Patterns of Policy Integration and Administrative Coordination Reforms: A

Comparative Empirical Analysis

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Abstract:

During the last decades, scholars have pointed to a process of "denationalization", i.e., the delegation of competencies away from the center of the nation state – upwards, downwards, and sideward. At the same time, a transformation of the central state has been observed, which aims at strengthening its steering capacity by means of integrating sectoral public policies and by coordinating administrative units. Little systematic comparative evidence is available regarding this second phenomenon, and, above all, concerning its relationship with denationalization. We contribute to this line of research by presenting a comparative analysis of cross-sectoral reforms concerning public policies and public sector organizations, covering four policy fields, in thirteen countries over the period 1985-2010. Based on descriptive statistics and Bayesian change-point estimation, we show that policy integration and administrative coordination reforms configure a powerful trend, which however displays considerable variation across time, policy fields, and countries.

Evidence for practice

- 1. The emergence of new policy problems required to increase the integration and coordination of existing policies and administrations. This growing demand for integration and coordination occurred in a period of denationalization partially as a response to it.
- 2. Although many policy challenges entail interdependent decision-making that requires international co-operation and collaboration with subnational and private actors, our results suggest that the nation state remains a focal point for the adjustment of public policies and administrative structures to specific policy challenges.
- 3. Overall, it appears that the development of policy instruments that cut across sectors provides momentum for administrative coordination reforms. Policymakers and civil servants should thus be aware that newly integrated policies are likely to generate a demand for changes in the relationships among public sectors organizations, especially regarding an increased coordination between administrative units.

Introduction

The political institutions of nation states, which constitute the cornerstone of democratic policymaking, are considered durable and resilient (Pierson 2000; Mahoney and Rueschemeyer 2003). However, as much as any human artifact, they change over time. They typically do so through long-term processes of gradual transformation (Streeck and Thelen 2005) that can take many shapes and colors and have indeed been studied from different perspectives.

Over the last two decades or so, scholars have convincingly observed that the nation state is being "hollowed out" (Rhodes 1994), "unraveled" (Hooghe and Marks 2003), and "disaggregated" (Slaughter 2004). In this vein, several pieces of research have pointed to the pressures that comes from above, from below and from within, implying the relocation of political power beyond the boundaries of nation states' central governments "upwards, downwards and sideward", ultimately resulting in the "denationalization" and "decentering" of policymaking (Zürn 2000; Hooghe and Marks 2001; Jordana and Levi-Faur 2004; Abbott and Snidal 2009; Piattoni 2010).

This broad phenomenon has also been tackled by public administration and public policy research, for example by the scholarship on New Public Management (NPM) reforms (Hood 1995; McLaughlin et al. 2002). NPM entails the transformation of organizational structures and processes in public administrations through the adoption and implementation of private sector-oriented management principles and tools. These reforms typically involve the application of results-based management, competition between administrative units, and individual performance incentives (Pollitt and Bouckaert 2017). The creation of sector-specific agencies that enjoy a certain degree of autonomy from their political "principal" is another manifestation of this reform agenda (Maggetti and Verhoest 2014).

Nevertheless, governments have also engaged in reforms that have progressively rearranged the boundaries that demarcate the goals and instruments of specific policy programs and, respectively, the tasks of public sector organizations. These post-New Public Management (post-NPM) reforms have been labelled "joined-up government" (Bogdanor 2005) and "whole-of-government" (Christensen and Laegreid 2007), among others (Tosun and Lang 2017). A key goal of these post-NPM reforms is to counteract the fragmentation created by NPM reforms by adopting a more holistic approach, i.e., to cut across policy sectors (Christensen and Lægreid 2007c, 2007d; Bouckaert et al. 2010; Egeberg and Trondal 2016), thereby ultimately reinforcing the central government (Dahlström et al. 2011).

These reorganizations entail "policy integration", intending to bundle existing policy goals and instruments across policy sectors, or to create them anew, so as to increase the effectiveness and the legitimacy of policy programs (Hou and Brewer 2010; Schaffrin et al. 2015), for instance in environmental policy (Jordan and Lenschow 2010). On the other hand, such reforms comprise "administrative coordination", aiming at strengthening the collaboration between public sector organizations (Reiter and Klenk 2018, 18), to tame the downsides of NPM reforms (Richards and Kavanagh 2000). Although they respond to a similar problem, the policy- and organization-related dimensions are usually treated separately in existing research, which is largely based on in-depth case studies of these types of reforms (Trein et al. 2019).

To make sense of this apparently paradoxical co-occurrence of denationalization and recentering, we embark in a comparative empirical analysis of reforms aiming at strengthening the steering capacity of the state. Beyond the specific context related to the analysis of post-NPM reforms, this study contributes to the wider literature on the transformation of the nation state. Precisely, we pose three research questions that aim at linking the transformation of the nation state with new public management and cross-sectoral policy and organizational reforms:

1) Does the process of re-centering public policies and governmental structures took place

sequentially as a reaction to the decentering and fragmentation of authority or is it a parallel, intertwined development? 2) What is the magnitude of this phenomenon at the macro level and in what manner did it unfold? 3) Can we identify systematic trajectories and variations with respect to policy-specific and country-specific factors and, if yes, how do they unfold? To tackle these questions, this article presents the results of a comparative empirical analysis of reforms in thirteen countries and four policy fields. The selected countries are Australia, Austria, Belgium, Canada, France, Germany, Italy, Netherlands, New Zealand, Sweden, Switzerland, the United Kingdom (UK), and the United States (US); we focus on environmental, migration, public health, and unemployment policy over the time period from 1980-2015.

Results show that the overall magnitude of reforms is remarkable: a powerful re-centering trend took place roughly at the same time of the processes of denationalization. What is more, distinguishing between policy integration and administrative coordination provides analytical leverage, as the two reform trajectories are related but they do not overlap. Finally, policy field-and country-specific factors shape the pace of reforms, whose highest frequency tends to occur in environmental policy and in countries with a centralized political system and an Anglo-Saxon administrative tradition.

Towards a comparative empirical analysis of post-NPM reforms

In this article, we adopt a research strategy geared towards description and interpretation as fundamental building blocks of scientific understanding, which is particularly appropriate when the goal is to map a relatively uncharted territory (Gerring 2012). In line with this approach, we aim at answering to *what* and *in what manner* questions, namely by accounting for the varying empirical manifestations of the phenomenon of interest and by investigating the associations occurring between multidimensional components of this phenomenon. Therefore, our analysis is guided by broad theoretical expectations (but not specific hypotheses) about general

regularities and variations in our observations (Gerring 2012). In line with our exploratory approach, these expectations are sometimes directional and sometimes fully open-ended.

Policy vs. administrative dimension

The first element that guides our analysis is the distinction between two dimensions: policy reforms and organizational reforms. Our approach builds on previous comparative studies of policy and administrative integration and/or coordination. Prior research has employed scales of coordination (Metcalfe 1994; Jordan and Schout 2006; Braun 2008, 230-1; Bouckaert et al. 2010, 16). Instead, we use a dichotomic conceptualization that incorporates a distinction in kind (Sartori 1970) between the (1) policy dimension and the (2) administrative/organizational dimension of cross-sectoral reforms (Tosun and Lang 2017; Trein et al. 2019). This strategy allows us to analyze the sequencing of policy and organizational reforms cutting across policy sectors as an open empirical question. Precisely, we refer to policy integration and administrative coordination, which we define as follows:

- 1. *Policy integration* denotes the policy dimension of reforms that aim at achieving crosscutting policy goals, i.e., policy instruments spanning across policy sectors or subsystems (we use the two terms as synonyms) in a larger policy field (Candel and Biesbroek 2016, 211-2; Jochim and May 2010). Decision makers usually enact policy integration reforms to deal with policy challenges that need comprehensive solutions that go beyond the scope of existing policy configurations (Peters 2015, 4). Empirical instances of policy integration are legislative changes that connect or combine existing laws, or new political strategies that embody future visions or plans that explicitly link various policy fields or subsystems (Trein 2017b).
- 2. *Administrative coordination* pertains to the administrative and organizational dimension of cross-sectoral policy reform. It concerns reforms that change the relations between

public sector organizations (Bouckaert et al. 2010, 36-40), namely with the goal to improve coordination (Christensen and Lægreid 2007c, 1059-60). Distinguishing amid the administrative and the policy dimension is important since public sector organizations tend to be particularly resistant to change (Pierson 1998, 552-3; Buchanan and Badham 2008), thus reform events are potentially rarer than for policy integration. Administrative coordination reforms entail creating procedures to avoid negative spill-overs and improving cooperation between administrative organizations. Examples are impact assessments, co-signing of legislative proposals, the establishment of transversal public sector agencies or units in charge of coordination (6 2004, 10; Bouckaert et al. 2010), or even the merger of administrative organizations or ministries (6 2004, 108; 6 et al. 2002, 29-34).

Complexity of policy problems

The second element that guides our analysis is the assumption that patterns of policy integration and administrative coordination reforms vary according to the complexity of the policy problem (Head and Alford 2015; Peters 2017, 392; Christensen et al. 2019), which in turn determines the demand for coordination (Peters and Savoie 1996). Precisely, we focus on two dimensions of complexity. On the one hand, we expect that the intrinsic technical complexity of the policy field shapes the dynamics of policy integration and administrative coordination. We assume that "technical complexity is high when a policy problem requires the understanding of a specialist or expert, a professional appraisal more than a normative judgment" (Gormley Jr 1983, 89-90). Although technical decisions can also be based on normative criteria, and vice versa, it is fruitful for comparative policy analysis to distinguish between predominantly technical policies, for which the use of knowledge and expertise is prominent in the policy process, and less technical ones, which mostly require other political resources (Gormley Jr 1983, 90; Eshbaugh-Soha 2006).

On the other hand, we expect that reform trajectories vary according to the scope of policy integration and administrative coordination. Their scope varies depending on whether dealing with the policy problem requires the incorporation of policy instruments and organizational structures (Meyer and Rowan 1977) from a small number of relatively close sectors within a single policy field, or alternatively, it implies bringing together a multitude of policy instruments and organizational structures from sectors that span across policy fields (Jochim and May 2010). In the following, we discuss the pertinence of these distinctions for our argument.

Table 1: Variation of integration and coordination complexity across policy fields

Scope of integration and coordination

		Within policy field	Across policy fields
Technical complexity	Lower	Employment	Migration
	Higher	Health	Environment

The policy fields and the related problems requiring integration and coordination we chose for this analysis vary according to their technical complexity and the scope of integration and coordination (cf. Table 1). *Environmental policy* is a case of technical complexity as it involves the use of technical expertise on a wide range of environmental issues (Oreskes and Conway 2010). Furthermore, policy integration and administrative coordination concern incorporating environmental matters into other policy fields, or unhinging of competencies from different policy fields (energy, competition, transportation, housing, etc.) to integrate them into a coherent environmental policy field. Examples for policy integration are framework laws and strategies focusing on environmental, climate, or sustainability issues; an instance of administrative coordination is the establishment of a national ministry for environmental policy

or coordinating council for administrative policy implementation. In addition to touching upon multiple existing policy sectors, environmental policy spans from the local to the global level (Jordan and Lenschow 2010; Adelle and Russel 2013).

Health policy is a technically complex field that involves medical and public health research (Oreskes and Conway 2010). However, policy integration and administrative coordination remain largely within the wider policy field and focus on the link between health care and public health or even more specific measures, such as integrated care (Trein 2017a, 2018). In this article, we focus on policy integration reforms that integrate preventative and curative aspects of health policy, for example strategies targeting non-communicable diseases or the integration of screening measures in health care plans. Administrative coordination reforms are changes geared towards the strengthening of the coordination between the public sector organizations in charge of health care (e.g. public hospitals) and those in charge of public health (the ministry of health).

Migration policy typically relies less extensively on expert knowledge than environmental and health policy as it is treated as comparatively less technically complex. At the same time, policy integration and administrative coordination spans across other policy fields, such as border management, housing policy, education, and employment (Entzinger and Biezeveld 2003; Scholten et al. 2017). In this case, examples of policy integration reform are legislative changes that aim at promoting encompassing strategies related to immigrant inclusion, which could involve social housing and language training; administrative coordination reforms are measures aiming to coordinate administrative units from different ministries, which share the responsibility for the inclusion of immigrants.

Unemployment policy is a very important but quite well-delimitated issue that does not percolate systematically into other policy fields. What is more, it is also a case of relatively

limited technical complexity, as "standard models" for dealing with the problem exist. We focus on reforms integrating and coordinating employment promotion services with cash transfers. One example related to policy integration concerns reforms that make the receipt of cash benefits conditional on participation in labor market activation measures. Instances of administrative coordination reforms are measures that stimulate cooperation of public sector organizations responsible for benefit payment with those in charge of labor market activation (Champion and Bonoli 2011; Aurich-Beerheide et al. 2015).

To ensure comparability amongst these different policy fields, we examine policy goals (environmental protection, improvement of public health, immigrant integration, and reduction of unemployment) (Howlett and Cashore 2009, 39). We compare reforms that aim to achieve these goals through a) an adjustment of substantive policy instruments and b) a reconfiguration of the relations between public sector organizations with respect to different sectoral elements that are relevant to integration in the policy field. This strategy allows us to examine different policy field-specific problems with an overall comparative approach.

Contextual factors

Time and sequences: The third element guiding our analysis concerns the timing of reforms. We expect that post-new public management reforms should start appearing during the 1980s and 1990s (Christensen et al. 2007, 18) with a peak during the post-2000 period (Christensen and Lægreid 2007b). We selected 1980 as the starting point because the trend toward New Public Management reforms conventionally began after this year (Hood 1991; McLaughlin et al. 2002). We also expect that the policy integration and administrative coordination reforms spread across different countries in our sample but that they appear in Anglo-Saxon countries first and later on in other European countries (Christensen and Lægreid 2007c). Furthermore,

there could be a sequence of policy- and organization-related reforms, yet we do not have a precise expectation on the shape of this relationship.

Administrative traditions: The fourth element focuses on the variance between countries. In that regard, we expect differences between countries according to their administrative traditions and the degree of government centralization. Concerning administrative traditions, we formulate an open expectation, namely that there are differences in reforms patterns between countries with an Anglo-Saxon, Germanic, Napoleonic, and Scandinavian tradition (Painter and Peters 2010). Furthermore, we expect to find less national-level policy integration and administrative coordination reforms in decentralized states due to the autonomy of subnational and regional government regarding policymaking and implementation (Pollitt and Bouckaert 2017, 51-5). The countries that we include in our analysis – Australia, Austria, Belgium, Canada, France, Germany, Italy, the Netherlands, New Zealand, Sweden, Switzerland, the UK, and the US – vary across these two dimensions.

Supranational authority (European Union): The fifth element that guides our analysis concerns the European Union (EU). In this instance, we expect that there are differences between EU members and non-EU members concerning policy integration and administrative coordination reforms, due to the role played by the emerging European administrative space as a platform for cooperation (Levi-Faur 2011; Egeberg and Trondal 2016). This expectation complements the first one, as it implies that the intensity of such reforms should be higher in EU member states but at a later point in time compared to non-EU members. Again, there is variance according to this dimension in the countries included in our empirical analysis.

