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Trend Inflation and Monetary Policy Regimes in Japan^{*}

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Abstract

This paper examines the dynamics of trend inflation in Japan over the last three decades based on the smooth transition Phillips curve model. We find that there is a strong connection between the trend inflation and monetary policy regimes. The results also suggest that the introduction of the inflation targeting policy and quantitative and qualitative easing in the beginning of 2013 successfully escaped from the deflationary regime, but were not enough to achieve the 2% inflation target. Finally, our results indicate the significance of exchange rates in explaining the recent fluctuations of inflation and the importance of oil and stock prices in maintaining the positive trend inflation regime.

Keywords: Hybrid Phillips curve, Monetary policy, Inflation targeting, Quantitative and qualitative easing, Smooth transition model

JEL classification: C22, E31, E52

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1 Introduction

Inflation is one of the most important variables for macroeconomists, practitioners, and policy makers, since inflation affects the value of money. As a result, inflation rates significantly influence the behaviors of individuals and firms. Therefore, the central banks and monetary authorities have paid special attention to the inflation rates recently, and inflation-targeting monetary policy has been adopted by more than 20 countries including US and UK. As for Japan, the first arrow in the first stage of Abenomics is to conduct an aggressive monetary policy; as part of this, the Bank of Japan (BOJ) introduced an inflation targeting policy in January 2013 by committing to a 2% price stability target. Following the introduction of this policy, the BOJ implemented innovative monetary policies, including the quantitative and qualitative easing (QQE) and negative interest policies. Nonetheless, it is still uncertain whether and when the 2% price stability target will be achieved.

In achieving this inflation target, one of the crucial indicators is trend inflation, which is defined as the infinite horizon forecast of inflation, that is, the level to which inflation is expected to settle after short-run fluctuations die out.¹ Since inflation is anticipated to approach the trend inflation in the future, aside from the short-term fluctuations along with the business cycles, the trend inflation can provide a useful measure with which to evaluate the appropriateness of the current monetary policy, as well as the necessity of additional monetary easing in order to achieve the inflation target. Therefore, it is extremely informative to examine the current trend inflation level and compare it with the inflation target set by the monetary authorities.

A number of recent studies theoretically and/or empirically investigate the dynamics of trend or expected inflation. For instance, Branch (2007) compares three reduced-form models of heterogeneous expectations and suggests that model uncertainty and sticky information are essential in modeling expected inflation. Lanne, Luoma, and Luoto (2009) show that inflation expectations are consistent with a sticky-information model by confirming that a significant proportion of households base their inflation expectations on past inflation rather than the rational forward-looking forecast. Pfajfar and Santoro (2010) identify three different underlying mechanisms for expectation formation: a static or highly autoregressive region on

¹This definition of trend inflation is the same as that of Ascari and Sbordone (2014) and based on Beveridge and Nelson (1981), who originally define a stochastic trend in terms of long-horizon forecasts. Note that trend inflation and expected inflation are used interchangeably in this paper, although, precisely speaking, trend inflation can be different from the short-run expected inflation.

the left hand side of the median, a nearly rational region around the median, and a fraction of forecasts on the right hand side of the median formed in accordance with adaptive learning and sticky information. Del Negro and Eusepi (2011) investigate the fit of standard DSGE models with nominal and real rigidities and find that they fail to fully capture the dynamics of expected inflation in the US, among many other findings. Finally, Pfajfar and Žakeji (2014) use laboratory experiments to document that more than 20% of subjects are best described by an adaptive learning model. In addition, they find that switching between different rules describes the behavior better than a single rule.²

A growing number of research show the strong connection between monetary policy and (expected) inflation. For instance, Castelnuovo (2010) examines the factors deriving the U.S. inflation expectation dynamics and shows that global indicators appear to have played a significant role until the mid-1980s, but these have subsequently been replaced by the U.S. monetary policy factor. Bhattarai, Lee, and Park (2014) document that whether monetary policy fully controls inflation and how changes in monetary and fiscal policy stances affect inflation depend crucially on the prevailing policy regime. Kaihatsu and Nakajima (2015) show that Japan's trend inflation remained at zero percent for about 15 years after the late 1990s, and then shifted away from zero percent after the introduction of the price stability target and the QQE. Michelis and Iacoviello (2016) examine the effects of an increase in the inflation target during a liquidity trap and indicate that Japan has made some progress towards overcoming deflation, but that further measures are needed to raise inflation to 2 percent in a stable manner. More recently, Ascari, Florio, and Gobbi (2017) suggest that a higher inflation target slows down the speed of convergence of inflation expectations, and central bank communication is an essential component of the inflation targeting framework.

Although there are several studies focusing on Japan, there is still not enough evidence regarding the dynamics of trend inflation and their relationship with monetary policies in Japan. In addition, few studies discuss which variables have played important roles in shifting the trend inflation regime in Japan. To fill this gap, the purpose of this paper is to investigate the dynamics of trend inflation in Japan over the last three decades and their relationship with monetary policies. Over the last three decades, the Japanese economy has experienced many significant events, such as the bursting of the bubble economy, the lost two decades, the Lehman and Euro financial crises, and the introduction of a zero interest rate

²For a more comprehensive review of trend or expected inflation, see Ascari and Sbordone (2014) and the references therein.

and inflation targeting monetary policies. It is quite meaningful to empirically study how the trend inflation in Japan has evolved through these events. In particular, the Japanese economy suffered from low expected inflation due to the deflationary mindset created by the lost two decades after the bursting of the bubble economy in 1990. It is important to examine whether the trend inflation during this period was indeed below zero or not and how the BOJ's policies during this period, such as the zero interest and quantitative easing policies, affected the trend inflation. In addition, it is of great interest to analyze whether and how the trend inflation has become closer to the BOJ's 2% target and which variables, if any, have contributed to these changes, since the BOJ introduced the QQE.

One of the difficulties in assessing the dynamics of trend inflation is that the trend inflation is unobservable. Although survey-based expected inflation rates have recently become available, it is often pointed out that surveyees are typically limited to professionals, and survey expected inflation contains various potential biases. For example, Fuhrer, Olivei, and Tootell (2012) attempt to estimate the expected inflation rates in Japan based on the survey data, but their estimates uniformly exceed the actual inflation rates between the beginning of 1990 and 2010. Therefore, it is not a straightforward matter to estimate the trend inflation rates from the survey data.

To overcome the problem associated with these survey data, many recent studies have attempted to estimate the trend inflation rates by modeling them as unobservable state variables and estimating them based on the macroeconometric models. In this same vein, this paper estimates the trend inflation rates in Japan using a hybrid Phillips curve. More specifically, we introduce regime switching to the Phillips curve to capture the regime shifts in trend inflation rates,³ following Kaihatsu and Nakajima (2015). They employ the Markov-switching (MS) model to examine the possible regime changes in trend inflation, but their estimated MS model is stationary. Therefore, the regime distribution will converge on the stationary distribution in the long-run, meaning that their MS model cannot capture a permanent regime change in trend inflation. However, it is likely that there are permanent regime changes in trend inflation given the experiences of the Japanese economy over the last three decades, including the bursting of the bubble economy and significant changes in monetary policy.

To capture the possible permanent regime changes in trend inflation rates, we apply the smooth-transition (ST) model to the hybrid Phillips curve, following Musso, Stracca, and

³In this paper, we use the “regime” to refer to the state, and both terms are used interchangeably.

van Dijk (2009), with extensions to multiple regimes and transition variables. By doing so, we attempt to determine the number of regimes, characterize each trend inflation regime, estimate the dynamics of trend inflation, and identify the important determinants of trend inflation regimes. More specifically, we address the following questions: (i) How many trend inflation regimes were there over the last three decades in Japan? (ii) Is there any relationship between (trend) inflation regimes and monetary policy regimes? (iii) What were the trend inflation rates under each inflation regime? (iv) Has the trend inflation increased after the adoption of inflation targeting policy by the BOJ? (v) Is the current trend inflation significantly different from the BOJ's target of 2%? (vi) What are the effects of oil prices, stock prices, and exchange rates on Japanese (trend) inflation?

Our findings can be summarized as follows. First, there have been three trend inflation regimes in Japan over the last three decades, and they reasonably corresponded to the traditional monetary policy regime between 1985 and 1994 (Regime 1), the extremely low interest rate monetary policy regime between 1995 and 2012 (Regime 2), and the inflation targeting monetary policy regime since 2013 (Regime 3).

Second, based on the three-regime ST Phillips curve model, each trend inflation regime can be characterized as follows. The trend inflation in Regime 1 was relatively high and stable at 1.5% for the core inflation and 2.0% for the core2 inflation.⁴ In Regime 2, the trend inflation decreased considerably to -0.20% for the core inflation and to -0.61% for core2 inflation. While the estimate of trend inflation was not significantly different from 0 for the core inflation, it was significantly negative for the core2 inflation. In addition, our results show that the trend inflation had been stable and below zero during this regime, although the BOJ enacted many pioneering monetary policies, such as a zero interest rate and quantitative easing monetary policies. Thus, our results suggest that those BOJ's monetary policies were not sufficient to escape from the deflationary regime, although they most likely supported the Japanese economy and prevented the trend inflation from decreasing further. Finally, the trend inflation in Regime 3 showed a sizable increase to 0.34% for the core inflation and 0.48% for the core2 inflation. While the estimate of trend inflation was not significantly different from 0 for the core inflation, it was significantly positive for the core2 inflation. More importantly, our results clearly demonstrate that the trend inflation in Regime 3 is

⁴In this paper, we calculate two measures of inflations from the consumer price index (CPI). More precisely, the core inflation is calculated from the headline CPI excluding fresh food, while core2 inflation is calculated from the headline CPI excluding food and energy. See Section 3.1 for more details.

significantly lower than the BOJ's 2% inflation target for both inflation measures. Thus, the QQE and the negative interest policies implemented in Regime 3 were partially successful for escaping from the deflationary regime, but they were not sufficient to achieve the BOJ's 2% inflation target.

