; Dolmas and Koenig, 2019). Therefore, in

¹ Another approach is to extract a measure of core inflation from the time series for industry inflation rates using statistical techniques such as factor analysis. The New York Fed produces one such measure. Future research could compare this approach to the ones considered in this paper.

addition to examining the volatility of different core measures, we examine their relationship to slack as measured, following studies such as Furman and Powell (2019), by the ratio of job vacancies to unemployment. Once again, over 2020-2021, outlier-exclusion measures perform the best: they drifted down as the economy weakened in the early part of the pandemic and then rose as the economy rebounded. The comovement of these core variables with slack is even stronger than that of "cyclical inflation" measures developed by the San Francisco Fed and Stock and Watson (2019), which weight industries based on their historical correlation with slack.

After finding that outlier-exclusion measures of core inflation perform better than fixed-exclusion measures, we compare different measures within the outlier-exclusion class. These measures are trimmed means of the price change distribution with different amounts of trimming, including the limiting case of weighted medians, which trim the entire distribution except the midpoint. We find that the performance of different measures is similar as long as there is substantial trimming, at least 25-30 percent from each side of the weighted distribution of prices. In particular, the Dallas Fed's measure of core PCE inflation, which trims the bottom 24 percent and top 31 percent from the distribution of prices each month, has a similar level of volatility and relation to slack as the Cleveland Fed's weighted median. Less heavily trimmed means, such as another core measure from the Cleveland Fed that trims the top and bottom 8 percent from the distribution, are less effective at filtering out the volatility in headline inflation.

In the rest of this paper, we briefly review the evidence regarding core inflation before the COVID-19 crisis and then focus on what happened over 2020-2021.

II. Pre-Pandemic Evidence on Alternative Core Measures

A substantial literature has examined the performance of core inflation measures before the COVID-19 pandemic, focusing on comparisons of outlier-exclusion measures—medians and trimmed means—to the traditional XFE measure. This work has evaluated core measures using criteria that include volatility, relation to slack, and forecasting power.²

Volatility

Since core measures are meant to filter out transitory movements in headline inflation, a good measure should be fairly stable over time. A number of pre-COVID-19 studies examine the volatility of alternative core variables, as measured by the variance of either the level or the change in the variable, and find that trimmed means and medians are less volatile than XFE inflation. Recent studies include Ball and Mazumder (2020) and Verbrugge (2021).

Figure 1 summarizes this evidence by reporting, for 1985-2019, the standard deviations of the headline inflation rate and core inflation as measured by XFE, trimmed mean and weighted median inflation. We examine monthly annualized seasonally adjusted inflation in both of the leading price indexes in the U.S.: the consumer price index (CPI) and the personal consumption expenditures (PCE) deflator. For both price indexes, we see that XFE inflation filters out a substantial share of the fluctuations in headline inflation: its standard deviation is smaller than that of headline by about one half (1.42/3.06) for the CPI and by about one-third (1.45/2.28) for the PCE. This result reflects the fact that sectoral shocks affecting headline inflation have often occurred in energy. We also see that the standard deviation of median inflation is even lower: it is lower than that of headline by about two-thirds

² For theoretical rationales for outlier-exclusion measures, see Bryan and Cecchetti (1994) and Ball and Mazumder (2011). These papers argue that large relative-price changes cause transitory movements in inflation in sticky-price models.

(1.05/3.06) for the CPI and by more than half (0.96/2.28) for the PCE deflator. The trimmed mean measures are also less volatile than XFE inflation.

Relation to Slack

According to the Phillips Curve, core inflation should move in the opposite direction from economic slack. A number of studies, including those cited above and Dolmas and Koenig (2019), find that median and trimmed mean inflation are more closely related to slack than either headline inflation or the traditional XFE measure of core. Ball and Mazumder argue that the apparent breakdown of the Phillips curve after 2008 disappears if core inflation is measured with the weighted median.

To highlight this point, Table 1 reports estimates of a simple Phillips curve for quarterly data for 1985-2019:

(1)
$$\pi - \pi^{e} = \alpha + \beta u + \varepsilon$$

where π denotes the annualized quarterly inflation rate; π^c denotes 10-year-ahead inflation expectations from the Survey of Professional Forecasters; and u denotes the 4-quarter average gap between unemployment and its CBO natural rate. For both headline and XFE inflation, the fit of the equation is poor, especially when the price index is the PCE deflator, for which the adjusted R-squared statistics are near zero. With the median, the adjusted R-squared statistics are higher, and so are the estimated coefficients on the unemployment gap (-0.25 for CPI and -0.19 for PCE). These Phillips curve slope estimates are comparable with those of recent studies such as Hazell and others (2020) (-0.25 for median CPI inflation). For trimmed mean inflation, the fit and slope coefficients are in between those for median and XFE inflation.

Forecasting

By filtering out the effects of transitory shocks, a measure of core inflation should be useful for forecasting the future path of headline inflation. By this criterion, the evidence on alternative core measures is mixed. Studies such as Smith (2004) find that median inflation is more effective than XFE as a forecaster of headline inflation, but other studies such as Crone (2013) find contrary results. Verbrugge (2019) surveys the literature on core inflation and concludes that "the forecasting evidence is mixed, and relative performance depends on time period, specification, and forecast evaluation period." More research is needed to sort out these issues.