Data collection and analytical strategy

To operationalize our conceptual framework, we created a new multilevel time series dataset of reform events that records events of policy change over time. We assembled information on policy integration and administrative coordination reform instances in the four policy fields and thirteen countries as we expect variance according to the reasons mentioned above. Our analysis focuses on reform events producing a statutory change in policy integration and administrative coordination (Sarapuu et al. 2014, 263-4) about which information is reliably available through desk research and we could straightforwardly contact experts for support. This approach allows us to capture above all formal changes through policymaking but we purposely do not measure changes in implementation practices or the entire policy paradigm (Hall 1993). The dataset entails information on reforms for the period 1980 to 2014. A detailed discussion of the operationalization process and the data collection strategy can be found in the Supplementary Materials 1 document, which is available online.

To measure policy integration and administrative coordination reforms, we collected a data set of reform events, similar to policy diffusion and conflict research (Prorok and Huth 2015; Maggetti and Gilardi 2016). The dataset measures reforms with two binary variables (0/1) – one for policy integration and another one for administrative coordination – per policy field in a country and year, which results in a dataset with 1820 observations on the dependent variable.

To analyze our data, we proceed in three steps: First, we present descriptive results for policy integration and administrative coordination reform events, over time, on three levels: (1) overall reforms, (2) reforms per policy field, and (3) reforms per country. Second, we use Bayesian change-point analyses (Carlin et al. 1992) to determine objectively if there is a structural break in the reform frequency overall, at the level of policy fields, and over countries (Leemann 2015, 598; Carlin et al. 1992).

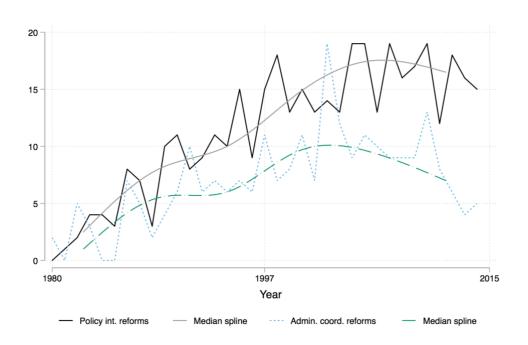
We estimate change point models for policy integration and administrative reforms overall, per policy field, and per country. We fit models that test for one change point, as we want to compare reform sequences between types of reforms (policy integration or administrative coordination), policy fields, and countries. Our interest is to compare sequences across reform types, policy fields and countries. If it is not possible to credibly estimate a model with one change point, we conclude that that there is no single structural change but rather a more complex distribution of reforms over time. (1) More information on the models can be found in the Supplementary Materials 1 and 2.

Results of the empirical analysis

Reforms over time

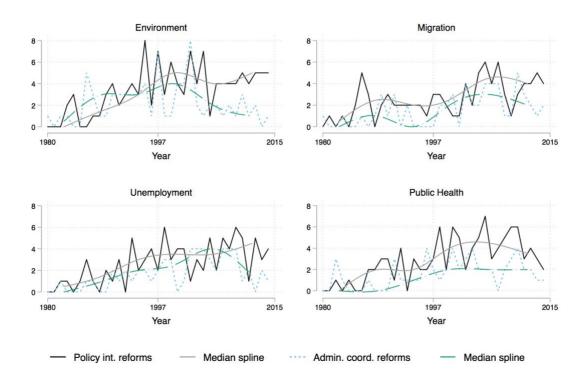
We start the presentation of the results with the overall frequency of policy integration and administrative coordination reforms over time. A simple description of the data shows that the two types of reform are slightly correlated (correlation coefficient: 0.13) but the results also reveal differences between the types of reforms (Figure 1).2) The dynamics of both reform types are similar in so far since after an onset of reforms during the 1980s, the number of reforms increased steeply, reached a peak in the mid-2000s, and declined afterwards.

Figure 1: Policy integration and administrative reforms over time (overall)



The two types of reforms coevolve differently, as the data suggests a much higher frequency of policy integration reforms than administrative coordination reforms. There is a steeper increase of the policy integration reform frequency compared to administrative coordination reforms; notably, administrative coordination reforms peak around 2000 and become less frequent afterwards. Policy integration reforms occur more often and reach the highest point a bit later than administrative coordination reforms.

Figure 2: Administrative coordination and policy integration reforms in different policy fields



There are interesting similarities and differences between policy fields concerning the frequency of policy integration and administrative coordination reforms. All four policy fields – environment, migration, public health, and unemployment – are similar insofar as there are more policy integration than administrative coordination reforms. Furthermore, we observe a tendency to have more reforms in the second half of the time series under observation, in all

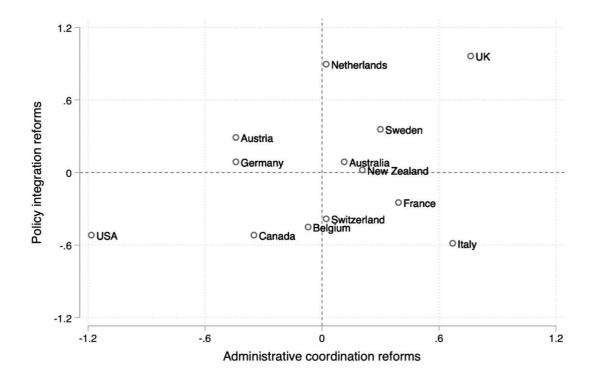
policy fields (after 1997) (Figure 2). The correlations of policy integration and administrative coordination reforms also vary between the different policy fields. The co-occurrence of both types of reforms are the highest in the field of migration policy (correlation: 0.22) and the lowest with respect to public health policy (correlation: 0.08).

On the other hand, there are differences between the four policy fields concerning policy integration and administrative coordination reform activities. Regarding environmental policy, we witness more overall reform intensity than in the other three policy fields and more administrative coordination reforms than policy integration reforms, notably prior to the early 1990s. Migration and public health show both much more policy integration reforms than administrative coordination reforms compared to environment and unemployment policy. On the other hand, the reform activity concerning unemployment is different as policy integration and administrative coordination types of reforms both increase in parallel but then evolve in a dissimilar way – policy integration reforms retained a similar frequency, whereas administrative coordination reforms reached a highpoint that goes beyond the frequency of policy integration reforms in the mid-2000s, and decrease significantly after that (Figure 2).

Variance between countries

The third part of the descriptive analysis focuses on differences between countries while also accounting for reform types and policy fields. To effectively map the magnitude of these reforms, we standardize the reform count around the mean by two standard deviations per country and policy field, which ensures comparability of the data (Gelman 2008; King 1986). First, we take a look at the overall patterns of reform (Figure 3). The results allow us to delineate four country groups of policy integration and administrative coordination reforms; some countries belong clearly to one group, others are more in between.

Figure 3: Overall reforms of policy integration and administrative coordination

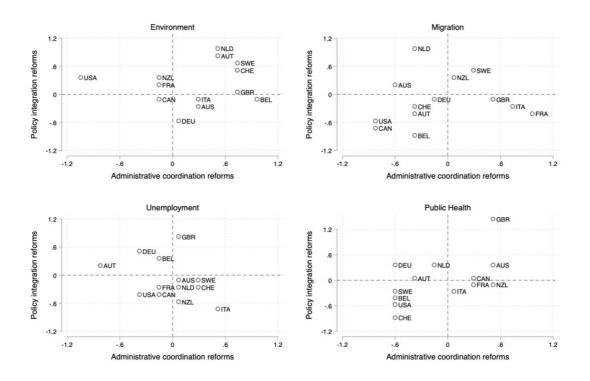


The first group comprises countries with a high frequency of policy integration and administrative coordination reforms (upper right quadrant, Figure 4), namely the UK and Sweden. The Netherlands score lower on the administrative coordination dimension but remain high on the policy integration score. Australia and New Zealand are formally in the group but remain close to the mean of the overall reform activity. The second group entails Austria and Germany, which have many policy integration reforms but few administrative coordination reforms (upper left quadrant, Figure 3). The third group gathers countries with few policy integration and few administrative coordination reforms (lower left quadrant, Figure 3), corresponding to Canada and the US. Belgium remains close to the mean of administrative coordination reforms but belongs clearly to the group of few policy integration reforms. The fourth group consists of countries that have experienced few policy integration reforms and many administrative coordination reforms (lower right quadrant, Figure 3). The most evident members of this group are France and Italy. Switzerland is situated at the margins of the group

close to the mean of few policy integration reforms but clearly part of the set of countries with few administrative coordination reforms.

Now, we turn to the comparison of policy fields. In environmental policy, countries have undergone more policy integration and administrative coordination reforms compared to other policy fields. Five countries are in the group with many policy integration and administrative coordination reforms in this field (upper right quadrant, upper left graph Figure 4). Particularly, Austria, the Netherlands, Sweden, and Switzerland are fully in this group. The UK has many administrative coordination reforms but is just located slightly above the mean for policy integration reforms.

Figure 4: Policy integration and administrative coordination reforms in countries and policy fields



The second group of countries are those with many policy integration but few administrative coordination reforms in environmental policy (upper left quadrant, upper left graph, Figure 4).

The countries in this group are France, New Zealand, and the US. There is only one country with few policy integration and few public administration reforms, Canada, but it is located close to the mean of policy integration and administrative coordination reforms (lower left quadrant, upper left graph, Figure 4). Countries with few policy integration reforms but many administrative coordination reforms, in environmental policy, are Australia, Belgium, Germany, and Italy (lower right quadrant, upper left graph, Figure 4).

Concerning migration policy, there is a different picture as most countries belong to the group with few policy integration and few administrative coordination reforms (lower left quadrant, upper right graph, Figure 4). These countries are Austria, Belgium, Canada, Germany, Switzerland, and the US. Germany is, however, close to the mean of policy integration and administrative coordination reforms. Contrariwise, the only two countries with many policy integration and administrative coordination reforms in the field of migration policy are New Zealand and Sweden (upper right quadrant, upper right graph, Figure 4). There are two countries with many policy integration but few administrative coordination reforms: Australia and the Netherlands (upper left quadrant, upper right graph, Figure 4). Three countries are in the group with few policy integration but many administrative coordination reforms, namely France, Italy, and the UK (lower right quadrant, upper right graph, Figure 4).

In the field of unemployment policy, the UK is the only country with many policy integration and administrative coordination reforms, although it is close to the mean of the administrative coordination reform measure (upper right quadrant, lower left graph, Figure 4). Austria, Belgium, and Germany experienced many policy integration reforms but few administrative coordination reforms (upper left quadrant, lower left graph, Figure 4). The rest of the countries cluster together below the mean of policy integration reforms and relatively close to the mean of administrative coordination reforms. On the one hand, Canada, France, and the US are in the group with few policy integration and administrative coordination reforms (lower right

quadrant, lower left graph, Figure 4). On the other, Austria, Italy, the Netherlands, New Zealand, Sweden and Switzerland belong to the group with few policy integration but many administrative coordination reforms (lower right quadrant, lower left graph, Figure 5). Italy is the only country that is fully in the group.

Finally, there is again a different picture regarding public health. Canada, Australia, and the UK display many policy integration and many administrative coordination reforms but these countries differ within this group since the UK is an outlier whereas Canada is close to the mean of policy integration reforms (upper right quadrant, lower right graph, Figure 4). Austria, Germany, and the Netherlands have experienced many policy integration and few administrative coordination reforms (upper left quadrant, lower right graph, Figure 4), although Austria is close to the mean of policy integration reforms. Belgium, Sweden, Switzerland, and the US have had few policy integration and many administrative coordination reforms (upper left quadrant, lower right graph, Figure 4). France, Italy, and New Zealand are in the group with few policy integration and many administrative coordination reforms (lower left quadrant, lower right graph, Figure 4).

Change Point Analysis

We turn now to the second part of the analysis, which reports the results of the Bayesian change point estimates. The change point analysis returns an estimated change point in 1988 for policy integration, and in 1989 for administrative coordination reforms. The change point estimates are credible in a three-year (policy integration) and five-year (administrative coordination) interval, which is quite precise (cf. Table S3 in Supplementary Materials S1).3) These results indicate that there is a (quasi)parallel development of policy integration and administrative coordination reforms because both types of reform increase in frequency around the same year relative to the previous period (1988, 1989).

Concerning the differences between policy fields, the results of the change point analysis offer more insights on the sequencing of policy integration and administrative coordination reforms. We estimate one model for each policy field. Overall, the change points for policy integration and administrative coordination reforms are rather close to one another, which underlines the parallel trajectory of reforms concerning the cross-sectoral policy dimension as well as administrative-focused reforms that change the relations between organizational units (Table 2; Table S4).4)

Table 2: Change point analysis per policy field

Change point	Environment	Migration	Unemployment	Public health
Policy integration	1989	1997	1992	1989
Administrative coordination	1986	1999	1991	1992
Sequence of structural changes	AC →PI	PI→AC	AC/PI	PI → AC

Environmental policy is the only field, in which the sequence from few to many administrative coordination reforms changed prior to the reforms concerning policy integration. On the other hand, in the fields of migration and public health, the change from few to many policy integration reforms occurred prior to the change in administrative coordination reform. Concerning unemployment, the difference in change points is too marginal to be discernible, i.e., the administrative coordination and policy integration reform sequences changed in parallel to each other (Table 2; Table S4).

Table 3: Change point analysis per country

Country	Policy integration	Administrative coordination	Sequence
Australia	1984	1998	PI→AC
Austria	1996	1993	AC → PI
Belgium	1990	1990	AC / PI

Canada	1988	1991	PI → AC
France	1997	2001	PI → AC
Germany	2000	2003	PI →AC (AC →PI)
Italy	1986	1985	AC/PI
Netherlands	1996	2006	$PI \rightarrow AC (AC \rightarrow PI)$
New Zealand	1998	1990	AC → PI
Sweden	1992	1996	PI → AC
Switzerland	1991	1986	AC → PI
United Kingdom	1985	1993	PI → AC
United States	1990	2001	PI→AC

The change point analysis of reform activities in different countries returns even more interesting findings. We estimated one model per country (Table 3; Table S5).5) The results of the analysis reveal remarkable similarities and differences between countries concerning the dynamics of policy integration and administrative integration. The most striking similarity is that in most countries the change point for policy integration reforms precedes the change point for administrative coordination reforms. Exceptions to this finding are Austria, New Zealand, and Switzerland where the change point for administrative coordination reforms is located before the one concerning policy integration reforms; Belgium and Italy are also interesting as in these two countries the change points for the two reform types are very close to one another. Nevertheless, we need to interpret these results carefully because the change point estimates for administrative coordination reforms have large credibility intervals for Austria and New Zealand (Table 3; Table S5). Furthermore, in Germany and the Netherlands, the change points for administrative coordination reforms have different interpretations; they are different from the other countries since the first period (t1) contains more administrative coordination reforms than the second period (t2), unlike the other countries and periods where the mean reform rate of the first period (prior to the change point) is always lower than the one after the change point.