Third, we extended the benchmark model so that oil prices, stock prices, and exchange rates could affect inflation. Here, our results indicate that oil prices and exchange rates had a relatively large effect on the core inflation in Regime 2 and Regime 3, respectively. On the other hand, oil prices, stock prices, and exchange rates had little effect on the core2 inflation in Regimes 2, although exchange rates became influential in Regime 3. Thus, our results suggest that the depreciation of the Japanese yen that occurred along with the introduction of the inflation targeting policy by the BOJ played an important role in the significant increase in inflation seen in 2013.

Finally, we consider another type of extended model in which oil prices, stock prices, and exchange rates can affect the dynamics of the trend inflation regime. Our results show that oil and stock prices had significant impacts on the trend inflation regime for the core inflation, while only stock prices strongly affected the trend inflation regime for the core2 inflation. This greatly contrasts with the above-mentioned results that suggest the importance of exchange rates in explaining the realization of inflation. More specifically, our results demonstrate that, even after 2012, the trend inflation regime tended to revert to a deflationary regime when oil or stock prices decreased. Therefore, the BOJ's purchase of Exchange Traded Funds (ETF) could be effective in preventing trend inflation from reverting to a deflationary regime, which was mainly observed before 2012.

The remainder of this paper is organized as follows. Section 2 introduces the ST Phillips curve model and explains how to choose the number of regimes. Section 3 summarizes the empirical results based on the benchmark model. Section 4 provides the empirical results based on the extended models. Finally, Section 5 concludes the paper.

2 Methodology

This paper employs a hybrid Phillips curve model with regime switching to estimate the dynamics of trend inflation rates in Japan, following Kaihatsu and Nakajima (2015). They apply an MS model to capture the possible regime changes in trend inflation. In the Markov-switching model's framework, the trend inflation dynamics are typically modeled by a sta-

tionary Markov process. Hence, expected value of trend inflation is constant. Although it is possible for trend inflation to deviate from its expected level temporarily, it must revert to the stationary level eventually. In this sense, an MS Phillips curve model cannot capture permanent regime changes in trend inflation.⁵ However, it is likely that there are permanent regime changes in trend inflation, for example, after drastic changes in monetary policies. Therefore, we adopt an ST Phillips curve model to capture the possible permanent regime changes in trend inflation rates. By doing so, we attempt to answer the questions addressed in the introduction.

2.1 ST Phillips Curve Model

The ST model is developed within the autoregressive model by, among others, Chan and Tong (1986), and Granger and Teräsvirta (1993); its statistical inference is established by Teräsvirta (1994). Since then, the ST model has been applied to many types of models. Particularly, Musso, Stracca, and van Dijk (2009) applies the ST model to the Euro-area Phillips curve to examine the possible regimes shifts in the Phillips curve. Our two-regime model is similar to theirs, but we extend it by allowing multiple regimes. In addition, we also consider models with multiple transition variables in the later analysis. In this subsection, we briefly discuss our model.

To examine the regime shifts in trend inflation in Japan, our benchmark model is a hybrid Phillips curve.⁶ One of the most important characteristics of the hybrid Phillips curve is that the current inflation rate depends not only on the current output gap and the trend inflation but also the past inflation rates. Specifically, our hybrid Phillips curve is given as

$$\pi_t = \sum_{k=1}^K \alpha_k \pi_{t-k} + \left(1 - \sum_{k=1}^K \alpha_k\right) \mu_t + \beta_t x_t + \varepsilon_t. \quad (1)$$

Here, π_t is an inflation rate at time t , μ_t is a trend inflation, and x_t is an output gap. If the inflation is persistent partially due to the backward-looking price setting by firms, the past high inflation tends to be followed by relatively high current inflations. The hybrid Phillips curve (1) explicitly models this possibility and can be considered to be the time-varying autoregressive (AR) model with an exogenous variable, assuming that the output

⁵By imposing zero restrictions on the transition probabilities, an MS model can also capture permanent regime changes. However, we still prefer the ST model, because it allows regimes to change slowly or suddenly, while the MS model assumes the regime changes occur only suddenly.

⁶See Fuhrer and Moore (1995), Roberts (1997), Galí and Gertler (1999), Galí, Gertler, and López-Salido (2005) for details on the hybrid Phillips curve.

gap is exogenous. If the output gap stays stationary level at 0 and the AR coefficients in (1) satisfy the stationarity conditions, trend inflation can be approximated by calculating a local-to-date t estimate of mean inflation from (1) as $\lim_{h \rightarrow \infty} E_t(\pi_{t+h}) \approx \mu_t$. Here, $E_t(\cdot)$ is a conditional expectation given the information available at time t . Therefore, in this sense, we can interpret μ_t as the trend inflation at time t .⁷

Over the past three decades, the Japanese economy has experienced many significant events, such as a bursting of the bubble economy, the lost two decades, the Lehman and Euro financial crises, and the introduction of a zero interest rate and inflation targeting monetary policies. As a result, it is likely that trend inflation in Japan has had regime shifts over the last thirty years. In this paper, we investigate this possibility by modeling regime changes as permanent regime shifts. More specifically, we apply the ST model to the hybrid Phillips curve (1) so that the trend inflation has regime shifts as

$$\mu_t = \mu^{(1)} + G(s_t; c, \gamma) (\mu^{(2)} - \mu^{(1)}). \quad (2)$$

Here $G(\cdot)$ is called a transition function taking the values between 0 and 1, and s_t is called a transition variable. If the current regime continues forever or the transition function G takes the same value forever, it can be easily shown that $\lim_{h \rightarrow \infty} E_t(\pi_{t+h}) = \mu_t$. Thus, in this modeling framework we can consider μ_t is the trend inflation under the current regime. If $G(s_t)$ in (2) is equal to 0, $\mu_t = \mu^{(1)}$, while $G(s_t) = 1$ implies $\mu_t = \mu^{(2)}$. Thus, trend inflation modeled as (2) is assumed to have two regimes characterized by $\mu^{(1)}$ and $\mu^{(2)}$, and trend inflation generally takes the value between them depending on the value of the transition function G .

The transition function and transition variable are determined according to the purpose of analysis. For example, Lin and Teräsvirta (1994) investigate a continuous permanent regime change using the logistic transition function with a time-trend transition variable. Since the purpose of this paper is to detect the possible permanent regime shifts in trend inflation in Japan over the last three decades, we follow their research, and use a logistic transition function given as

$$G(s_t; c, \gamma) = \frac{1}{1 + \exp(-\gamma(s_t - c))}, \quad \gamma > 0. \quad (3)$$

⁷This approximation of trend inflation is typically used in the time-varying Bayesian VAR literature, implicitly assuming trend inflation evolves as a driftless random walk. See Ascari and Sbordone (20014), for example. More precise interpretation of trend inflation in this paper will be discussed after we introduce the ST model for μ_t .

Here, c is a location parameter determining the timing of the transition, and γ is a smoothness parameter capturing the speed of the transition. One of the advantages of the logistic transition function is that it can express various forms of transitions depending on the values of c and γ . Additionally, c and γ can be estimated from the data, enabling the selection of the best transition patterns based on data, which is very attractive for the purposes of this paper, particularly examining the regime shifts in trend inflation.

Finally, following Lin and Teräsvirta (1994), we use a time trend $s_t = t/T$ as the transition variable, where T is the sample size. In addition, we assume $0.05 < c < 0.95$ so that we can detect the regime shifts in trend inflation within the sample period. In this setting, $G(s_t)$ takes the value close to zero with smaller s_t around the beginning of the sample period, making μ_t close to $\mu^{(1)}$. Therefore, $\mu^{(1)}$ can be considered to be the trend inflation around the beginning of the sample. In contrast, around the end of the sample, μ_t approaches $\mu^{(2)}$ as $G(s_t)$ approaches one with a larger s_t . Thus, $\mu^{(2)}$ can be considered to be the trend inflation around the end of the sample. Specifically, under these assumptions, the trend inflation μ_t changes from $\mu^{(1)}$ to $\mu^{(2)}$ with time as $G(s_t)$ changes from zero to one. By estimating the model, we can identify not only the trend inflation levels of two regimes, $\mu^{(1)}$ and $\mu^{(2)}$, but we can also identify the timing and speed of the change from $\mu^{(1)}$ to $\mu^{(2)}$.