All in all, our reading of the pre-pandemic evidence is that outlier-exclusion measures of core inflation have performed better than other measures. Similar evidence led the Bank of Canada to adopt a weighted median and trimmed mean as official measures of core inflation in 2016, replacing its CPIX measure, which is similar to XFE.³ In explaining this change, Bank of Canada Deputy Governor Schembri (2017) said that "there have been large transitory shocks to CPI components not excluded from CPIX" and "...this highlights an inherent weakness in measures of core inflation such as CPIX, which include a

³ CPIX "excludes eight of the most volatile components of the CPI (fruit, vegetables, gasoline, fuel oil, natural gas, mortgage interest, intercity transportation and tobacco products) and adjusts the remainder for the effect of changes in indirect taxes" (Bank of Canada 2016).

fixed and pre-determined set of components." Officials also cited evidence that the new core measures comoved more strongly with the output gap than did the CPIX (Bank of Canada, 2016).

In contrast, the Federal Reserve has maintained its focus on the traditional XFE measure of core, reporting it prominently in the Summary of Economic Projections released after FOMC meetings. We will see that the case for the Federal Reserve to move away from this practice has been strengthened by the experience during the COVID pandemic.

III. Comparison of Fixed-Exclusion and Outlier-Exclusion Core Measures During the Pandemic

Here we compare the behavior of fixed-exclusion and outlier-exclusion measures of core inflation during 2020 and 2021, the height of the pandemic. We consider core inflation in both the CPI, which traditionally has been the most prominent price index, and the PCE deflator, which the Fed has emphasized in its policymaking since the early 2000s.

We focus on two representatives of the class of outlier-exclusion measures: weighted median CPI inflation and weighted median PCE inflation, which are both published by the Cleveland Fed. The weighted median is the oldest of the outlier-exclusion measures of core—the weighted median CPI was developed by Bryan and Pike (1991) and Bryan and Cecchetti (1994)—and arguably it is also the simplest. Weighted medians are calculated from inflation rates of the CPI divided into 44 categories and for the 201 categories in the PCE deflator. Later, we compare these median inflation rates to other outlier-exclusion measures, including the Dallas Fed's trimmed mean PCE inflation.⁴

We compare the weighted median CPI to two fixed-exclusion measures of core CPI inflation: XFE inflation, and the sticky-price inflation series that the Atlanta Fed produces. The Atlanta Fed variable excludes a fixed set of industries with flexible prices, defined as prices that typically adjust more often than those of the average industry in micro data. Commentators such as Krugman (2021) suggest that the Atlanta series is a good measure of core inflation.⁵

For the PCE deflator, we again compare the weighted median measure of core inflation to XFE inflation and one other fixed-exclusion variable: the COVID-insensitive inflation rate produced by the San Francisco Fed. This variable was developed in August 2020 and excludes the prices of industries that had been strongly affected by the COVID-19 crisis (see Shapiro 2020). It is natural to think that this index filters out the shocks that caused volatility in headline inflation during the pandemic and therefore provides a useful measure of core inflation in that period.

We first examine the paths of these different core measures over time and then examine histograms of industry price changes in selected months, which help us understand why some core measures are more volatile than others.

The Paths of the Alternative Core Measures

For both the CPI and the PCE deflator, Figure 2 shows the paths of headline inflation and the various measures of core from January 2020 through December 2021. The graphs on the left show monthly inflation at annualized rates, and the graphs on the right show inflation over the previous 12

⁴ The weighted median inflation rate is constructed from the distribution of industry inflation rates, with each industry weighted as in the aggregate price index. The weighted median is the inflation rate of the industry at the 50th percentile of this distribution. For details, see the Cleveland Fed's web site.

⁵ The Atlanta Fed uses the term "underlying inflation" for its sticky-price inflation rate. It does not call it core inflation. Instead, it defines "core sticky-price inflation" as the inflation rate excluding both flexible price industries and food and energy industries with sticky prices.

months. Figure 3 presents the standard deviations of the monthly rates. Several features of these data are apparent:

First, for both the CPI and the PCE deflator, the XFE measure of core inflation has been highly volatile. Its monthly standard deviation is only modestly lower than that of headline inflation (3.8 compared to 4.7 for the CPI, and 3.0 compared to 3.4 for the PCE), in contrast to the pre-COVID-19 era when its standard deviation was much lower. The series for XFE inflation follows the erratic fluctuations in headline inflation: it spikes below zero and then sharply up over April-July 2020; then spikes to high levels—near 10 percent for CPI—over April-June 2021; then plunges back down to 2 percent for CPI in August before another sharp rise in October.

The fluctuations in one-month XFE inflation over 2020-2021 induced unusually large movements in 12-month inflation. For the CPI index, 12-month XFE inflation stayed in a narrow range from 1.6 to 2.4 percent in the pre-COVID-19 period of 2015-2019, but it fell to 1.2 in June 2020 and then rose to 5.5 in December 2021—at the time, the highest level in 30 years. (12-month XFE inflation continued to rise after that and peaked at 6.6 in September 2022.)

Second, weighted median inflation was relatively stable over 2020-21. For both CPI and PCE, the ratio of the standard deviations of median and headline inflation is around a third and is close to the ratio over 1985-2019. In addition, we can see in Figure 2 that median inflation has moved smoothly over time, without the spikes exhibited by headline and XFE inflation. The 12-month averages of the two medians drifted down modestly over 2020 and then rose over 2021 as the economy strengthened (a pattern we explore further below).

