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Evaluating the effect of Japan’s 2004 postgraduate training programme on the spatial distribution of physicians

Rie Sakai¹,²,³*, Hiroshi Tamura⁴,⁵, Rei Goto⁶,⁷ and Ichiro Kawachi¹

Abstract

Background: In 2004, the Japanese government permitted medical graduates for the first time to choose their training location directly through a national matching system. While the reform has had a major impact on physicians’ placement, research on the impact of the new system on physician distribution in Japan has been limited. In this study, we sought to examine the determinants of physicians’ practice location choice, as well as factors influencing their geographic distribution before and after the launch of Japan’s 2004 postgraduate medical training programme.

Methods: We analyzed secondary data. The dependent variable was the change in physician supply at the secondary tier of medical care in Japan, a level which is roughly comparable to a Hospital Service Area in the US. Physicians were categorized into two groups according to the institutions where they practiced; specifically, hospitals and clinics. We considered the following predictors of physician supply: ratio of physicians per 1,000 population (physician density), age-adjusted mortality, as well as measures of residential quality. Ordinary least-squares regression models were used to estimate the associations. A coefficient equality test was performed to examine differences in predictors before and after 2004.

Results: Baseline physician density showed a positive association with the change in physician supply after the launch of the 2004 programme (P-value < .001), whereas no such effect was found before 2004. Urban locations were inversely associated with the change in physician supply before 2004 (P-value = .026), whereas a positive association was found after 2004 (P-value < .001). Urban location and area-level socioeconomic status were positively correlated with the change in hospital physician supply after 2004 (P-values < .001 for urban centre, and .025 for area-level socioeconomic status), even though in the period prior to the 2004 training scheme, urban location was inversely associated with the change in physician supply (P-value = .015) and area-level socioeconomic status was not correlated.

Conclusion: Following the introduction of the 2004 postgraduate training programme, physicians in Japan were more likely to move to areas with already high physician density and urban locations. These changes worsened regional inequality in physician supply, particularly hospital doctors.

Keywords: Human resources, Physician distribution, Postgraduate medical training programme, Japan

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**Background**

Optimizing physician supply and distribution are vital ingredients of sustaining equitable access to essential health services. However, there may be a tension between expanding access to physician supply versus improving the quality of their training, as our case study from Japan will illustrate.

In 2004, the Japanese Ministry of Health, Labour and Welfare (MHLW) sought to improve the quality of medical residency training nationwide by instituting a new postgraduate medical education (PGME) programme [1]. Prior to 2004, medical graduates commenced their specialty training immediately after graduating from medical school. Since medical graduates ended up being trained only in their chosen specialty, they had little or no experience in other fields. Since 2004, a 2-year general residency has been required of all medical graduates, ensuring that residents rotate through different specialties to gain hands-on experience at teaching hospitals designated by MHLW. These hospitals would include both university-affiliated and non-university-affiliated hospitals, encompassing both public and private institutions [2]. After 2004, new physicians commenced their specialty training following the mandatory 2-year residency training programme.

Before 2004, a majority of new graduates entered their specialty training programme at the university hospital associated with the medical school where they graduated. In those times, physicians were dispatched to non-university hospitals by the department of their specialization in the university hospital, and individual choice was not considered.

As part of the 2004 reforms, the Ministry permitted medical graduates to choose their preferred residency location directly through a national matching system for the first time [2]. Then, medical graduates tended to select independent urban hospitals not affiliated with a university for their training rather than university hospitals [3,4]. Even though the matching system only applied to the 2-year residency training programme, young physicians now had the freedom to choose a residency location that could also provide them the specialty training, in terms of targeted mentors and professional recognition, when the residency was completed. As a result, young physicians tended to stay at the same location and continue their specialty training after the residency training. Subsequently, the number of incoming physicians at university hospitals decreased. Medical specialty departments in university (teaching) hospitals normally dispatch physicians at all levels to other affiliated hospitals. Because the number of physicians at university hospitals has decreased, university hospitals find it increasingly difficult to send physicians to affiliated hospitals, which are often located in rural and underserved areas [5]. Furthermore, physicians working in rural areas return to university hospitals to fill the void left by the lack of new medical graduates. The Japan Medical Association Research Institute reported that almost 60% of all university hospitals have reduced the dispatch of physicians to other medical institutions since the launch of the new training programme [6].