Theoretical implications

Our analysis makes five broader theoretical contributions that are specifically relevant for public administration and public policy scholarship but also provide insights to political research in a wider sense:

First of all, the overall magnitude of policy integration and administrative coordination reforms is worthy of attention. The dynamics of re-centering are pervasive across sectors and countries, indicating a powerful trend of reforms. Our results suggest that these reforms emerged almost in parallel to the onset of NPM reforms. Thus, post-NPM reforms (Pollitt and Bouckaert 2017, 217) are part of a larger wave of policy change that re-centers governance in the nation state (Christensen et al. 2007). These reforms are not only a reaction to some of the problems created by NPM reforms but coincide with policy changes aiming to reorganize political coordination structures to deal with new policy challenges (Christensen and Lægreid 2007a, 11). As such, they aim at dealing with the particular problems induced by NPM, while they also follow up from the processes of denationalization upwards, downwards and sideward (Zürn 2000), suggesting that these phenomena are more complex that what is usually thought. Our findings imply that denationalization and re-centering are actually intertwined and shall be considered as two sides of the same coin, whereby the devolution of powers from the central state creates the need and the momentum for re-organizing the relationships between policy sectors and among public sector organizations (see also Egeberg and Trondal 2018).

Secondly, our results indicate that it makes sense to distinguish between a policy and an organizational dimension of integration and coordination. Indeed, it appears that the trajectories of policy integration and administrative coordination reforms are related and overlap partially but they are not perfectly correlated; and they exhibit some discrepancies with concerning their frequency and timing. It is important to note that for most cases the change point for policy

integration reforms precedes the change point for administrative coordination reforms (with exception of the relatively new issue of environmental protection), implying that policy change tends to shape organizational reforms, and not the reverse (Christensen and Laegreid 2007). In other words, policy integration reforms tend to create a demand for more administrative coordination, resulting in the re-assertion of the central government (Christensen et al. 2007; Dahlström et al. 2011).

Thirdly, our findings point to variance between policy fields in line with the complexity of reforms, namely their technical complexity and scope. We witness more overall reform intensity in environmental policy – a technically complex, wide-ranging field – than in the other areas, and specifically more administrative coordination reforms in the early years, a result which may stem from the fact that this is a more recent policy field compared to the others, e.g. unemployment policy. These results suggest that policymakers pursue integration coordination reforms especially in policy fields presenting complex policy problems (Christensen et al. 2019). The concentrated or dispersed distribution of reform targets and their strength or weakness in term of resources and capacity resulting from differences in complexity may help in explaining these variations; further research is however required to explore the impact of these factors.

Fourth, with respect to variations across countries, the main findings suggest that reform activity is more intense in countries within the Anglo-Saxon administrative tradition. These countries where not only among the first to create post-NPM reforms (Christensen and Lægreid 2007a, 11) but are also forerunners concerning policy integration reforms, especially Australia, Canada and the UK. Furthermore, our results indicate that the Netherlands, the UK, and Sweden are in the group with a high intensity of post-NPM reforms (Figure 4). This is finding resonates with the literature, which argues that, "measured in terms of management tool use, Sweden, the United Kingdom and the Netherlands would seem to be the countries most committed to NPM

reforms (Jeannot and Bezes 2016, 225)." Our results suggest also that there are some differences between countries belonging to the Germanic and Napoleonic administrative traditions (Painter and Peters 2010). In Germany and Austria, policy integration reforms outweigh administrative coordination reforms, whereas this relationship is inverse in France and Italy. Countries with a Napoleonic state tradition, notably France, have a centralized and politicized bureaucracy (Dahlström et al. 2011, 13) that functions as a "general purpose elite for the state" (Ongaro 2009, 254). Therefore, the predominance of administrative coordination over policy integration reforms makes sense in these countries. Our results imply that the vertical centralization of the state structure (Pollitt and Bouckaert 2017, 54) plays a role regarding the intensity of post-NPM as well as policy integration and administrative coordination reforms in general. For example, the German government conducted administrative reforms at the lower level of government (Andrews et al. 2016, 277). The differences within the Anglo-Saxon group of countries – notably between the centralized UK on the one hand, and decentralized Canada, and the U.S. on the other, emphasize this point.

Fifth, the timing and sequencing of reforms varies considerably between countries. This also provides evidence concerning differences between administrative traditions. Notably, Anglo-Saxon countries have early change points for reform activity, especially concerning policy integration reforms, such as illustrated by Australia, Canada, and the UK, but not the U.S. Conversely, there are other countries with early change points of policy integration or administrative coordination reforms; notably Italy and Switzerland. These findings underline the importance of country-specific effects of timing (Pierson 2000) and reform intensity.

Conclusions

This article provided systematic comparative evidence on the reassertion of the center of the nation state by means of integrating sectoral public policies and by coordinating administrative

units. We presented a comparative analysis of cross-sectoral policy and administrative reforms. Our descriptive statistics and Bayesian change-point estimations indicate that policy integration and administrative coordination reforms configure a powerful trend. These reforms took place roughly at the same time of the processes of denationalization upwards, downwards and sideward (Zürn 2000) — and more specifically following the spread of post-NPM reforms (Christensen and Lægreid 2007c), suggesting that denationalization and re-centering are actually intertwined phenomena. This overall trend displays considerable variation across time, policy fields, and countries. In particular, the highest frequency of reforms is found in environmental policy and in unitary Anglo-Saxon countries. With a broad comparative perspective focusing on the cross-national level, our study complements and extends existing research on municipal collaboration (Klok et al. 2018; Song et al. 2018) and environmental policy integration at the local level (Krause et al. 2019).

All in all, a systematic discussion of the determinants of these variations is beyond of the scope of this article. Further research needs to explore the interplay of various explanatory factors, such as administrative traditions, the degree of centralization of the state, and the timing of reform events. What is more, future scholarship should explore the role of additional variables such as partisan ideology (Jain and Sarkar 2018), as well as the extent to which intense policy integration and administrative coordination reforms will eventually result in paradigmatic changes (Hall 1993) as regards cross-sectoral governance. Finally, future research should study the implementation phase and find out whether policy integration and administrative coordination reforms actually achieve superior policy outcomes.

Endnotes

1)We use the Bayesian estimator built into the Stata (bayesmh), which is based on the Metropolis-Hastings sampling algorithm. The models are based on a Poisson distribution and assume uniform priors.

2) The figures are based on: (Bischof 2017).

3)The Supplementary Material Part 2 contains the fit statistics for the Bayesian models. The number of the models in Supplementary Materials Part 2 corresponds to the numbering of the models in Supplementary Materials Part 1, Tables S3, S4, and S5.

4)The credibility intervals vary for the different estimates (cf. Table S4). We show the change point in black if the credibility interval is lower than ten years and in grey if it is higher than 10 years.

5)The credibility intervals vary for the different estimates (cf. Table S5). We show the change point in black if the credibility interval is lower than ten years and in grey if it is higher than 10 years.

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Supplementary Materials Part 1: Coding and supplementary statistics

Title of the paper: Patterns of Policy Integration and Administrative

Coordination Reforms: A Comparative Empirical Analysis

Method

To measure policy integration and administrative coordination reforms, we collected a data set of reform events, similar to policy diffusion and conflict research (Prorok and Huth 2015; Maggetti and Gilardi 2016). The dataset measures reforms with two binary variables (0/1) – one for policy integration and another for administrative coordination – per policy field in a country and year, which results in a dataset with 1820 observations on the dependent variable (cf. Table S2). This measurement strategy displays whether there is a reform in a given sector and year but does not compare degrees of integration or coordination; we thus included solely reforms that were substantially relevant for our analytical approach, i.e., where were sure that the reform fits the category of policy integration and administrative coordination reforms in the sense we discussed it conceptually. This approach allows us to measure the temporal and multilevel dynamics of the reforms under investigation, in accordance with the above-defined concepts of policy integration and administrative coordination and their application in the four policy fields. Consequently, our dataset contains reform activities per year nested in four fields and thirteen countries (Steenbergen and Jones 2002; Rohlfing 2008). We present the details of the operationalization for each policy field in the Supplementary Material documents to the article (cf. Table S2, Supplementary Materials Part 1). Some examples of the reforms that we entered in the dataset include the following:

- 1. *Environment:* Policy integration: the amendment to the German *Grundgesetz* that includes environmental protection in article 20a institutionalized the creation of an environmental policy field (OECD 2002). *Administrative coordination:* the establishment of a federal ministry for environmental protection, in Germany, is an instance of administrative coordination in environmental policy (Wurzel 2008).
- 2. *Migration:* Policy integration: the Dutch Civic Integration Act of 2007 created tighter language requirements for all immigrants. We use it as an example for policy integration because it links immigration, integration, and education measures (Van Meeteren et al. 2013). Administrative coordination: the creation of the Dutch Ministry for Aliens Affairs and Integration, in 2002 (Bruquetas-Callejo et al. 2011).
- 3. *Public Health: Policy integration:* in the field of public health, the 1992 UK *Health of the Nation Strategy* is an example for policy integration because it combined curative and preventative aspects of health policy (Trein 2018, 264). *Administrative coordination:* the UK *Health Development Agency* that was set up in 2000 is an instance of administrative coordination as it aimed to increase preventative elements in the National Health Service (Trein 2018, 264). One exception to our classification are "health in all policies" projects, which aim at a broad integration of public health goals in all other policies. Nevertheless, this is a very specific aspect of policy integration and administrative coordination reforms in health policy, and these reforms have also been included in our dataset (Kickbusch and Buckett 2010).
- 4. *Unemployment: Policy integration:* In the field of unemployment policy, the US *Middle Class Tax Relief and Job Creation Act* of 2012 is an instance of policy integration because it institutionalizes activation measures for unemployment benefit recipients (Dunn 2013, 14). *Administrative coordination:* The nationally decided and locally administrated change in unemployment benefits and training delivery, in

Germany, in 2004, is an instance of administrative coordination in the field of unemployment (Schiller 2016).

We present further details of the operationalization for each policy field in the Supplementary Material Part 1 (cf. Table S2; the full dataset will be released after publication). To collect the data, we followed these steps: (1) Survey of primary sources, secondary literature, edited books, and policy reports (for instance by international organizations or governments). (2) Creation of time series of reforms. (3) Data sheets validated by international experts. (4) Exclusion of reforms that are unclear in their substantial relevance for our analytical focus. The response rate of experts was very high (around 80 percent). For the few remaining data sheets that we could not directly verify through expert reviews, we conducted additional research to be sure that we did not miss relevant reform events or included reforms that were irrelevant for policy integration and administrative coordination. Our data come with some limitations. Firstly, we do not record all reforms in any given country and policy field but we conducted a survey of those reforms that appeared in the secondary literature and in policy reports and were added or confirmed through an expert review. The two steps – review of the secondary literature and expert consultation – provided nevertheless remarkably consistent results. Secondly, we only focus on national-level reforms for reasons of comparability and feasibility, even though we are aware that cross-sectoral reforms do also occur at the subnational level (Steurer and Clar 2015; Klok et al. 2018; Song et al. 2018). Thirdly, we do not code explicitly the rationale of reforms, for example whether integration and coordination of labor market activation and social benefits is predominantly a social investment approach supporting workers or rather a measure to reduce social benefits. A reform can contain both two goals and be ambiguous in this respect (Thelen 2014). Such an analysis would require a more fine-grained investigation than what we can offer at this stage and is beyond our research goals. Eventually, our research does not cover the implementation phase and whether more policy integration and administrative coordination reforms do actually lead to better policy results. This limitation does not weaken our analysis as we examine policy outputs by looking at integration and coordination in a functional, goal-oriented and utilitarian, sense, i.e., at the re-centering/reassertion of policy sectors around specific issues (Christensen et al. 2007).

To analyze our data, we proceed in three steps, First, we present descriptive results for policy integration and administrative coordination reform events, over time, on three levels: (1) overall reforms, (2) reforms per policy field, and (3) reforms per country. Second, we use Bayesian change-point analyses (Carlin et al. 1992) to determine objectively if there is a structural break in the reform frequency overall, at the level of policy fields, and in countries. Bayesian change point models allow, "... us to describe the probability that the underlying data generating process changes based on the parameter estimates" (Leemann 2015, 598). To put it in our own words, we can estimate whether there are sequences of reform activities, which are separated by structural breaks, i.e., whether there are systematically more reform events before or after a specific year, in our time series (1980-2014). The models use a Poisson point process that is appropriate to our data, which is a count of reform events per year overall, in a policy field, or in a country (Carlin et al. 1992).

We estimate change point models for policy integration and administrative reforms overall, per policy field, and per country. We fit models that test for one change point, as we want to compare reform sequences between type of reform (policy integration or administrative coordination), policy fields, and countries. Our interest is to compare sequences across reform types, policy fields and countries. If it is not possible to credibly estimate a model with one change point, we conclude that that there is no single structural change but rather a more complex distribution of reforms over time.

Descriptive statistics, coding, and models

Table S1: Descriptive statistics for policy integration and administrative coordination reforms

Variable	Obs.	Mean	Std. Dev.	Min.	Max.
Policy integration reforms	1,820	.2192308	.413839	0	1
Administrative coordination reforms	1,820	.1340659	.3408168	0	1

Table S2: Operationalization of policy integration and administrative coordination across policy sectors (dependent variables)

Policy field	Policy integration	Administrative coordination
Environment	- National strategies and action plans for	- Transversal bodies for environmental
(Object of	the integration of sustainable	policy at the level of the central
integration:	development policies	government, with competences for
creation of a	- Framework legislation that integrates	formulating national environmental
field of	environmental matters of various	policy and coordinating the
environmental	sectoral policies	implementation of national
policy; no	- Environmental (framework) legislation	environmental strategies
purely sectoral	that integrates formerly disperse	- Inter-sectoral ministerial councils or
integration of	legislation and reduces fragmentation	working groups for environmental
environmental	- Constitutional law on environmental	policy, e.g. "green cabinets"
concerns in	protection:	- Increase of the Ministry of
other policies)	- Central legislation that leads to	Environment's responsibilities of
	harmonization of sub-national policy	transversal coordination of
	(in federal systems)	environmental policy
	- Environmental planning at ministerial	- Intergovernmental agreements and units
	level	for environmental policy (in federal

				systems) that delimit the respective
				responsibilities
			-	Joint federal and sub-national bodies
				for nation-wide harmonization and/or
				coordination
			_	Reorganizations of the central
				government that lead to integration of
				the environmental portfolio:
			_	Reorganization at the level of
				regulatory agencies that lead to
				integration of competences for
				environmental policy or that create
				coordinative capacities
			_	Creation of a public service for the
				environment or of sustainability units in
				the public service
			-	Strategies for the promotion of
				employment in the environmental
				sector
			_	Reforms that harmonize or coordinate
				administrative procedures regarding
				e.g. departmental environmental
				reporting systems or the development
				of sustainability action plans
Migration	-	Integration or coordination of laws	-	Organization to integrate or coordinate
(Object of		referring to temporary and permanent		different ministries and levels of
integration:		residence		government that are related to
integration and	-	National action plans or strategies for		immigration and immigrant integration
coordination of		immigration and immigrant integration	_	Accumulating immigration and
immigration	-	Integration policy action plan		integration portfolios in one ministry
	<u> </u>		<u> </u>	

and immigrant	-	Strategy to harmonize immigration and	-	Creation of interdepartmental working
integration		integration policies between sectors and		groups
policies and		levels of government	-	Councils to coordinate different
organizations,	-	Labor market integration and education		ministries in the field
as well as		reforms that make further immigration	-	Commissioner for foreigners
mainstreaming		benefits conditional on employment	-	Conditionality of immigration benefits
of immigrant		and education efforts of the applicant		for integration efforts
integration			-	Organizations that bring together
policies)				policymakers from different sectors and
				different levels of government at same
				time
Public health	-	Reforms that include preventive	-	Network amongst hospitals with a
(Object of		measures into health the services paid		particular focus on health promotion
integration:		by the general health insurance, such as		and prevention
integration and		screening programs	-	National public health agency and
coordination of	-	Health promotion and legislation with a		ministry that includes sections for
curative and		focus on the coordination and		disease prevention and others that are
preventative		integration of prevention and cure –		responsible for curative aspects of
elements of		either in general or with a focus on		health policy
health policy)		specific diseases	-	Public organizations that coordinate the
	-	General and specific national health		prevention and treatment of specific
		strategies (e.g., cancer, diabetes, HIV,		diseases and/or the policy advocacy for
		tobacco, nutrition, etc.)		it
	-	Strategies that focus on health	-	Establishment of institutions of health
		inequalities		information
	-	Public health funds that allow	-	Inter-ministerial conferences and
		organizations and levels of government		councils that coordinate preventative
		to operate policy programs that		and curative aspects concerning certain
		coordinate or even integrate preventive		diseases and/or risk factors, such as
		and curative measures		drugs, tobacco, cancer etc.

