

Changes in Prescription of Psychotropic Drugs After Introduction of Polypharmacy Reduction Policy in Japan Based on a Large-Scale Claims Database

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Abstract

Background and Objectives In Japan, polypharmacy reduction policy, which reduces the reimbursement of medical cost, was introduced to address unnecessary psychotropic polypharmacy. The rule was applied to the prescriptions of three or more anxiolytics or three or more hypnotics in the policy introduced in 2012. The prescriptions of four or more antidepressants or four or more antipsychotics were added to the rule in the policy revised in 2014. Furthermore, the prescriptions of three or more drugs of anxiolytics, hypnotics, antidepressants, or antipsychotics were subject to the reduction criteria of the policy revision in 2016. Benzodiazepine receptor agonists (BZs) are classified both into anxiolytics and hypnotics, and the reduction rule was not applied to the category of BZs before April 2018. This study aimed to examine the effect of the policy on the prescriptions of four drug categories as well as BZs from the point of view of the number of drugs and doses. **Methods** This was a retrospective observational study using a large-scale Japanese health insurance claims database. Patients who were prescribed at least one psychotropic drug (anxiolytic, hypnotic, antidepressant, or antipsychotic) during the study period (from April 2011 to March 2017) were selected. Segmented regression analysis was used to analyze the proportions of patients with three or more or four or more drugs as well as patients above clinically recommended doses, and the means of the average daily doses by drug category.

Results A total of 312,167 patients were identified as a study population. The proportions of patients with three or more drugs in anxiolytics, hypnotics, antidepressants, and antipsychotics significantly decreased after the introduction or revisions of the policy, but not BZs. The proportions of patients with three or more drugs in March 2017 were 0.9%, 2.0%, 1.2%, 2.4%, and 8.9% in anxiolytics, hypnotics, antidepressants, antipsychotics, and BZs, respectively. The effect of the policy in reducing the proportions of patients above clinically recommended doses was identified in antipsychotics after the revision in 2016, but not identified in the sum of anxiolytics and hypnotics as well as BZs after the revision in 2014, and antidepressants after the revision in 2016. The proportions of monotherapy were increased from April 2011 to March 2017 only for antidepressants (76.9% \rightarrow 80.8%) and antipsychotics (79.8% \rightarrow 82.1%), and not changed or decreased for anxiolytics (85.2% \rightarrow 85.7%), hypnotics (78.6% \rightarrow 77.6%), sum of anxiolytics and hypnotics (68.1% \rightarrow 65.7%), BZs (68.0% \rightarrow 67.3%), and sum of psychotropic drugs (52.1% \rightarrow 49.9%).

Conclusions The polypharmacy reduction policy reduced the proportions of patients with three or more drugs in four drug categories, but not BZs. Only limited effects were seen for reducing the proportions of patients above clinically recommended doses. The policy was revised in April 2018 again. Further investigation is needed to examine the effect of the revision in 2018.

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1 Introduction

Psychotropic drugs such as anxiolytics, hypnotics, antidepressants, and antipsychotics are commonly prescribed in the treatment of mental and behavioral disorders [1]. Psychotropic polypharmacy is also common in clinical practice [2–4]. Mojtabai and Olfson reported that the proportion of

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Key Points

The polypharmacy reduction policy for psychotropic drugs in Japan had some impacts on reducing the proportions of patients with three or more drugs in each drug category. However, it is difficult to say that monotherapy was expanded.

Only limited effects were seen for reducing the proportions of patients above clinically recommended doses although the proportions of patients with three or more drugs were decreased.

More effective interventions in addition to the reduction by the number of drugs should be considered.

patients with two or more psychotropic drugs increased from 42.6 to 59.8% from 1996-7 to 2005-6 in office-based psychiatry practices in the USA [2]. Their study reported that the proportions of patients with two or more drugs of sedative-hypnotics, antidepressants, and antipsychotics within the drug category in 2005–6 were 17.8%, 25.4%, and 14.9%, respectively [2]. In Japan, the proportions of patients with two or more drugs of anxiolytics, hypnotics, antidepressants, and antipsychotics within the drug category were reported as 16.4%, 27.3%, 34.7%, and 30.0%, and those of three or more drugs were reported as 1.9%, 6.1%, 8.9%, and 8.5% based on claims data from the Japan Medical Data Center's database in 2009 [5]. In addition, there is a report that the proportion of patients with two or more drugs of any anxiolytics or hypnotics was 54.6% in psychiatry and 20.4% in non-psychiatry based on claims data from the Japanese National Database in 2011 [6]. However, evidence supporting psychotropic polypharmacy is limited [3, 7–10]. Psychotropic polypharmacy increases the risk of adverse events and drug-drug interactions [2, 9, 11-16]. Several guidelines indicate that combination therapy (i.e., combination of several treatments including pharmacological and nonpharmacological treatments) and multiple prescription (i.e., prescription of two or more drugs within the drug category) are not standard therapy and should be considered only if a patient's symptoms are moderate/severe or do not respond to an adequate dose and duration of a medication [17-19].

In Japan, polypharmacy reduction policy, which reduces the reimbursement of medical cost, was introduced in 2012 to address unnecessary psychotropic polypharmacy (Table 1) [20]. All citizens and residents in Japan are covered by health insurance systems. The reimbursement rate of the fee for continuous psychiatric outpatient services/consultation was reduced by 20% if three or more anxiolytics or three or more hypnotics were prescribed at one time in the policy introduced in April 2012. The policy was revised and tightened in October 2014 after the notification of the revision in April 2014, that is, antidepressants as well as antipsychotics were added to the fees reduction provision. The fee for continuous psychiatric outpatient services/consultation, prescription fees, and drug fees were not reimbursed or only partially reimbursed if three or more anxiolytics, three or more hypnotics, four or more antidepressants, or four or more antipsychotics were prescribed at one time. Furthermore, in April 2016, the policy was further tightened, and these fees were not reimbursed or only partially reimbursed if three or more anxiolytics, three or more hypnotics, three or more antidepressants, or three or more antipsychotics were prescribed at one time.