To determine if the 2004 reform had the unintended consequence of impacting physician supply and distribution, we performed an ecological analysis using nationally available data.

In a previous study, we examined the impact of the 2004 reform on the supply of paediatricians in Japan [7]. Our previous study suggested that the 2004 medical residency scheme had the unintended consequence of making it easier for new graduates to choose residency training location, exacerbating regional inequalities in paediatrician supply. A limitation of our previous study was that we ignored the distinction between hospital-based clinicians and smaller-clinic-based physicians (that is primary care clinics with fewer than 20 beds). The 2004 reforms affected resident training programmes that take place primarily in training hospitals designated by the MHLW, as opposed to physicians’ practice locations in small clinics. Therefore, the spatial distribution for clinic-based physicians would not be expected to be affected by the new scheme.

Indeed Toyabe [8] analyzed the time trends in the number and distribution of physicians between 1996 and 2006 and showed that the increasing inequality in geographic distribution of hospital-based clinicians was markedly worse compared to clinic-based physicians; moreover, the number of physicians working at hospitals increased over time in urban areas but not in areas with low population density.

In this study, we sought to disaggregate the hospital clinician trends from clinic-based physicians. We are interested in 2 questions: first, what are the principal drivers of physicians’ practice location choice, and second, what factors affected physician distribution before and after the launch of the new programme in 2004?

**Data and methods**

**Unit of analysis**

We conducted an ecological analysis of physician supply and distribution. The Japanese medical system is organized into three tiers of administration: national, prefectural and municipal. Japan has 47 prefectures, and during the study period underwent administrative re-organization through a large-scale merging of municipalities which decreased the total number of municipalities from 3,232 to 1,750 between 1998 and 2010. Data are adjusted to reflect new municipal boundaries by merging former smaller municipalities into larger ones. The main unit of analysis used for our study is the ‘secondary tier of medical care’ (STM), typically comprising several municipalities. Each prefecture encompasses four to ten STMs based on medical resources,
transportation, and geography, and are roughly comparable to Hospital Service Areas in the US. STMs are considered independent administrative areas from a health service perspective, and are less prone to local spillovers compared to municipalities or counties (typically used in other studies) [8-14]. The total number of STMs did not change significantly during the study period, which was between 1998 and 2010, although borders were redrawn. The STM boundaries from 2010 (n = 346) were used in this study.

Data

Dependent variable

Our main dependent variables of interest are differences in numbers of physicians between the 2 4-year time periods: 1998 to 2002, which represents the period before the 2004 programme started (pre-period), and 2006 to 2010, which represents the period after the introduction of the 2004 programme (post-period). That is to say, the results can be interpreted as such: when the estimates are negative, the predictors are related to decreases in the number of physicians. When the estimates are positive, the predictors are related to increases in the number of physicians.

Only physicians who mainly worked as health care service providers are included, while physicians who were engaged in basic research or government service were excluded from the analysis. Physicians were categorized into two groups according to the institutions where they practiced: hospitals versus clinics.

Independent variables

The two main predictors of interest for the change in physician supply analysis were: measures of need and measures of residential quality, as generally highlighted in the literature on physicians’ practice location choice [15-18].

The 2 primary markers of need that we used were: physicians per 1,000 population (physician density), and age-adjusted mortality rates at the beginning of the 2 periods.

We considered urban/rural status as an indicator of residential quality. Municipalities were divided into five categories, based on the metropolitan area code defined by the Ministry of Internal Affairs and Communications: 1) central cities of major metropolitan areas, 2) central cities of metropolitan areas, 3) surrounding municipalities of central cities of metropolitan areas, 4) surrounding municipalities of central cities of metropolitan areas, and 5) other municipalities. This classification is revised, based on the results of the national census in Japan, which is conducted every 5 years.

