

Working Paper Series



Thomas Y. Wu May, 2004

Working Paper Series	Brasília	n. 83	Мау	2004	P. 1-26

Working Paper Series

Edited by:

Research Department (Depep)

(E-mail: workingpaper@bcb.gov.br)

Reproduction permitted only if source is stated as follows: Working Paper Series n. 83.

Authorized by Afonso Sant'Anna Bevilaqua (Deputy Governor for Economic Policy).

General Control of Publications

Banco Central do Brasil Secre/Surel/Dimep SBS – Quadra 3 – Bloco B – Ed.-Sede – M1 Caixa Postal 8.670 70074-900 Brasília – DF – Brazil Phones: (5561) 414-3710 and 414-3711 Fax: (5561) 414-3626 E-mail: editor@bcb.gov.br

The views expressed in this work are those of the authors and do not necessarily reflect those of the Banco Central or its members.

Although these Working Papers often represent preliminary work, citation of source is required when used or reproduced.

As opiniões expressas neste trabalho são exclusivamente do(s) autor(es) e não refletem, necessariamente, a visão do Banco Central do Brasil.

Ainda que este artigo represente trabalho preliminar, citação da fonte é requerida mesmo quando reproduzido parcialmente.

Banco Central do Brasil Information Bureau

Address:	Secre/Surel/Diate
	SBS – Quadra 3 – Bloco B
	Edifício-Sede – 2º subsolo
	70074-900 Brasília – DF – Brazil
Phones:	(5561) 414 () 2401, 2402, 2403, 2404, 2405, 2406
DDG:	0800 992345
Fax:	(5561) 321-9453
Internet:	http://www.bcb.gov.br
E-mails:	cap.secre@bcb.gov.br
	dinfo.secre@bcb.gov.br

Does Inflation Targeting Reduce Inflation? An Analysis for the OECD Industrial Countries^{*}

Thomas Y. Wu^{**}

Abstract

Despite of its popularity, empirical studies have failed to find evidence of the causal effect of a country's adoption of the Inflation Targeting regime on that country's inflation rate decline. This paper applies the multi-period differences-in-differences estimation to the quarterly CPI inflation rates from the first quarter of 1985 until the third quarter of 2002 to the 22 OECD industrial countries and finds two basic sets of results. The first set of evidences is that countries that have officially adopted Inflation Targeting experience a decrease in their average inflation rates that is not only due to a reversion to mean process. The second set of results is that (1) there seems to be no evidence that Inflation Targeting countries experienced a significant increase in the level of their real interest rates after they adopted the new regime and that (2) even after controlling for the level of real interest rates there is still a causal effect from the adoption of Inflation Targeting to the reduction in inflation rates. In other words, the empirical evidence rejects the idea that the better performance in the inflation rates of the Inflation Targeting countries is only due to a more "aggressive" monetary policy.

Keywords: Inflation targeting, Monetary policy, Empirical evaluation **JEL Classification**: E42, E52, E58

^{*} The author would like to thank Lars Svensson, Adriana Lleras-Muney, Giovanni Mastrobuoni, Helio Mori, Marcelo Kfoury Muinhos and an anonymous referee for useful comments and suggestions.

^{*} Graduate student at the Economics Department, Princeton University. E-mail: tywu@Princeton.EDU

1. Introduction

After the introduction in New Zealand in 1990, many others developed and emerging countries also adopted Inflation Targeting as their monetary policy regime [see Carare and Stone (2003) for a survey]. Despite of its popularity, most empirical studies have failed to find evidence of the causal effect of a country's adoption of the Inflation Targeting regime on that country's inflation rate. Taking an event-study approach, Neumann and von Hagen (2002) "cannot confirm the superiority of IT over other monetary policy strategies geared at price stability". Using a two-period differences-in-differences analysis for 20 OECD countries, Ball and Sheridan (2003) "find strong evidence of generic regression to mean. Just as short people on average have children who are taller than they are; countries with unusually high and unstable inflation tend to see these problems diminish, regardless of whether they adopt inflation targeting." They conclude that once these initial effects are controlled "the apparent benefits of [inflation] targeting disappear."

The problem with Neumann and von Hagen (2002)'s methodology is that the sample selected is small and arbitrary. There are only 6 Inflation Targeting countries (Australia, Canada, Chile, New Zealand, Sweden and the United Kingdom) and only 3 non Inflation Targeting countries (Germany, Switzerland, and the United States) from which 2 of them are "accused" to behave in practice as an Inflation Targeting country: Germany [see Bernanke and Mihov (1998)] and the United State [see Mankiw (2001)]. The potential sample selection bias is large. The sample used in Ball and Sheridan (2003) is more representative (20 OECD countries). Since they are regressing the change in the mean of the inflation rate in two different periods in Inflation Targeting dummies, they are running a regression with only 20 observations. The potential problem associated with the small sample is the lack of power to reject a false null hypothesis¹. Furthermore, the before and after sample averages constructed to calculate the change in inflation rates cover different periods across countries (since each of them adopted the regime in different period in time) which leaves for the non Inflation Targeting countries an arbitrarily choice of the "break" date, which could potentially affect the results.

¹ The null hypothesis on question is that the coefficient of the Inflation Targeting dummy is equal to zero, which means that Inflation Targeting does not matter.

The main objective of this paper is to provide further empirical evidence of whether or not the official adoption of the Inflation Targeting monetary policy regime by a country is effective to reduce both the unconditional inflation rate and the inflation rate conditional on the monetary policy instrument utilization in that country. We are also interested to test if this effect persists after initial conditions in inflation rates are controlled. This paper avoids the potential problems of previous works using the multiperiod differences-in-differences estimation to the quarterly CPI inflation rates from the first quarter of 1985 until the third quarter of 2002 to all the 22 OECD countries. The multi-period differences-in-differences is a more suitable framework when the different individuals in the sample started the "treatment" in different periods². As we will see in the dataset description, the range of dates when countries in our sample adopted the Inflation Targeting regime varies from March 1990 (New Zealand) to January 2000 (Switzerland).