Unemployment
(Object of
integration:
integration and
coordination of
activation and
benefit related
policies)

- National strategies, action plans or reform packages that integrate active and passive labour market policies (e.g. "welfare to work" principle)
- Employment policy reforms that introduce or enhance activation measures in employment policy
- Reforms that integrate formerly
 separated social assistance and/or
 unemployment benefits, e.g. by creating
 an integrates system of income and
 employment benefits
- Adoption of reforms that apply an activation approach to pension, family or invalidity policy

- Creation of transversal bodies for employment policy at the level of the central government
- Creation of intergovernmental
 agreements or units (in federal systems)
 for nation-wide harmonization and/or
 coordination of employment policy
- Reorganizations of the central government that lead to integration of employment portfolio by merging the ministries responsible for various sectors such as employment, social affairs, health, etc.
- Reorganization of implementation
 administrations that lead to integration
 of active and passive employment
 policy and/or services for employment

 and social assistance:
- Creation of one-stop shop service
 centers that offer comprehensive
 services related to social assistance,
 unemployment benefits, and job
 placement
- Introduction of an individualized approach to employment assistance
- Integration of administrative procedures
 for both unemployment and social
 security administrations such as unified
 electronic declarations or social
 identification cards

	-	Procedures that enhance or
		institutionalize inter-agency
		collaboration between unemployment
		and social security administrations

In the following analysis, we present the mean and the credibility interval for the change point analyses as well as the change point ratio, i.e., the rate of reforms before and after the change point. We put the change point estimates in black if the credibility interval is lower than years and in grey if it is above the ten year range.

Table S3: Change point estimates for reforms overall

	Mod	lel 1 PI reforms overall	Model 2 AC reforms overall	
	Mean	Equal-tailed [95% Cred.	Mean	Equal-tailed [95% Cred.
		Interval]		Interval]
Change point	1988.68	1988.021; 1991.563	1989.123	1985.145; 1990.968
Change point ratio	3.886992	2.664904; 5.601599	0.3247457	0.1567961; 0.4855151

Table S4: Change point estimates in policy fields

	Mean	Equal-tailed [95% Cred.	Mean	Equal-tailed [95% Cred.
		Interval]		Interval]
	Model 3	3 PI reforms environment	Model 4	AC reforms environment
Change point	1988.832	1986.856; 1992.573	1985.565	1981.693; 1990.712
Change point ratio	0.2319790	0.0987619; 0.4382453	0.3402191	0.0713108; 0.8452686
	Model	4 PI reforms migration	Model :	5 AC reforms migration
Change point	1996.41	1983.547; 2004.777	1998.622	1991.516; 2003.804
Change point ratio	0.4068223	0.0851659; 0.6966697	0.3478884	0.1682653; 0.595772

	Model 6	PI reforms unemployment	Model 7 A	C reforms unemployment
Change point	1991.657	1985.747; 1995.463	1991.102	1985.948; 2000.523
Change point ratio	0.305005	0.1448183; 0.536739	0.2427823	0.0523292; 0.5563208
	Model 7	PI reforms public health	Model 8 A	AC reforms public health
Change point	Model 7	PI reforms public health 1986.001; 1997.472	Model 8 A	AC reforms public health 1988.131; 1998.974

Table S5: Change point estimates in different countries

	Mean	Equal-tailed [95% Cred.	Mean	Equal-tailed [95% Cred.
		Interval]		Interval]
	Model	11 PI reforms Australia	Model	12 AC reforms Australia
Change point	1984.01	1983.013; 1988.663	1988.461	1987.443; 1988.98
Change point	0.0920413	0.0018629; 0.3904608	0.0361373	0.0009373; 0.1413488
ratio				
	Mode	l 13 PI reforms Austria	Model	14 AC reforms Austria
Change point	1996.497	1996.02; 1996.97	1993.198	1985.029; 2005.802
Change point	0.2263511	0.1402987; 0.3462127	0.2403007	0.0148142; 0.5129851
ratio				
	Model	15 PI reforms Belgium	Model	16 AC reforms Belgium
Change point	1990.516	1990.012; 1990.973	1990.264	1987.385; 1992.605
Change point	0.0231214	0.0005429; 0.0792848	0.2560539	0.0873936; 0.5153542
ratio				
	Mode	l 17 PI reforms Canada	Model	18 AC reforms Canada
Change point	1988.461	1987.302; 1988.994	1991.408	1990.187; 1991.976
Change point	0.1619546	0.0520175; 0.3345606	0.0318699	0.0007904; 0.1267353
ratio				
	Mode	el 19 PI reforms France	Model	20 CA reforms France
Change point	1997.513	1997.015; 1997.977	2001.693	1997.036; 2005.251

Change point	0.1270663	0.0680743; 0.2101841	0.4076678	0.2478191; 0.6130514	
ratio					
	Model	21 PI reforms Germany	Model 22 AC reforms Germany		
Change point	2000.171	1998.406; 2001.956	2003.948	1982.344; 2011.988	
Change point	0.3083142	0.2111483; 0.4421475	17.65929	0.160055; 94.56315	
ratio					
	Mod	lel 23 PI reforms Italy	Mode	el 24 AC reforms Italy	
Change point	1986.275	1984.846; 1988.982	1985.838	1982.029; 1996.612	
Change point	0.0884374	0.0012463; 0.321816	0.2455122	0.0096732; 0.6308424	
ratio					
<u> </u>	Model 2	5 PI reforms New Zealand	Model 26	AC reforms New Zealand	
Change point	1998.008	1996.674; 2001.581	1990.355	1981.992; 2001.327	
Change point	0.294353	0.185947; 0.4374334	0.3773636	0.0133753; 0.7732216	
ratio					
	Model 2	7 PI reforms Netherlands	Model 28	3 AC reforms Netherlands	
Change point	1996.273	1980.475; 2009.901	2006.601	1982.068; 2012.868	
Change point	0.49951	0.1017079; 0.8495666	34.93808	0.6081615; 163.5394	
ratio					
	Mode	l 29 PI reforms Sweden	Model	30 AC reforms Sweden	
Change point	1992.513	1991.983; 1993.353	1996.62	1995.121; 1998.33	
Change point	0.3521408	0.2177849; 0.5373336	0.3314779	0.1866236; 0.5285806	
ratio					
	Model 3	1 PI reforms Switzerland	Model 32	2 AC reforms Switzerland	
Change point	1991.515	1990.522; 1992.421	1986.435	1985.385; 1986.974	
Change point	0.1913225	0.0850247; 0.3443868	0.0486118	0.0008284; 0.1928803	
ratio					
	Mod	del 33 PI reforms UK	Mod	lel 34 AC reforms UK	
Change point	1985.473	1985.018; 1985.948	1993.881	1992.602; 1998.251	
Change point	0.0263216	0.0007708; 0.0936803	0.2887824	0.1573705; 0.4628316	
ratio		•			

	Mod	lel 35 PI reforms USA	Model 36 AC reforms USA		
Change point	1990.385	1988.185; 1995.234	2001.62	1995.578; 2008.57	
Change point	0.2902547	0.125141; 0.533262	0.1537796	0.0061423; 0.4000002	
ratio					

Figure S1: Reforms in the UK

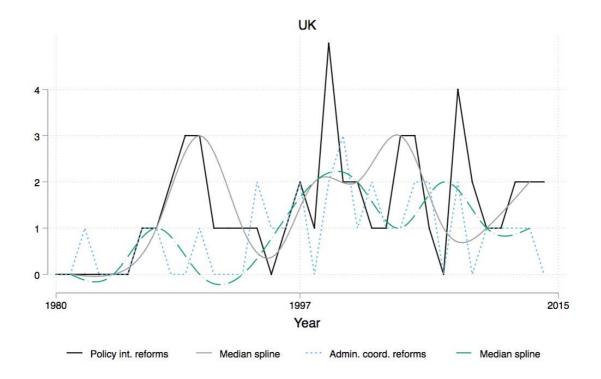


Figure S2: Reforms in Anglo-Saxon countries (non-UK)

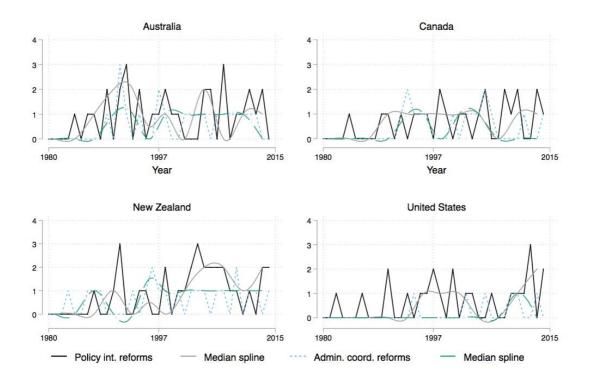


Figure S3: Reforms in federal and European countries

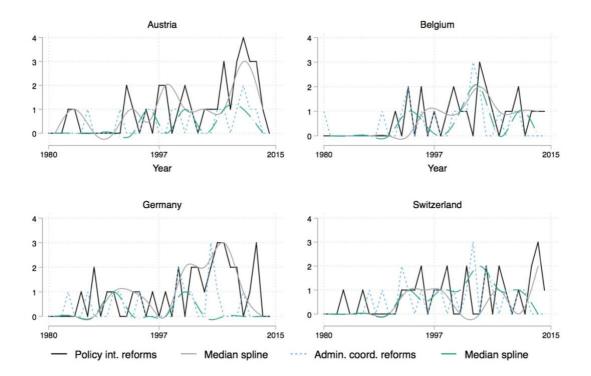
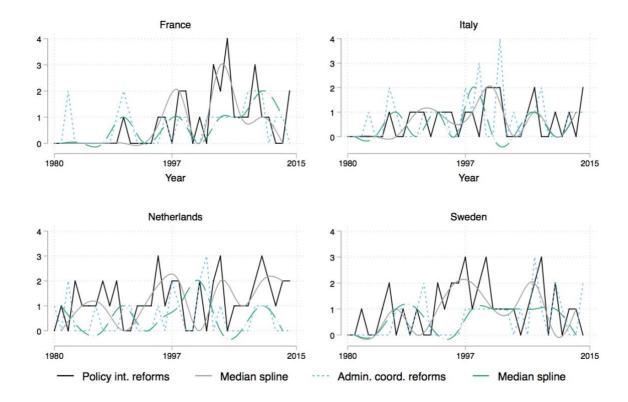


Figure S4: Reforms in unitary states in Europe



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i We use the Bayesian estimator built into the Stata (bayesmh), which is based on the Metropolis-Hastings sampling algorithm. The models are based on a Poisson distribution and assume uniform priors.

Supplementary Materials Part 2: Model Fit of Bayesian Estimates

Title of the paper: Patterns of Policy Integration and Administrative Coordination Reforms: A Comparative Empirical Analysis

Model-fit statistics for Bayesian estimates. The number of the models corresponds to the number of the models in Supplementary Materials Part 1.