The classification from 2000 and 2005 (aligned to census years) was used to characterize the pre-period (1998 to 2002) and post-period (2006 to 2010), respectively. In this study, the metropolitan and the major metropolitan areas were combined into a single category, since there were only 5 central cities among 1,750 municipalities in 2000 and 6 in 2005. This resulted in 3 basic groups: 1) STMs that included central cities for major metropolitan areas and metropolitan areas, defined as urban centres (n = 26 in pre-period and n = 28 in post-period); 2) STMs that include surrounding municipalities of central cities of the metropolitan areas and the major metropolitan areas, which are defined as suburban areas (n = 127 in pre-period and n = 130 in post-period); and 3) others, which are defined as rural (n = 193 in pre-period and n = 188 in post-period). ‘Rural’ is used as a reference group in the models. Because no standard definition of the term ‘rural’ exists [19-22], we checked the robustness of the model with respect to alternative urban/rural measures.

Previous studies have employed one of the following definitions [19]: 1) metropolitan statistical area [10,21], which is comparable to metropolitan area codes in Japan; 2) population size [12,19,21]; and 3) population density [19,23]. We employed population density as an alternative way to define urban/rural status. Under this alternative definition, the STMs with a population density of more than 1,000/km² are defined as urban (n = 68 in pre-period and n = 67 in post-period), and the remaining are defined as rural (n = 278 in pre-period and n = 279 in post-period).

As an additional measure of local residential quality, we also included a composite area-based index of socio-economic status (SES composite index), which was created from indicators representing education, occupation, and income. The index was derived from a factor analysis of the percentage of the local population with a college-level education, the percentage of white-collar workers, the unemployment rate, and per capital income. Factor scores, formulated by a principal component analysis with varimax rotation, were used to construct a composite index to represent each aspect of SES for the study units [24].

Table 1 describes each of the variables selected in the models. In addition to measures of local need and residential quality, we considered measures of professional interactions because the published literature has suggested that professional interactions were important factors that affect physicians’ decisions regarding their practice locations [15-18]. Meteorological data on average temperature and humidity were available only at the prefecture level.

Data sources

We obtained data from multiple sources. Data for physician totals were obtained from the Survey of Physicians, Dentists, and Pharmacologists [25], which is conducted every 2 years by the MHLW. All licensed physicians are expected to complete this survey and register their working addresses and specialties under the Medical Practitioners Law [26]. The local population by age group of 5-year-olds was obtained from the Basic Resident
Table 1 Variables selected in the models

| Variables                          | Explanation                                                                 |
|-----------------------------------|-----------------------------------------------------------------------------|
| **Measures of needs**             |                                                                             |
| Age-adjusted mortality            |                                                                             |
| Physician density                 | The number of physicians who work for any medical facilities per 1,000 population |
| Hospital physician density        | The number of physicians who work for hospitals per 1,000 population       |
| Clinic physician density          | The number of physicians who work for clinics per 1,000 population          |
| **Measures of residential quality** |                                                                             |
| Urban/rural status                | The metropolitan area code defined by the Ministry of Internal Affairs and Communications |
| Per capita income                 | As a proxy for educational level in the community                           |
| with a university-level education |                                                                             |
| Unemployment rate                 | The number of unemployed individuals per the number of all individuals currently in the labour force (workforce) |
| Percent of white-collar workers   | The number of professionals, technical workers, managers, and administrators per number of workforce |
| Primary school students per number of primary schools | As a proxy for children’s educational opportunities |
| Crime rate                        | The number of crimes per total population as a proxy for neighbourhood safety |
| Temperature                       | As a proxy for climate discomfort. The discomfort index was calculated by using temperature and humidity and used in the model. |
| Humidity                          |                                                                             |
| **Other factors**                 |                                                                             |
| Total population                  |                                                                             |
| Hospital beds per 1,000 population | As a proxy for continuing education                                        |
| The presence or absence of...     |                                                                             |

Registered [27] and was used to calculate physician-to-population ratios.

Factors previously shown to be associated with physician supply [15-18] were obtained from publicly-available secondary data. Numbers of deaths by age group of 5-year-olds were obtained from the vital registration system [28-31]. The oldest data yielded mortality dates back to 1999, so the age-adjusted mortality of 1999 was applied in the analysis of the period 1998 to 2002. The age-adjusted mortality from 2006 was used in the analysis of the period 2006 to 2010. For the calculation of age-adjusted mortality, direct age-standardization was applied using the 1985 model population of Japan as the standard.