The first set of evidence found is that, after controlling for country specific effects and time effects, countries that have officially adopted Inflation Targeting experience a decrease in their average inflation rates after the adoption of the new regime and no evidence that this estimated effect is only due to a reversion to mean process in the inflation rate. The second set of results is found reapplying the analysis conditioning the expected inflation rate to the real interest rate. The real interest rate is the channel through which the short run nominal interest rate determined by the Monetary Authority affects the inflation rate (by affecting credit, consumption, investment and the usual components of the aggregate demand). One could suggest that the performance "gain" in the inflation rates of the adoption of the Inflation Targeting regime is only due to a more "aggressive" monetary policy. But we fail to find empirical evidence that Inflation Targeting the new regime. Furthermore, we also find strong empirical evidence of a decrease in the level of inflation rates even after the controlling for the real interest rate level.

² Chapter 11 in Stock and Watson (2002) describes the general set up of the multi-period differences-indifferences estimator (see Appendix 11.2). For more technical details on panel regression and fixed effects estimators, see Chapter 5 in Hayashi (2000).

OECD	Inflation Targeting:		
countries	Yes or no?	When?	
Australia	1	Sep-94	
Austria	0	-	
Belgium	0	-	
Canada	1	Feb-91	
Denmark	0	-	
Finland	1	Feb-93 to Dec-98	
France	0	-	
Germany	0	-	
Greece	0	-	
Ireland	0	-	
Italy	0	-	
Japan	0	-	
Luxembourg	0	-	
Netherlands	0	-	
New Zealand	1	Mar-90	
Norway	0	-	
Portugal	0	-	
Spain	1	Nov-94 to Dec-98	
Sweden	1	Jan-93	
Switzerland	1	Jan-00	
United Kingdom	1	Oct-92	
United States	0	-	
Total	8	-	

Table 1: Selected OECD Countries Characteristics (1 = yes, 0 = no)

The rest of the paper is organized as follows: Section 2 briefly describes the dataset and the estimation strategy of the multi-period differences-in-differences. Section 3 estimates the effect of the Inflation Targeting regime on the expected inflation rates not conditioned in any other macroeconomic variable. Section 4 recalculates the effects of the Inflation Targeting regime on the expected inflation rates conditioned on lagged values of the real interest rates. Section 5 concludes.

2. Methodology and Data Description

Since the interest in this paper is on the causal effect of the adoption of Inflation Targeting on the inflation rate of a country, the differences-in-differences estimator is the natural approach. The sample includes quarterly CPI inflation rates and interest rates for the 22 OECD industrial countries from the first quarter of 1985 until the third quarter of 2002 (71 periods). This data was collected in the IMF IFS database. For these

22 countries, the control group consists of the 12 countries that have never officially adopted Inflation Targeting regime during our sample period. For the 8 countries in the treatment group, the official date of adoption of the Inflation Targeting regime varies from March 1990 (New Zealand) to January 2000 (Switzerland)³.

The differences-in-differences estimator compares the average change in the inflation rate for the countries in the treatment group over the course of the experiment (the official adoption of the Inflation Targeting regime) relative to the average change in the inflation rate in the control group over the same time. When there are more than two periods, the differences-in-differences estimator in the multi-period can be calculated in a panel regression with combined time and country specific fixed effects:

(1)
$$\pi_{it} = \beta_0 + \beta_1 \text{Treatment}_{it} + \beta_2 C_i + \beta_3 T_t + \varepsilon_{it}$$

where i = 1,..., 22 denotes the country in alphabetical order, t = 1,..., 71 denotes the periods from 1985.1 to 2002.3, π_{it} is the CPI inflation rate for country i in period t, Treatment_{it} = 1 if the ith country official monetary policy regime was Inflation Targeting in period t and = 0 otherwise, C_i is a set of controls for omitted variables that vary across countries but are constant through time, and T_t is a set of controls for omitted variables that vary through time but are constant across countries. In equation (1), β_1 is the differences-in-differences coefficient. If the official adoption of the Inflation Targeting regime by a country effectively reduces that country's inflation rate, we should expect a negative and significant coefficient.

As mentioned in the Introduction, this is not the only test in which we are interested. We are also interested to test whether or not the estimated effect measured by β_1 is just capturing an exogenous tendency of inflation to revert to common mean. This would be the case if the countries that adopted Inflation Targeting were countries with high inflation rates that would fall independently of the adoption or not of the Inflation Targeting regime. This hypothesis will be tested with the inclusion of the first lag of the inflation rate as one of the regressors:

³ Also note that two of these countries, Finland and Spain, abandoned the Inflation Targeting regime prior to the launch of the European Currency Union in January 1, 1999.

(2)
$$\pi_{it} = \beta_0 + \beta_1 \text{Treatment}_{it} + \beta_2 \pi_{i,t-1} + \beta_3 C_i + \beta_4 T_t + \varepsilon_{it}$$

If we estimate a coefficient associated with the first lag of the inflation rate, β_2 , between 0 and 1, this will indicate that the inflation rate follows a stationary autoregressive process, which tends to revert to the mean. Intuitively, this new specification is just saying that the inflation rate presents a certain degree of persistence or inertia. In the presence of persistence or inertia, countries with higher initial inflation rates will experience a higher decrease in their inflation rates. This can be seen if we subtract $\pi_{i,t-1}$ from both sides of equation (2):

(3)
$$\Delta \pi_{it} = \beta_0 + \beta_1 \text{Treatment}_{it} + (\beta_2 - 1)\pi_{i,t-1} + \beta_3 C_i + \beta_4 T_t + \varepsilon_{it}$$