Furthermore, we can extend the two-regime model (2) to models with three or more regimes. For example, the three-regime model can be written as

$$\mu_t = \mu^{(1)} + G_1(s_t; c_1, \gamma_1)(\mu^{(2)} - \mu^{(1)}) + G_2(s_t; c_2, \gamma_2)(\mu^{(3)} - \mu^{(2)}). \quad (4)$$

Here, G_i , $i = 1, 2$ is the logistic transition function (2), and we assume $0.05 < c_1$ and $c_1 + 0.05 < c_2 < 0.95$. In this model, when s_t is near 0 or around the beginning of the sample, μ_t approaches the trend inflation of the first regime, $\mu^{(1)}$, because both $G_1(s_t)$ and $G_2(s_t)$ take small values near 0. When $c_1 < s_t < c_2$, μ_t becomes close to the trend inflation of the second regime, $\mu^{(2)}$; this is because $G_1(s_t)$ tends to be near one, but $G_2(s_t)$ tends to be near zero. Finally, when $c_2 < s_t$, μ_t is close to $\mu^{(3)}$ with $G_1(s_t)$ and $G_2(s_t)$ taking values near one. Thus, under this specification, the trend inflation μ_t changes from $\mu^{(1)}$ via $\mu^{(2)}$ to $\mu^{(3)}$ with time as first $G_1(s_t)$ changes from zero to one; this is followed by a similar change in $G_2(s_t)$. The extent to which trend inflation is close to each regime's trend inflation, and the way in which it becomes close, depends on the values of c_i and γ_i , which can be estimated from data. This makes the multiple-regime ST model attractive for the examination of the dynamics of trend inflation in Japan

A number of recent studies have pointed out that the flattening of the Phillips curve (1) has been promoted in advanced countries. For instance, Roberts (2006) reports that the US Phillips curve has been flattened since 1980s and that the changes in monetary policy have played an important role in this flattening. Similarly, De Veirman (2009) and Fuhrer, Olivei, and Tootell (2012) document that the Phillips curve has been flattened in Japan since the early 1990s. Therefore, it is quite relevant to consider the time variation in the slope of the Phillips curve. Similar to μ_t , we model β_t using the ST model. For example, the three-regime model is specifically given as

$$\beta_t = \beta^{(1)} + G_1(s_t; c_1, \gamma_1)(\beta^{(2)} - \beta^{(1)}) + G_2(s_t; c_2, \gamma_2)(\beta^{(3)} - \beta^{(2)}) \quad (5)$$

Here, we assume that the transition functions, G_1 and G_2 , in (4) and (5) share the same parameters of c_i and γ_i . In other words, it is assumed that the timing and speed of regime transitions in μ and β are the same. We impose this restriction to increase the tractability of models by reducing the number of parameters to estimate, particularly for the multiple regime models. However, note also that this assumption is not that restrictive, since the actual dynamics could be very different due to the different estimates of $\mu^{(i)}$ and $\beta^{(i)}$ for each regime.

In sum, the ST Phillips curve model in this paper is given by (1) with μ_t and β_t being modeled with the ST model such as (4) and (5).

2.2 Choice of number of regimes

The choice of the number of regimes is crucial for the ST model. As previously discussed, over the last three decades the Japanese economy has experienced many significant events, such as the bursting of the bubble economy, and the introduction of zero interest rate and inflation targeting monetary policies. As a result, it is likely for trend inflation in Japan to have had several regime shifts over the last three decades, but there is no guidance about the number of regime. Hence, it is important to specify the number of regimes. In this paper, we choose the number of regimes based on hypothesis testing, which can compare the models with the M and $M + 1$ regimes. In this subsection, we briefly discuss those tests.

First, we test the one-regime Phillips curve model against the two-regime Phillips curve model. In this case, the null hypothesis and the alternative hypothesis can be expressed as $H_0 : \gamma = 0$ and $H_1 : \gamma > 0$, respectively. However, this test is not standard since parameters

$\mu^{(i)}$ and $\beta^{(i)}$, $i = 1, 2$ cannot be identified under the H_0 .⁸

To deal with this identification problem, Luukkonen, Saikkonen, and Teräsvirta (1988) suggest approximating the logistic function with a first-order Taylor approximation around $\gamma = 0$. This results in the auxiliary regression of the form

$$\pi_t = \sum_{k=1}^K a_k \pi_{t-k} + b_0 + b_1 x_t + b_2 s_t + b_3 x_t s_t + e_t. \quad (6)$$

Luukkonen, Saikkonen, and Teräsvirta (1988) show that testing $H_0 : \gamma = 0$ in the two-regime Phillips curve model characterized with (1) and (2) is equivalent to testing $H'_0 : b_2 = b_3 = 0$ in the auxiliary regression (6). Since there is no identification problem in this auxiliary regression, we can easily test the null hypothesis $H'_0 : b_2 = b_3 = 0$. Specifically, Luukkonen, Saikkonen, and Teräsvirta (1988) demonstrate that the Lagrange-multiplier (LM) test statistic to test H'_0 asymptotically follow the Chi-squared distribution with 2 degree of freedom. Based on their results, we can test the one-regime model against the two-regime model.

Furthermore, Eitrheim and Teräsvirta (1996) develop the LM statistic to test the M -regime model against the alternative of the $M+1$ regime model based on the similar auxiliary regression model. Therefore, Based on their results, we can test, for example, the two-regime model against the three-regime model.

3 Empirical Analysis

In this and the following sections, we discuss our empirical results. Specifically, based on the empirical analysis we address the following questions: (i) How many trend inflation regimes were there over the last three decades in Japan? (ii) Is there any relationship between (trend) inflation regimes and monetary policy regimes? (iii) What were the trend inflation rates under each inflation regime? (iv) Has the trend inflation increased after the adoption of inflation targeting policy by the BOJ? (v) Is the current trend inflation significantly different from the BOJ's target of 2%? (vi) What are the effects of oil prices, stock prices, and exchange rates on Japanese (trend) inflation?

⁸If we express the null hypotheses as $H_0 : \mu^{(1)} = \mu^{(2)}, \beta^{(1)} = \beta^{(2)}$, then there is still an identification issue, since we cannot identify γ and c .

3.1 Data

Our empirical analysis is based on the Japanese monthly data of CPI, industrial production index, nominal effective exchanger rate, oil prices, and stock prices, with the sample period lasting from January 1985 to July 2016. We use two measures for CPI, namely the CPI excluding fresh food and the CPI excluding food and energy. Both data are downloaded from the Ministry of Internal Affairs and Communications, and they are seasonally adjusted by the X-12-ARIMA method. The seasonally adjusted industrial production is obtained from the Ministry of Economy, Trade, and Industry, while the nominal effective exchange rate is downloaded from the BOJ. For the oil price, we use the oil price index obtained from the International Monetary Fund. Finally we collect the TOKYO Price Index (TOPIX) from the Datastream for the Japanese stock price.

We calculate the inflation rate by taking the first difference of log of CPI measures and multiplying them 1200 to annualize. Thus, the inflation rate at time t , π_t , is calculated as

$$\pi_t = 1200(\log p_t - \log p_{t-1}),$$

where p_t is a CPI measure at time t .⁹ We call the inflation based on the CPI excluding fresh food core inflation, and the CPI excluding food and energy core2 inflation.¹⁰

Finally, the output gap is calculated by taking the difference between the industrial production and its trend calculated by the Hodrick-Prescott filter.¹¹

3.2 Choice of Number of Regimes

The purpose of this paper is to investigate the dynamics of trend inflation in Japan over the last three decades and their relationship to monetary policy. To this end, we employ the ST Phillips curve (1) to detect the regime shifts in trend inflation. In this subsection, we select the number of regimes by the sequential testing based on Luukkonen, Saikkonen, and Teräsvirta (1988) and Eitrheim and Teräsvirta (1996), as discussed in the previous section.

⁹During the sample period, the consumption tax rate changed three times in April 1989, April 1997, and April 2014. In this paper, we assume that the consumption tax hikes are fully reflected within one month, and we adjust them by linearly interpolating the data of April from the data in March and May in the concerned year. Rigorously speaking, there are some goods, such as public utility charges, that reflect the consumption tax hike with more than a one-month delay. However, the proportion of those goods is relatively small and should not affect the estimation results.

¹⁰Note that for many countries, including US, the core inflation typically means the core2 inflation in this paper. Note also that the core inflation is the BOJ's official measure for the 2% inflation target.

¹¹More precisely, we normalize it to have zero mean and unit variance.

The second and third rows of Table 1 summarize the results of hypothesis testing of the one-regime model against the two-regime model based on Luukkonen, Saikkonen, and Teräsvirta (1988).¹² The second row shows the values of their proposed LM statistic, and the third row reports their p -values. As can be seen, the LM statistics take large values with small p -values for both inflation measures. Thus, the one-regime model is obviously rejected against the two-regime model, meaning that there is at least one regime shift in Japanese inflation regimes.

[Insert table 1 here]

Next, we test the two-regime model against the three-regime model based on Eitrheim and Teräsvirta (1996). The results are shown in the fourth and fifth rows of Table 1, indicating the great contrast between the two inflation measures. For the core inflation, the two-regime model is preferred to the three-regime model with a large p -value of 0.46. However, for the core2 inflation, the two-regime model is rejected against the three-regime model with less than 5% p -value.

Finally, the last two rows of Table 1 report the results of the hypothesis testing of the three-regime model against the four-regime model. The relatively large p -values suggest that there is no evidence of the four-regime model over the three-regime model for both measures.