The data for the following five variables were obtained from the Regional Statistics by Municipalities, which were produced by the Ministry of Internal Affairs and Communications (MIAC) [32]: 1) per capita income; 2) number of hospital beds; 3) number of primary schools; 4) number of primary school students; and 5) crime rates, defined as number of crimes per 1,000 population. The data for the following 4 variables were obtained from the 2000 and 2005 Japanese Census [33-35]: 1) metropolitan area codes; 2) percentage of the population with a college-level education; 3) unemployment rate; and 4) percentage of white-collar workers. Unemployment rates and the percentage of white-collar workers were calculated using the mean of 1995 and 2000 data and applied to the time period 1998 to 2002. Corresponding data from 2005 were applied to analysis of the time period 2006 to 2010. The percentage of the population with a college-level education is only collected every 10 years. The data from 1990 were no longer publicly available. Therefore, data from 2000 were applied to the time period 1998 to 2002. The mean of 2000 and 2010 data were applied to the time period 2006 to 2010.

To assess average climate (as a potential factor in physician location preference), the discomfort index, developed by the US Weather Bureau (currently the National Weather Service) and widely used in previous studies [36,37], was calculated by using temperature and humidity. Temperature and humidity could only be obtained at the prefecture level; data for the model were retrieved from Regional Statistics by Prefectures, which was produced by MIAC [38].

Statistical analysis

Descriptive statistics of all continuous variables were presented as means with standard deviations and 95% confidence intervals (CIs) for the periods 1998 to 2002 (pre-period) and 2006 to 2010 (post-period). Mean equality tests were performed to examine the statistical significance of the observed differences.

Ordinary least-squares regression models were used to analyze changes in STM-level physician supply in the pre- and post-period. For both periods, changes in physician supply were evaluated as a function of STM-level baseline factors, which were defined as 1998 conditions for the pre-period and 2006 conditions for the post-period. A test of coefficient equality in regressions was performed to examine significant differences in coefficients between the pre- and the post-period.

To examine if the main predictors of interest had meaningful effects on the change in physician supply, after
accounting for the effects of the control variables, likelihood ratio tests (LRTs) were performed to compare the models that only included control variables with the ones that included each main predictor of interest or all of these predictors together with the control variables. By doing these LRTs, we can check whether each and all of the predictors have a significant contribution to the explanation of changes in physician supply in the pre- or post-period, that could not already be accounted for by the control variables.

As a robustness check, the under-5-year-old population and the over-65-year-old population were used to calculate physician density, because these age groups tend towards greater demand for medical services [15].

A two-tailed $P$-value of less than .05 was considered statistically significant. All analyses were performed using SAS 9.2 software (SAS Institute, Inc., Cary, NC, USA). This study does not directly involve the use of human subjects, nor their identifiable data, but aggregated and de-identified data that was released by the Japanese government and is publicly-available. The study was consistent with the Declaration of Helsinki.

**Results**

Table 2 shows the aggregate level change in physician supply. Both the absolute number of physicians and the physician-to-population ratio increased in both the pre- and post-periods.

Table 3 shows descriptive statistics of dependent variables, which are differences in numbers of physicians between both 4-year time periods: 1998 to 2002 for the pre-period, and 2006 to 2010 for the post-period, and continuous independent variables for the pre- and post-periods, along with the $P$-value resulting from testing the Equality of Means. Overall physician density increased ($P$-values for overall physician density was .001, for hospital physician density was .011, and for clinic physician density was < .0001). Table 4 shows descriptive statistics of categorical independent variables for the pre- and post-periods. The number of urban, suburban, and rural centres changed slightly between the pre- and post-period, and the number of medical schools did not change during the study period.