Turning to the fixed-exclusion measures besides XFE, we see that the behavior of the Atlanta Fed sticky-price CPI variable is in between that of XFE and weighted median. The Atlanta Fed variable follows the ups and downs in headline and XFE inflation, but in a muted way. Perhaps surprisingly, the volatility of the COVID-insensitive PCE inflation rate is similar to that of XFE inflation. The COVID-insensitive variable follows many of the fluctuations in headline and XFE inflation and has its own idiosyncratic spike in December 2020, as we discuss in what follows.

Which Industries Are Influential?

What explains the different movements of alternative core measures? The measures differ in which industries they exclude in a given month, so we can better understand them by examining inflation rates at the industry level. Here we focus primarily on measures of core CPI inflation and examine the months of April 2020 and April 2021. In April 2020, at the start of the pandemic, annualized headline CPI inflation plunged to –9.0 percent; in April 2021, it jumped to 8.3 percent as the economy recovered and hit supply constraints. In both months, alternative core inflation measures diverged sharply. Similar spikes occurred for headline PCE inflation in April 2020 and April 2021.

Figure 4 shows histograms of industry inflation rates for the CPI in the two months, with April 2020 on the left and April 2021 on the right. Each bar in the histograms has a width of 0.5 percentage points of monthly inflation (approximately 6 points of annualized inflation for low inflation rates). The height of a bar is the total weights in the CPI basket of industries with inflation rates within the range covered by the bar. For visual clarity, we truncate the vertical axis at 15 percent. For each month, the graph at the top also shows how much of the weights in each inflation range is accounted for by food or energy industries, which are excluded from XFE inflation. Similarly, the graph at the bottom shows the weights of flexible-price industries that are excluded from the Atlanta Fed's core CPI inflation measure.

The histograms show, first, that the extreme values of headline inflation arise from skewness in the distributions of inflation rates. In April 2020, a left tail of industries with large price decreases drags down headline inflation (weighted skewness = -3.6), and in April 2021 a large right tail does the opposite

(weighted skewness = 4.8). The median inflation rate is not affected by this skewness and therefore is moderate in both months, at 2.0 percent and 2.7 percent, respectively.

We can also see why XFE inflation is ineffective at filtering out industry shocks in the two Aprils. In both of them, the food and energy industries that are excluded are mostly near the middle of the distribution of inflation rates: changes in most food and energy prices were not especially large. Most of the industries in the tails that influence headline inflation are *not* excluded from XFE inflation. In April 2020, when XFE inflation is negative, the largest 5 annualized price falls not excluded from XFE inflation are Car and truck rental (–92.0 percent); Public transportation (–77.3 percent); Lodging away from home (–62.8 percent); Motor vehicle insurance (–59.8 percent); and Men's and boys' apparel (–41.9 percent). In April 2021, during the positive spike in XFE inflation, the largest 5 price increases not excluded from XFE inflation are Car and truck rental (277.3 percent); Used cars and trucks (199.8 percent); Lodging away from home (88.9 percent); Infants' and toddlers' apparel (36.2 percent); and Miscellaneous personal goods (28.5 percent). Because the prices of food and energy items were stable compared with these outliers, the spike in XFE inflation (9.6 percent) was greater than that in headline inflation (8.3 percent).

Turning to the Atlanta sticky-price measure, as reported in the bottom row of Figure 4, we can see that it also excludes many industries near the middle of the distributions in the two months. It has mixed success in excluding outliers because some of the sticky-price industries included in the measure experienced large price movements during 2020-21. For example, in April 2020 the sticky-price index excluded the XFE industry with the largest price fall, Car and truck rental, but failed to exclude the second and fourth largest price falls among XFE industries—Public transportation and Motor vehicle insurance, with annualized price falls of 77.3 percent and 59.8 percent, respectively. The partial but not complete success in excluding outliers explains why the Atlanta Fed measure is less volatile than XFE inflation but more volatile than the weighted median.

The other fixed-industry exclusion measure examined above, COVID-insensitive inflation, is measured only for PCE inflation. Like the Atlanta Fed core measure, it filters out some but not all of the largest price changes in April 2020 and April 2021. The potential for instability in the COVID-insensitive index is illustrated most clearly by December 2020, when it spiked to 7.3 percent (and median PCE inflation was 1.9 percent). For that month, an important outlier not excluded from the COVID-insensitive index was Financial service charges and fees, with an annualized rise of 165.1 percent. The effect of such an outlier is magnified by the fact that the COVID-insensitive index excludes more than half of the weighted industries in the PCE basket. The small size of the remaining basket makes the index more responsive to large price changes for the included items.

IV. Core Inflation Measures and Economic Slack

The noise in headline inflation arising from industry price changes can obscure the Phillips curve relationship between inflation and economic slack. Because it filters out this noise, a good core inflation measure should have a stronger relationship to slack, and pre-pandemic research judged core measures partly by that criterion. Here we examine some simple evidence on the co-movement of slack with alternative core measures over 2020-2021. Once again, the starkly different movements in the core series mean the data for this episode are informative.

⁶ PCE XFE inflation in April 2020 and April 2021 was affected by price movements in similar industries to those that affected the CPI XFE. In April 2020, the largest 5 annualized price falls among industries not excluded from PCE XFE inflation were Mutual fund sales charges (–92.7 percent); Motor vehicle rental (–92.0 percent); Other imputed commissions (–87.8 percent); Air transportation (–84.8 percent); and Portfolio management and investment advice services (–69.7 percent). In April 2021, the largest 5 annualized price increases among industries not excluded from PCE XFE inflation were Motor vehicle rental (277.3 percent); Spectator sports (216.7 percent); Used light trucks (184.6 percent); Used autos (184.6 percent); and Hotels and motels (106.8 percent).