Okumura et al. reported the effect of the polypharmacy reduction policy for anxiolytics and hypnotics, which took effect in 2012 and 2014 [21]. Their study used a database of out-of-hospital prescriptions for outpatients dispensed by community pharmacies, thus it could not evaluate in-hospital prescriptions dispensed by pharmacies inside the hospitals. The aim of the policy is to reduce unnecessary psychotropic polypharmacy. Hence, it is important to follow not only outof-hospital prescriptions but also in-hospital prescriptions. Moreover, their investigation period, which was between April 2011 and November 2014, seems to be too short to evaluate the effect of the policy revision in 2014, which took effect in October 2014. The polypharmacy reduction policy introduced in 2012 and revised and tightened in 2014 and 2016 was applied to the prescription of "3 or more" or "4 or more" drugs within the drug category (anxiolytics, hypnotics, antidepressants, and antipsychotics) (Table 1). Benzodiazepine receptor agonists (BZs), which are mainstay anxiolytics/hypnotics and have similar mechanisms of action, are classified both into anxiolytics and hypnotics (Table S1 of the Electronic Supplementary Material [ESM]). BZs have high potential for tolerance, dependence, and misuse as well as adverse events such as cognitive impairment, accidents, and falls [22]. The tolerance for BZs causes the increase of their daily dosage [23], which might cause more dependence and adverse events. Hence, promotion of proper prescription and proper use of BZs is an urgent matter. However, the polypharmacy reduction policy in Japan had not had a reduction rule for the category of BZs before April 2018. In addition, high-dose prescription of psychotropic drugs has been a problem in Japan [24, 25]. In particular, some studies indicate that Japanese patients receive higher doses of antipsychotics compared with patients in other countries [26-28]. It is also important to address unnecessary highdose treatment, but this policy had the reduction rule just for the number of drugs, not for total doses although the potency is different between drugs (Table S1 of the ESM).

ltem	Regular score ^a	2012 ^b	2014 ^c	2016 ^d
Fee for continuous psychiatric outpa- tient services/consultation	55	Fee reduction by 20% if 3 or more anxiolytics or 3 or more hypnotics were prescribed	(A) The fee was not reimbursed if 3 or more anxiolytics, 3 or more hypnot- ics, 4 or more antidepressants, or 4 or more antipsychotics were prescribed (excluding temporary prescription)	 (B) The fee was not reimbursed if 3 or more anxiolytics, 3 or more hypnotics, 3 or more hypnotics, 3 or more antipsychotics were prescribed (excluding temporary prescription, or in the case that prescription of 3 antidepressants or 3 antipsychotics was necessary for patients) (C) Fee reduction by 50% if 3 or more antidepressants or 3 or more antipsychotics were prescribed (excluding the case of B)
Fee for hospital visit/in-house mental therapy ⁶	2012: max 700 2014 and 2016: max 600	No reduction	No reduction	Fee reduction by 50% if 3 or more anti- depressants or 3 or more antipsychotics were prescribed
Prescription fee for out-of-hospital prescription	68	No reduction	Score: 30 (in the case of A)	Score: 30 (in the case of B)
Prescription fee for in-hospital pre- scription	42	No reduction	Score: 20 (in the case of A)	Score: 20 (in the case of B)
Drug fee	I	No reduction	Fee reduction by 20% of all drugs prescribed at the same time (in the case of A)	Fee reduction by 20% of anxiolytics, hypnotics, antidepressants, and antipsy- chotics (in the case of B)
<i>max</i> maximum				
^a Regular score in cases where the psy. patients pay copayments partially depen	chotropic prescription does nding on age and income and	not meet the fees reduction criteria. The difference of the remainder is reimbursed by their instances of the second seco	e amount of money (Japanese yen) by mu urance	ultiplying the score by 10 is charged. The

Table 1 Summary of polypharmacy reduction policy for psychotropic drugs

^bThe polypharmacy reduction policy for psychotropic drugs was introduced and enforced on 1 April, 2012

°The first revision of the polypharmacy reduction policy was notified on 1 April, 2014 and enforced on 1 October, 2014

^dThe second revision of the polypharmacy reduction policy was enforced on 1 April, 2016

*Mental therapy is a treatment that psychiatrists continuously counsel patients with psychiatric disorders to improve their interpersonal relationship and their ability of social adaptation under certain treatment plans. In this study, we aimed to examine the effect of the polypharmacy reduction policy on the prescriptions of four drug categories as well as BZs from the point of view of the number of drugs and doses using a large-scale Japanese healthcare claims database. This is the first report to evaluate the effect of the polypharmacy reduction policy on all psychotropic prescriptions including both out-of-hospital and in-hospital prescriptions covering the periods through pre-introduction to post-second revision of the policy (that is, between April 2011 and March 2017).

2 Materials and Methods

2.1 Data Source

This study was conducted using a large-scale, Japanese health insurance claims database developed by MinaCare Co., Ltd. (Tokyo, Japan). This database included about 5 million cumulative insured persons', mainly company employees and their family members' anonymized claims data provided by corporate health insurance societies. Elderly patients (aged \geq 75 years) were not included in the database. In this study, monthly administrative claims data including pharmacy claims, medical claims, and diagnosis procedure combination (DPC) claims between April 2011 and March 2017 in health insurance societies that fully covered the investigation period were used. The DPC claims were based on the DPC system, which is a case-mix payment system, according to diagnosis and procedures, which consists of two elements: flat-fee per day payment and fee-for-service payment for inpatients hospitalized only in the DPC introduction hospitals (DPC hospitals) [29]. The database included information on patients' characteristics (encrypted personal identifiers, age, and sex) and prescribed medications. Pharmacy claims included the information of out-of-hospital prescriptions for outpatients dispensed by community pharmacies, and DPC claims included that of inhospital prescriptions for inpatients hospitalized in the DPC hospitals. Medical claims included the information of inhospital prescriptions for outpatients as well as in-hospital prescriptions for inpatients admitted to the hospitals other than the DPC hospitals dispensed by pharmacies inside the hospitals.