Figure 1: Model 1, Change point and estimated ratio of Period 1 and Period 2

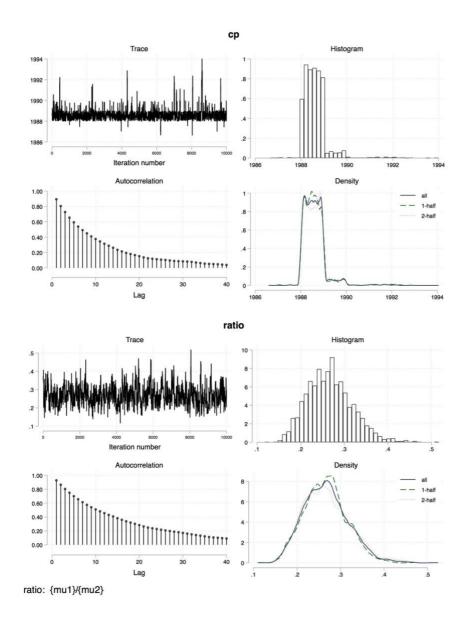


Figure 2: Model 2, Change point and estimated ratio of Period 1 and Period 2

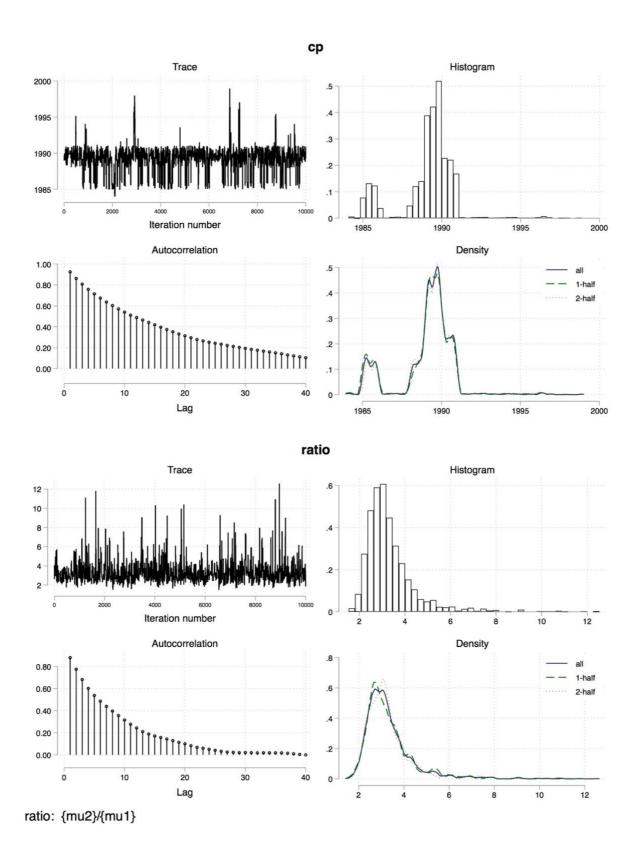


Figure 3: Model 3, Change point and estimated ratio of Period 1 and Period 2

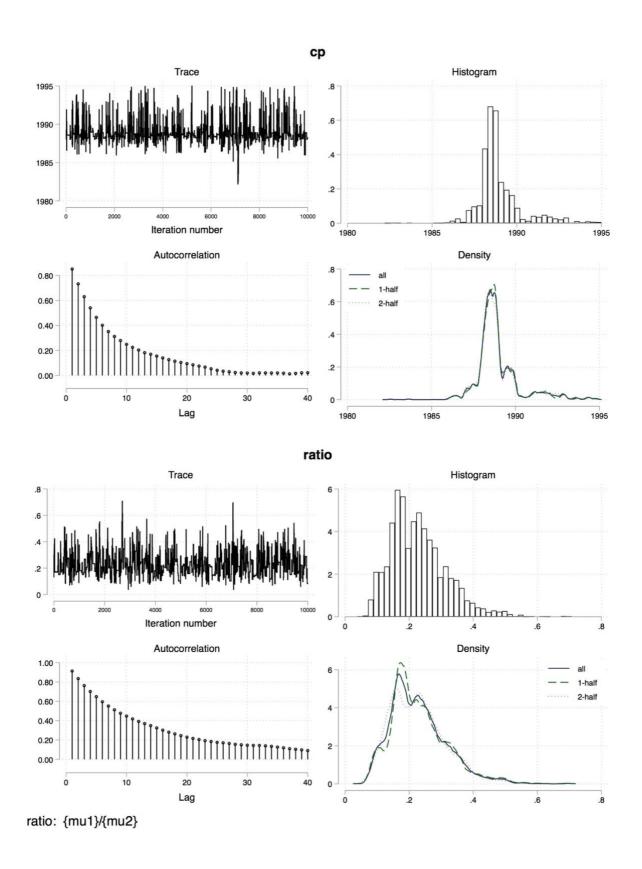


Figure 4: Model 4, Change point and estimated ratio of Period 1 and Period 2

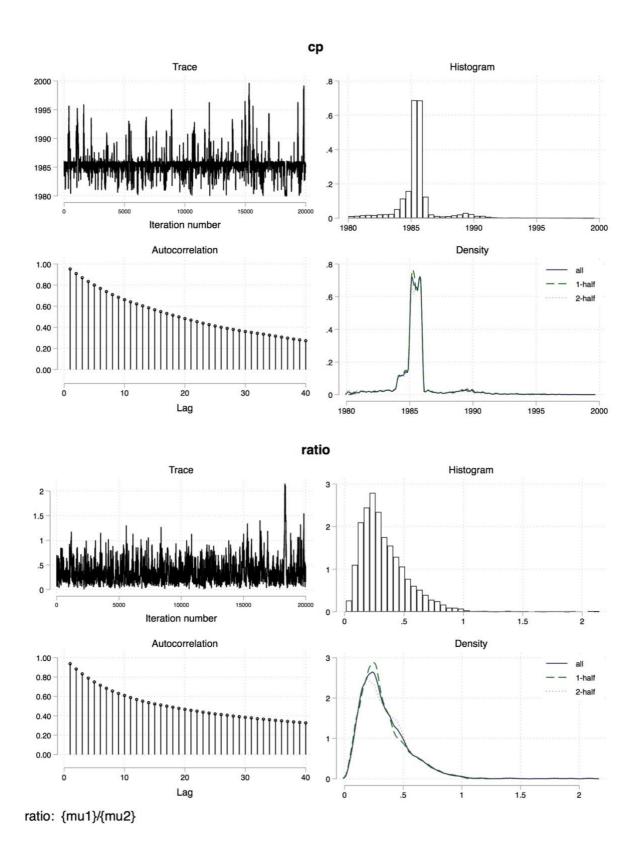


Figure 5: Model 5, Change point and estimated ratio of Period 1 and Period 2

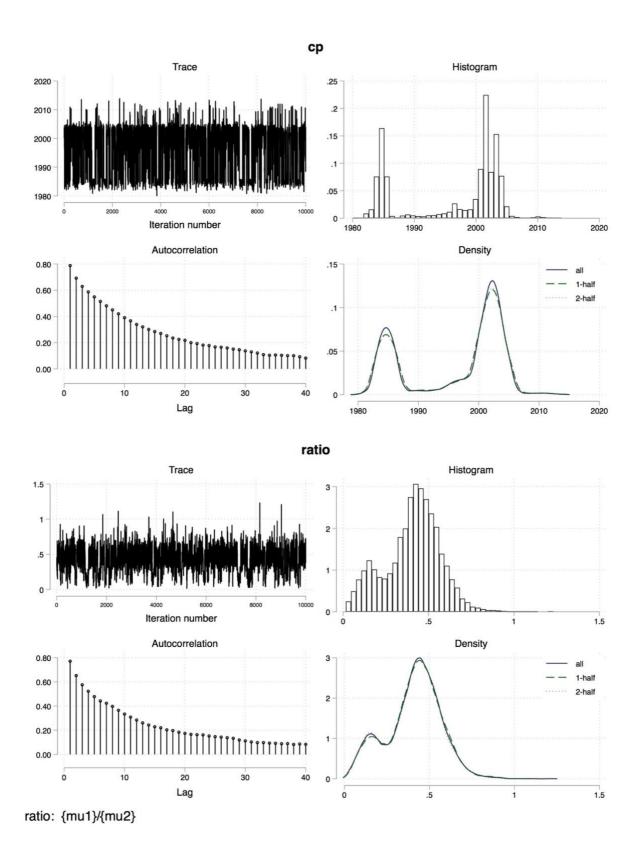


Figure 6: Model 6, Change point and estimated ratio of Period 1 and Period 2

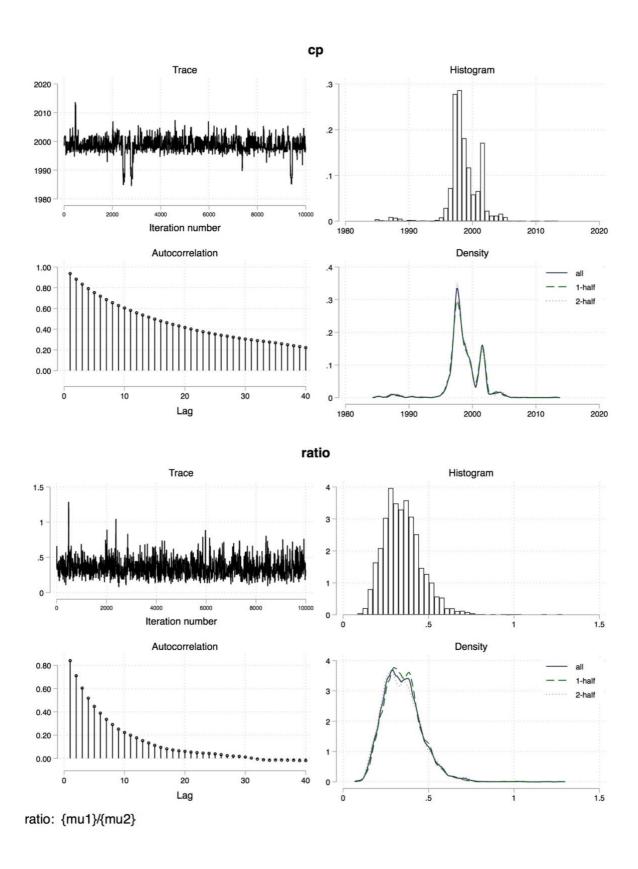


Figure 7: Model 7, Change point and estimated ratio of Period 1 and Period 2

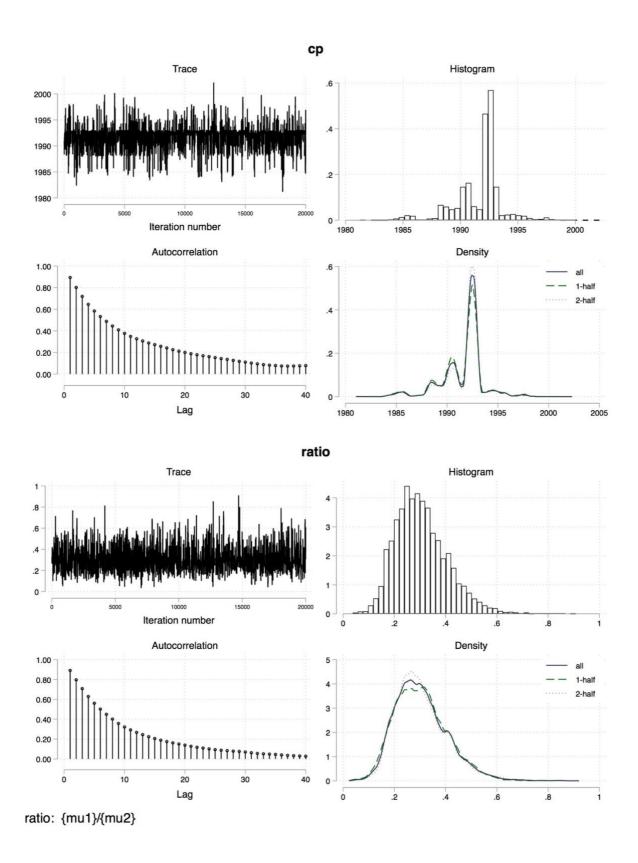


Figure 8: Model 8, Change point and estimated ratio of Period 1 and Period 2

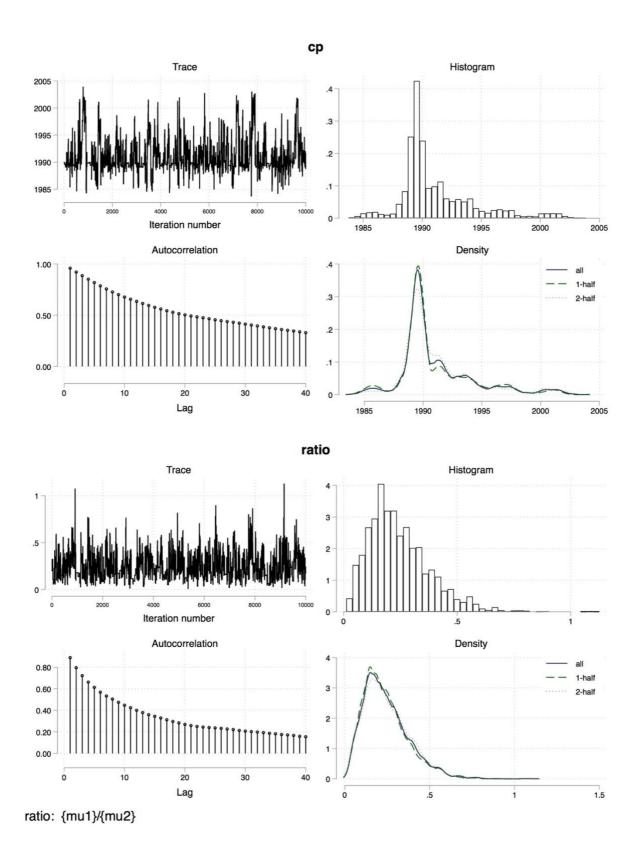


Figure 9: Model 9, Change point and estimated ratio of Period 1 and Period 2

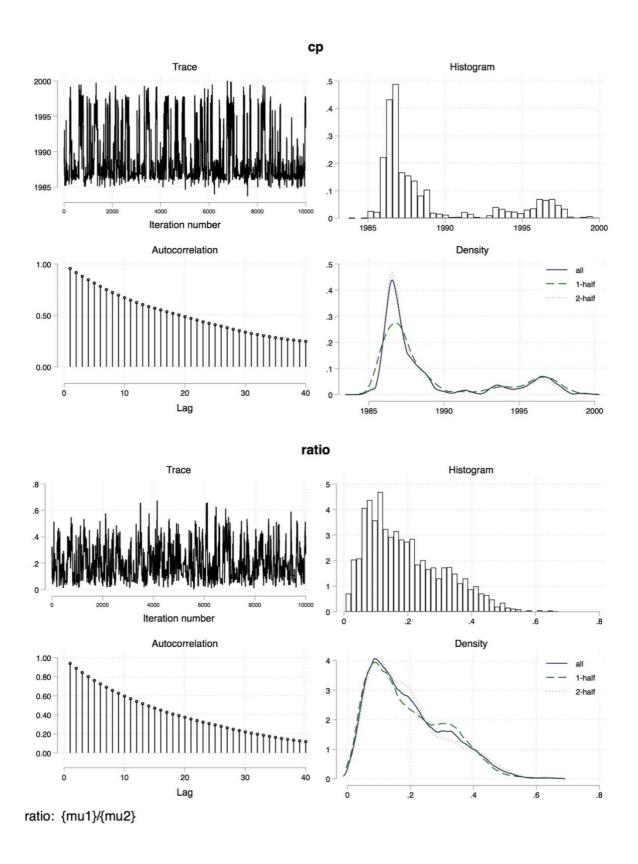