Table 5 presents the results of our main predictors of interest from the multivariate ordinary least-squares regression models controlled by all other factors shown in Table 1 for all physicians. While the change in physician supply was not associated with baseline physician density in the pre-period, it was positively associated with baseline physician density in the post-period ($P$-value < .0001). In other words, in the post-2004 period, areas with already high physician supply attracted even more physicians. After adjustment for all other variables, we estimated that each unit increase in physician density (1 physician per 1,000 population) in 2006 was associated with an increase in the number of physicians of 64.80 in 2010. While the change in physician supply was inversely associated with urban centres in the pre-period ($P$-value .026), it was positively associated with urban centres in the post-period ($P$-value < .0001). On average, we estimated that urban centres lost 26.71 physicians from 1998 to 2002 and gained 68.81 from 2006 to 2010, compared to rural areas after adjustment for all other variables.

Table 6 shows the results from the LRT for all physicians. Physician density, urban/rural status, and the SES composite index did not have meaningful effects on the change in physician supply in the pre-period, while they had significant effects in the post-period.

Table 7 shows the results from the multivariate ordinary least-squares regression analyses for hospital-based clinicians. While the change in hospital physician supply was inversely associated with baseline hospital physician density in the pre-period ($P$-value = .047), it was positively associated with baseline hospital physician density in the post-period ($P$-value < .001). Urban centres and the SES composite index showed statistically-positive associations with the change in hospital physician supply in the post-period ($P$-values < .001 for urban centres, and .025 for SES c index), whereas the change in hospital physician supply was inversely associated with urban centres and no

**Table 2 The aggregate level change in physician supply at the national level**

|                  | 1998 | 2002 | 4-year relative change (2002 to 1998)/1998 | 2006 | 2010 | 4-year relative change (2010 to 2006)/2006 |
|------------------|------|------|------------------------------------------|------|------|------------------------------------------|
| Number of all physicians (A = B + C) | 236,933 | 249,574 | 5.34% | 263,540 | 280,431 | 6.41% |
| Number of physicians working at the hospitals (B) | 153,100 | 159,131 | 3.94% | 168,327 | 180,966 | 7.51% |
| Number of physicians working at the clinics (C) | 83,833 | 90,443 | 7.88% | 95,213 | 99,465 | 4.47% |
| Population (millions) (D) | 125.57 | 126.46 | 0.71% | 127.06 | 127.06 | 0.00% |
| Physician density$^a$ (A/D) | 1.89 | 1.97 | 4.60% | 2.07 | 2.21 | 6.41% |
| Hospital physician density$^b$ (B/D) | 1.22 | 1.26 | 3.21% | 1.32 | 1.42 | 7.51% |
| Clinic physician density$^c$ (C/D) | 0.67 | 0.72 | 7.13% | 0.75 | 0.78 | 4.46% |

$^a$Number of all physicians per 1,000 population.

$^b$Number of physicians working at hospitals per 1,000 population.

$^c$Number of physicians working at health care facilities per 1,000 population.
such effects of SES composite index during the pre-period (P-value = .015 for urban centres and .483 for SES composite index). The coefficient equality test showed significant differences in coefficients between the pre-period and post-period both for urban centres (P-value < .0001) and the SES composite index (P-value = .026).

Table 8 shows the results from the LRT for physicians working at the hospitals. Hospital physician density and urban/rural status had meaningful effects on the change in hospital physician supply both in the pre- and post-periods. However, both estimates were negative in the pre-period, and positive in the post-period. Therefore,
Table 5 Results of multivariate ordinary least-squares regression models for all physicians

| Main predictors of interest | Estimate coefficient | 95% CI  | P-value | Estimate coefficient | 95% CI  | P-value |
|-----------------------------|----------------------|--------|---------|----------------------|--------|---------|
| Measure of public health need |                      |        |         |                      |        |         |
| Age-adjusted mortality      | 5.70                 | [4.50 to 6.90] | .000   | 6.10                 | [5.10 to 7.10] | .000   |
| Physician density            | 5.55                 | [4.35 to 6.75] | .199   | 6.40                 | [5.20 to 7.60] | .199   |
| Measure of residential quality |                    |        |         |                      |        |         |
| Urban centre                 | 26.71                | [20.31 to 33.11] | .000   | 23.81                | [19.11 to 28.51] | .000   |
| Suburban                     | 5.86                 | [5.31 to 6.41] | .272   | 5.94                 | [5.44 to 6.44] | .272   |
| Rural area                   | Reference            | Reference |        | Reference            | Reference |        |
| SES composite index          | 6.96                 | [6.46 to 7.46] | .056   | 7.94                 | [7.45 to 8.45] | .056   |

*The models included the control variables: total population, number of primary school students per number of primary schools, crime rate, discomfort index calculated by temperature and humidity, hospital beds per 1,000 population, and the presence or absence of medical schools.