In addition to the core inflation measures that we analyze above, we consider two other variables that are meant to capture the part of inflation that is correlated with slack. One, the San Francisco Fed's measure of cyclical PCE inflation, excludes industries with prices that typically do not comove with slack (for details, see Mahedy and Shapiro 2017). The other, Stock and Watson's (2019) cyclically-sensitive PCE inflation, is similar but gives weights to industries between zero and one, according to their covariation with real activity, rather than fully including or fully excluding each industry. The San Francisco Fed staff and Stock and Watson do not use the term "core inflation" for their variables, but the measures are interesting here because they are designed to have one of the properties of a good core measure.

To capture economic slack, we use the ratio of job vacancies to unemployment (V/U), a popular measure in recent work on inflation (e.g., Furman and Powell, 2021; Ball, Leigh, and Mishra, 2022). We examine the relationship between the level of core inflation over the last 12 months and the average V/U ratio over the same 12 months.

Figure 5 presents the results for various measures of core CPI and core PCE inflation. Each graph shows the path over time of a core measure and the V/U ratio, with months during 2020 and 2021 in blue and red, respectively. The Phillips curve implies that these variables should comove positively, with core inflation rising as V/U rises, indicating a tighter labor market.

Once again, for both price indexes the results for XFE inflation are negative: the data are not consistent with a reliable Phillips curve relation. XFE inflation and slack sometimes move in opposite rather than the same directions, or are uncorrelated, notably over April-September 2020 for the PCE deflator. Starting in April 2021, XFE inflation is consistently much higher than it was in earlier parts of the pandemic despite a similar range of V/U ratios.

Again echoing our earlier results, median inflation performs better: we can see a positive relationship between median inflation and the V/U ratio. For both the CPI and the PCE deflator, the 12-month median drifts down from January 2020 through February 2021 as the 12-month V/U ratio declines, and after that the median rises as the V/U ratio rises. The slope of the V/U-to-inflation tradeoff seems fairly stable over most of 2020-21. A caveat is that the relationship seems to change in the last three months of 2021, when inflation rises faster than one would expect based on V/U.⁷

The performances of the Atlanta sticky-price and San Francisco COVID-insensitive measures of core are once again middling. These variables appear to have positive relationships with the V/U ratio, but these relationships are less tight than the ones for median inflation. The two measures of cyclical inflation, from the San Francisco Fed and Stock and Watson, have unstable relationships with V/U: there is little or no change in these variables as V/U falls over 2020, but they rise sharply as V/U rises in 2021.

V. Alternative Outlier-Exclusion Measures

So far, we have shown that one simple outlier-exclusion measure of core inflation, the weighted median, has been more stable and more closely related to economic slack over 2020-2021 than several fixed-exclusion measures. Here, we compare the weighted median to other members of the outlier-exclusion class of core measures, specifically, various trimmed means of industry inflation rates. The median is a limiting case of this class in which 50 percent of the distribution of inflation rates is trimmed from each side of the median.

We first examine the two trimmed-mean measures of core inflation published by Federal Reserve Banks, the Dallas Fed trimmed PCE inflation and the Cleveland Fed trimmed CPI inflation. The Dallas Fed measure removes industries with total weights of 31 percent from the top of the distribution of PCE

⁷ See Ball, Leigh, and Mishra (2022) for more on the rapid rise in inflation during 2021. That paper argues that the rise in median inflation can be explained primarily by two factors, the rise in V/U and pass-through to core inflation from shocks to headline inflation.

industry inflation rates and industries with total weights of 24 percent from the bottom; the asymmetry in trimming is meant to produce an average level of core inflation that matches headline inflation. The Cleveland Fed variable symmetrically trims 8 percent of the weights from both the top and the bottom of the CPI industry inflation rates.

Figure 6 shows the paths over 2020-2021 of one-month and 12-month core inflation as measured by the Dallas and Cleveland Fed trimmed means and compares them to their respective weighted median inflation rates. Figure 7 shows the standard deviations of each one-month and 12-month series. We see that the trimmed means, like the weighted medians, filter out most of the monthly fluctuations in headline inflation and are more stable than fixed-exclusion core measures. There are some nuances to the results, however, which differ for the PCE and CPI price indexes.

For the PCE, we can see first from the 12-month series that the trimmed mean is somewhat below the median throughout the 2020-2021 period. The difference averages 0.36 percentage points. This finding is not surprising: it reflects the asymmetric trimming by the Dallas Fed, which reduces the trimmed mean. In monthly data, the standard deviation of the trimmed mean is modestly below that of the median (1.19 vs. 1.30).

For the CPI, the trimmed mean is not systematically higher or lower than the median, but it is substantially more volatile. Its standard deviation is 2.20 percentage points compared to 1.46 for the median. This difference reflects the fact that the trimmed mean follows headline inflation somewhat more than the median does when headline spikes down in April 2020 and up in April-June 2021 and October 2021.