In sum, our results demonstrate that the two-regime model is preferred for core inflation, while the three-regime model is dominant for core2 inflation. In other words, it is enough to consider three regimes in trend inflation over the last three decades in Japan. For this reason and to make the results comparable between two inflation measures, we will use the three-regime ST Phillips curve for both measures in the following analysis.

3.3 Inflation Regime and Monetary Policy Regime

In this subsection, we show the estimated regime transition dynamics to see when and how the regime shifts in the three-regime ST Phillips curve model characterized by (1) and (4) have occurred over the last three decades.

We estimate the three-regime ST Phillips curve model via the maximum likelihood estimation (MLE), assuming that ε_t independently and identically follows the Normal distribution

¹²We set $K = 2$ in (1) for the rest of the analysis, since the higher order AR terms are not significant.

with the mean of 0 and variance of σ^2 . The estimation results are documented in Table 2.¹³ For the core inflation, c_1 is estimated to be 0.29, meaning that the center of the transition from Regime 1 to Regime 2 is estimated to be around June 1994. In addition, the estimate of γ_1 of 200 indicates that the speed of the transition is very rapid. To see this point graphically, Figure 1 plots the estimated dynamics of the transition functions $G_1(s_t)$ and $G_2(s_t)$. As can be seen, for the core inflation, G_1 has been almost 0 until the end of 1993, but it increased rapidly to 1 during 1994 and has been 1 since the beginning of 1995. For the core2 inflation, c_1 is estimated as 0.35, suggesting that the center of transition is around March 1996. The speed of the transition is estimated to be relatively slow with a γ_1 estimate of 19.1. As a result, G_1 for the core2 inflation changes from 0 to 1 relatively smoothly between 1994 and 1998, as can be confirmed from Figure 1.

[Insert Table 2 and Figure 1 here]

Regarding c_2 and γ_2 , both inflation measures show quite similar estimation results. c_2 is estimated to be 0.88 and 0.89 for the core and core2 inflation, respectively. In other words, the estimation results indicate that the center of the transition from Regime 2 to Regime 3 is around September 2012 and February 2013 for each measure, respectively. In addition, γ_2 is estimated to be 200 for both measures, meaning that the speed of transition is very rapid. These results can be also verified from the estimated dynamics of G_2 , which are plotted in Figure 1.

In sum, our results suggest that the first regime shift occurred at around 1995, although the speed of transition depended on the measure of inflation. The BOJ had conducted the traditional monetary policy using the bank rate as a policy rate before 1995. However, the liberalization of interest rates was completed in October 1994, and the direct relationship between the bank rate and deposit interest rate has disappeared. Following these events, the BOJ adopted the call rate as a new policy rate in March 1995. Then, the BOJ started the extremely low interest rate policy with the 0.5% call rate in September 1995. Thus, there were significant changes to the BOJ's monetary policy in 1995. Indeed, previous studies, such as Miyao (2000) and Inoue and Okimoto (2008), detect a regime shift in the effect

¹³If the transition function looks like a step function, the estimate of γ_i becomes very large and is not well determined, since the log-likelihood becomes insensitive with γ_i . In these cases, we have fixed γ_i at an upper bound equal to 200 and have re-estimated the model. In this case, the parameter's standard errors are denoted by NA.

of Japanese monetary policy around this period. Interestingly, the first regime shift in the three-regime Phillips curve seems to coincide with this timing.

The second regime shift took place at around the beginning of 2013, and it occurred very rapidly. The BOJ introduced the inflation targeting policy in January 2013 by committing to a 2% price stability target. Following the introduction, the BOJ launched the QQE in April 2013. Obviously, the second regime shift in the three-regime Phillips curve corresponds to these changes.

Thus, there seems to be strong relationship between the inflation regimes and monetary policy regimes in Japan over the last three decades. Specifically, the first inflation regime is characterized by the conventional monetary policy regime. The second inflation regime roughly corresponds to the low or zero interest rate monetary policy regime. The third inflation regime coincides with the inflation targeting monetary policy regime.

3.4 Characteristics of Each Trend Inflation Regime

The previous subsection demonstrated the strong correspondence between the inflation regime and monetary policy regime. In this subsection, we investigate how the trend inflation and slope of the Phillips curve varied through the regime changes, focusing more on the trend inflation.

Figure 2 plots the estimated dynamics of the trend inflation and slope of the Phillips curve based on the three-regime ST Phillips curve model. As can be seen, trend inflation has changed significantly depending on the regimes. In particular, the trend inflation dropped considerably in Regime 2 for both inflation measures with some rebound in Regime 3. Similarly, the slope of the Phillips curve greatly decreased in Regime 2, followed by no change in the core inflation and a further decline in the core2 inflation. This is generally consistent with the recent finding of flattening of the Phillips curve in Japan, which is documented by, among others, De Veirman (2009) and Fuhrer, Olivei, and Tootell (2012). The results also indicate that no shift in the slope of the Phillips curve in Regime 3 is the main reason why the two-regime model is preferred for the core inflation. In other words, the results suggest that there were arguably three regimes in trend inflation for both inflation measures and these three regimes reasonably related to monetary policy regimes.

[Insert Figure 2 here]

Next, we characterize each trend inflation regime more precisely based on the estimates

reported in Table 2. As can be seen in Table 2, the trend inflation in Regime 1 is significantly positive with estimates of 1.5% and 1.9% for core and core2 inflations, respectively. In addition, as confirmed by Figure 2, the trend inflation had been stable until at least 1993. Thus, Regime 1 is characterized by relatively high stable trend inflation for both inflation measures.

In contrast, the trend inflation in Regime 2 is negatively estimated for both measures. More precisely, the core trend inflation in Regime 2 is estimated to be -0.20 , but it is not significantly negative. As a result, the core trend inflation showed a significant decrease at around 1995; it was then stable until the end of 2012. On the other hand, the core2 trend inflation in Regime 2 is estimated significantly negatively with an estimate of -0.61 . As can be seen from Figure 2, the core2 trend inflation changed smoothly from 1.9% to -0.61% between 1994 and 1998, and it stayed the same until the end of 2012. In the 2000s, the BOJ enacted innovative monetary policies, such as the zero interest rate and quantitative easing monetary policies. However, our results indicate that these policies were not enough to keep or recover the positive trend inflation, although they might prevent the trend inflation from decreasing further.

Finally, the core trend inflation in Regime 3 is estimated positively, but it is insignificantly different from 0 with an estimate of 0.34%. As a result, the core trend inflation jumped up from -0.20% to 0.34% in the beginning of 2013, as can be seen in Figure 2. In contrast, the estimate of the core2 trend inflation in Regime 3 is significantly positive with an estimate of 0.47. As a result, the core2 trend inflation had a sizable rapid increase from -0.61% to 0.47% in the beginning of 2013, as confirmed in Figure 2. However, compared with the BOJ's 2% inflation target, the trend inflation in Regime 3 is significantly smaller for both inflation measures. Thus, our results suggest that the BOJ's policies after the introduction of the 2% inflation target, such as QQE and the negative interest policies, are partially successful for escaping from the deflationary regime, but they are not sufficient to achieve the BOJ's 2% inflation target.

4 Results of the Extended Model

Analyses thus far have been based on the hybrid Phillips curve (1). In this model, the current inflation rate is determined by the past inflation rates and the current output gap. However, it is likely that inflation in Japan depends on other variables, such as oil prices, stock prices,

and exchange rates. For example, a rise in inflation was observed after the introduction of the 2% inflation target by the BOJ, which is partly due to the increase in the trend inflation, as we confirmed the previous section. However, it is plausible that price increases in import goods due to the depreciation of yen also played some role. In addition, it is often argued that the recent Japanese inflation was suppressed by a decline in oil prices as a result of the stagnation of the emerging economy, particularly China, and the oversupply by oil producing countries. Indeed, previous studies, such as Hooker (2002) and Hara, Hiraki, and Ichise (2015), have proposed the Phillips curve, including the oil prices and exchange rates. Furthermore, it is conceivable that the stock prices could affect inflation, particularly trend inflation. Following these observations, in this section we extend the benchmark model of the previous section to accommodate the oil prices, stock prices, and exchange rates to see their effects on the inflation and check the robustness of the results of the previous section.

4.1 Extended Phillips Curve

In this subsection, we examine the effects of the oil prices, stock prices, and exchange rates by employing the extended three-state Phillips curve model including these variables. Specifically, following Hooker (2002) and Hara, Hiraki, and Ichise (2015), we consider the following extended Phillips curve:¹⁴

$$\begin{aligned} \pi_t = & \sum_{k=1}^K \alpha_k \pi_{t-k} + (1 - \sum_{k=1}^K \alpha_k) \mu_t + \beta_t x_t + \delta_t \sum_{j=0}^J \Delta o_{t-j} \\ & + \xi_t \sum_{j=0}^J \Delta e_{t-j} + \theta_t \sum_{j=0}^J \Delta q_{t-j} + \varepsilon_t. \end{aligned} \quad (7)$$

Here, $\Delta o_t = 100(\log(O_t) - \log(O_{t-1}))$, $\Delta e_t = 100(\log(E_t) - \log(E_{t-1}))$, $\Delta q_t = 100(\log(Q_t) - \log(Q_{t-1}))$, and O_t , E_t , and Q_t are the oil price index, nominal effective exchange rate, and TOPIX, respectively.¹⁵ One problem associated with this extended Phillips curve is that it is formidable, if not impossible, to consider the three-regime ST model due to the highly nonlinear structure with many parameters to estimate. Therefore, for this analysis, we restrict the data to between 1996 and 2016 and assume that each coefficient evolves the

¹⁴Hooker (2002) uses $J = 2$ without the contemporaneous term, and Hara, Hiraki, and Ichise (2015) set $J = 3$. For our analysis, we employ $J = 2$, which is preferred to $J = 3$ by information criterion for the core inflation. However, the results with $J = 3$ are qualitatively very similar.