If β_2 lie between 0 and 1, then ($\beta_2 - 1$) will lie between -1 and 0: the higher is the inflation rate in one quarter the higher will be the decrease in the inflation rate in the next quarter. If it were the case that Inflation Targeting countries experienced a higher decrease in inflation rates only because they were the countries with high inflation in the beginning of our sample period (the second half of the 80's), then we would expect a significant β_2 and an non significant β_1 .⁴

Finally we reapply the analysis conditioning the expected inflation to the real interest rate. The real interest rate is the channel through which the short run nominal interest rate determined by the Monetary Authority affects consumption, credit, investment and all the usual components of the aggregate demand, affecting the inflation rate. So suppose we find empirical evidence that the inflation rate is actually lower if the country is currently under an Inflation Targeting regime. Then one could ask the following interesting question: is the better performance in the inflation rates of the Inflation Targeting countries only due to a more "aggressive" monetary policy? More specifically, we are interested to know if the only reason why Inflation Targeting countries have lower inflation rates is because they set really high real interest rates. If

⁴ This is the result obtained by Ball and Sheridan (2003): a significant β_2 and an insignificant β_1 . Note that if our sample had only 2 periods, equation (3) would be almost identical with Ball and Sheridan (2003)'s regression: a cross-section, as the dependent variable would be just the change in inflation rates between the 2 periods, the Treatment variable would collapse to an indicator variable of whether or not the country had adopted Inflation Targeting, the lag of the inflation rate would just be the inflation rate of the initial period (the first period) and the difference in the coefficients associated with the time-effects would become the new constant.

this is the case, then one could suggest that the adoption of the regime itself doesn't matter much, but only how high you set the real interest rates.

This hypothesis will be tested with two different procedures. The first procedure estimates an equation with the same specification as equation (2) but with the real interest rate as the dependent variable:

(4)
$$r_{it} = \beta_0 + \beta_1 \text{Treatment}_{it} + \beta_3 C_i + \beta_4 T_t + \varepsilon_{it}$$

where r_{it} is the real interest rate for country i in period t. If we estimate a positive and significant β_1 this will mean that countries experienced a significant increase in the real interest rate after adopting the Inflation Targeting regime. The second procedure is to include in equation (2) the real interest rate as a regressor:

(5)
$$\pi_{it} = \beta_0 + \beta_1 \text{Treatment}_{it} + \beta_2 \pi_{i,t-1} + \beta_{3i} r_{i,t-2} + \beta_4 C_i + \beta_5 T_t + \varepsilon_{it}$$

In equation (5) we assumed that the effect of the real interest rate happens with a lag of 2 periods. Equation (5) can be thought of a reduced form solution of the substitution of an IS Curve into a Phillips Curve. The idea is that the real interest rate takes at least 1 quarter to affect the output gap (via an IS Curve) and the change in the output gap takes at least another quarter to affect the inflation rate (via the sacrifice ratio in the Phillips Curve). We also allowed the effect of a change in the real interest rate on the CPI inflation rate to vary across countries. This coefficient is given by the product of a country's sacrifice ratio with the elasticity of the output gap with respect to the real interest rate. Since these two coefficients are country specific such as the degree of price staggering or the quality of credit markets, it is natural to allow the coefficient of β_{3i} to vary across countries.

Once again, we should expect the differences-in-differences estimator β_1 to be negative and significant even if the β_{3i} are negative and significant. This will mean that the expected inflation conditional on the real interest rate is lower if the country is currently under a Inflation Targeting regime.

3. The Unconditional Expected Level of the Inflation Rate

In this section we are interested in two main hypothesis: (1) countries that officially adopted the Inflation Targeting regime experienced a reduction in their inflation rates after adopting the new regime and (2) this effect is not only due to a reversion to the mean process. Table 2 presents the results of the estimation of equation (1), including a set of controls for time and country effects. The set of country specific controls includes country fixed effects and the set of time controls includes time effects and a linear time trend called "Time" to capture some deterministic trend in inflation rates⁵.

Regression (1) presents the results for the regression of the CPI inflation rate on the "Treatment" variables without any further control for individual characteristics, country fixed effects or time effects. The estimated coefficient of -0.40 for the "Treatment" variable is significant at the 1% significance level, which means that the quarterly inflation rate fell in average by 0.40% in the Inflation Targeting countries after they have adopted the new regime. This causal effect is significant even after controlling for the fact that inflation rate has presented an exogenous downward trend estimated by the coefficient associated with the "Time" variable. The estimated coefficient of -0.02 is significant at the 1% significant level and implies that inflation rates tended to decrease 0.02% per quarter. The coefficients associated with the country fixed effects and the time effects are not displayed for sake of clearness (there are 22 + 71 estimated coefficients), but the F-statistics testing the exclusion of each group are presented in the table. The null hypothesis that each group of dummy variables is zero can be easily rejected. The R² of 45% can be considered satisfactory since the dependent variable is being explained only by a set of dummies and not any other economic variable.

⁵ Technically, the inclusion of a linear time trend in the regression is redundant since we already included time effects: all other coefficients, standard errors and descriptive statistics such as R^2 will remain the same. But the explicit inclusion of the linear time trend can make it easier to see if there was any deterministic downward or upward trend in the inflation rate through our sample period.

Table 2: Estimation Output

Dependent Variable: CPI Inflation Rate (quarterly % rate) Frequency: quarterly Sample Period: 1985.1 to 2002.3

Regressor	(1)	(2)
Treatment	-0.40** (0.085)	-0.35** (0.081)
Time trend	-0.03** (0.005)	-0.02** (0.003)
Initial condition		0.10** (0.037)
F-statistics Testing Exclu	sion of Group	of Variables
Country effects = 0	20.37 (<0.001)	12.16 (<0.001)
Time effects = 0	5.27 (<0.001)	5.20 (<0.001)
R^2	0.45	0.45

These regressions are estimated using panel data for the 22 OECD countries collected at the IMF IFS database for the first quarter of 1985 until the third quarter of 2002. White's robust standard errors are given in parentheses under the coefficients, and p-values are given in parentheses under the F-statistics. The symbols * and ** denote that the individual coefficient is significant at the 10% and 1% significance level respectively.