The industry-level data reveal that volatility in the trimmed mean CPI occurs because the Cleveland Fed's 8 percent trims from the top and bottom are too narrow to exclude all the industries with large price changes. For example, in April 2020, when headline CPI inflation plummeted to -9.0 percent at a monthly annualized rate, the Cleveland Fed trimmed mean failed to exclude industries such as Men's and boys' apparel; Women and girls' apparel; and Footwear, with annualized price decreases of 41.9 percent, 39.4 percent, and 26.9 percent, respectively. Consequently, trimmed mean inflation fell to an annualized 0.1 percent. Median CPI inflation was 2.0 percent.

Motivated by these results, we have systematically investigated the effects of alternative amounts of trimming. We construct trimmed means for the CPI and PCE with symmetric trimming rates ranging from 0 percent (as in the case of headline inflation) up to 50 percent on each side (as in the case of median). Figure 8 plots the standard deviation of the monthly annualized inflation rate over 2020-2021 for the various trimmed means against the total trimming applied. For both the CPI and the PCE deflator, we see that the volatility of the trimmed mean falls as the amount of trimming rises from zero to about 25-30 percent on each side of the distribution, or 50-60 percent in total. Beyond that point, there is little effect of additional trimming. These findings confirm that the Cleveland Fed's trim, which totals 16 percent, is not optimal for reducing volatility while the Dallas Fed's trim, which totals 55 percent, has similar volatility to the weighted median.

Figure 8 also compares the Dallas asymmetric trim to a symmetric trim for PCE with the same 55 percent total (27.5 percent on each side). We see that the choice of symmetry or asymmetry, while affecting the average level of the trimmed mean, has essentially no effect on volatility for a given total amount of trimming.

In sum, we find that the choice between a median measure of core inflation and a heavily trimmed mean such as the Dallas Fed's does not matter materially for volatility over the 2020-21 period. We also find (in results not shown) that this choice does not matter for the comovement between the core inflation measure and the V/U ratio. In contrast, a light trim such as Cleveland's produces a core measure that is more volatile and less closely related to slack.

VI. Conclusion

How should economists and policymakers measure core inflation? Since the 1970s, the primary measure of core at the Federal Reserve has been the inflation rate excluding food and energy (XFE inflation). Yet, even before the COVID-19 pandemic, there was substantial evidence that outlier-exclusion measures of core—weighted medians and trimmed means—performed better by criteria including volatility and relation to economic slack. Such evidence led the Bank of Canada to adopt this kind of core measure in 2016, replacing its XFE-type measure.

The COVID period is highly informative about the behavior of alternative core measures. Headline inflation fluctuated erratically over 2020-2021 as a result of sectoral shocks related to the pandemic, and core measures have varying success in filtering out these shocks. XFE inflation performs quite poorly by both the criteria of volatility and relation to slack. Fixed-exclusion measures of core that exclude a wider set of industries, such as the Atlanta Fed's sticky-price inflation rate, perform better, but the most successful measures are weighted medians and trimmed means. The COVID-era experience has strengthened the case for the Federal Reserve to revise its measure of core inflation.

The success of outlier-exclusion measures of core is impressive when we consider some of the measures they outperform. They are less variable during the 2020-21 period than even the COVID-19-insensitive inflation rate designed specifically to filter out the effects of the pandemic. They are more closely related to slack than cyclically-sensitive inflation rates designed to maximize correlation with slack.

The pandemic period also provides evidence on the relative performance of core measures that trim different amounts of the industry price-change distribution. For 2020-2021, it appears best to trim at least 25-30 percent from each side of the distribution. It does not matter much whether the trimming is increased from that level to the 50 percent that defines the median. Future research should examine whether these results hold over longer time periods.

References

- Ball, Laurence M., Daniel Leigh, and Prachi Mishra. 2022. "Understanding U.S. Inflation during the COVID-19 Era." Brookings Papers on Economic Activity (Fall): 1–54.
- Ball, Laurence, and Sandeep Mazumder, 2020, "The Nonpuzzling Behavior of Median Inflation," in *Changing Inflation Dynamics, Evolving Monetary Policy*, ed. by Gonzalo Castex, Jordi Galí, and Diego Saravia. Edition 1. Vol. 27, Chapter 3, pp. 49–70 (Central Bank of Chile).
- ———, 2011, "Inflation Dynamics and the Great Recession," *Brookings Papers on Economic Activity*, Brookings Institution, Vol. 42 (Spring), pp. 337–405.
- Bank of Canada, 2016, "Renewal of the Inflation-Control Target—Background Information," October (Ottawa: Bank of Canada).
- Bryan, Michael F., and Stephen G. Cecchetti, 1994, "Measuring Core Inflation," in *Monetary Policy*, ed. by N. Gregory Mankiw (Chicago: University of Chicago Press).
- Bryan, Michael F., and Christopher J. Pike, 1991, "Median Price Changes: An Alternative Approach to Measuring Current Monetary Inflation," Economic Commentary (Federal Reserve Bank of Cleveland).
- Crone, Theodore M., N. Neil K. Khettry, Loretta J. Mester, and Jason A. Novak, 2013, "Core Measures of Inflation as Predictors of Total Inflation," *Journal of Money, Credit and Banking*, Vol. 45, pp. 505–19.
- Dolmas, Jim, and Evan F. Koenig, 2019, "Two Measures of Core Inflation: A Comparison," Federal Reserve Bank of St. Louis *Review*, Fourth Quarter 2019, 101(4), pp. 245-58.
- Dolmas, Jim, 2005, "Trimmed Mean PCE Inflation," Federal Reserve Bank of Dallas Research Department Working Paper No. 0506.
- Gordon, Robert J, 1975, "The Impact of Aggregate Demand on Prices," *Brookings Papers on Economic Activity:* 2, Brookings Institution, pp. 613–62.
- Hazell, Jonathon, Juan Herreno, Emi Nakamura, and Jón Steinsson, 2020, "The Slope of the Phillips Curve: Evidence from U.S. States," NBER Working Paper No. 28005 (Cambridge, Massachusetts: National Bureau for Economic Research).
- Krugman, Paul, 2021, "Wonking Out: I'm Still on Team Transitory," New York Times, September 10.
- Macklem, Tiff, 2001, "A New Measure of Core Inflation," *Bank of Canada Review*, Vol. 2001 (Autumn), pp. 3–12 (Ontario: Bank of Canada).