*Standard error.

*Confidence intervals.

*SES composite index was created from the percent of the population with a college-level education, percent of white-collar workers, the unemployment rate, and per capita income.

Table 6 Results from likelihood ratio test (LRT) for all physicians

| Model                      | R squared | LR statistic | DF | P-value | R squared | LR statistic | DF | P-value |
|----------------------------|-----------|--------------|----|---------|-----------|--------------|----|---------|
| Model only with control variables (#1) | 0.625 | 10.81 | 1 | .001 | 0.525 | 4.75 | 1 | .029 |
| #1 + Age-adjusted mortality | 0.636 | 10.81 | 1 | .001 | 0.525 | 4.75 | 1 | .029 |
| #1 + Physician density      | 0.642 | 10.81 | 1 | .001 | 0.525 | 4.75 | 1 | .029 |
| #1 + urban/rural status     | 0.627 | 4.24 | 2 | .120 | 0.764 | 34.05 | 2 | .004 |
| #1 + SES composite index    | 0.627 | 3.14 | 1 | .077 | 0.701 | 57.18 | 1 | <.001 |
| Full model                  | 0.640 | 18.95 | 5 | .002 | 0.783 | 172.10 | 5 | <.001 |

*The likelihood ratio test statistic.

*Degree of freedom.

*The models included only control variables, which are total population, number of primary school students per number of primary schools, crime rate, discomfort index calculated by temperature and humidity, hospital beds per 1,000 population, and the presence or absence of medical schools.

*The models included control variables and age-adjusted mortality.

*The models included control variables and ratio of number of physicians to 1,000 population.

*The models included control variables and urban centre and suburban.

*The models included control variables and socioeconomic status (SES) composite index, which was created from the percent of the population with a college-level education, percent of white-collar workers, the unemployment rate, and per capita income.

*The models included all variables.
composite index, which had meaningful effects on the change in hospital physician supply between pre- and post-periods, also had meaningful effects on the clinic physician supply both in pre- and post-periods.

All the robustness checks showed the similar results. (Detailed results are available upon request).

### Discussion

The current study explored community-level factors that affected changes in physician supply in Japan, as well as the impact of the 2004 national training programme on physician supply. We found that the determinants of the change in physician supply differed before and after the launch of the 2004 PGME programme for the following two reasons. First, physicians tended to move to places with higher physician density after the launch of the programme. Second, physicians tended to leave urban centres before the launch of the 2004 programme, whereas they tended to move to urban centres afterwards. The LRTs supported these phenomena, that is physician density was an important variable in the post-period, whereas it was not in the pre-period, and urban/rural status were important variables in post-period, while they were not in the pre-period.

In short, the PGME programme - which was introduced to improve the quality of medical training - had the unintended consequence of worsening geographical inequality in physician supply. The essence of this story is that our disaggregated analysis revealed that the

### Table 7 Results of multivariate ordinary least-squares regression models for physicians working at the hospitals

| Measure of public health need | 1998 to 2002 | 2006 to 2010 |
|------------------------------|-------------|-------------|
| Age-adjusted mortality       | −67.61      | 54.76       |
| Hospital physician density   | −10.96      | 57.87       |
| Clinic physician density     | 7.22        | 33.85       |

| Measure of residential quality | 1998 to 2002 | 2006 to 2010 |
|-------------------------------|-------------|-------------|
| Urban centre                  | −25.95      | 51.99       |
| Suburban                      | −0.72       | −5.11       |
| Rural area                    | Reference   | 10.50       |