Regression (2) adds to regression (1) the first lag of the inflation rate as one of the regressors in order to control for the initial condition. The coefficient associated with the lagged inflation rate, called "Initial condition", is significant at the 1% significant level. The estimated coefficient of 0.10 lies between 0 and 1 and therefore indicates that the inflation rate follows a stochastic process that reverts to mean process. The inclusion of the new variable also decreases the magnitude of the negative coefficient of the "Treatment": the new difference-in-differences estimator goes from -0.40 to -0.35, however, it remains significant at the 1% significance level. There is also practically no change in the \mathbb{R}^2 with the inclusion of the new variable. Also note that the null hypothesis that each group of dummy variables that control for country fixed effects and time effects is zero can still be easily rejected. Given these results, one can conclude that the decrease in inflation rates experienced by Inflation Targeting countries effect was not only due to a reversion to mean process.

4. The Expected Level of Inflation Rate Conditional on the Real Interest Rate

The previous section presented strong empirical evidence that the countries that officially adopted the Inflation Targeting regime experienced a decrease in their inflation rates. It also presented empirical evidence that this effect was not only due to a reversion to mean process.

Given these results, there is one last interesting question to be asked: is the better performance in the inflation rates of the Inflation Targeting countries due to a more "aggressive" monetary policy? More specifically, we are interested to know if the only reason why Inflation Targeting countries have lower inflation rates is because they set really high real interest rates. If this is the case, then one could suggest that the regime itself doesn't matter much, but only how high you set the real interest rates.

This question is addressed in two ways. Table 3 shows the results of the first procedure. We estimate the same set of regressions estimated for the level of the inflation rate (with country fixed effects and time effects) but using the real interest rate as the dependent variable. The difference from regression (1) to regression (2) is that in the latter there is a control for the initial condition introducing the first lag of the real interest rate as one of the regressors. In both specifications, the coefficient for the treatment variable was insignificant. Given this result, it is hard to believe in the hypothesis that Inflation Targeting countries experienced a significant increase in the level of their real interest rates after they adopted the new regime.

Table 3: Estimation Output

Dependent Variable: Real Interest Rate (annualized quarterly % rate) Frequency: quarterly Sample Period: 1986.1 to 2002.3

Regressor	(1)	(2)
Treatment	-0.25 (0.332)	-0.15 (0.331)
Time trend	-0.02 (0.016)	-0.01 (0.011)
Initial condition		0.04 (0.045)
F-statistics Testing Exclusion of Group of Variables		

Country effects = 0	13.76 (<0.001)	7.98 (<0.001)
Time effects = 0	4.58 (<0.001)	4.46 (<0.001)
R ²	0.34	0.34

These regressions are estimated using panel data for the 22 OECD countries collected at the IMF IFS database for the first quarter of 1985 until the third quarter of 2002. White's robust standard errors are given in parentheses under the coefficients, and p-values are given in parentheses under the F-statistics. The symbols * and ** denote that the individual coefficient is significant at the 10% and 1% significance level respectively.

The second set of evidence is presented in Table 4. The equations estimated in the table have the same specification of the equations presented in Table 3 with the inclusion of the second lag of real interest rate as on of the regressors explaining the inflation rate. That is, we regress the inflation rate on our Treatment variable, the first lag of the inflation rate, the second lag of the real interest rate, a time trend, country fixed effects and time effects.

Table 4: Estimation Output

Dependent Variable: CPI Inflation Rate (quarterly % rate) Frequency: quarterly Sample Period: 1986.1 to 2002.3

(1) (2) Regressor -0.34** -0.28** Treatment (0.082)(0.087)Time trend -0.01** -0.01* (0.004)(0.004)Initial condition 0.12** 0.18** (0.038)(0.048)-0.06** Real interest rate (0.009)Real interest rate effect? individual group **F-statistics Testing Exclusion of Group of Variables** Real interest rate = 05.89 (<0.001) Country effects = 07.88 13.86 (< 0.001)(< 0.001)Time effects = 05.23 4.91 (0.009)(<0.001) R^2 0.48 0.53

These regressions are estimated using panel data for the 22 OECD countries collected at the IMF IFS database for the first quarter of 1985 until the third quarter of 2002. White's robust standard errors are given in parentheses under the coefficients, and p-values are given in parentheses under the F-statistics. The symbols * and ** denote that the individual coefficient is significant at the 10% and 1% significance level respectively.

The first column of results in Table 4 restricts the effects of real interest rate on the inflation rate to be the same for the whole group of countries $[\beta_{3i} = \beta_3$ for all i]. This coefficient is negative and significant at 1%: a 1% increase in the annualized real interest rate reduces inflation two quarters ahead in 0.06%. The differences-in-differences coefficient remains negative and significant at 1%: the estimated coefficient of -0.34 is practically the same as the coefficient estimated in Table 2. The coefficient associated with the lagged inflation rate also remains practically unchanged: the estimated value was 0.12, statistically significant at 1%. The deterministic time trend coefficient remains negative and significant at 1%, but its magnitude is reduced from - 0.02 to -0.01. The R² of 48% is marginally higher than the one in the regression without

the real interest rate as a regressor. Finally, the null hypothesis that each group of dummy variables that control for country fixed effects and time effects is zero can be rejected at the 1% significance level.