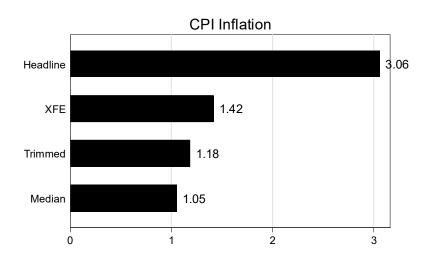
- Mahedy, Tim, and Adam Shapiro, 2017, "What's Down with Inflation?" FRBSF Economic Letter 2017–35 (November), Research from Federal Reserve Bank of San Francisco.
- Mishkin, 2007, "Headline versus Core Inflation in the Conduct of Monetary Policy," Speech at the Business Cycles, International Transmission and Macroeconomic Policies Conference, HEC Montréal (Montréal: Canada).
- Schembri, Lawrence, 2017, "Getting to the Core of Inflation," Remarks at the Department of Economics, Western University (London: Ontario, Canada).
- Shapiro, Adam Hale, 2020, "A Simple Framework to Monitor Inflation," Federal Reserve Bank of San Francisco Working Paper 2020–29.
- Smith, Julie K, 2004, "Weighted Median Inflation: Is This Core Inflation?" *Journal of Money, Credit and Banking*, Vol 36, No. 2, pp. 253–63.
- Stock, James H., and Mark W. Watson, 2019, "Slack and Cyclically Sensitive Inflation," NBER Working Paper No. 25987 (Cambridge, Massachusetts: National Bureau for Economic Research).
- Verbrugge, Randal, 2021, "Is It Time to Reassess the Focal Role of Core PCE Inflation?" Federal Reserve Bank of Cleveland Working Paper No. 21–10.
- ———, 2019, "Behavior of a New Median PCE Measure: A Tale of Tails" Federal Reserve Bank of Cleveland Working Paper No. 2019–10.
- Yellen, Janet, 2016, "Macroeconomic Research After the Crisis," Speech at 60th Annual Economic Conference "The Elusive 'Great' Recovery: Causes and Implications for Future Business."

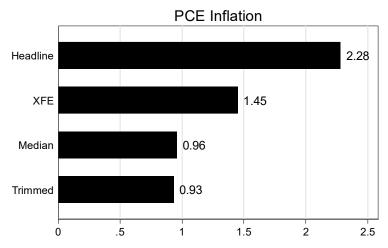
Table 1. Phillips Curve Estimates for Selected Inflation Measures, 1985-2019

	<i>R-</i> squared	β	(s.e.)	α	(s.e.)	N
CPI Inflation						
Headline XFE Trimmed Median	0.014 0.161 0.186 0.376	-0.174** -0.170*** -0.183*** -0.254***	(0.087) (0.035) (0.039) (0.036)	-0.154 -0.118** -0.153*** 0.130***	(0.160) (0.053) (0.051) (0.043)	140 140 140 140
PCE Inflation						
Headline XFE Trimmed Median	-0.002 0.010 0.206 0.279	-0.068 -0.054* -0.149*** -0.190***	(0.066) (0.031) (0.025) (0.025)	-0.410*** -0.411*** -0.210*** 0.204***	(0.124) (0.059) (0.041) (0.041)	140 140 140 140

Note: "XFE" denotes inflation measure excluding food and energy. "Median" denotes weighted median series produced by the Federal Reserve Bank of Cleveland staff. "Trimmed" denotes the trimmed mean series prepared by the Federal Reserve Bank of Cleveland staff and Federal Reserve Bank of Dallas staff for the CPI and PCE, respectively. Equation estimated: $\pi_t - \pi_t^e = \alpha + \beta \tilde{u}_t + \varepsilon_t$ where π_t = quarterly seasonally adjusted annualized inflation; π_t^e = 10-year-ahead Survey of Professional Forecasters inflation expectations; and \tilde{u}_t = trailing 4-quarter average gap between unemployment and its CBO natural rate. Table reports adjusted *R*-squared statistics; point estimates; robust standard errors (s.e.) in parentheses; and number of observations (*N*). *, **, and *** denote statistical significance at the 10, 5, and 1 percent level, respectively.