### Table 8 Results from likelihood ratio test (LRT) for physicians working at the hospitals

| Model only with control variables (#1) | R squared | LR statistic | DF | P-value | R squared | LR statistic | DF | P-value |
|----------------------------------------|-----------|--------------|----|---------|-----------|--------------|----|---------|
| #1 + Age-adjusted mortality           | 0.279     | 3.20         | 1  | .074    | 0.637     | 5.64         | 1  | .018    |
| #1 + hospital physician density       | 0.291     | 9.21         | 1  | .002    | 0.742     | 123.55       | 1  | < .001  |
| #1 + clinic physician density         | 0.279     | 3.07         | 1  | .808    | 0.689     | 59.87        | 1  | < .001  |
| #1 + urban/rural status               | 0.291     | 10.29        | 2  | .006    | 0.662     | 31.85        | 2  | < .001  |
| #1 + SES composite index              | 0.274     | 0.90         | 1  | .342    | 0.676     | 45.05        | 1  | < .001  |
| Full model                             | 0.310     | 23.39        | 6  | .001    | 0.761     | 156.11       | 6  | < .001  |

The likelihood ratio test statistic.

The models included only control variables, which are total population, number of primary school students per number of primary schools, crime rate, discomfort index calculated by temperature and humidity, hospital beds per 1,000 population, and the presence or absence of medical schools.

The models included control variables and age-adjusted mortality.

The models included control variables and ratio of number of physicians working at the hospitals to population.

The models included control variables and urban centre and suburban.

The models included control variables and socioeconomic status (SES) composite index, which was created from the percent of the population with a college-level education, percent of white-collar workers, the unemployment rate, and per capita income.

The models included all variables.
deterioration in physician supply to rural and lower-SES areas primarily affected hospital-based clinicians. More specifically, before the launch of the 2004 programme, physicians working at hospitals tended to go to locations with lower physician density, while the opposite trend was observed after the launch of the new programme. Second, physicians working at hospitals tended to move to urban centres and higher SES communities. Moreover, for physicians working at the clinics, tendencies to move to urban centres and higher SES communities were observed in both pre- and post-periods. The LRTs also supported these phenomena, that is hospital physician density and urban/rural status were important variables in both pre- and post-period for physicians working at hospitals; however, the direction of the effects were the opposite, and urban/rural status and SES composite index were important variables in both pre- and post-periods for physicians working at clinics.

The public perception in the Japanese media (also acknowledged by the government) is that regional inequality in physician supply worsened after the launch of the 2004 programme because many physicians - when allowed to choose freely - prefer work in urban areas [5,39]. However, published quantitative analyses of the 2004 programme’s impact on physician distribution have

| Table 9 Results of multivariate ordinary least-squares regression models for physicians working at the clinicsa |
|-----------------------------------------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|
| Main predictors of interest | 1998 to 2002 | 2006 to 2010 | | | | | | | | | | |
| Measure of public health need | | | | | | | | | | | | |
| Age-adjusted mortality | –30.98 | 16.38 | [-63.08 to 1.12] | .059 | 49.23 | 25.59 | [-0.93 to 99.39] | .0544 | .009 | | | |
| Hospital physician densityb | 9.90 | 3.02 | [3.98 to 15.83] | .001 | 23.53 | 3.87 | [15.95 to 31.1] | < .001 | .006 | | | |
| Clinic physician densityb | –17.27 | 6.96 | [-30.92 to -3.63] | .013 | –19.64 | 8.58 | [-36.46 to -2.83] | .022 | .830 | | | |
| Measure of residential quality | | | | | | | | | | | | |
| Urban centre | 2.90 | 5.87 | [-8.6 to 14.39] | .622 | 21.00 | 7.08 | [7.12 to 34.88] | .003 | .050 | | | |
| Suburban | –4.84 | 2.62 | [-9.97 to 0.29] | .064 | 1.50 | 3.34 | [-5.05 to 8.04] | .654 | .136 | | | |
| Rural area | Reference | Reference | | | | | | | | | | |
| SES composite indexc | 7.55 | 1.81 | [4.01 to 11.1] | < .001 | 8.57 | 2.37 | [3.93 to 13.21] | < .001 | .734 | | | |

The models included: total population, number of primary school students per number of primary schools, crime rate, discomfort index calculated by temperature and humidity, hospital beds per 1,000 population, and the presence or absence of medical schools.

Standard error.

Confidence intervals.

Ratio of number of physicians working at the hospitals to population.

Ratio of number of physicians working at the clinics to population.