2.2 Study Population and Outcome Measures

Patients who were prescribed at least one psychotropic drug (anxiolytic, hypnotic, antidepressant, or antipsychotic) between April 2011 and March 2017 (study period) were defined as a study population. We included both prevalent and new users of psychotropic drugs because our study aim was to evaluate the effect of the policy on this entire population of patients. The classification of the psychotropic drugs was based on the polypharmacy reduction policy in Japan [20] (Table S1 of the ESM). The monthly utilizations of psychotropic drugs were measured as the total number of prescribed drugs in each month by drug category. The number of prescribed drugs was counted based on generic names regardless of formulation.

In addition, the average daily dose of psychotropic drugs was calculated for each patient in each month by drug category and the mean of the average daily doses as well as the proportion of patients who were prescribed more than clinically recommended doses in Japan were calculated. Diazepam-equivalent doses for anxiolytics and hypnotics [30], imipramine-equivalent doses for antidepressants [31, 32], and chlorpromazine-equivalent doses for antipsychotics [33–37] were used (Table S1 of the ESM). For the means of the average daily doses and the proportions of patients above clinically recommended doses, the analysis in which anxiolytics and hypnotics were summed was conducted because BZs, which are mainstay anxiolytics/hypnotics and have similar mechanisms of action, are classified both into anxiolytics and hypnotics. The analysis for BZs was also conducted. The information of "days of supply" was partially missing (30-45% by drug category) in medical claims and DPC claims between April 2011 and March 2012 because entry of the information was not mandatory in these claims before April 2012 [38]. The information of "days of supply" was not missing after April 2012. Hence, the analyses for the means of the average daily doses and the proportions of patients above clinically recommended doses were conducted for the time period after April 2012.

2.3 Statistical Analysis

Characteristics of patients who had any prescription records for psychotropic drugs were summarized using descriptive statistics in each segment period, where the definition of the segment is given below. Segmented regression analysis of interrupted time series [39] using SAS proc autoreg (SAS/ETS software, version 9.4 of the SAS System for Microsoft Windows, SAS Institute Inc., Cary, NC, USA) was conducted to estimate the changes following the introduction or revisions of the polypharmacy reduction policy for psychotropic drugs. This method allows the assessment of how much an intervention such as policy introduction affects specific outcomes immediately and over time. Each segment of the series is allowed to exhibit both a level (intercept) and a trend (slope). A change in level, i.e., an increase or decrease in the outcome after the intervention, constitutes an abrupt intervention effect. A change in trend is defined by an increase or decrease in the slope of the segment after the intervention as compared with the segment preceding the intervention. A change in trend represents a gradual change in the value of the outcome during the segment [39]. In this study, dependent variables of the segmented regression analysis were the proportions of patients in various categories (three or more drugs, four or more drugs, patients above clinically recommended doses) and the means of the average daily doses by drug category. The analysis for the proportions of patients with three or more or four or more drugs were conducted for four drug categories (anxiolytics, hypnotics, antidepressants, and antipsychotics) and BZs. The analyses for the proportions of patients above clinically recommended doses and the means of the average daily doses were conducted for sum of anxiolytics and hypnotics, BZs, antidepressants, and antipsychotics. Independent variables were level and trend change indicator variables for each of the segmented period.

Study period was divided into five segments: period 1; "Baseline" (from April 2011 to March 2012), period 2; "Introduction of the policy" (from April 2012 to March 2014), period 3; "Notification of the revision in 2014" (from April 2014 to September 2014), period 4; "Enforcement of the revision in 2014" (from October 2014 to March 2016), and period 5; "Revision in 2016" (from April 2016 to March 2017). We considered the period 3 as a "phasein" period before the first revision because the first revision of the polypharmacy reduction policy was notified in April 2014 and enforced in October 2014. The segmented regression analysis was carried out in steps. First, stepwise autoregression with a significance level of 0.05 was used to select the appropriate autocorrelation structure for the full model. Following selection of the autocorrelation structure, the full model was examined in terms of appropriateness of autocorrelation structure (generalized Durbin-Watson test) and for the degree of heteroscedasticity (Portmanteau Q test, Engle's Lagrange multiplier test). Next, the most parsimonious model was identified by successively eliminating least significant regression terms. The significance level of 0.05 was used as the criterion for retention. The final parsimonious model was again examined for the appropriateness of autocorrelation structure and for the degree of heteroscedasticity.

In addition, observed changes of the proportions of patients by the number of prescribed drugs were described and plotted for four drug categories of psychotropic drugs, sum of anxiolytics and hypnotics, BZs, and sum of psychotropic drugs (i.e., sum of anxiolytics, hypnotics, antidepressants, and antipsychotics) to capture the long-term prescription trend between April 2011 and March 2017. The analysis restricted to the patients who were continuously enrolled in the database during the study period was conducted as a sensitivity analysis to examine the robustness of the results. Data analyses other than the segmented regression analysis were conducted using R version 3.4.1 (R Foundation for Statistical Computing, Vienna, Austria).

3 Results

3.1 Patient Characteristics

A total of 312,167 patients had at least one prescription record for psychotropic drugs during the study period. The patient characteristics were stable throughout the study period (Table 2).

3.2 Effect of the Polypharmacy Reduction Policy for Psychotropic Drugs

The observed changes of the proportions of patients by the number of prescribed drugs are shown in Table 3 and plotted in Fig. S1 of the ESM. The estimated changes of the proportions of patients with "3 or more" or "4 or more" drugs following the introduction or revisions of the polypharmacy reduction policy based on the most parsimonious segmented regression model are shown in Table 4 and Fig. 1.