In the second column of results in Table 4 we allow the effects of real interest rate on the inflation rate to be individual, varying across countries $[\beta_{3i} \neq \beta_{3j}]$ for $i \neq j$]. Although the table does not present any of such 22 coefficients estimated, the null hypothesis that this group of coefficients is zero can be easily rejected. The inclusion of the real interest rate marginally reduces the magnitude of differences-in-differences coefficient: it goes from -0.34 to -0.28, a less than one standard deviation change. Nevertheless, the differences-in-differences coefficient remains significant at 1%. The deterministic time trend coefficient is no longer significant at 1% but remains significant at 10%. The coefficient associated with the first lag of the inflation rate remains significant at 1% but presents a more than one standard deviation increase, indicating a higher measure of persistence or inertia: 0.18. The R² increases to 53% and the null hypothesis that each group of dummy variables that control for country fixed effects and time effects is zero can be easily rejected.

In summary, this section has provided two sets of empirical evidence. First, it failed to find evidence that Inflation Targeting countries experienced a significant increase in the level of their real interest rates after they adopted the new regime. Second, it showed that even after we control for the level of real interest rates (that have a negative and significant effect) there is still a causal effect from the adoption of Inflation Targeting to the reduction in inflation rates. These evidences allow us to reject the idea that the better performance in the inflation rates of the Inflation Targeting countries is only due to a more "aggressive" monetary policy (that is, setting really high real interest rates).

5. Conclusion

After the introduction in New Zealand in 1990, many other developed and emerging countries also adopted Inflation Targeting as their monetary policy regime. Despite of

its popularity, empirical studies have failed to find evidence of the causal effect of a country's adoption of the Inflation Targeting regime on that country's inflation rate.

This paper applies the multi-period differences-in-differences estimation to the quarterly CPI inflation rates from the first quarter of 1986 until the third quarter of 2002 to all the 22 OECD industrial countries. The first set of evidence finds that even countries that have officially adopted Inflation Targeting experienced a decrease in their average inflation rates after the adoption of the new regime and also that this estimated effect persists even after we control for the initial inflation rate. In order words, the better performance of Inflation Targeting countries is not only due to a reversion to mean process in the inflation rate.

The second set of results is found reapplying the analysis conditioning the inflation rate to the real interest rate. The real interest rate is the channel through which the short run nominal interest rate determined by the Monetary Authority affects the inflation rate (by affecting credit, consumption, investment and the usual components of the aggregate demand). One could suggest that the performance "gain" in the inflation rates of the adoption of the Inflation Targeting regime is only due to a more "aggressive" monetary policy. Intuitively, this would mean that that the adoption of the regime itself doesn't matter much, but only how high you set the real interest rates. However, the empirical evidence provided in this paper rejects this hypothesis. First, there seems to be no evidence that Inflation Targeting countries experienced a significant increase in the level of their real interest rates after they adopted the new regime. Second, it showed that even after controlling for the level of real interest rates (that have a negative and significant effect) there is still a causal effect from the adoption of Inflation Targeting to the reduction in inflation rates.

References

Ball, Laurence and Niamh Sheridan, "Does Inflation Targeting Matter?", *NBER Working Paper 9577*, March 2003.

Bernanke, Ben S., and Ilian Mihov, "Measuring Monetary Policy", *Quarterly Journal of Economics 113*, 869-902, 1998.

Carare, Alina and Mark Stone, "Inflation Targeting Regimes", *IMF Working Paper*, WP/03/9, January 2003.

Corbo, Vittorio, Oscar Landerretche and Klaus Schmidt-Hebbel, "Assessing Inflation Targeting after a Decade of World Experience", *International Journal of Finance and Economics* 6, 348-68, 2001.

Hayashi, Fumio, "Econometrics", Princeton University Press, 2000.

Hu, Yifan, "Empirical Investigations of Inflation Targeting", *Institute for International Economics*, WP 03-6, July 2003.

Johnson, David, "The Effect of Inflation Targeting on the Behavior of Expected Inflation: Evidence from an 11 Country Panel", *Journal of Monetary Economics* 49, 1521-38, 2002.

Mankiw, Gregory, "U.S. Monetary Policy During the 1990s", *NBER Working Paper* 8471, September 2001.

Neumann, Manfred J. M. and Jurgen von Hagen, "Does Inflation Targeting Matter?", *Federal Reserve Bank of St. Louis Review*, vol 84 no. 4 pages 149:53, July-August 2002.

Stock, James and Mark Watson, "Introduction to Econometrics", *Addison-Wesley Publishing*, 2002.

Wooldridge, Jeffrey, "Econometric Analysis of Cross Section and Panel Data", *MIT Press*, 2002.

Appendix

All regressions in this paper have been estimated with robust standard errors. The reason for this option is because the residuals are not spherical. In a panel data, a non-spherical error structure means that there is either cross-sectional heteroskedasticity across panels or time series autocorrelation within panels or both.

Table A.1: Estimation Output

Frequency: quarterly

Sample Period: 1985.1 to 2002.3				
Regressor	(1)	(2)		
Treatment	-0.35** (0.061)	-0.31** (0.056)		
Time trend	-0.02** (0.002)	-0.02** (0.002)		
Initial condition		0.13** (0.026)		
χ^2 -statistic Testing Heteroskedasticity				
H ₀ : no Heteroskedasticity	886.14 (<0.001)	885.82 (<0.001)		
F-statistic Testing Autocorrelation				
H ₀ : no Autocorrelation	4.33 (0.050)	102.66 (<0.001)		

Dependent Variable: CPI Inflation Rate (quarterly % rate)

These regressions are estimated using FGLS for panel data for the 22 OECD countries collected at the IMF IFS database for the first quarter of 1985 until the third quarter of 2002, controlling for heteroskedastic error structure and panel specific first-order autocorrelation. Standard errors are given in parentheses under the coefficients, and p-values are given in parentheses under the F-statistics and χ^2 -statistics. The symbols * and ** denote that the individual coefficient is significant at the 10% and 1% significance level respectively.

The output of the tests that detect heteroskedasticity and autocorrelation are presented in this Appendix. For each specification estimated in this paper, two different tests are run. The first test, which tests for heteroskedasticity, is the likelihood ratio test. The second test is the test for serial correlation in the idiosyncratic errors of a linear panel-data model discussed by Wooldridge (2002). Table A.2 refers to the specifications estimated

in Table 2, Table A.2 refers to the specifications of Table 3 and Table A.3 refers to Table 4.