Figure 10: Model 10, Change point and estimated ratio of Period 1 and Period 2

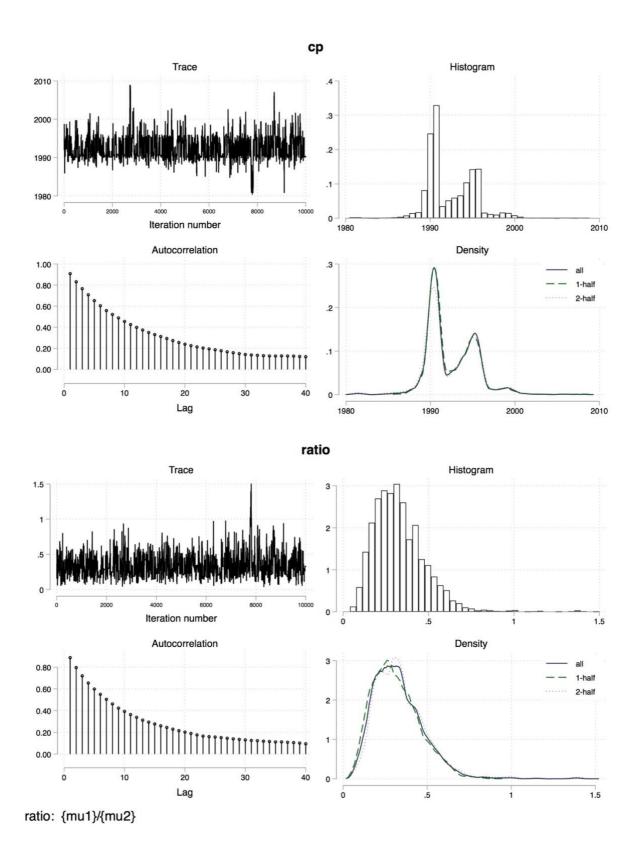


Figure 11: Model 11, Change point and estimated ratio of Period 1 and Period 2

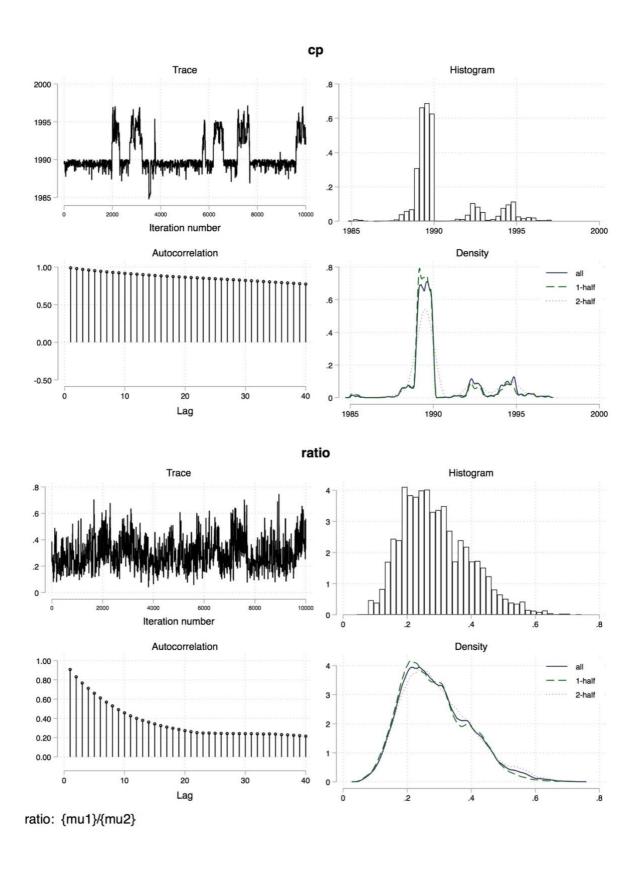


Figure 12: Model 12, Change point and estimated ratio of Period 1 and Period 2

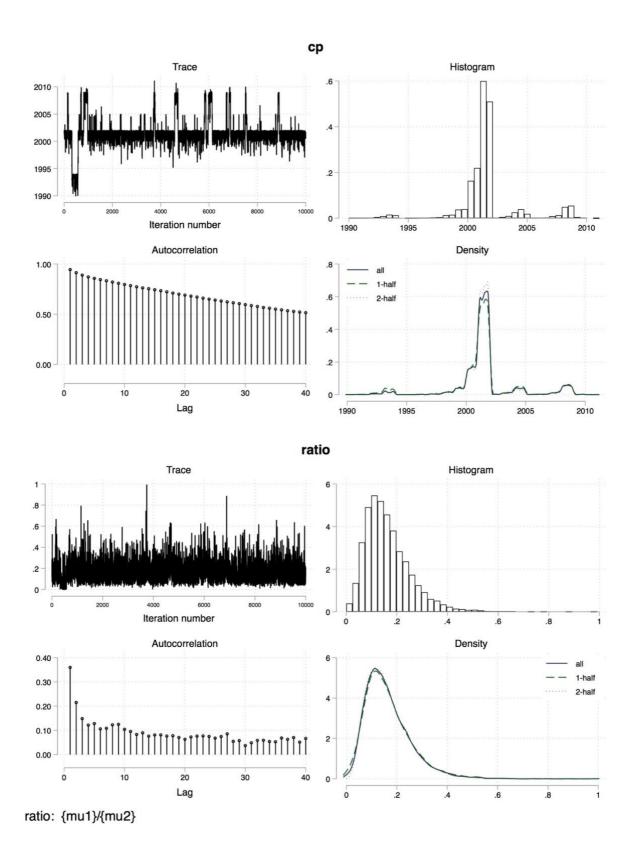


Figure 13: Model 13, Change point and estimated ratio of Period 1 and Period 2

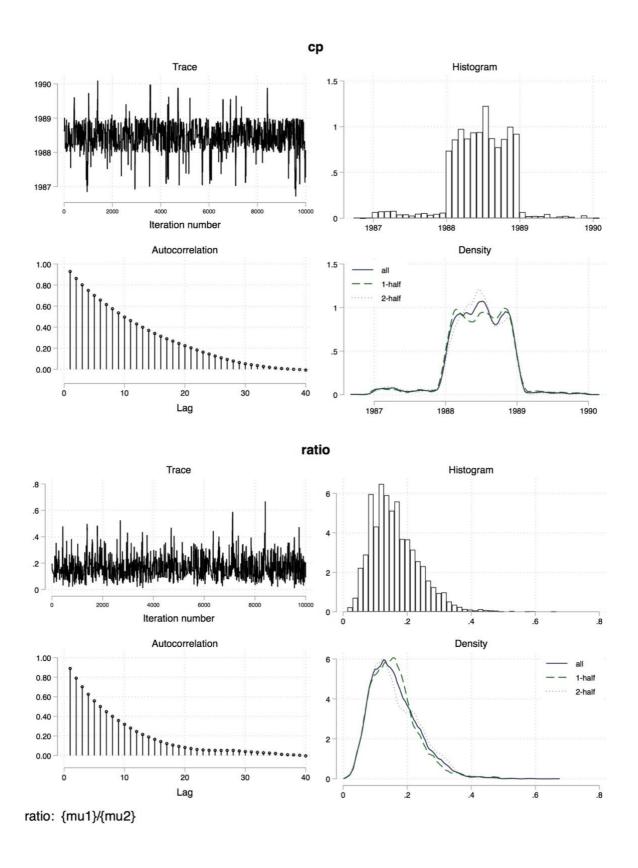


Figure 14: Model 14, Change point and estimated ratio of Period 1 and Period 2

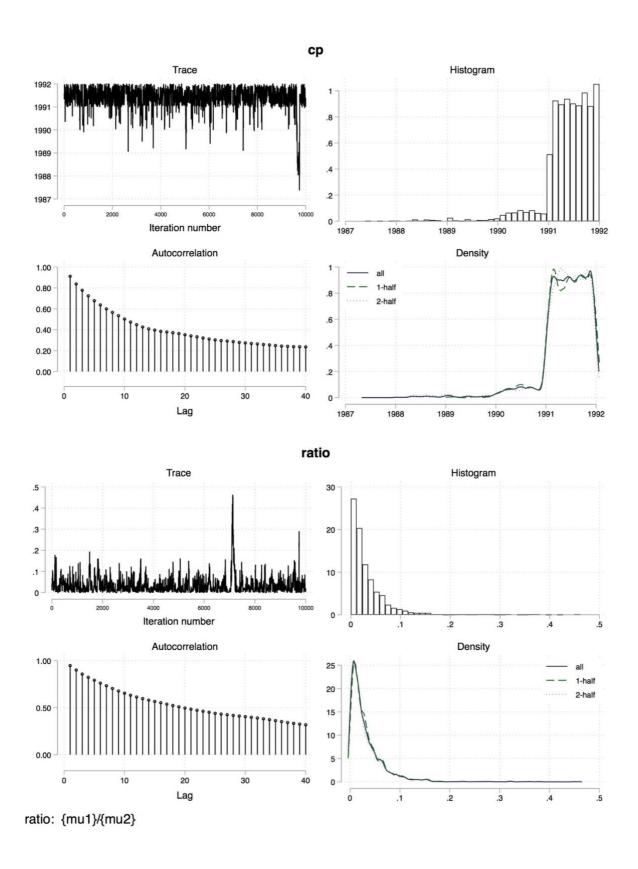


Figure 15: Model 15, Change point and estimated ratio of Period 1 and Period 2

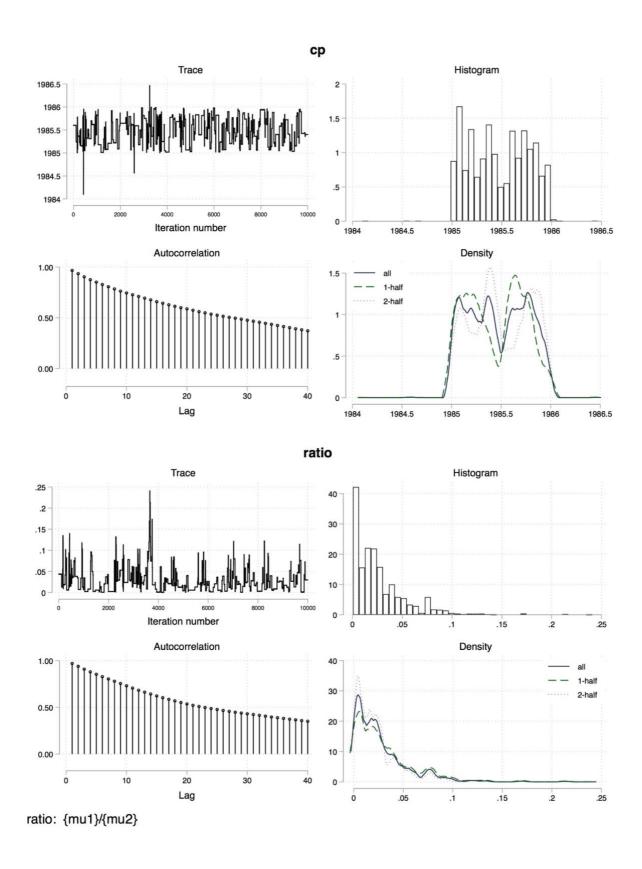


Figure 16: Model 16, Change point and estimated ratio of Period 1 and Period 2

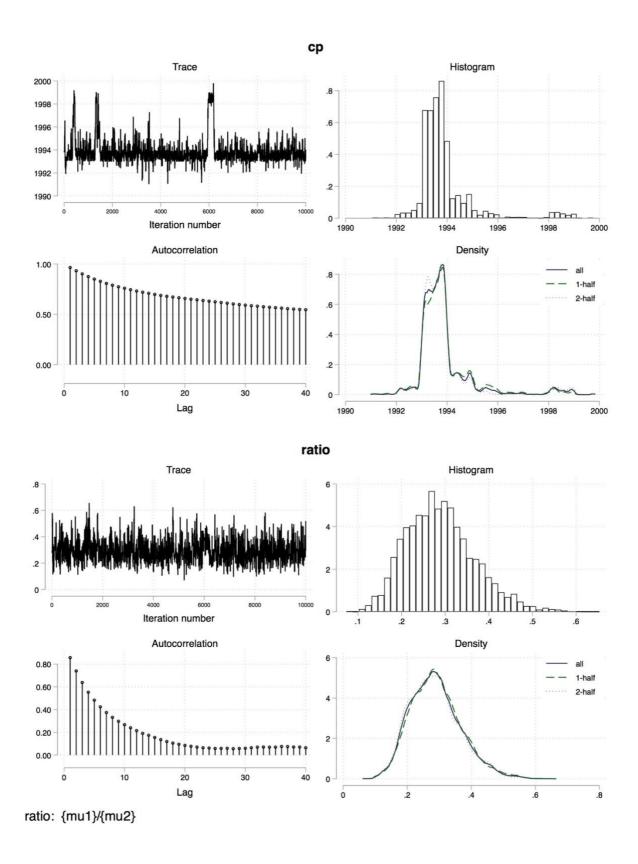


Figure 17: Model 17, Change point and estimated ratio of Period 1 and Period 2

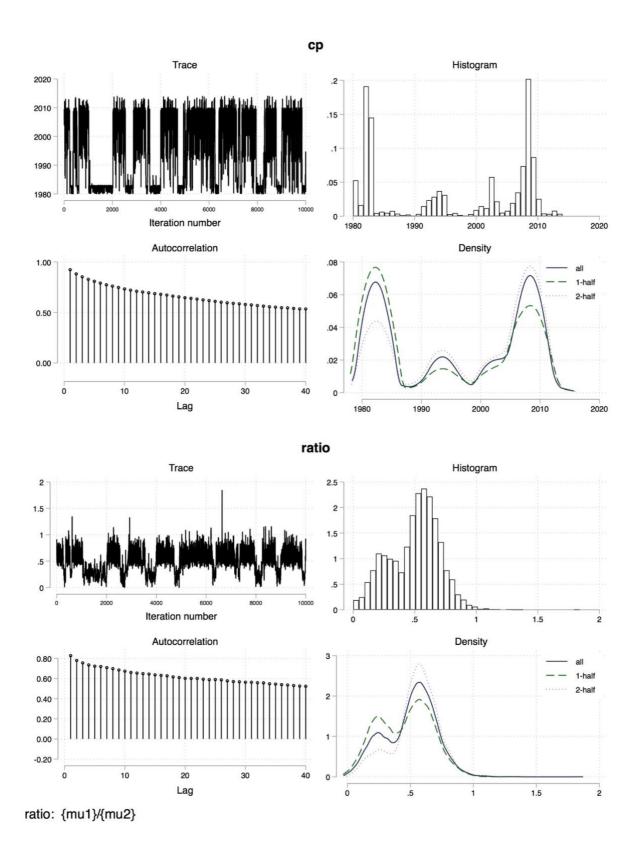


Figure 18: Model 18, Change point and estimated ratio of Period 1 and Period 2

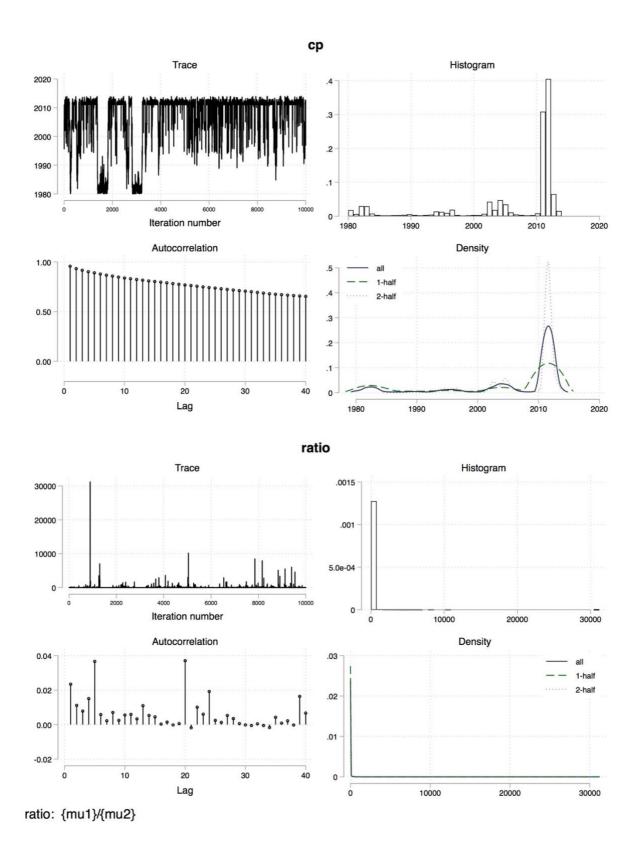