¹⁵More precisely, we normalize each variable to have zero mean and unit variance as an output gap to make each coefficient easy to compare.

following two-regime ST model:¹⁶

$$\begin{aligned}
\mu_t &= \mu^{(2)} + G_2(s_t; c_2, \gamma_2) (\mu^{(3)} - \mu^{(2)}) \\
\beta_t &= \beta^{(2)} + G_2(s_t; c_2, \gamma_2) (\beta^{(3)} - \beta^{(2)}) \\
\delta_t &= \delta^{(2)} + G_2(s_t; c_2, \gamma_2) (\delta^{(3)} - \delta^{(2)}) \\
\xi_t &= \xi^{(2)} + G_2(s_t; c_2, \gamma_2) (\xi^{(3)} - \xi^{(2)}) \\
\theta_t &= \theta^{(2)} + G_2(s_t; c_2, \gamma_2) (\theta^{(3)} - \theta^{(2)})
\end{aligned} \tag{8}$$

Judging from the regime dynamics of the previous sections, the assumption of two regimes is not unreasonable when using the data after 1995. In addition, we assume that each coefficient shares the common transition parameters c_2 and γ_2 , as the previous section, to restrain the number of parameters. Thus, we require the timing and speed of the regime transition of each parameter to be the same. However, note that this assumption is not restrictive since we still estimate the coefficient of each regime, for example $\mu^{(i)}$ and $\theta^{(i)}$, allowing for very different dynamics for each coefficient. Finally, we impose the sign restrictions that the coefficient on output gap, oil price, exchange rate, and the stock price are consistent with the economic theory. Specifically, we assume that the coefficients on output gap, oil prices, and stock prices are nonnegative, while the coefficients on the exchange rate are nonpositive.¹⁷

Figure 3 plots the estimated dynamics of each coefficient based on the extended two-regime ST Phillips curve, which is characterized by (7)-(8), for the core inflation.¹⁸ As can be seen, the results demonstrate that the trend inflation experienced a noticeable increase around the beginning of 2013, which is consistent with the results of the previous section. The results also indicate that the coefficient on the output gap and oil price had been positive throughout the sample, although the oil price became less important in Regime 3. On the contrary, the exchange rate turned into an important factor in Regime 3 despite the fact that it had no effect in Regime 2. Finally, the results clearly suggest that stock prices played a minor role throughout the period, particularly in Regime 3.

[Insert Figure 3 here]

Figure 4 shows the results of the dynamics of each coefficient in the extended two-regime ST Phillips curve (7)-(8) for the core2 inflation. As can be seen, the results are qualitatively

¹⁶We call these two regimes Regime 2 and Regime 3 to correspond with results of the previous section.

¹⁷If these restrictions are bound for some coefficients, we replace them with 0 and re-estimate the model.

¹⁸To save space, the estimates are not reported here, but they are available upon request from the author.

similar to those of the core inflation, except that the oil prices were not important throughout the sample. This is not surprising, since the core2 inflation is calculated from the CPI excluding food and energy. More importantly, the results suggest that the trend inflation increased notably in Regime 3 and the exchange rate became influential in Regime 3, although the effects of stock prices were completely negligible.

[Insert Figure 4 here]

To see these points more clearly, we have calculated the estimate for each factor component in the extended two-regime ST Phillips curve (7)-(8) and plotted them in Figure 5.¹⁹ As can be seen, the core trend inflation lowered the core inflation by -0.16% in Regime 2, while it elevated the core inflation by 0.25% in Regime 3. Similarly, the core2 trend inflation decreased the core2 inflation by -0.40% in Regime 2, while it increased the core2 inflation by 0.46% in Regime 3. Thus, the results demonstrate that the negative trend inflation was one of the main causes of the deflationary regime between 1996 and 2012; the result also indicate that changes in trend inflation were one of the key factors in the recent increase in inflation. Furthermore, the results illustrate that both the output gap and oil prices played a significant role in determining the core inflation in Regime 2, but they became less important in Regime 3. In particular, the results indicate that the recent decline in oil prices has lowered the core inflation at most 0.1% . Correspondingly, both output and oil prices had no effect on the core2 inflation in Regime 3, although the output gap was relatively influential in Regime 2. On the contrary, the exchange rate affected the core and core2 inflation more significantly in Regime 3 than in Regime 2, showing that the rapid depreciation of the yen after the introduction of the 2% inflation target increased the core (core2) inflation by up to 0.18% (0.24%), but the appreciation of the yen during the last one year of the sample lowered it by -0.27% (-0.35%). Finally, the stock prices had little effect on either the core or the core2 inflations in both regimes 2 and 3.

[Insert Figures 5 here]

In sum, our results are clear-cut. Even if we consider the effects of oil prices, stock prices, and exchange rates on inflation, trend inflation shows similar dynamics to the previous section. Specifically, trend inflation has been below 0% and stable until the end of 2012; it

¹⁹For this figure, we have taken the 12-month moving average to filter out the short-run fluctuation.

rapidly increased to more than 0% at around the beginning of 2013. Thus, our results demonstrate that the negative trend inflation was one of the main causes of the deflationary regime between 1996 and 2012; our results also indicate that changes in trend inflation were one of the key factors for the recent increase in inflation. In addition, our results suggest that while the output gap and oil prices were relatively important in Regime 2, the exchange rate played an essential role in explaining the rise and decline of both core and core2 inflations in Regime 3. Finally, it was clear that stock prices were not a significant determinant of inflation in both Regime 2 and Regime 3.

4.2 ST Phillips Curve with Multiple Transition Variables

In the previous subsection, we extended the Phillips curve so that the oil prices, stock prices, and exchange rates could affect the realization of inflation. However, in that model, these variables could not influence the trend inflation directly, although it is of great interest to examine the effects of these variables on the trend inflation. Therefore, it is informative to investigate how the recent depreciation of the yen, decline in oil prices, and surge in stock prices affect the dynamics of trend inflation regimes. In this subsection, we extend the benchmark model so that the oil prices, stock prices, and exchange rates can influence the trend inflation regime.

To this end, we use the benchmark ST Phillips curve model (1) with the extended transition function, including oil prices, stock prices, and exchange rates. More specifically, we define a transition variable vector as $s_t = (t/T, \sum_{j=0}^J \Delta o_{t-j-1}, \sum_{j=0}^J \Delta q_{t-j-1}, \sum_{j=0}^J \Delta e_{t-j-1})'$ and assume that the transition function for the trend inflation can be written as

$$G(s_t) = \frac{1}{1 + \exp[-\gamma_T(s_{1,t} - c_T) - \gamma_O(s_{2,t} - c_O) - \gamma_E(s_{3,t} - c_E) - \gamma_Q(s_{4,t} - c_Q)]}, \quad \gamma_T > 0 \quad (9)$$

Thus, in this model, we can capture the transition of trend inflation depending not only on time but also on the oil prices, stock prices, and exchange rates. Similar to the model in the previous subsection, this model may be too complicated to estimate the three-regime model. Therefore, we restrict the data to between 1996 and 2016, and we assume that there are only the two regimes, like in the previous subsection.²⁰ In addition, we assume $\gamma_O = 0$ for the

²⁰We again call these two regimes Regime 2 and Regime 3 to make them correspond with the results so far.

core2 inflation, since it is hard to expect that the oil price affects the trend inflation of core2 inflation by definition.

Table 3 summarizes the estimation results of the two-regime ST Phillips curve model (1) with (9) as a transition function for the trend inflation regime.²¹ As can be seen, the results of the trend inflation are consistent with the previous results. To be specific, for the core inflation, the trend inflation is estimated to be negative in Regime 2 and positive in Regime 3, although they are not significantly different from 0. In contrast, for the core2 inflation, the trend inflation was significantly negative in Regime 2 and significantly positive in Regime 3. The results also indicate that the oil prices significantly affected the trend inflation regime for the core inflation. Specifically, the positive estimate suggests that if the oil price has increased over the last three months, then the trend inflation regime tends to shift from the deflationary regime (Regime 2) to the inflationary regime (Regime 3). Thus, our results indicate the possibility that the recent decline in the oil prices pulls back the current inflation regime to the deflationary regime. Finally, our results show that the exchange rate played an insignificant role in determining the trend inflation regime for both inflations, while stock prices had a significant positive impact on the trend inflation regime. This greatly contrasts with the results of the previous subsections. Thus, for the realization of the inflation, the exchange rate matters more; however, for the trend inflation regime, the stock prices are more important. This is relevant because the exchange rate directly affects inflation through the price of import goods, while the stock prices should have more of an effect on the people's minds, altering the trend inflation.