Figure 1. Pre-pandemic Volatility of Monthly Annualized Inflation, 1985–2019 (Standard deviation; percentage points)

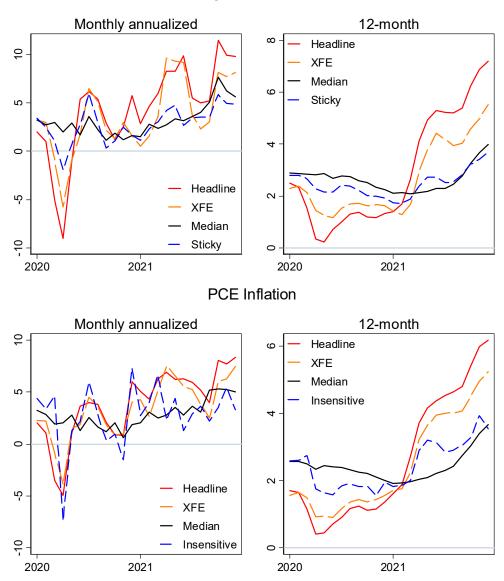




Note: "XFE" denotes inflation measure excluding food and energy. "Median" denotes weighted median series produced by the Federal Reserve Bank of Cleveland staff. "Trimmed" denotes the trimmed mean series prepared by the Federal Reserve Bank of Cleveland staff and Federal Reserve Bank of Dallas staff for the CPI and PCE, respectively.

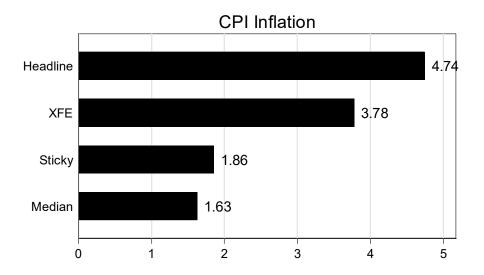
Figure 2. Inflation Since COVID-19, 2020–2021 (percent)

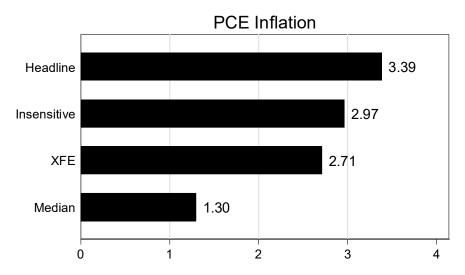
CPI Inflation



Note: "XFE" denotes inflation measure excluding food and energy. "Median" denotes weighted median series produced by the Federal Reserve Bank of Cleveland staff. "Insensitive" denotes series produced by Federal Reserve Bank of San Francisco staff (Shapiro 2020) that excludes food and energy as well as additional PCE components for which either prices or quantities moved in a statistically significant manner at the onset of the COVID-19 pandemic, between February and April 2020. "Sticky" denotes series produced by the Federal Reserve Bank of Atlanta staff based on a subset of CPI components assessed as slow to change due to the low frequency of price adjustment.

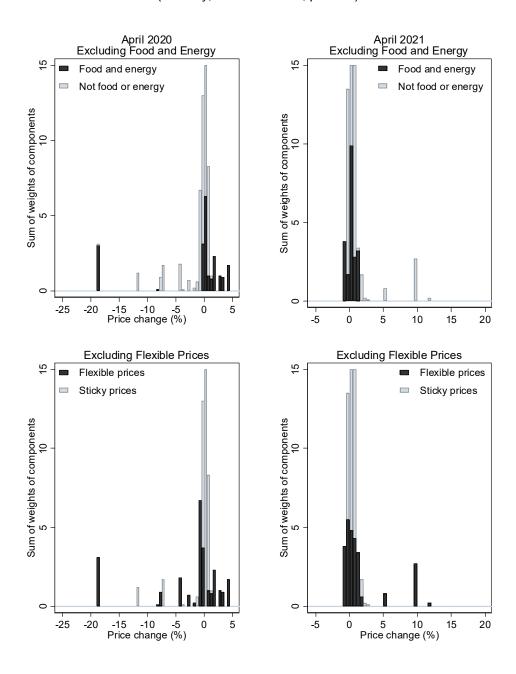
Figure 3. Volatility of Monthly Annualized Inflation During 2020–21 (Standard deviation; percentage points)





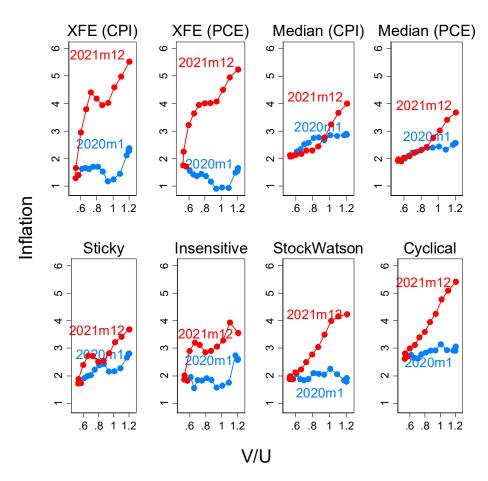
Note: "XFE" denotes inflation measure excluding food and energy. "Median" denotes weighted median series produced by the Federal Reserve Bank of Cleveland staff. "Insensitive" denotes series produced by Federal Reserve Bank of San Francisco staff (Shapiro 2020) that excludes food and energy as well as additional PCE components for which either prices or quantities moved in a statistically significant manner at the onset of the COVID-19 pandemic, between February and April 2020. "Sticky" denotes series produced by the Federal Reserve Bank of Atlanta staff based on a subset of CPI components assessed as slow to change due to the low frequency of price adjustment.

Figure 4. April 2020 and April 2021: Histogram of Changes in the Prices of CPI Categories (Monthly, not annualized, percent)



Note: Figure reports non-annualized inflation rates. Vertical axis cut off at 15. Weights computed following Dolmas (2005). "Flexible prices" refer to prices of industries that are excluded from the Federal Reserve Bank of Atlanta sticky-price CPI inflation measure.