Table A.2: Estimation Output

Dependent Variable: Real Interest Rate (annualized quarterly % rate)

Frequency: quarterly Sample Period: 1986.1 to 2002.3

Regressor	(1)	(2)		
Treatment	-0.18 (0.300)	-0.10 (0.291)		
Time trend	-0.03** (0.010)	-0.02* (0.010)		
Initial condition		0.06* (0.026)		
χ^2 -statistic Testing Heteros	kedasticity			
H ₀ : no Heteroskedasticity	593.17 (<0.001)	616.12 (<0.001)		
F-statistic Testing Autocorrelation				
H ₀ : no Autocorrelation	2.03 (0.169)	62.63 (<0.001)		

These regressions are estimated using FGLS for panel data for the 22 OECD countries collected at the IMF IFS database for the first quarter of 1985 until the third quarter of 2002, controlling for heteroskedastic error structure and panel specific first-order autocorrelation. Standard errors are given in parentheses under the coefficients, and p-values are given in parentheses under the F-statistics and χ^2 -statistics. The symbols * and ** denote that the individual coefficient is significant at the 10% and 1% significance level respectively.

We can see by these tables that we can easily reject the null hypothesis that the residuals are spherical. In the presence of non-spherical disturbances, there are two solutions: one is to use robust standard errors; the other is to use FGLS. Although robust standard errors tend to be less efficient than FGLS, they are robust to any type of correlation within the observations of each panel/group. FGLS will only be correct (and in these cases also more efficient) if the assumptions about the error structure are correct.

Table A.3: Estimation Output

Dependent Variable: CPI Inflation Rate (quarterly % rate) Frequency: quarterly

Sample Period: 1986.1 to 2002.3

Regressor	(1)	(2)		
Treatment	-0.33** (0.061)	-0.29** (0.057)		
Time trend	-0.01** (0.002)	-0.01** (0.002)		
Initial condition	0.09** (0.027)	0.12** (0.026)		
Real interest rate	-0.01* (0.006)			
Real interest rate effect?	group	individual		
χ^2 -statistic Testing Heteros	kedasticity			
H ₀ : no Heteroskedasticity	775.31 (<0.001)	755.62 (<0.001)		
F-statistic Testing Autocorrelation				
H ₀ : no Autocorrelation	92.528 (<0.001)	266.78 (<0.001)		

These regressions are estimated using FGLS for panel data for the 22 OECD countries collected at the IMF IFS database for the first quarter of 1985 until the third quarter of 2002, controlling for heteroskedastic error structure and panel specific first-order autocorrelation. Standard errors are given in parentheses under the coefficients, and p-values are given in parentheses under the F-statistics and χ^2 -statistics. The symbols * and ** denote that the individual coefficient is significant at the 10% and 1% significance level respectively.

In this Appendix we also recalculate the estimated coefficients using FGLS controlling for heteroskedastic error structure and panel specific first-order autocorrelation. As we can see, the results are practically the same as the ones presented in the paper using robust standard errors.

Banco Central do Brasil

Trabalhos para Discussão

Os Trabalhos para Discussão podem ser acessados na internet, no formato PDF, no endereço: http://www.bc.gov.br

Working Paper Series

Working Papers in PDF format can be downloaded from: http://www.bc.gov.br

1	Implementing Inflation Targeting in Brazil Joel Bogdanski, Alexandre Antonio Tombini and Sérgio Ribeiro da Costa Werlang	Jul/2000
2	Política Monetária e Supervisão do Sistema Financeiro Nacional no Banco Central do Brasil Eduardo Lundberg	Jul/2000
	Monetary Policy and Banking Supervision Functions on the Central Bank <i>Eduardo Lundberg</i>	Jul/2000
3	Private Sector Participation: a Theoretical Justification of the Brazilian Position <i>Sérgio Ribeiro da Costa Werlang</i>	Jul/2000
4	An Information Theory Approach to the Aggregation of Log-Linear Models <i>Pedro H. Albuquerque</i>	Jul/2000
5	The Pass-Through from Depreciation to Inflation: a Panel Study Ilan Goldfajn and Sérgio Ribeiro da Costa Werlang	Jul/2000
6	Optimal Interest Rate Rules in Inflation Targeting Frameworks José Alvaro Rodrigues Neto, Fabio Araújo and Marta Baltar J. Moreira	Jul/2000
7	Leading Indicators of Inflation for Brazil Marcelle Chauvet	Sep/2000
8	The Correlation Matrix of the Brazilian Central Bank's Standard Model for Interest Rate Market Risk José Alvaro Rodrigues Neto	Sep/2000
9	Estimating Exchange Market Pressure and Intervention Activity <i>Emanuel-Werner Kohlscheen</i>	Nov/2000
10	Análise do Financiamento Externo a uma Pequena Economia Aplicação da Teoria do Prêmio Monetário ao Caso Brasileiro: 1991–1998 Carlos Hamilton Vasconcelos Araújo e Renato Galvão Flôres Júnior	Mar/2001
11	A Note on the Efficient Estimation of Inflation in Brazil <i>Michael F. Bryan and Stephen G. Cecchetti</i>	Mar/2001
12	A Test of Competition in Brazilian Banking Márcio I. Nakane	Mar/2001