For anxiolytics and hypnotics, the polypharmacy reduction policy was introduced in April 2012 and revised in October 2014. The revision of the policy in 2014 was notified in April 2014 (Table 1). For the proportions of patients with three or more anxiolytics, there were immediate and notable decreases in the levels at three timepoints (policy introduction in April 2012, notification of the revision in April 2014, and enforcement of the revision in October 2014); there was a slight positive change in the trend (slope) at the policy introduction in April 2012 compared with the preceding period (Table 4), but the overall slope remained slightly negative throughout the study period (Fig. 1a). For the proportions of patients with three or more hypnotics, there was a decrease in the level at the enforcement of the revision in October 2014; there were negative changes in the trends at two timepoints (policy introduction in April 2012 and notification of the revision in April 2014) followed by a positive change in the trend after the enforcement of the revision in October 2014 (Table 4), although the overall slope was consistently negative after April 2012 (Fig. 1b). The largest negative change in the trend compared to the preceding period was observed after the notification of the revision in April 2014. The proportions of patients with "3 or more anxiolytics" and "3 or more hypnotics" decreased from 1.9% and 4.8% in April 2011 to 0.9% and 2.0% in March 2017, respectively (Table 3).

The polypharmacy reduction policy for antidepressants and antipsychotics was introduced in October 2014 after the notification in April 2014 and tightened in April 2016 (Table 1). Thus, prescription of four or more antidepressants

Tab	ole 2	Patient	character	istics
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Characteristic	Period 1 April 2011– March 2012	Period 2 April 2012– March 2014	Period 3 April 2014– September 2014	Period 4 October 2014– March 2016	Period 5 April 2016– March 2017
	(N=105,729)	(N=152,543)	(<i>N</i> =76,128)	(N=126,490)	(<i>N</i> =99,520)
Sex (%)					
Male	46.7	46.8	47.9	47.2	47.9
Female	53.3	53.2	52.1	52.8	52.1
Age, years (%) ^a					
Mean [SD]	42.7 [18.2]	42.1 [18.0]	44.3 [17.1]	43.1 [17.4]	43.7 [17.1]
<18	10.0	10.3	7.6	8.8	8.1
18–24	4.6	4.8	4.3	5.1	5.1
25-34	15.4	15.4	13.2	14.0	13.7
35–49	32.7	33.8	35.4	34.5	34.1
50-64	25.6	24.8	26.6	26.0	27.1
65–74	11.7	10.9	12.8	11.5	11.8

N total number of patients who were prescribed at least one psychotropic drug in each segmented period, SD standard deviation

^aAs of the initial month of prescription records for any psychotropic drugs in each segmented period

and four or more antipsychotics were subject to the reduction criteria in 2014, and prescription of three or more antidepressants and three or more antipsychotics were subject to the criteria in 2016 (Table 1). There were decreases in both the levels and trends of the proportions of patients with three or more antidepressants as well as antipsychotics after the policy revision in April 2016 (Table 4, Fig. 1c, e). There were some changes in the levels or trends of the proportions of patients with four or more antidepressants as well as antipsychotics between April 2014 and March 2017 (Table 4, Fig. 1d, f). Consistent downward trends (slopes) were seen throughout the study period, although the numerical values of the slopes varied in each segmented period for the proportions of patients with "3 or more" and "4 or more" antidepressants as well as antipsychotics (Fig. 1c-f). The proportions of patients with "3 or more" and "4 or more" antidepressants decreased from 4.5% and 0.7% in April 2011 to 1.2% and 0.1% in March 2017, respectively (Table 3). The proportions of patients with "3 or more" and "4 or more" antipsychotics decreased from 4.9% and 1.1% in April 2011 to 2.4% and 0.5% in March 2017, respectively (Table 3). For BZs, which are mainstay anxiolytics/hypnotics, the proportion of patients with three or more BZs had a downward trend before the introduction of the policy in April 2012, but the continuous downward trend was not seen after April 2012 (Table 4, Fig. 1g). In addition, there were no significant decreases in the levels of the proportions of patients with three or more BZs after the policy introduction in April 2012 as well as after the notification and enforcement of the revision in 2014. The proportion of patients with three or more BZs was still 8.9% in March 2017 (Table 3).

The proportions of patients with two drugs were unchanged or increased in all drug categories throughout the study period (Table 3, Fig. S1 of the ESM), which contrasted with the proportions of patients with three or more drugs that decreased after the introduction or revisions of the polypharmacy reduction policy. The proportions of patients with monotherapy were increased from April 2011 to March 2017 only for antidepressants (76.9% \rightarrow 80.8%) and antipsychotics (79.8% \rightarrow 82.1%), and not changed or decreased for anxiolytics (85.2% \rightarrow 85.7%), hypnotics (78.6% \rightarrow 77.6%), the sum of anxiolytics and hypnotics (68.1% \rightarrow 65.7%), BZs (68.0% \rightarrow 67.3%), and the sum of psychotropic drugs (52.1% \rightarrow 49.9%).

The estimated changes of the proportions of patients above clinically recommended doses and the means of the average daily doses after April 2012 based on the most parsimonious segmented regression model are shown in Table 5 and Figs. 2 and 3. The polypharmacy reduction policy for anxiolytics and hypnotics was introduced in April 2012 and tightened in October 2014, and that for antidepressants and antipsychotics was introduced in October 2014 and tightened in April 2016. The revision of the policy in 2014 was notified in April 2014 (Table 1). For the sum of anxiolytics and hypnotics, BZs, antidepressants, and antipsychotics, the proportions of patients above clinically recommended doses had downward trends before the notification of the revision in April 2014, but the continuous downward trends were not seen after April 2014 (Table 5, Fig. 2a-d). There were some increases and decreases in the sum of anxiolytics and hypnotics, BZs, and antidepressants, but there were no statistically significant decreases in the levels or downward changes in the trends after the strictest revisions of the policy, that