Figure 19: Model 19, Change point and estimated ratio of Period 1 and Period 2

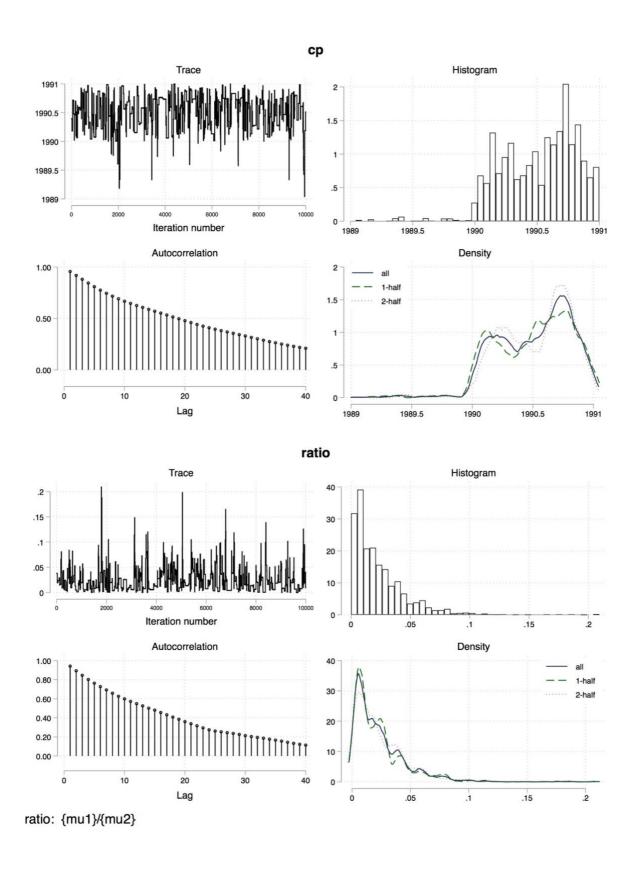


Figure 20: Model 20, Change point and estimated ratio of Period 1 and Period 2

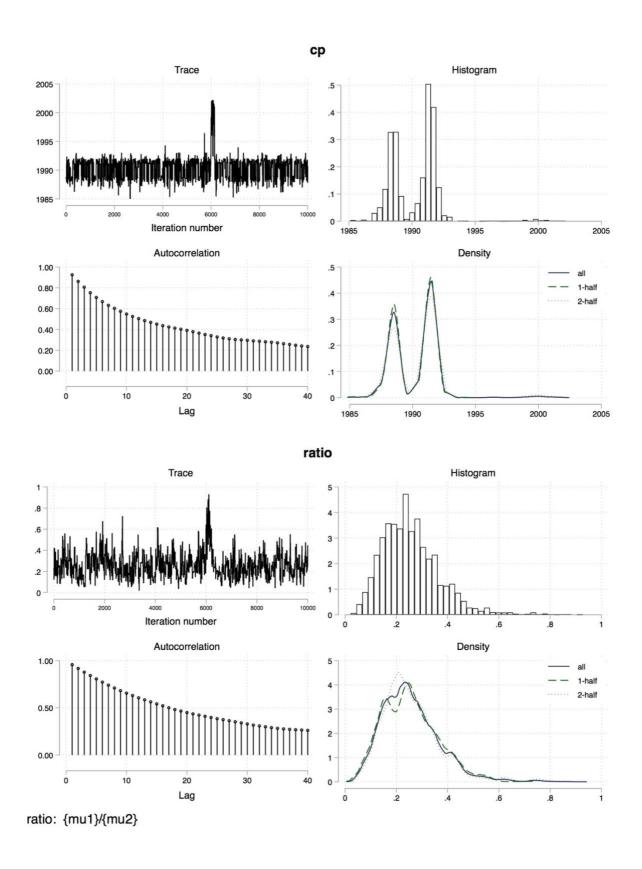


Figure 21: Model 21, Change point and estimated ratio of Period 1 and Period 2

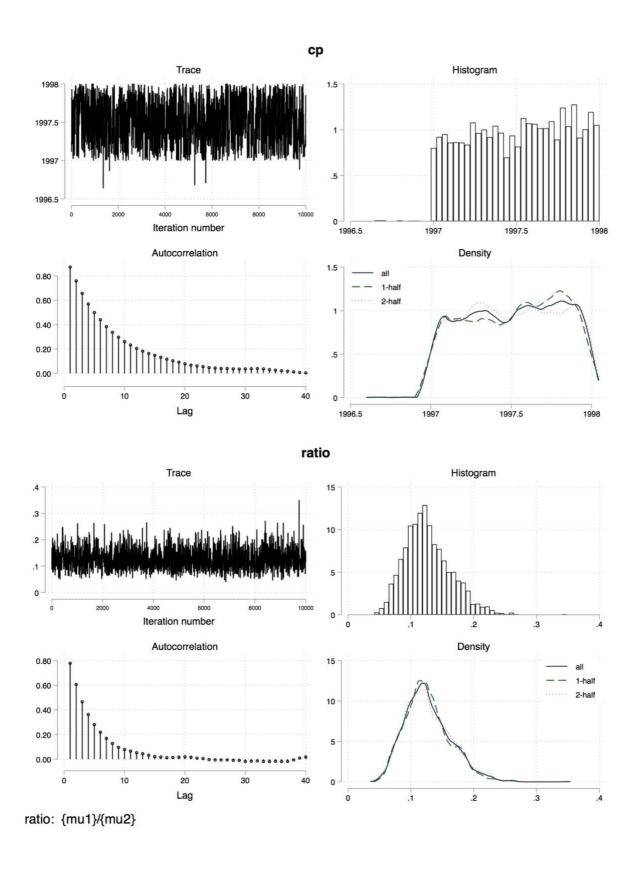


Figure 22: Model 22, Change point and estimated ratio of Period 1 and Period 2

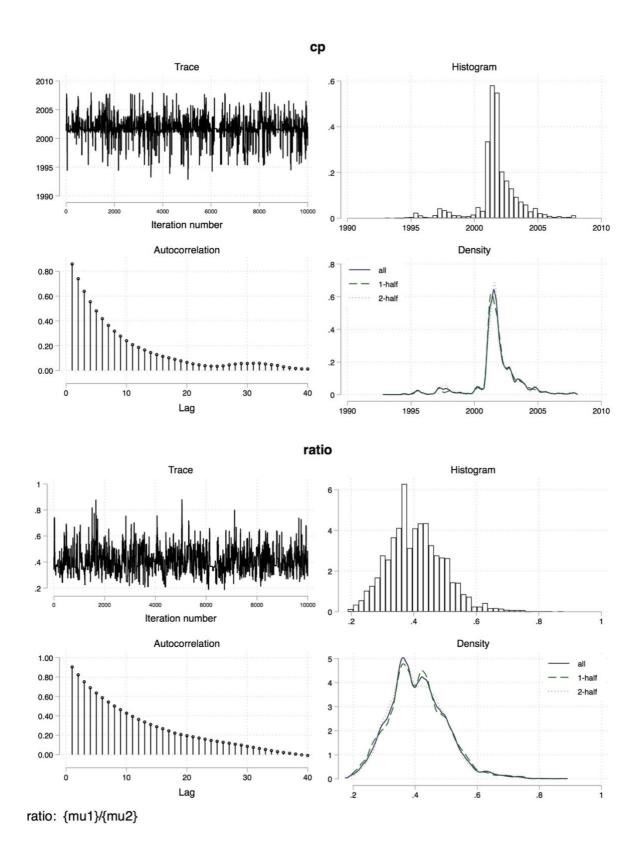


Figure 23: Model 23, Change point and estimated ratio of Period 1 and Period 2

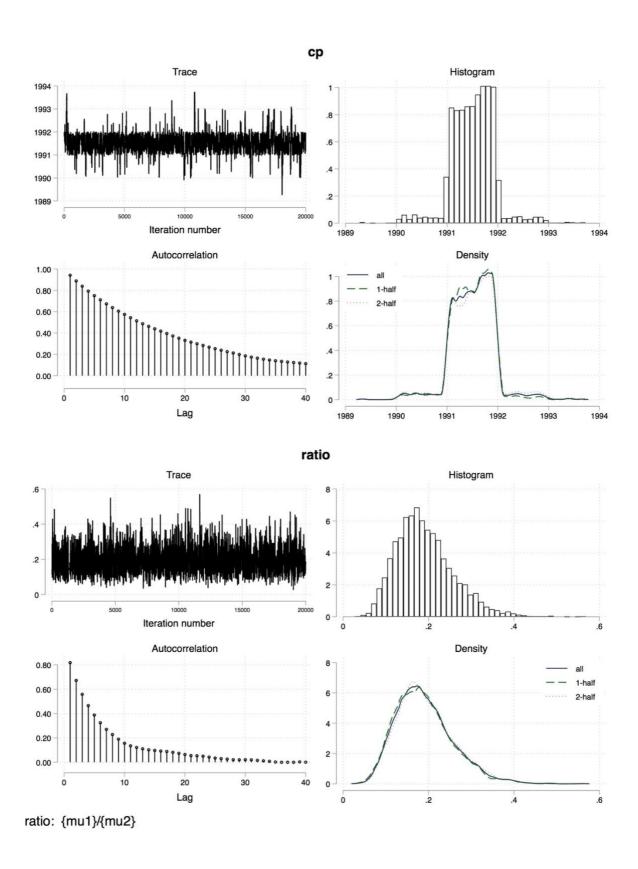


Figure 24: Model 24, Change point and estimated ratio of Period 1 and Period 2

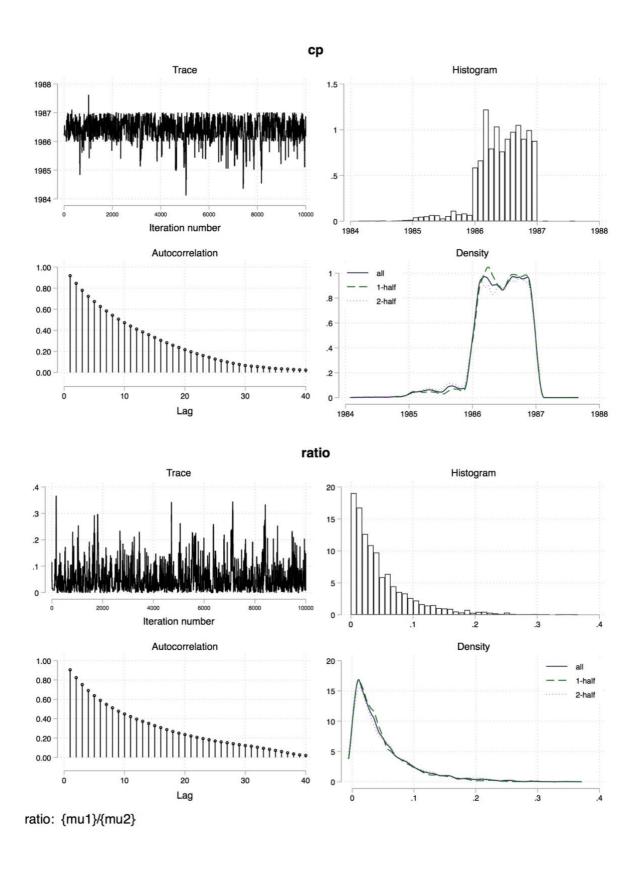


Figure 25: Model 25, Change point and estimated ratio of Period 1 and Period 2

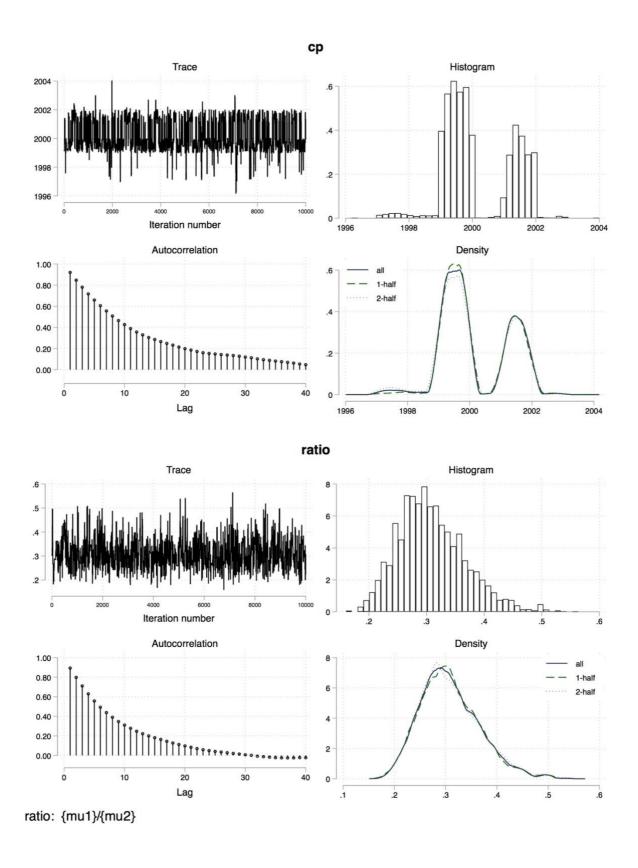


Figure 26: Model 26, Change point and estimated ratio of Period 1 and Period 2

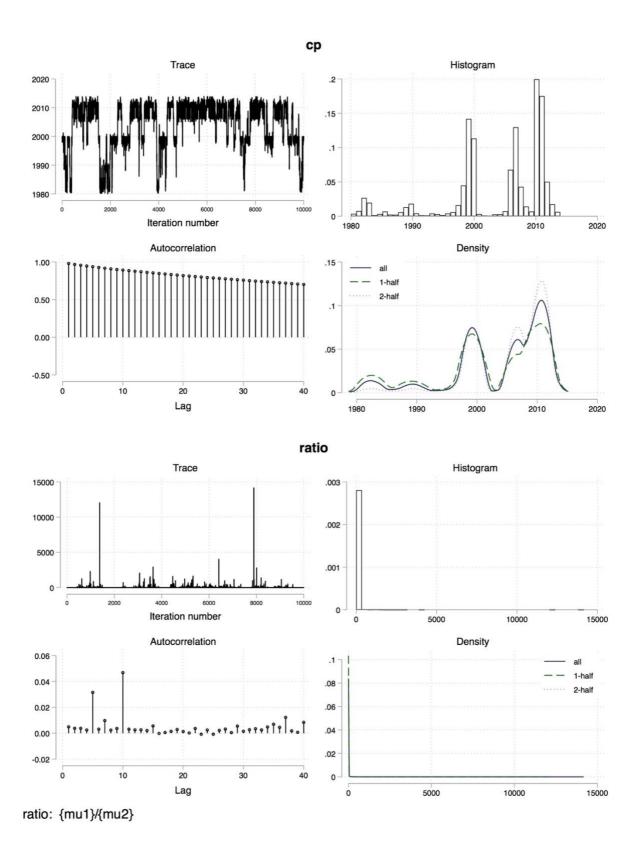


Figure 27: Model 27, Change point and estimated ratio of Period 1 and Period 2