[Insert Table 3 here]

To see the joint effects of these variables on the trend inflation, Figure 6 plots the estimated dynamics of trend inflation based on the two-regime ST Phillips curve model (1) with (9) as a transition function for the trend inflation regime. As can be seen, the results suggest that the trend inflation had been negative and stable almost all the time before 2013, but the trend inflation increased rapidly to more than 0.5% around the beginning of 2013 for both inflation measures. This regime shift was caused by the drastic changes in the BOJ's monetary policy, which was captured by the time-trend variable and the corresponding surge

²¹As in the previous subsection, we set $J = 2$ for this analysis. In addition, if the estimate of γ_i reaches the upper limit of 200, we set $\gamma_i = 200$ and re-estimate the model. In this case, the parameter's standard errors are denoted by NA.

in stock prices. However, the trend inflation occasionally went back to the deflationary regime even after that. For the core inflation, the oil and stock price decreases seemed to be equally responsible for this reversion, while the stock price decline was the main reason for the core2 inflation.

[Insert Figure 6 here]

In sum, the results of this subsection show the robustness of our findings of the shift in the trend inflation from the deflationary regime to the inflationary regime after the introduction of the 2% inflation target by the BOJ. In addition, our results indicate the importance of oil and stock prices in maintaining the inflationary regime. The BOJ tripled the purchase of ETF in October 2014 and almost doubled it again in July 2016. Our results suggest that this kind of policy could be effective in preventing the trend inflation regime from going back to the deflationary regime, which was mainly observed before 2013.

5 Conclusions

Over the last three decades, the Japanese economy has experienced many significant events, such as the bursting of the bubble economy, the lost two decades, the Lehman and Euro financial crises, and the introduction of a zero interest rate and inflation targeting monetary policies. It is quite meaningful to empirically study how trend inflation rates in Japan have evolved through these events. Along this vein, this paper investigated the possible regime shifts in trend inflation in Japan over the last three decades and their relation with monetary policy regimes.

We applied the ST Phillips curve model to identify the number of regimes, characterize each regime, and estimate the dynamics of trend inflation. Our results indicated that there were arguably three regimes in the trend inflation in Japan over the last three decades. In addition, our results suggested that these three regimes reasonably corresponded to the traditional monetary policy regime between 1985 and 1994 (Regime 1), the extremely low interest rate monetary policy regime between 1995 and 2012 (Regime 2), and the inflation targeting monetary policy regime since 2013 (Regime 3).

Our three-regime ST Phillips curve model showed that the trend inflation in Regime 1 was relatively high with more than 1.5%, and stable. Nonetheless, the trend inflation in Regime 2 decreased considerably and stayed below 0% most of the time in this regime, although in the

2000s the BOJ enacted many pioneering monetary policies, such as a zero interest rate and quantitative easing monetary policies. Thus, those BOJ's monetary policies were not enough to escape from the deflationary regime, although they most likely supported the Japanese economy and prevented the trend inflation from decreasing further. Finally, the trend inflation in Regime 3 revealed a sizable increase, recovering the inflationary regime. However, our results clearly demonstrated that the trend inflation in Regime 3 was significantly smaller than the BOJ's 2% inflation target for both inflation measures. Thus, the QQE and the negative interest policies conducted in Regime 3 were partially successful to escape from the deflationary regime, but they were not sufficient to achieve the BOJ's 2% inflation target.

In addition, we extended the benchmark model so that the oil prices, stock prices, and exchange rates could affect inflation. Here, our results indicated that the oil price and exchange rate had relatively large effects on the core inflation in Regime 2 and Regime 3, respectively. On the other hand, the oil prices, stock prices, and exchange rates had little effect on the core2 inflation in Regime 2, although the exchange rates became influential in Regime 3. Thus, our results suggested that the depreciation of the Japanese yen occurred due to the introduction of the inflation targeting policy by the BOJ played an important role on the significant increase of inflation in 2013. Furthermore, the recent rebound of the exchange rates is an important cause of the recent decline in inflation.

Finally, we also considered another type of extended model in which the oil prices, stock prices, and exchange rates could affect the dynamics of the trend inflation regime. Our results showed that the oil and stock prices had a significant impact on the trend inflation regime for the core inflation, while the stock price strongly affected the trend inflation regime for the core2 inflation. This greatly contrasts with the above results, which show the importance of the exchange rates in explaining the realization of inflation. More specifically, our results demonstrated that, even after 2012, the trend inflation regime tended to move back to the deflationary regime when the oil prices or stock prices decreased markedly. Therefore, the BOJ's purchase of ETF could be effective in preventing the trend inflation from going back to the deflationary regime that was mainly observed before 2013.

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Table 1: Results of the hypothesis testing

		Core	Core2
1 regime vs 2 regimes	LM stat	15.16	65.00
	P-value	0.0190	0.0000
2 regimes vs 3 regimes	LM stat	5.72	13.68
	P-value	0.4554	0.0334
3 regimes vs 4 regimes	LM stat	8.572	8.369
	P-value	0.1991	0.2123

Notes: The table shows the results of the sequential testing of the M regime smooth-transition model against the $M+1$ regime smooth-transition model based on Luukkonen, Saikkonen, and Teräsvirta (1988) and Eitrheim and Teräsvirta (1996), where M is the number of regime under the null hypothesis. Core inflation is calculated from the headline CPI excluding fresh food, while core2 inflation is calculated from the headline CPI excluding food and energy.

Table 2: Estimation results of bench mark model

	Core		Core2	
	Estimate	Std. Error	Estimate	Std. Error
$\mu^{(1)}$	1.452	0.231	1.924	0.156
$\beta^{(1)}$	0.537	0.267	0.623	0.237
$\mu^{(2)}$	-0.195	0.152	-0.605	0.106
$\beta^{(2)}$	0.171	0.135	0.130	0.081
$\mu^{(3)}$	0.338	0.563	0.475	0.215
$\beta^{(3)}$	0.186	0.787	0.001	0.521
α_1	0.238	0.050	-0.091	0.054
α_2	0.144	0.061	0.051	0.052
σ	1.421	0.056	1.358	0.049
γ_1	200	NA	19.14	5.203
c_1	0.294	0.010	0.350	0.019
γ_2	200	NA	200	NA
c_2	0.8770	0.0230	0.8906	0.0218
LLH	-665.6		-648.6	

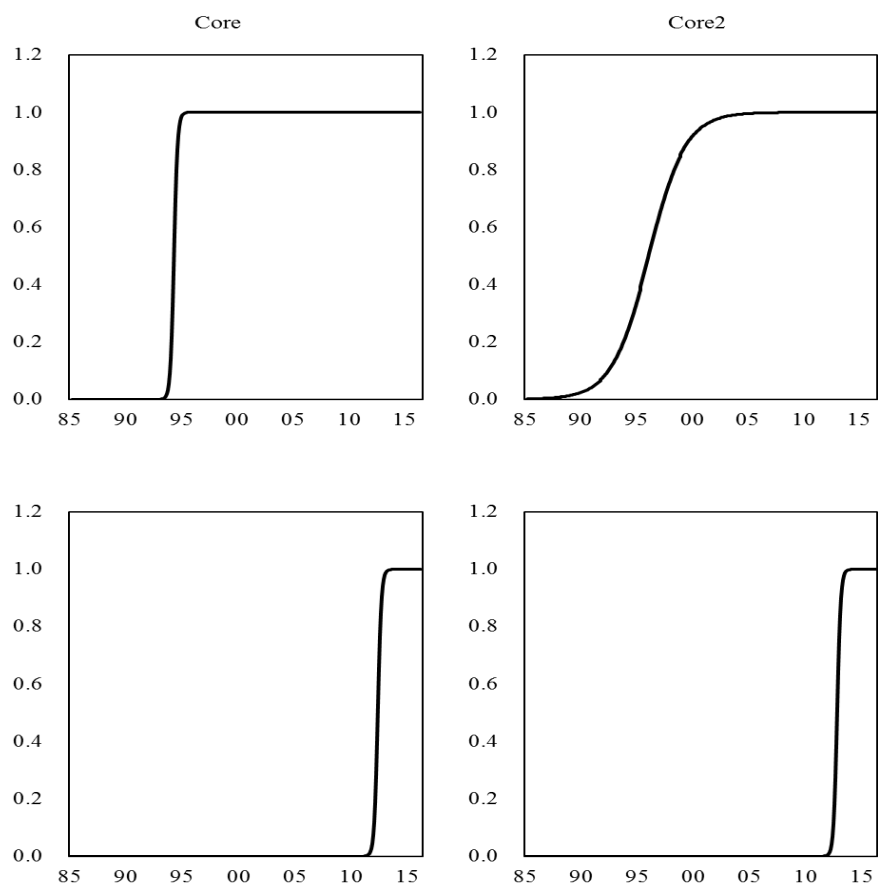
Note: The table shows the estimation results of the three-regime ST Phillips curve model (1) based on the maximum likelihood estimation, assuming that the error term independently and identically follows the Normal distribution with the mean of 0 and variance of σ^2 . If the estimate of γ_i reaches the upper bound of 200, we have fixed γ_i at 200 and have re-estimated the model. In this case, the parameter's standard errors are denoted by NA. LLH reports the log-likelihood value of each model.