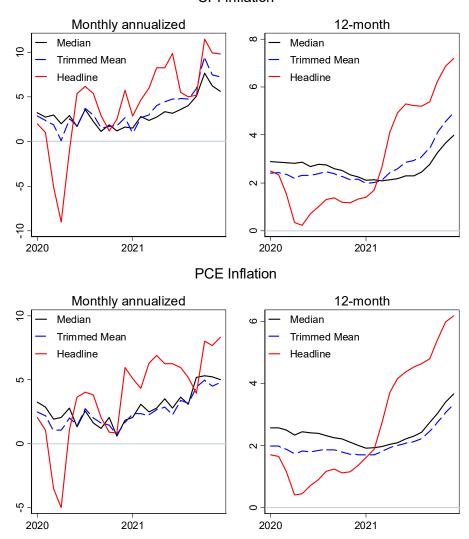
Figure 5. Inflation Relation with Vacancy-to-unemployment Ratio, 2020–2021 (12-month rates; percent and ratio)



Note: Blue points indicate 2020. Red dots indicate 2021. Inflation indicates 12-month inflation rate. V/U denotes ratio of vacancies to unemployed (12-month average). "XFE" denotes CPI inflation measure excluding food and energy. "Median" denotes weighted median CPI series produced by the Federal Reserve Bank of Cleveland staff. "Sticky" denotes series produced by the Federal Reserve Bank of Atlanta staff based on a subset of CPI components assessed as slow to change due to the low frequency of price adjustment. "Insensitive" denotes PCE series produced by Federal Reserve Bank of San Francisco staff (Shapiro 2020) that excludes food and energy as well as additional PCE components for which either prices or quantities moved in a statistically significant manner at the onset of the COVID-19 pandemic, between February and April 2020. "Cyclical" denotes PCE measure produced by Federal Reserve Bank of San Francisco staff (Mahedy and Shapiro 2017) that excludes food and energy and also excludes additional items assessed as being acyclical. "StockWatson" denotes cyclically sensitive PCE inflation measure of Stock and Watson (2019) published on Federal Reserve Bank of Atlanta Underlying Inflation Dashboard.

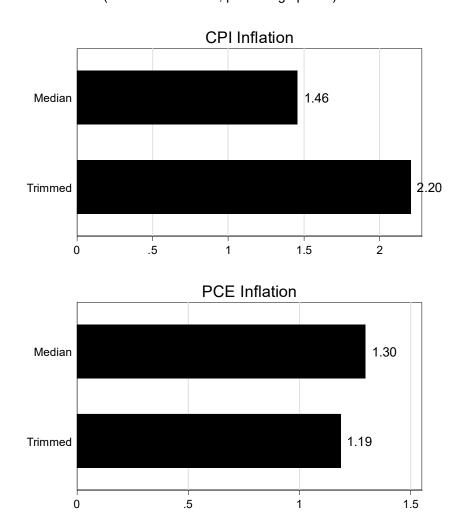
Figure 6. Median and Trimmed-Mean Inflation, 2020–2021 (percent)

CPI Inflation



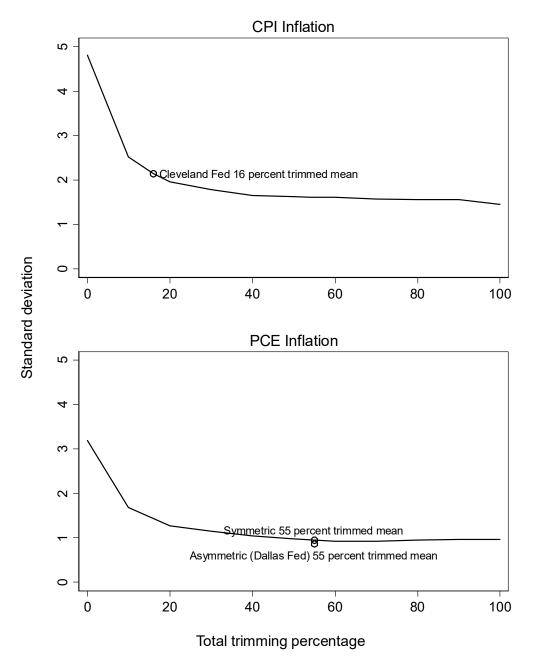
Note: "Median" denotes weighted median series produced by the Federal Reserve Bank of Cleveland staff. "Trimmed" denotes the trimmed mean series prepared by the Federal Reserve Bank of Cleveland staff and Federal Reserve Bank of Dallas staff for the CPI and PCE, respectively.

Figure 7. Volatility of Median and Trimmed-Mean Monthly Annualized Inflation During 2020–2021 (Standard deviation; percentage points)



Note: "Median" denotes weighted median series produced by the Federal Reserve Bank of Cleveland staff. "Trimmed" denotes the trimmed mean series prepared by the Federal Reserve Bank of Cleveland staff and Federal Reserve Bank of Dallas staff for the CPI and PCE, respectively.

Figure 8. Trimmed-Mean Inflation Volatility vs. Total Trimming Percentage, 2020–2021 (Standard deviation of monthly annualized inflation; percentage points)



Note: Total trimming percentage indicates sum of the proportion of price changes trimmed from upper and from lower end of the weighted distribution of monthly price changes.