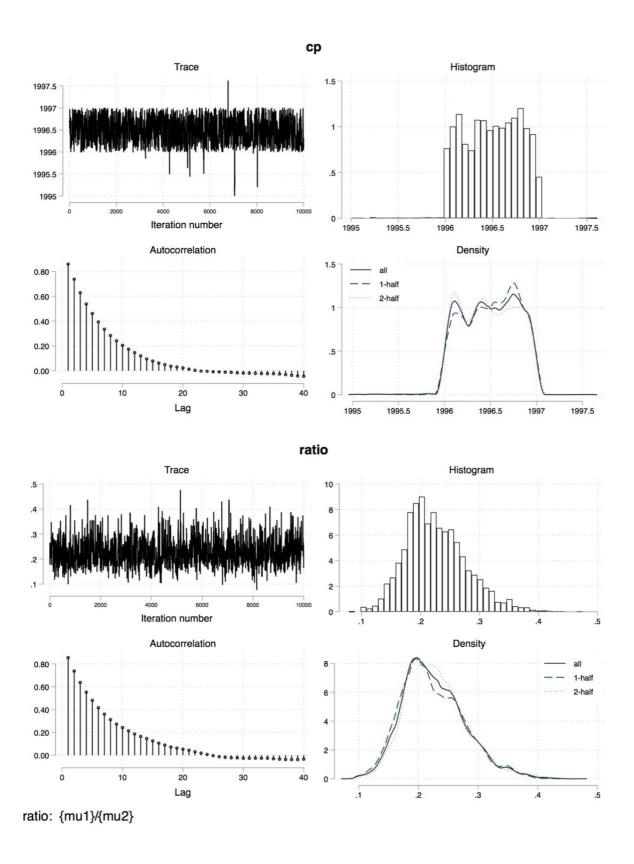


Figure 28: Model 28, Change point and estimated ratio of Period 1 and Period 2

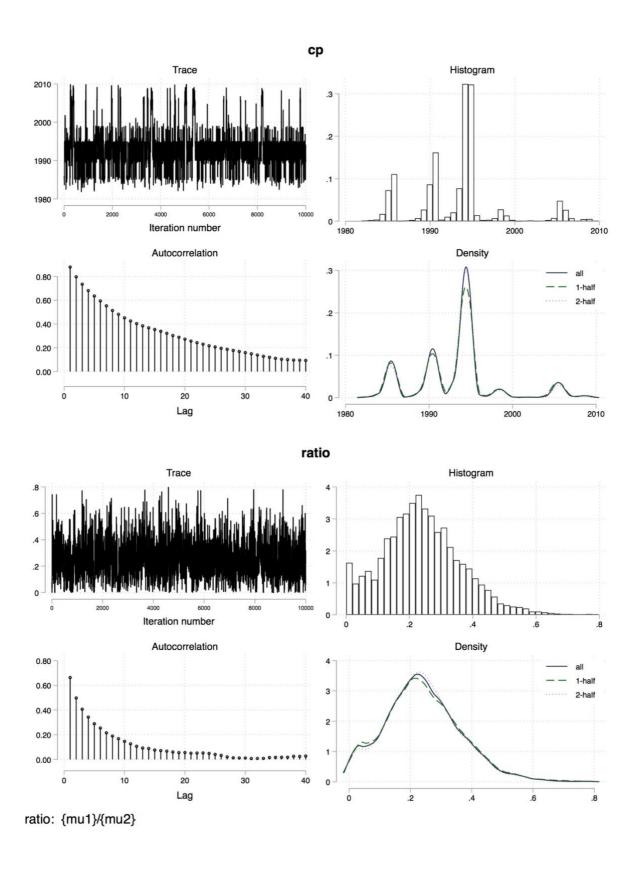


Figure 29: Model 29, Change point and estimated ratio of Period 1 and Period 2

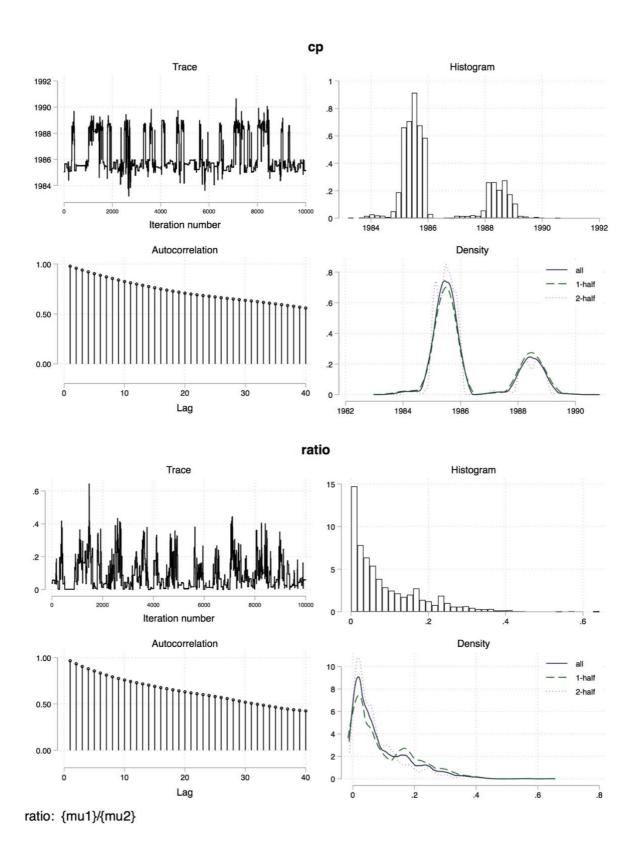


Figure 30: Model 30, Change point and estimated ratio of Period 1 and Period 2

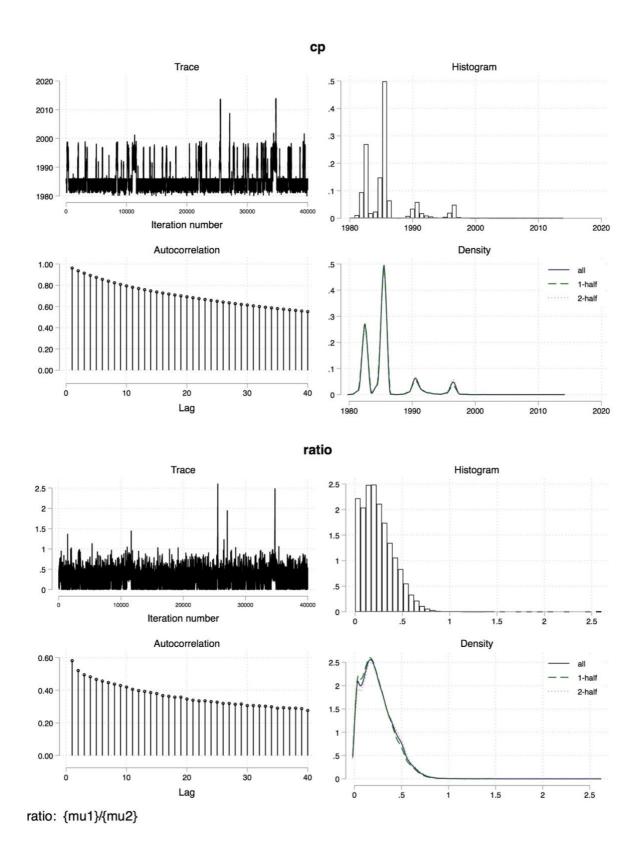


Figure 31: Model 31, Change point and estimated ratio of Period 1 and Period 2

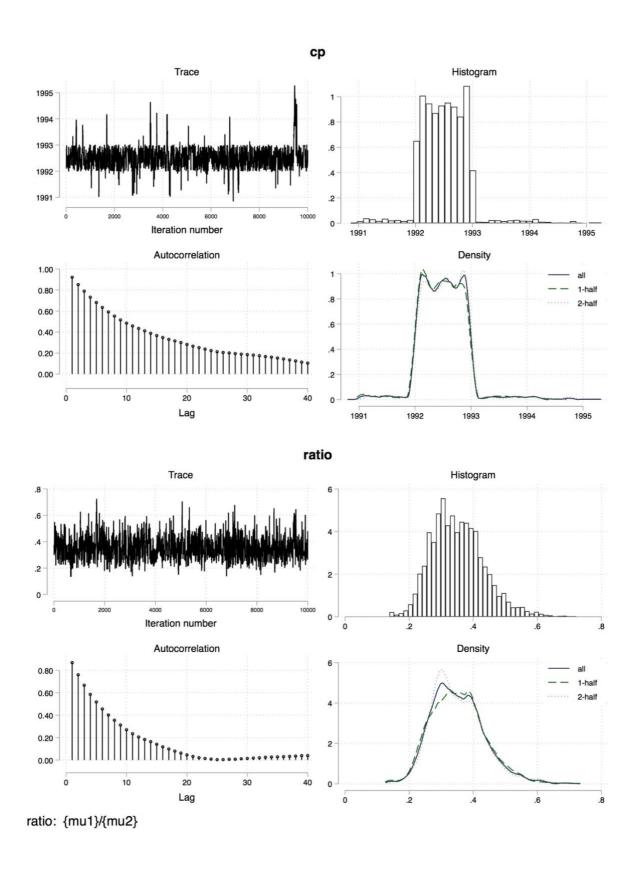


Figure 32: Model 32, Change point and estimated ratio of Period 1 and Period 2

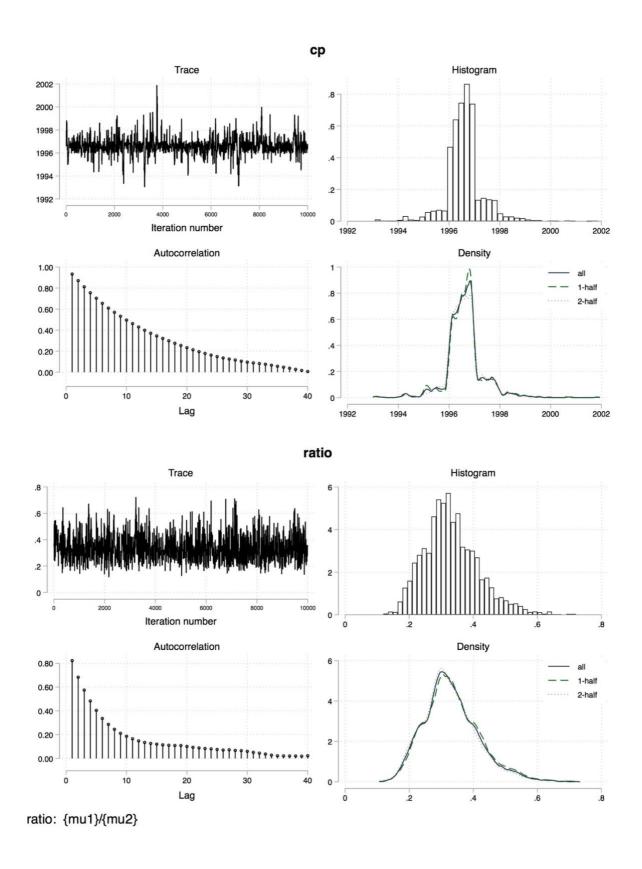


Figure 33: Model 33, Change point and estimated ratio of Period 1 and Period 2

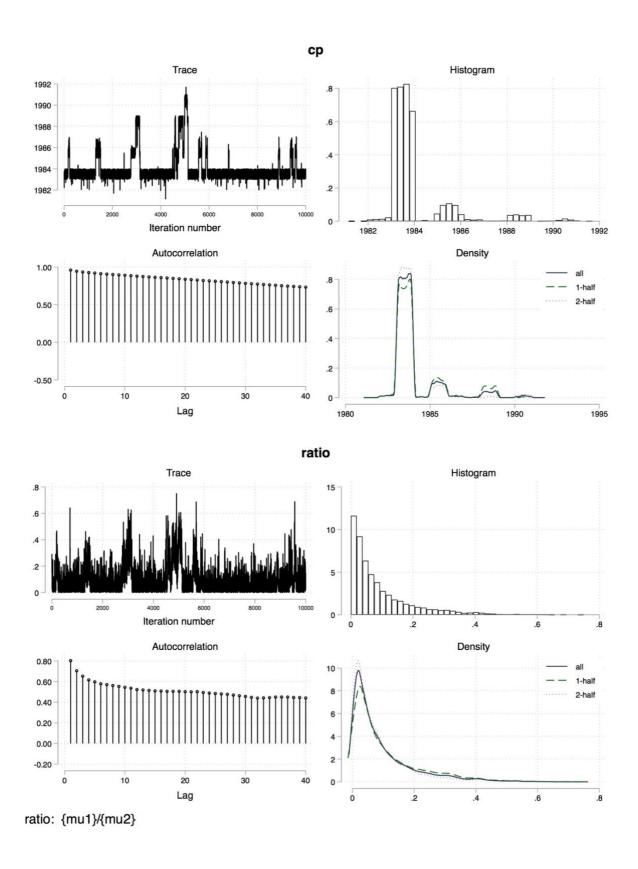


Figure 34: Model 34, Change point and estimated ratio of Period 1 and Period 2

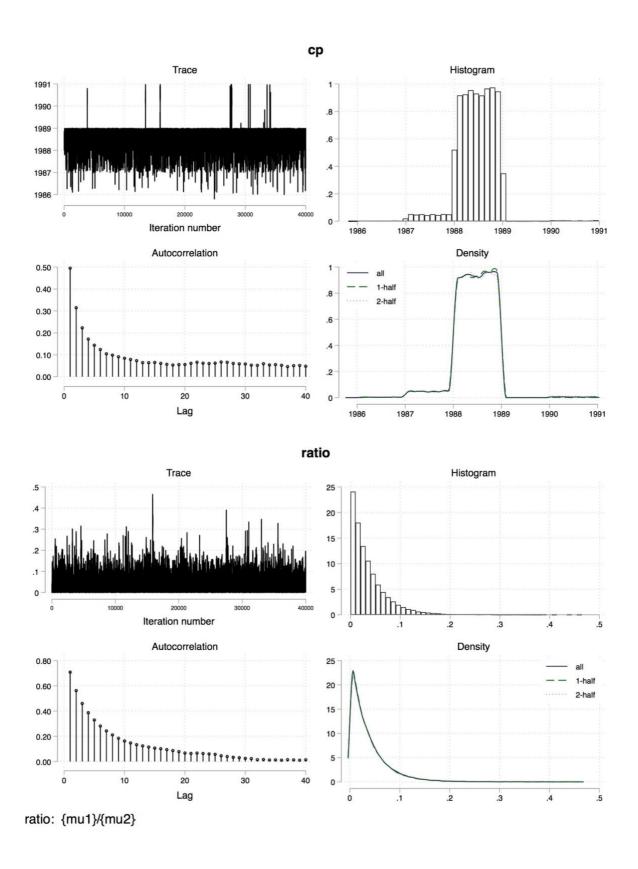


Figure 35: Model 35, Change point and estimated ratio of Period 1 and Period 2

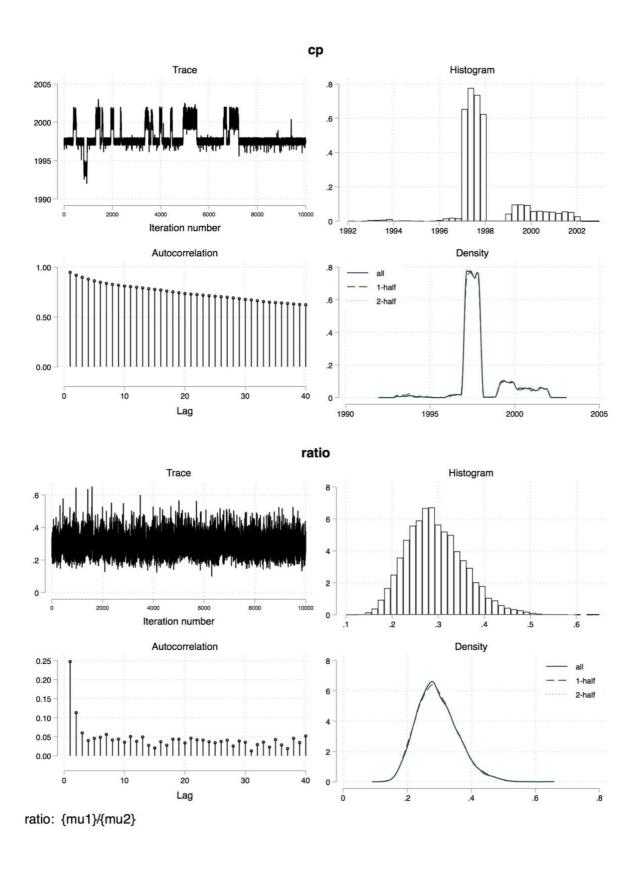


Figure 36: Model 36, Change point and estimated ratio of Period 1 and Period 2