Table 3: Estimation results of multiple transition variable model

	Core		Core2	
	Estimate	Std. Error	Estimate	Std. Error
$\mu^{(2)}$	-0.2290	0.1531	-0.3974	0.0880
$\beta^{(2)}$	0.2272	0.1078	0.1716	0.0833
$\mu^{(3)}$	0.5591	0.4085	0.5719	0.2397
$\beta^{(3)}$	0.7780	0.8287	0.3182	0.9184
γ_T	200	NA	200	NA
c_2	0.8614	0.0116	0.8932	0.0124
γ_O	8.8265	2.8311	0	NA
γ_E	-0.0001	1.0841	-0.9865	3.3808
γ_S	8.1270	3.8458	13.0258	4.7553
LLH	-437.5		-427.6	

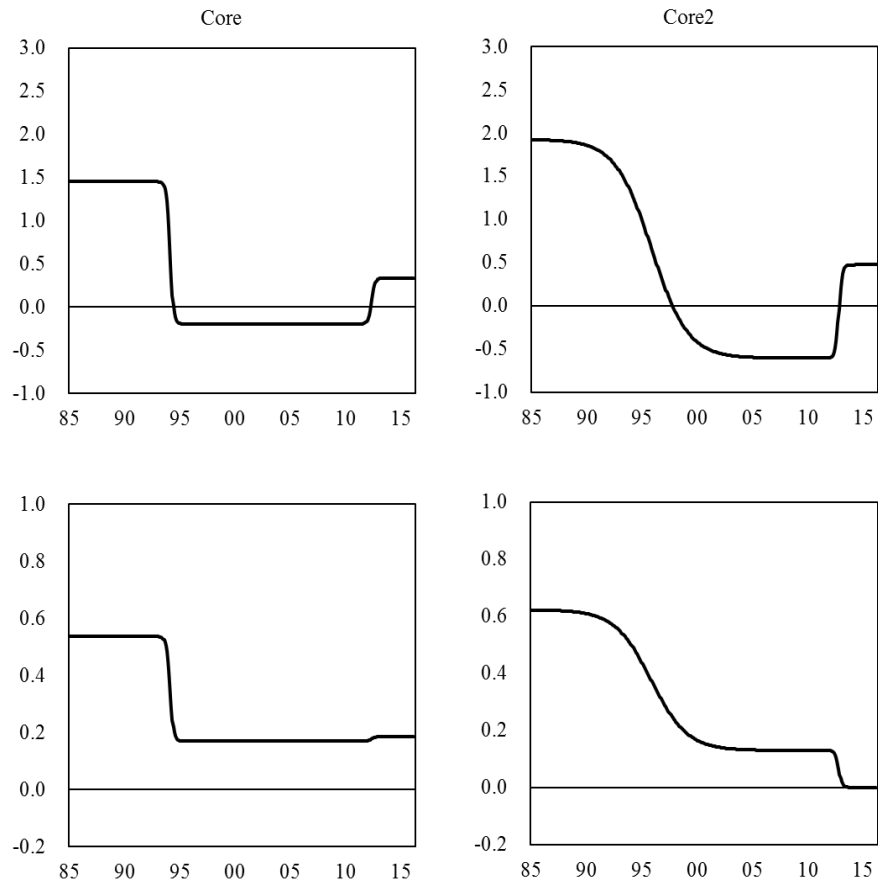
Note: The table shows the estimation results of the two-regime ST Phillips curve model (1) with (9) as a transition function for the trend inflation regime. If the estimate of γ_i reaches the upper bound of 200, we have fixed γ_i at 200 and have re-estimated the model. In this case, the parameter's standard errors are denoted by NA. LLH reports the log-likelihood value of each model. For this estimation, we restrict the data to between 1996 and 2016, and we assume that there are only the two regimes. In addition, we assume $\gamma_O = 0$ for the core2 inflation, since it is hard to expect that the oil price affects the trend inflation of core2 inflation by definition.

Figure 1: Dynamics of transition functions



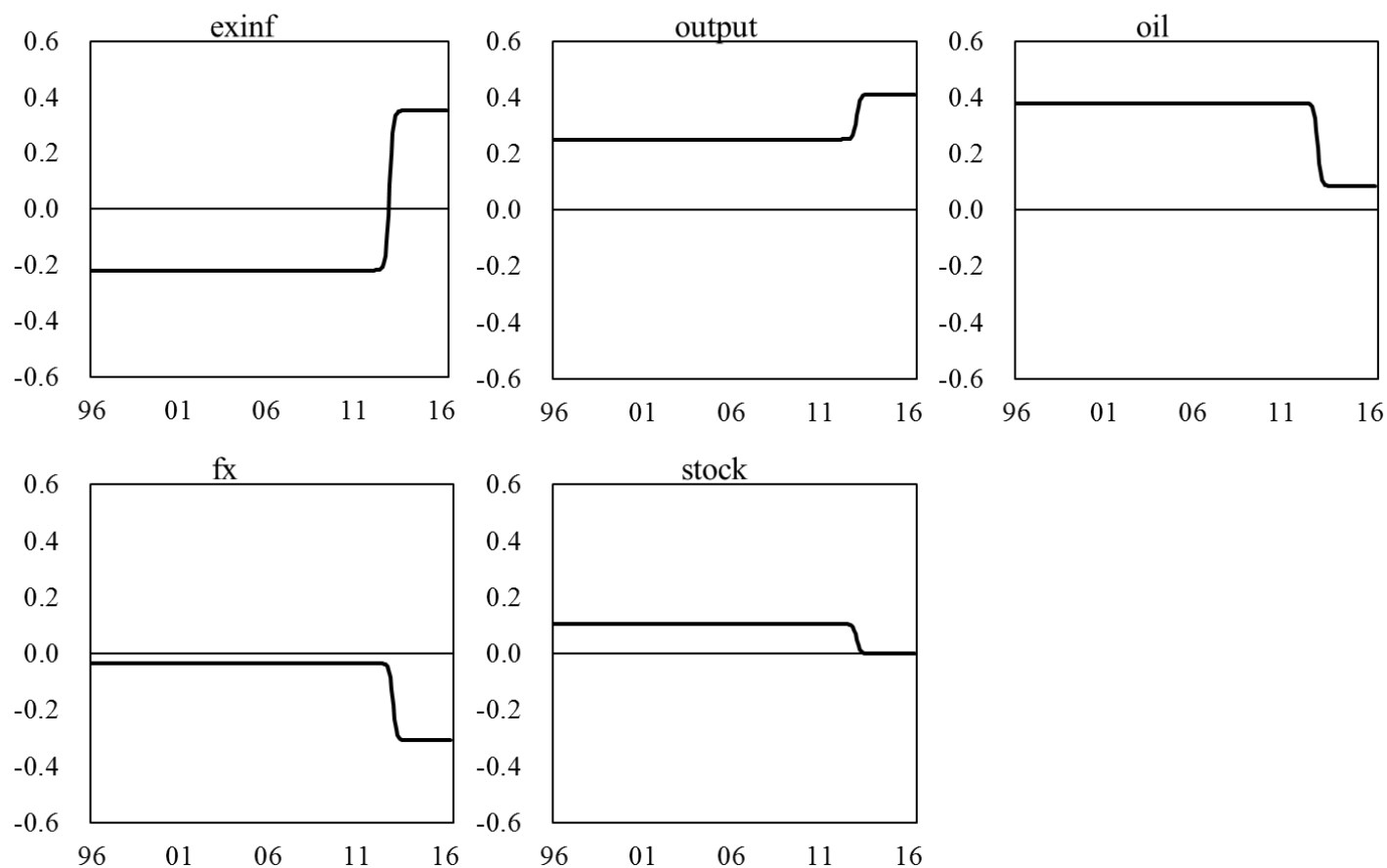
Notes: The graph shows the estimated time series of two transition functions of the three-regime ST Phillips curve model (1).