lable 3 Observed changes of the prop	ormons of p	attents by the	e number of	prescribed (Irugs								
Drugs	Apr 2011	Oct 2011	Apr 2012	Oct 2012	Apr 2013	Oct 2013	Apr 2014	Oct 2014	Apr 2015	Oct 2015	Apr 2016	Oct 2016	Mar 2017
Anxiolytics (N)	22,032	21,928	20,359	20,898	20,201	20,565	21,098	21,755	21,357	22,324	21,102	21,141	20,542
1	85.2	85.6	86.6	86.7	87.0	86.5	86.1	85.8	85.9	85.6	85.8	85.5	85.7
2	12.9	12.6	11.7	11.8	11.6	12.0	12.6	13.2	13.2	13.5	13.3	13.5	13.4
>3	1.9	1.8	1.6	1.5	1.4	1.5	1.3	1.0	0.9	0.9	1.0	0.9	0.9
Hypnotics (N)	18,159	18,815	18,160	18,987	18,521	18,836	18,914	19,775	19,427	20,391	19,416	19,916	19,859
1	78.6	78.3	78.8	79.1	79.1	78.9	77.5	78.4	77.8	77.8	77.4	77.2	77.6
2	16.7	16.8	16.4	16.3	16.3	16.6	18.2	19.0	19.9	20.0	20.4	20.8	20.4
>3	4.8	4.8	4.8	4.7	4.6	4.5	4.3	2.6	2.3	2.2	2.2	2.0	2.0
Antidepressants (N)	14,670	14,936	14,767	14,898	14,594	14,351	14,486	14,895	14,853	15,109	14,657	15,035	14,941
1	76.9	77.2	77.4	78.5	79.2	79.5	80.0	78.9	79.1	79.5	79.6	81.0	80.8
2	18.6	18.4	18.7	17.9	17.3	17.1	17.0	17.9	17.9	17.5	18.4	17.7	18.1
> 3	4.5	4.4	4.0	3.6	3.4	3.4	3.0	3.1	3.0	3.1	2.0	1.3	1.2
≥4	0.7	0.8	0.7	0.6	0.5	0.6	0.5	0.3	0.3	0.3	0.3	0.1	0.1
Antipsychotics (N)	8522	8734	8686	8779	9113	9169	9401	9639	9490	9818	9572	6696	9675
1	79.8	80.4	80.0	79.8	80.8	80.4	80.9	81.5	80.3	80.7	81.2	81.5	82.1
2	15.3	14.7	14.9	15.2	14.3	14.9	14.3	14.0	15.2	15.2	15.2	15.7	15.5
l>3	4.9	5.0	5.1	4.9	4.9	4.7	4.8	4.4	4.5	4.1	3.6	2.9	2.4
≥4	1.1	1.3	1.1	1.2	1.2	1.2	1.0	0.9	0.8	0.7	0.6	0.4	0.5
Sum of anxiolytics and hypnotics (N)	33,150	33,674	32,054	33,313	32,278	32,636	32,853	33,972	33,239	34,688	32,871	33,324	32,891
1	68.1	68.2	69.1	69.5	69.3	68.4	67.1	66.8	66.2	65.9	65.5	65.4	65.7
2	21.3	21.2	21.1	20.9	21.3	21.9	22.4	23.2	23.8	23.7	24.2	24.3	24.2
≥3	10.6	10.6	9.8	9.6	9.4	9.8	10.6	10.0	10.1	10.4	10.3	10.3	10.1
BZs (N)	30,968	31,513	29,937	31,132	30,137	30,728	30,875	32,005	31,208	32,586	30,898	31,183	30,635
1	68.0	68.2	69.3	8.69	69.7	0.69	67.4	67.1	6.99	66.7	66.8	9.99	67.3
2	21.8	21.8	21.4	21.1	21.5	21.9	22.7	23.5	23.9	23.8	24.0	24.2	23.8
≥3	10.2	10.0	9.3	0.0	8.8	9.2	9.9	9.4	9.2	9.5	9.2	9.2	8.9
Sum of psychotropic drugs (N)	39,189	39,849	38,603	40,039	39,030	38,922	38,957	40,134	39,372	40,842	38,922	39,630	39,335
1	52.1	52.2	52.5	53.2	52.7	52.0	50.7	50.4	50.0	50.0	49.4	49.4	49.9
2	22.1	22.1	22.2	22.5	22.7	22.7	23.0	23.2	23.3	23.2	23.6	24.0	23.8
.0	12.0	12.0	12.2	12.0	12.3	12.5	12.9	13.0	13.2	13.3	13.5	13.4	13.4
4	6.7	6.9	6.7	6.4	6.3	6.5	7.0	7.1	7.2	7.3	7.2	7.2	7.2
5	3.7	3.6	3.3	3.2	3.2	3.5	3.4	3.7	3.6	3.5	3.5	3.7	3.4
≥ 6	3.3	3.2	3.1	2.8	2.8	2.8	2.9	2.6	2.8	2.7	2.7	2.3	2.3
Values displayed are proportions of pa <i>Apr</i> April, <i>BZs</i> benzodiazepine recept	ttients (%). 7 or agonists,	Fotal number Mar March,	of patients	who were pr ber of patien	escribed at l its who were	east one dru prescribed	ig within the at least one	e drug catego drug within	ory in each n the drug cat	nonth was u egory in eac	lsed as a den ch month, <i>O</i>	ominator et October, s	um of psy-
chotropic drugs sum of anxiolytics, hy	pnotics, ant	idepressants.	and antipsy	/chotics									