13	Modelos de Previsão de Insolvência Bancária no Brasil Marcio Magalhães Janot	Mar/2001
14	Evaluating Core Inflation Measures for Brazil <i>Francisco Marcos Rodrigues Figueiredo</i>	Mar/2001
15	Is It Worth Tracking Dollar/Real Implied Volatility? Sandro Canesso de Andrade and Benjamin Miranda Tabak	Mar/2001
16	Avaliação das Projeções do Modelo Estrutural do Banco Central do Brasil para a Taxa de Variação do IPCA Sergio Afonso Lago Alves	Mar/2001
	Evaluation of the Central Bank of Brazil Structural Model's Inflation Forecasts in an Inflation Targeting Framework <i>Sergio Afonso Lago Alves</i>	Jul/2001
17	Estimando o Produto Potencial Brasileiro: uma Abordagem de Função de Produção <i>Tito Nícias Teixeira da Silva Filho</i>	Abr/2001
	Estimating Brazilian Potential Output: a Production Function Approach <i>Tito Nícias Teixeira da Silva Filho</i>	Aug/2002
18	A Simple Model for Inflation Targeting in Brazil Paulo Springer de Freitas and Marcelo Kfoury Muinhos	Apr/2001
19	Uncovered Interest Parity with Fundamentals: a Brazilian Exchange Rate Forecast Model <i>Marcelo Kfoury Muinhos, Paulo Springer de Freitas and Fabio Araújo</i>	May/2001
20	Credit Channel without the LM Curve Victorio Y. T. Chu and Márcio I. Nakane	May/2001
21	Os Impactos Econômicos da CPMF: Teoria e Evidência <i>Pedro H. Albuquerque</i>	Jun/2001
22	Decentralized Portfolio Management Paulo Coutinho and Benjamin Miranda Tabak	Jun/2001
23	Os Efeitos da CPMF sobre a Intermediação Financeira Sérgio Mikio Koyama e Márcio I. Nakane	Jul/2001
24	Inflation Targeting in Brazil: Shocks, Backward-Looking Prices, and IMF Conditionality Joel Bogdanski, Paulo Springer de Freitas, Ilan Goldfajn and Alexandre Antonio Tombini	Aug/2001
25	Inflation Targeting in Brazil: Reviewing Two Years of Monetary Policy 1999/00 Pedro Fachada	Aug/2001
26	Inflation Targeting in an Open Financially Integrated Emerging Economy: the Case of Brazil Marcelo Kfoury Muinhos	Aug/2001

27	Complementaridade e Fungibilidade dos Fluxos de Capitais Internacionais Carlos Hamilton Vasconcelos Araújo e Renato Galvão Flôres Júnior	Set/2001
28	Regras Monetárias e Dinâmica Macroeconômica no Brasil: uma Abordagem de Expectativas Racionais <i>Marco Antonio Bonomo e Ricardo D. Brito</i>	Nov/2001
29	Using a Money Demand Model to Evaluate Monetary Policies in Brazil Pedro H. Albuquerque and Solange Gouvêa	Nov/2001
30	Testing the Expectations Hypothesis in the Brazilian Term Structure of Interest Rates Benjamin Miranda Tabak and Sandro Canesso de Andrade	Nov/2001
31	Algumas Considerações sobre a Sazonalidade no IPCA Francisco Marcos R. Figueiredo e Roberta Blass Staub	Nov/2001
32	Crises Cambiais e Ataques Especulativos no Brasil <i>Mauro Costa Miranda</i>	Nov/2001
33	Monetary Policy and Inflation in Brazil (1975-2000): a VAR Estimation André Minella	Nov/2001
34	Constrained Discretion and Collective Action Problems: Reflections on the Resolution of International Financial Crises <i>Arminio Fraga and Daniel Luiz Gleizer</i>	Nov/2001
35	Uma Definição Operacional de Estabilidade de Preços <i>Tito Nícias Teixeira da Silva Filho</i>	Dez/2001
36	Can Emerging Markets Float? Should They Inflation Target? <i>Barry Eichengreen</i>	Feb/2002
37	Monetary Policy in Brazil: Remarks on the Inflation Targeting Regime, Public Debt Management and Open Market Operations Luiz Fernando Figueiredo, Pedro Fachada and Sérgio Goldenstein	Mar/2002
38	Volatilidade Implícita e Antecipação de Eventos de <i>Stress</i> : um Teste para o Mercado Brasileiro Frederico Pechir Gomes	Mar/2002
39	Opções sobre Dólar Comercial e Expectativas a Respeito do Comportamento da Taxa de Câmbio <i>Paulo Castor de Castro</i>	Mar/2002
40	Speculative Attacks on Debts, Dollarization and Optimum Currency Areas Aloisio Araujo and Márcia Leon	Apr/2002
41	Mudanças de Regime no Câmbio Brasileiro Carlos Hamilton V. Araújo e Getúlio B. da Silveira Filho	Jun/2002
42	Modelo Estrutural com Setor Externo: Endogenização do Prêmio de Risco e do Câmbio Marcelo Kfoury Muinhos, Sérgio Afonso Lago Alves e Gil Riella	Jun/2002