Figure 2: Dynamics of expected inflation and the slope of the Phillips curve



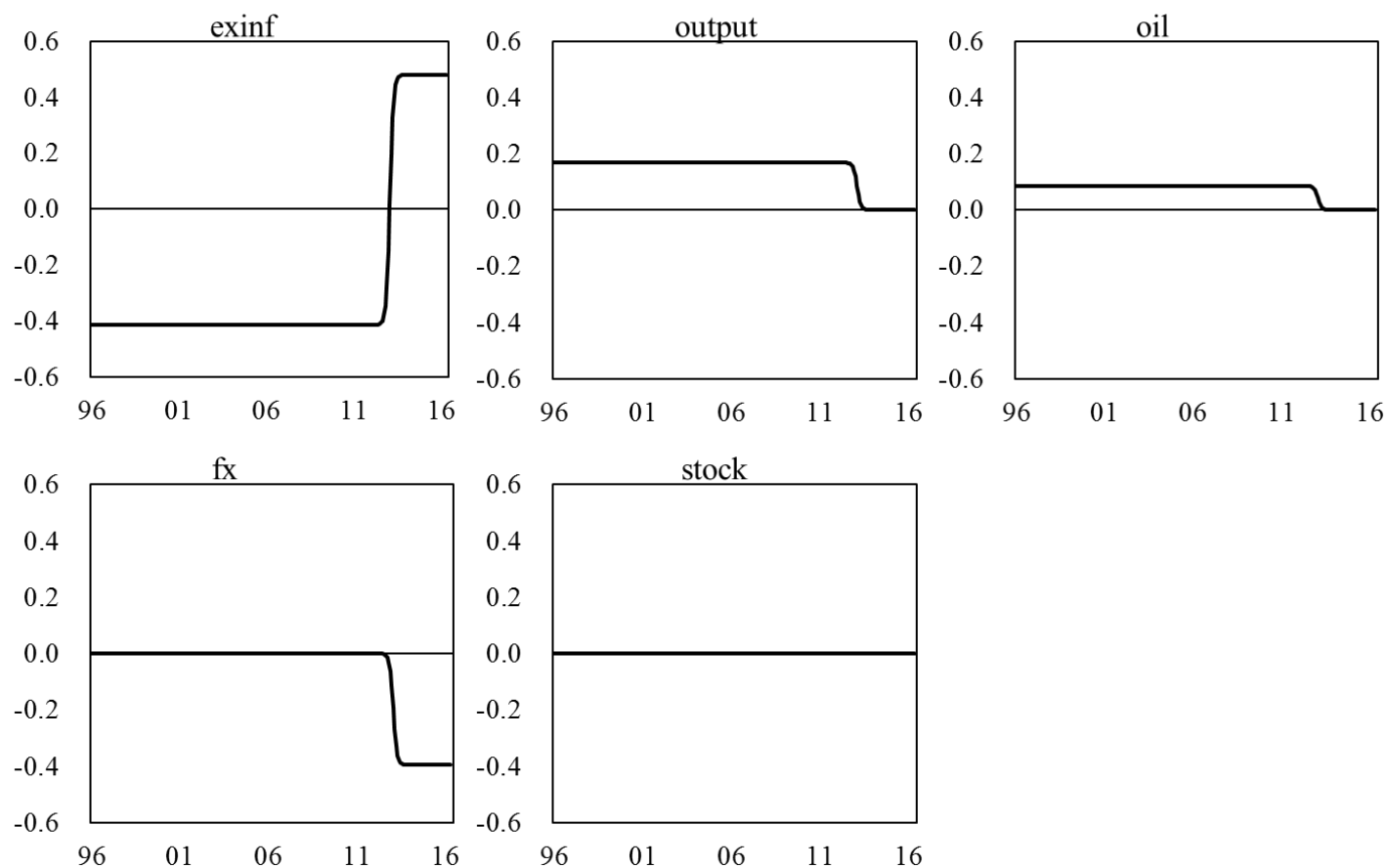
Notes: The graph shows the estimated time series of trend inflation in percentage and the slope of the Phillips curve, based on the three-regime ST Phillips curve model (1).

Figure 3: Dynamics of each coefficient for the core inflation



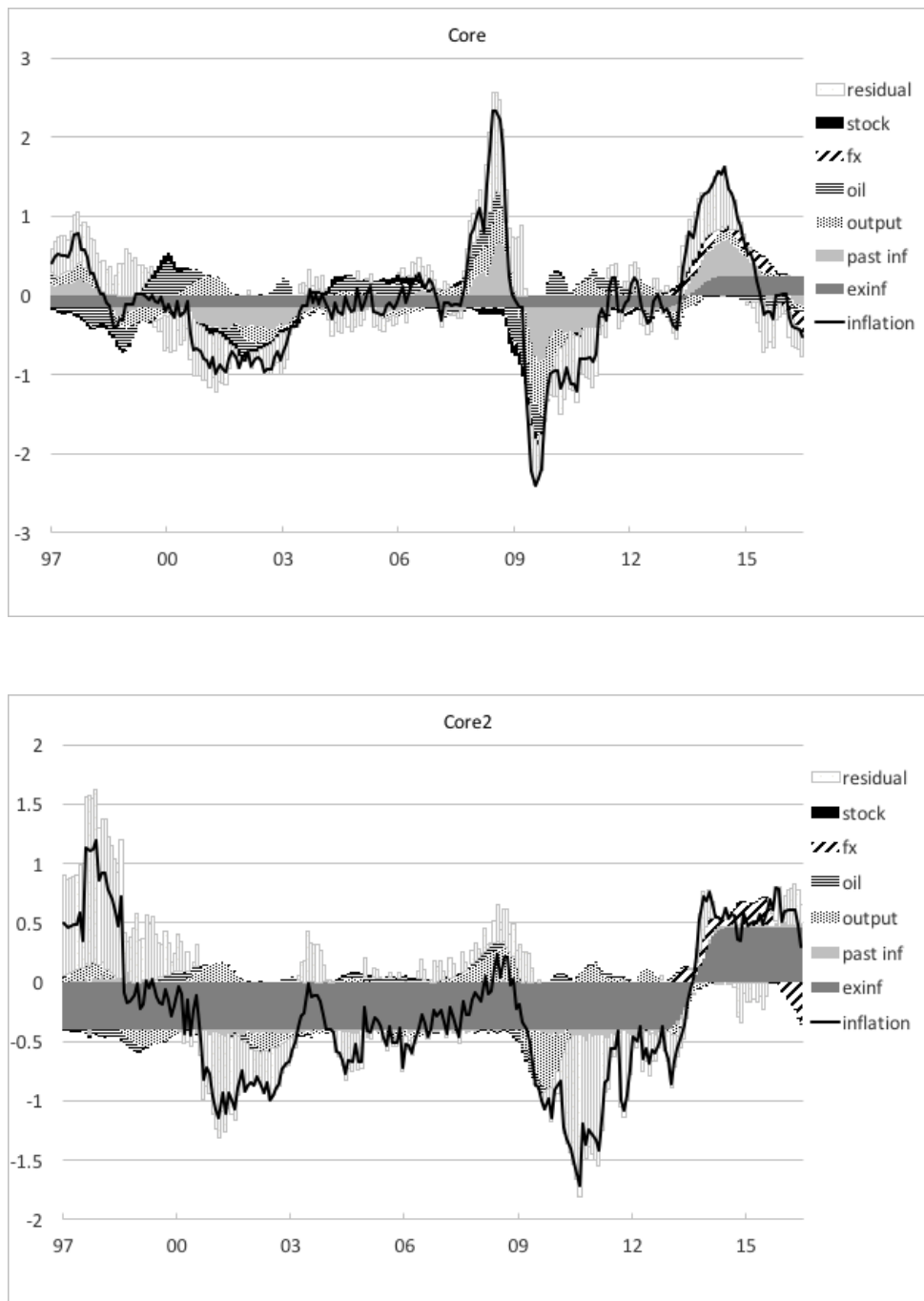
Notes: The graph shows the estimated time series of trend inflation in percentage and the coefficient on each variable, based on the extended two-regime Phillips curve model (7)-(8). For this estimation, we restrict the data to between 1996 and 2016, and we assume that there are only the two regimes.

Figure 4: Dynamics of each coefficient for the core2 inflation



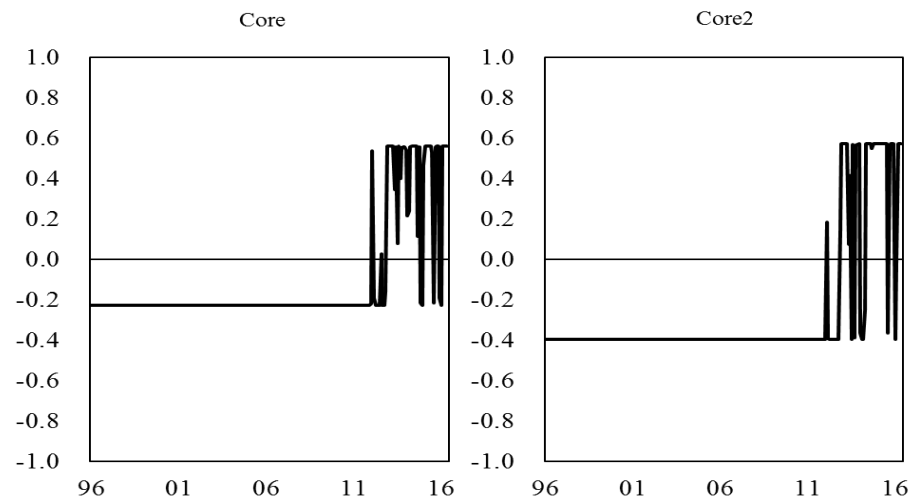
Notes: The graph shows the estimated time series of trend inflation in percentage and the coefficient on each variable, based on the extended two-regime Phillips curve model (7)-(8). For this estimation, we restrict the data to between 1996 and 2016, and we assume that there are only the two regimes.

Figure 5: Factor decomposition of the inflations



Notes: The graph shows the estimate for each factor component in percentage in the extended two-regime ST Phillips curve model (7)-(8). For this estimation, we restrict the data to between 1996 and 2016, and we assume that there are only the two regimes.

Figure 6: Dynamics of expected inflation based on the multiple transition variable model



Note: The graph shows the estimated time series of trend inflation in percentage based on the extended two-regime Phillips curve model (1) with (9) as a transition function for the trend inflation regime. For this estimation, we restrict the data to between 1996 and 2016, and we assume that there are only the two regimes.