		nd to supprised at			more an age one	and some om no a				
Parameter	Period 1 (base	line)	Period 2 (introd policy)	luction of the	Period 3 (notified sion in 2014)	cation of the revi-	Period 4 (enford revision in 2014	cement of the 4)	Period 5 (revisio	on in 2016)
	April 2011–M	arch 2012	April 2012-Ma	rch 2014	April 2014–Sep	ptember 2014	October 2014–N	March 2016	April 2016–Maı	ch 2017
	Intercept	Baseline trend	Level change	Trend change	Level change	Trend change	Level change	Trend change	Level change	Trend change
Anxiolytics ≥ 3 (%)	1.8966 (0.0406)	-0.2304 (0.0738)	-0.1411 (0.0496) ^a	$0.1884 \ (0.0758)^a$	-0.1433 (0.0394) ^a		-0.2979 (0.0406) ^a			
Hypnotics≥3 (%)	4.8287 (0.0431)			-0.1824 (0.0427) ^a		-3.2988 (0.3204) ^a	-0.2541 $(0.1250)^{a}$	3.2556 (0.3072) ^a		
Antidepres- sants $\geq 3 \ (\%)$	4.5176 (0.0302)	-0.4524 (0.0263)	-0.1601 (0.0563)			0.2868 (0.0617)	0.2062 (0.0694)		-1.1167 (0.0742) ^a	-0.6192 (0.1134) ^a
Antidepres- sants ≥4 (%)	0.6843 (0.0135)		-0.0778 (0.0215)	-0.0608 (0.0145)		-0.2316 (0.0622) ^a		0.2256 $(0.0665)^{a}$		-0.1416 (0.0499) ^a
Antipsychot- ics≥3 (%)	4.9358 (0.0414)		0.1415 (0.0689)	-0.2244 (0.0500)	0.2214 (0.1026)	-0.6156 (0.2388)		0.6984 (0.2772)	-0.8185 (0.0998) ^a	-1.0812 (0.1584) ^a
Antipsychot- ics≥4 (%)	1.1380 (0.0138)				-0.1147 (0.0360) ^a		-0.1234 $(0.0454)^{a}$	-0.1344 (0.0363) ^a	-0.1524 (0.0532) ^a	
BZs≥3 (%)	10.2709 (0.2657)	-1.0200 (0.3252)		1.0056 (0.3600)						
The most parsin at the final itera nificance corres in trend from th ous periods	annious model v tion are displaye pond to the jumi e preceding peri-	vas derived from th sd. The time unit of p between the end of od to the current pe	he full model by s f trend is per year of the preceding p eriod. Actual valu	uccessively elimir . Values displayed beriod and the star ie of the slope in e	nating the least si l are point estima t of the current pe ach period is con	gnificant term wit tes (standard erro eriod. The trend c nputed by the sum	h $p > 0.05$. Only t rs) of each parameter a hange parameter a t of the baseline tr	hose terms signifi- eter. The level cha and its statistical si end and the cumu	cant at the signifing parameter an ignificance corres lative sum of the	cance level of 0.05 d its statistical sig- pond to the change trends in the previ-

44 ants with thr 100 4 ofthe Table 4 Estimated ch

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^aThe periods when the relevant reduction criteria of the polypharmacy reduction policy were introduced or revised

BZs benzodiazepine receptor agonists

is after the notification and enforcement of the revision in 2014 for anxiolytics and hypnotics, and after the revision in 2016 for antidepressants (Table 5, Fig. 2a–c). In addition, the proportions of patients above clinically recommended doses were increased or not changed between March 2014 (before the notification of the revision in 2014) and March 2017 for the sum of anxiolytics and hypnotics, BZs, and anti-depressants (Fig. 2a–c). On the other hand, for antipsychotics, there was a statistically significant downward change in the trend after the strictest policy revision in April 2016, and the proportion of patients above clinically recommended doses was decreased after April 2016 (Table 5, Fig. 2d).

The means of average daily doses generally showed similar tendency to the proportions of patients above clinically recommended doses except the significant decreases after the enforcement of the revision in October 2014 for the sum of anxiolytics and hypnotics as well as BZs (Table 5, Fig. 3). As a whole, the means of the average daily doses were not decreased between March 2014 (before the notification of the revision in 2014) and March 2017 for antidepressants (Fig. 3c). On the other hand, the means of the average daily doses were decreased after the revision in April 2016 for the sum of anxiolytics and hypnotics, BZs, and antipsychotics (Fig. 3a, b, d).

The analysis based on the full segmented regression model generally yielded similar results (Tables S2 and S3 of the ESM). In addition, the results of the sensitivity analysis restricted to the patients who were continuously enrolled in the database during the study period supported the robustness of these results (data not shown).

4 Discussion

In this study, we investigated the effect of the polypharmacy reduction policy for psychotropic drugs in the period between April 2011 and March 2017. The proportions of patients with three or more anxiolytics significantly decreased after the introduction of the policy in 2012 as well as after the notification and enforcement of the revision in 2014. The proportions of patients with three or more hypnotics significantly decreased after the notification and enforcement of the revision in 2014. In addition, the proportions of patients with three or more antidepressants and three or more antipsychotics significantly decreased after the revision in 2016. These results indicated that the polypharmacy reduction policy led to significant decreases in the proportions of patients with three or more drugs in all categories of the psychotropic drugs (anxiolytics, hypnotics, antidepressants, and antipsychotics). On the other hand, there were no significant decreases in the proportions of patients with three or more BZs after the policy introduction in 2012 as well as after the notification and enforcement of the revision in 2014. The increases in the level of the proportion of patients with three or more antidepressants after the enforcement of the revision in October 2014 as well as with three or more antipsychotics after the notification of the revision in April 2014 seemed to be due to the increases of the proportions of patients with three antidepressants or three antipsychotics after the reduction for the prescription of four or more drugs (Fig. S1c and S1d of the ESM). The change in the trend of the proportion of patients with three or more BZs after the introduction of the policy in April 2012 was thought to be due to the changes of prescriptions of anxiolytics and hypnotics, but there were no significant decreases after April 2012. The proportions of patients with monotherapy were increased from April 2011 to March 2017 only for antidepressants and antipsychotics, and not changed or decreased for anxiolytics, hypnotics, sum of anxiolytics and hypnotics, BZs, and sum of psychotropic drugs. The proportions of patients with two or more drugs in March 2017 were still 14.3%, 22.4%, 19.2%, and 17.9% in anxiolytics, hypnotics, antidepressants, and antipsychotics, and 34.3%, 32.7%, and 50.1% in the sum of anxiolytics and hypnotics, BZs, and sum of psychotropic drugs, respectively.