43	The Effects of the Brazilian ADRs Program on Domestic Market Efficiency Benjamin Miranda Tabak and Eduardo José Araújo Lima	Jun/2002
44	Estrutura Competitiva, Produtividade Industrial e Liberação Comercial no Brasil <i>Pedro Cavalcanti Ferreira e Osmani Teixeira de Carvalho Guillén</i>	Jun/2002
45	Optimal Monetary Policy, Gains from Commitment, and Inflation Persistence <i>André Minella</i>	Aug/2002
46	The Determinants of Bank Interest Spread in Brazil Tarsila Segalla Afanasieff, Priscilla Maria Villa Lhacer and Márcio I. Nakane	Aug/2002
47	Indicadores Derivados de Agregados Monetários Fernando de Aquino Fonseca Neto e José Albuquerque Júnior	Set/2002
48	Should Government Smooth Exchange Rate Risk? Ilan Goldfajn and Marcos Antonio Silveira	Sep/2002
49	Desenvolvimento do Sistema Financeiro e Crescimento Econômico no Brasil: Evidências de Causalidade <i>Orlando Carneiro de Matos</i>	Set/2002
50	Macroeconomic Coordination and Inflation Targeting in a Two- Country Model Eui Jung Chang, Marcelo Kfoury Muinhos and Joanílio Rodolpho Teixeira	Sep/2002
51	Credit Channel with Sovereign Credit Risk: an Empirical Test <i>Victorio Yi Tson Chu</i>	Sep/2002
52	Generalized Hyperbolic Distributions and Brazilian Data José Fajardo and Aquiles Farias	Sep/2002
53	Inflation Targeting in Brazil: Lessons and Challenges André Minella, Paulo Springer de Freitas, Ilan Goldfajn and Marcelo Kfoury Muinhos	Nov/2002
54	Stock Returns and Volatility Benjamin Miranda Tabak and Solange Maria Guerra	Nov/2002
55	Componentes de Curto e Longo Prazo das Taxas de Juros no Brasil Carlos Hamilton Vasconcelos Araújo e Osmani Teixeira de Carvalho de Guillén	Nov/2002
56	Causality and Cointegration in Stock Markets: the Case of Latin America Benjamin Miranda Tabak and Eduardo José Araújo Lima	Dec/2002
57	As Leis de Falência: uma Abordagem Econômica <i>Aloisio Araujo</i>	Dez/2002
58	The Random Walk Hypothesis and the Behavior of Foreign Capital Portfolio Flows: the Brazilian Stock Market Case <i>Benjamin Miranda Tabak</i>	Dec/2002
59	Os Preços Administrados e a Inflação no Brasil Francisco Marcos R. Figueiredo e Thaís Porto Ferreira	Dez/2002

60	Delegated Portfolio Management Paulo Coutinho and Benjamin Miranda Tabak	Dec/2002
61	O Uso de Dados de Alta Freqüência na Estimação da Volatilidade e do Valor em Risco para o Ibovespa João Maurício de Souza Moreira e Eduardo Facó Lemgruber	Dez/2002
62	Taxa de Juros e Concentração Bancária no Brasil Eduardo Kiyoshi Tonooka e Sérgio Mikio Koyama	Fev/2003
63	Optimal Monetary Rules: the Case of Brazil Charles Lima de Almeida, Marco Aurélio Peres, Geraldo da Silva e Souza and Benjamin Miranda Tabak	Feb/2003
64	Medium-Size Macroeconomic Model for the Brazilian Economy Marcelo Kfoury Muinhos and Sergio Afonso Lago Alves	Feb/2003
65	On the Information Content of Oil Future Prices <i>Benjamin Miranda Tabak</i>	Feb/2003
66	A Taxa de Juros de Equilíbrio: uma Abordagem Múltipla Pedro Calhman de Miranda e Marcelo Kfoury Muinhos	Fev/2003
67	Avaliação de Métodos de Cálculo de Exigência de Capital para Risco de Mercado de Carteiras de Ações no Brasil Gustavo S. Araújo, João Maurício S. Moreira e Ricardo S. Maia Clemente	Fev/2003
68	Real Balances in the Utility Function: Evidence for Brazil Leonardo Soriano de Alencar and Márcio I. Nakane	Feb/2003
69	r-filters: a Hodrick-Prescott Filter Generalization Fabio Araújo, Marta Baltar Moreira Areosa and José Alvaro Rodrigues Neto	Feb/2003
70	Monetary Policy Surprises and the Brazilian Term Structure of Interest Rates Benjamin Miranda Tabak	Feb/2003
71	On Shadow-Prices of Banks in Real-Time Gross Settlement Systems <i>Rodrigo Penaloza</i>	Apr/2003
72	O Prêmio pela Maturidade na Estrutura a Termo das Taxas de Juros Brasileiras Ricardo Dias de Oliveira Brito, Angelo J. Mont'Alverne Duarte e Osmani Teixeira de C. Guillen	Mai/2003
73	Análise de Componentes Principais de Dados Funcionais – Uma Aplicação às Estruturas a Termo de Taxas de Juros Getúlio Borges da Silveira e Octavio Bessada	Mai/2003
74	Aplicação do Modelo de Black, Derman & Toy à Precificação de Opções Sobre Títulos de Renda Fixa Octavio Manuel Bessada Lion, Carlos Alberto Nunes Cosenza e César das Neves	Mai/2003
75	Brazil's Financial System: Resilience to Shocks, no Currency Substitution, but Struggling to Promote Growth <i>Ilan Goldfajn, Katherine Hennings and Helio Mori</i>	Jun/2003

76	Inflation Targeting in Emerging Market Economies Arminio Fraga, Ilan Goldfajn and André Minella	Jun/2003
77	Inflation Targeting in Brazil: Constructing Credibility under Exchange Rate Volatility André Minella, Paulo Springer de Freitas, Ilan Goldfajn and Marcelo Kfoury Muinhos	Jul/2003
78	Contornando os Pressupostos de Black & Scholes: Aplicação do Modelo de Precificação de Opções de Duan no Mercado Brasileiro <i>Gustavo Silva Araújo, Claudio Henrique da Silveira Barbedo, Antonio</i> <i>Carlos Figueiredo, Eduardo Facó Lemgruber</i>	Out/2003
79	Inclusão do Decaimento Temporal na Metodologia Delta-Gama para o Cálculo do VaR de Carteiras Compradas em Opções no Brasil Claudio Henrique da Silveira Barbedo, Gustavo Silva Araújo, Eduardo Facó Lemgruber	Out/2003
80	Diferenças e Semelhanças entre Países da América Latina: uma Análise de <i>Markov Switching</i> para os Ciclos Econômicos de Brasil e Argentina <i>Arnildo da Silva Correa</i>	Out/2003
81	Bank Competition, Agency Costs and the Performance of the Monetary Policy <i>Leonardo Soriano de Alencar and Márcio I. Nakane</i>	Jan/2004
82	Carteiras de Opções: Avaliação de Metodologias de Exigência de Capital no Mercado Brasileiro Cláudio Henrique da Silveira Barbedo e Gustavo Silva Araújo	Mar/2004