Socioeconomic status (SES) composite index was created from the percent of the population with a college-level education, percent of white-collar workers, the unemployment rate, and per capita income.

| Table 10 Results from likelihood ratio test (LRT) for physicians working at the clinics |
|-----------------------------------------------|----------------|----------------|----------------|----------------|
| Model only with control variables (#1) | 0.709 | 0.449 | | |
| #1 + Age-adjusted mortalityd | 0.718 | 11.37 | 1 | .001 | 0.448 | 0.62 | 1 | .429 |
| #1 + hospital physician densitye | 0.728 | 24.64 | 1 | < .001 | 0.532 | 57.54 | 1 | < .001 |
| #1 + clinic physician densityf | 0.709 | 1.42 | 1 | .233 | 0.459 | 7.79 | 1 | .005 |
| #1 + urban/rural statusg | 0.714 | 8.65 | 2 | .013 | 0.467 | 13.87 | 2 | < .001 |
| #1 + SES c indexh | 0.730 | 27.46 | 1 | < .001 | 0.500 | 34.66 | 1 | < .001 |
| Full modeli | 0.747 | 54.20 | 6 | < .001 | 0.560 | 83.92 | 6 | < .001 |

The likelihood ratio test statistic.

Degree of freedom.

The models included only control variables, which are total population, number of primary school students per number of primary schools, crime rate, discomfort index calculated by temperature and humidity, hospital beds per 1,000 population, and the presence or absence of medical schools.

The models included control variables and age-adjusted mortality.

The models included control variables and ratio of number of physicians working at the hospitals to population.

The models included control variables and urban centre and suburban.

The models included control variables and socioeconomic status (SES) composite index, which was created from the percent of the population with a college-level education, percent of white-collar workers, the unemployment rate, and per capita income.

The models included all variables.
number of years after graduation. The government has medical school tuition for those students who agree to work in rural areas for designated number of years was first instituted on a large scale in 2006 [46]. The first graduates covered by this policy graduated in 2012; therefore, this policy does not impact the results of our study.

There are some limitations to consider in interpreting the results of this study. First, publicly-available data do not indicate whether a physician works full-time or part-time. This analysis was based on an overall headcount, which might overestimate the number of physicians. In particular, the percentage of female physicians is increasing [25] and the percentage of female physicians who work part-time is higher than that of men [50]. Second, publicly-available data do not include information on physician age or gender, although previous studies have noted the effect of gender or age on differences in physician practice location choices [18,51-53]. In reality, a majority of clinics in Japan are privately-owned, with the very few exceptions of clinics owned by the local governments in some rural areas. Therefore, it is possible that the data for physicians at clinics included physicians who do not provide clinical work, but are rather engaged in business administration. Last, some local governments have been implementing their own policies to attract physicians to specific (generally underserved) areas, and these policies could also influence physician practice location choice. Some regions use public funding to provide a better salary to physicians who work in rural areas to ensure physician supply in underserved areas [48]. Omitting this variable for this type of aid in the model would underestimate the coefficients reported here reflecting the true effect of the policy change on physician practice location choices. Therefore, the true effect would be even stronger than the estimated coefficients in the current study.

Conclusions
After the 2004 PGME reforms, physicians tended to move to places with higher physician density, and the shift toward urban, higher-SES locations became more accentuated.
These changes were primarily driven by hospital-based clinicians. Our study suggests that new placement schemes should be developed to achieve more equity in access to medical care in Japan.

**Abbreviations**

CI: Confidence interval; LRTs: Likelihood ratio test; MHLW: The Ministry of Health, Labor and Welfare; MAC: The Ministry of Internal Affairs and Communications; PGME: New postgraduate medical education; SES: Socioeconomic status; STM: Secondary tier of medical care.

**Competing interests**

The authors declare that they have no competing interests.

**Authors’ contributions**

RS designed the study, collected and analyzed the data, drafted the initial manuscript, and managed subsequent drafts with revisions from all other authors. HT and RG contributed the interpretation of results and discussion, and critically reviewed the manuscript. IK supervised the study as a whole. All authors significantly contributed to the interpretation of the results, and have given final approval of the version to be published.

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