The study using a large and representative sample of visits to office-based psychiatrists in the USA reported that the proportions of patients with two or more drugs in 2005-6 were 17.8%, 25.4%, and 14.9% in sedative-hypnotics, antidepressants, and antipsychotics, respectively [2]. The study using Australian pharmaceutical claims data showed that the proportions of patients with two or more drugs in 2015 were 3.7%, 7.3%, and 2.9% in antidepressants, antipsychotics, and BZs, respectively [40]. The Research on Asian Psychotropic Prescription Patterns (REAP) for antidepressants reported that the proportions of patients with two or more antidepressants were 3-25% in five East Asian countries in 2004 [41]. We cannot compare these figures directly because the databases, populations, and study periods were different, but the proportions of patients with two or more drugs within the drug category in Japan did not seem to be lower than these countries even in 2017.

In Japan, the high rate of antipsychotic polypharmacy compared with other countries has been known for a few decades [42, 43], and some clinical trials were conducted to simplify antipsychotic prescription in Japan [44–46]. There had been efforts to reduce antipsychotic polypharmacy, but drastic measures to address it had been needed. The polypharmacy reduction policy reduced antipsychotic polypharmacy and the mean daily dose of antipsychotics. The decreasing trend shown in the present study corresponded with the other report [43]. However, the REAP for antipsychotics in 2016 indicated that the rate of psychotropic polypharmacy including within- and between-drug categories and high-dose treatment for patients with schizophrenia was the



∢Fig. 1 Estimated changes of the proportions of patients with three or more/four or more drugs by drug category based on the most parsimonious segmented regression model: **a** anxiolytics (≥ 3), **b** hypnotics (≥ 3), **c** antidepressants (≥ 3), **d** antidepressants (≥ 4), **e** antipsychotics (≥ 3), **f** antipsychotics (≥ 4), and **g** benzodiazepine receptor agonists (BZs) (≥ 3). Black circle, observed; solid line, estimated piecewise linear trend; dotted line, predicted curve based on an autoregressive model

highest in Japan among 15 Asian countries/areas [26, 47], and further improvement will be needed.

The polypharmacy reduction policy in Japan had not had a reduction rule for the category of BZs before April 2018. BZs were separately classified into anxiolytics and hypnotics, and therefore, if two BZs of anxiolytics and one BZ of hypnotics were prescribed at one time, a fees reduction was not applied. In the present study, there were no significant decreases in the proportions of patients with three or more BZs after the policy introduction in 2012 and the notification and enforcement of the revision in 2014. The reduction policy should be applied to polypharmacy of BZs because they have similar mechanisms of action and safety profiles.

Various policies to reduce the prescription of BZs were introduced in Western countries. In the USA, Medicare Part D, which is a prescription drug coverage program, excluded BZs from coverage in 2006 [48, 49]. In the Netherlands, BZs were excluded from the Dutch reimbursement list when used as anxiolytics, hypnotics, or sedatives in 2009 [50, 51]. Furthermore, in France, the new payment system started in 2012, in which general practitioners could receive monetary benefit in the case that they reduced the prescription of BZs in some criteria [52]. In the Netherlands case, the prescription of BZs was decreased, but in the USA and France cases,

 Table 5
 Estimated changes of the proportions of patients above clinically recommended doses and the means of the average daily doses based on the most parsimonious segmented regression model

Parameter	Period 2 (in the policy)	troduction of	Period 3 (notif revision in 201	ication of the (4)	Period 4 (en the revision	forcement of in 2014)	Period 5 2016)	(revision in
	April 2012-	-March 2014	April 2014–Se	ptember 2014	October 201	4–March 2016	April 20	16–March 2017
	Intercept	Baseline trend	Level change	Trend change	Level change	Trend change	Level change	Trend change
Proportion of patients above	clinically rec	ommended dos	es					
Sum of anxiolytics and hypnotics > 15 mg/day $(\%)^{a}$	19.6607 (0.1411)	-0.5160 (0.0691)	0.5013 (0.1104)	0.6288 (0.0905)				-0.8028 (0.1848)
BZs>15 mg/day (%) ^a	18.5358 (0.1568)	-0.3672 (0.0766)	0.6110 (0.1328)			0.6756 (0.1172)		-0.7620 (0.2244)
Antidepressants > 200 mg/ day (%) ^a	12.4249 (0.0531)	-0.0459 (0.0206)				-0.1440 (0.0494)		0.7752 (0.1284)
Antipsychotics > 450 mg/ day $(\%)^a$	13.4086 (0.1775)	-0.9420 (0.0862)	0.4037 (0.1477)			1.0368 (0.1344)		-0.9936 (0.2580)
Mean of average daily doses								
Sum of anxiolytics and hypnotics (mg/day) ^b	14.8746 (0.1159)	-0.4056 (0.0567)	0.2834 (0.1018)		-0.2284 (0.0963)	0.5580 (0.0913)		-0.7440 (0.1776)
BZs (mg/day) ^b	14.4497 (0.1156)	-0.3708 (0.0565)	0.2773 (0.1014)		-0.2065 (0.0959)	0.5808 (0.0912)		-0.5316 (0.1776)
Antidepressants (mg/day) ^b	109.1584 (0.3876)	1.0476 (0.1404)		-1.6992 (0.2160)				1.5852 (0.3840)
Antipsychotics (mg/day) ^b	229.2387 (2.5214)	-7.9116 (0.9972)				8.9544 (2.3940)		- 16.2432 (4.8996)

The most parsimonious model was derived from the full model by successively eliminating the least significant term with p > 0.05. Only those terms significant at the significance level of 0.05 at the final iteration are displayed. The time unit of trend is per year. Diazepam-equivalent doses for anxiolytics and hypnotics as well as BZs, imipramine-equivalent doses for antidepressants, and chlorpromazine-equivalent doses for antipsychotics were used. The level change parameter and its statistical significance correspond to the jump between the end of the preceding period and the start of the current period. The trend change parameter and its statistical significance correspond to the change in trend from the preceding period to the current period. Actual value of the slope in each period is computed by the sum of the baseline trend and the cumulative sum of the trends in the previous periods

BZs benzodiazepine receptor agonists

^aProportion of patients prescribed more than the clinically recommended doses in Japan. Values displayed are point estimates (standard errors) of each parameter

^bMean of the average daily doses. Values displayed are point estimates (standard errors) of each parameter



Fig. 2 Estimated changes of the proportions of patients above clinically recommended doses based on the most parsimonious segmented regression model: **a** sum of anxiolytics and hypnotics, **b** benzodiaze-

pine receptor agonists (BZs), **c** antidepressants, and **d** antipsychotics. Black circle, observed; solid line, estimated piecewise linear trend; dotted line, predicted curve based on an autoregressive model

the prescription of BZs was not decreased. There are limitations to compare these policies because the policy characteristics and environments are different between countries, but some political intervention will be needed in Japan based on the lessons from other countries. Actually, in Japan, the new reduction rule for BZs was introduced in April 2018, in which the reimbursement rates of the prescription fees are reduced by about 30–40% if BZs are prescribed for more than 12 months with the same dosage and regimen [20]. This fees reduction seemed to be applied in April 2019 when 12 months passed after the rule was enforced. The effect of this rule needs to be investigated, but there is some doubt about the effect because this fees reduction is not applied if the dosage or regimen of BZs is changed within 12 months.

In the present study, the proportions of patients above clinically recommended doses were increased or not changed between March 2014 (before the notification of the revision in 2014) and March 2017 for the sum of anxiolytics and hypnotics, BZs, and antidepressants although there were some increases and decreases. For antipsychotics, the proportion of patients above clinically recommended doses was decreased after the revision in April 2016. There were immediate increases in the levels of the proportions of patients above clinically recommended doses for sum of anxiolytics and hypnotics as well as BZs after the notification of the revision in April 2014. The increases of the means of the average daily doses were also identified at that time. The temporal increases of the doses by switching of medications seemed to be one of the reasons. This tendency corresponded with the other report [21]. The effect of the policy in reducing the proportions of patients above clinically recommended doses was identified in antipsychotics after the policy revision in 2016, but not identified in the sum of anxiolytics and hypnotics as well as BZs after the notification and enforcement of the revision in 2014, and antidepressants after the revision in 2016. Thus, in the present study, only limited effects were seen for reducing the proportions of patients above clinically recommended doses although the proportions of patients with three or more drugs were decreased after the introduction or revisions of the polypharmacy reduction policy. The rule considering total doses in addition to the number of prescribed drugs should be taken into account in this policy because the potency is different between drugs (Table S1 of the ESM). On the



Fig. 3 Estimated changes of the means of the average daily doses based on the most parsimonious segmented regression model: \mathbf{a} sum of anxiolytics and hypnotics, \mathbf{b} benzodiazepine receptor agonists

(BZs), **c** antidepressants, and **d** antipsychotics. Black circle, observed; solid line, estimated piecewise linear trend; dotted line, predicted curve based on an autoregressive model

other hand, the means of the average daily doses in the sum of anxiolytics and hypnotics as well as BZs were decreased after April 2016, although there was no policy revision for anxiolytics and hypnotics at that time. Further investigation is needed to examine the trend after March 2017.

There are some limitations in this study. First, the results might have been biased because of changes in the study population and simultaneously occurring other interventions [53]. However, the patient characteristics were stable during the study period, and the sensitivity analysis restricted to the patients who were continuously enrolled in the database during the study period yielded similar results. In addition, other interventions, if any, should not have had a big enough impact to reverse the effect of the polypharmacy reduction policy because this policy is the only one to penalize prescribers. Second, because the insurance claims included a monthly summary of healthcare services provided by healthcare providers, drugs prescribed in each month was regarded as a simultaneous prescription. We did not evaluate out-of-hospital/in-hospital prescriptions separately and could not evaluate prescriptions based on psychiatry/non-psychiatry separately. However, we believe it is important to examine whole prescriptions for each patient using the claims data, which includes all prescribed drugs covered by the health insurance system, to evaluate the actual condition of psychotropic polypharmacy. Third, as mentioned in the methods section, we could not evaluate the effect of the introduction of the policy in 2012 on the proportions of patients above clinically recommended doses and the mean daily doses for the sum of anxiolytics and hypnotics as well as BZs because of the lack of information before April 2012. We were, however, able to evaluate the effect of the policy revision in 2014 on the proportions of patients above clinically recommended doses and the means of the average daily doses. As the rule of the fees reduction in 2014 was much stricter than that in 2012 (Table 1), our study did cover the most important parts of the policies. Fourth, elderly patients aged \geq 75 years were not included because the claims data used in this study were mainly for those covered by employment-based health insurance. There is a limitation to generalize these findings to the elderly population and the population covered by other types of insurance. Last, we did not investigate any effectiveness indicators such as disease improvement or deterioration, rates of adverse events, medical resource utilization, and medical cost. Further investigation is needed to examine the effect of the policy on such effectiveness indicators.

5 Conclusions

This study demonstrated that the polypharmacy reduction policy for psychotropic drugs led to decreases in the proportions of patients with three or more drugs in anxiolytics, hypnotics, antidepressants, and antipsychotics, but not BZs. The proportions of monotherapy were increased only for antidepressants and antipsychotics, and not changed or decreased for anxiolytics, hypnotics, sum of anxiolytics and hypnotics, BZs, and the sum of psychotropic drugs. In addition, only limited effects were seen for reducing the proportions of patients above clinically recommended doses. Further investigation is needed to examine the effect of the following revision of the policy enforced in April 2018 on psychotropic prescription including BZs.

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Compliance with Ethical Standards

Funding Pfizer Japan Inc. provided financial support for the use of claims data.

Conflict of interest Yoko Hirano is an employee of Pfizer Pharmaceuticals K.K. Yoichi Ii is an employee of Pfizer R&D Japan G.K. and holds stock/stock options of Pfizer Inc.

Ethics approval This study did not require ethical committee review in accordance with current ethical standards for epidemiological studies in Japan [54].

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