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Data Availability Statement: The time-dependent variable for this study was the oral cancer mortality rate, standardized by gender and age using the direct standardization technique. Oral Cancer deaths were collected and classified according to the International Classification of Diseases (ICD-10), considering codes C-00 to C-10, from 1996-2019. The number of OC deaths was collected from the Mortality Information System (acronym in Portuguese, SIM), openly available at https:// datasus.saude.gov.br/transferencia-de-arquivos/.

RESEARCH ARTICLE

The Brazilian National Oral Health Policy and oral cancer mortality trends: An autoregressive integrated moving average (ARIMA) model

Elisa Miranda Costa^{1*}, Elisa Santos Magalhães Rodrigues^{1*}, Francenilde Silva de Sousa^{1*}, Felipe Bezerra Pimentel^{2*}, Mariana Borges Sodré Lopes^{1*}, João Ricardo Nickenig Vissoci^{3*}, Erika Barbara Abreu Fonseca Thomaz^{1*}

1 Public Health Department, Federal University of Maranhão, São Luís, Maranhão, Brazil, 2 Department of Electrical Engineering, Federal University of Maranhão, São Luís, Maranhão, Brazil, 3 Duke Global Health Institute, Duke University, Durham, North Carolina, United States of America

• These authors contributed equally to this work.

* elisamirandacosta@gmail.com

Abstract

Objective

This study analyzes the effect of the Brazilian National Oral Health Policy (NOHP) on oral cancer mortality rates (OCMR).

Method

This is an ecological study with secondary oral cancer death data, using interrupted time series analysis (ARIMA, Autoregressive Integrated Moving Average). Annual death data were collected from the Mortality Information System (1996–2019). The outcome was the OCMR, standardized by gender and age We considered the NOHP, categorized as "0" (before its implementation), from 1996 to 2004, and "1 to 15", from 2005 to 2019. ARIMA modeling was carried out for temporal analysis, and regression coefficient estimation (RC).

Results

The Brazilian NOHP implementation was associated with an increase in OCMR in the North region (CR = 0.16; p = 0.022) and with a decrease in the Southeast region (CR = -0.04; p<0.001), but did not affect the other macro-regions nor Brazil. The forecast models estimated an increase in OCMR for the North, and Northeast, a decrease for the Southeast, and stability for the South and Brazil.

Conclusion

The Brazilian NOHP is not being effective in reducing the OCMR. The trends behaved differently in the Brazilian territory, highlighting health inequities. We recommend that the NOHP strengthen the oral health care network, incorporating oral cancer as a notifiable disease, The denominator was the total population obtained from the Brazilian Institute of Geography and Statistics (acronym in Portuguese, IBGE), considering the 1991, 2000, and 2010 censuses, and inter-census projections. The data referring to the Brazilian population were gathered from the DATASUS, available at https://datasus.saude.gov. br/populacao-residente. For this study, we calculated the oral cancer mortality rates for every 100 thousand inhabitants. This study was based on secondary data from Brazilian public domain databases, with no need to be approved by an Ethics Committee.

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adopting strategies for prevention, screening, and providing opportunities for early treatment of the disease.

Introduction

According to the 2019 Global Burden of Disease Study, oral and oropharyngeal cancers accounted for approximately 3.1% of deaths from all cancers in the world in 2019, which represents about 313,000 deaths [1]. In 2019, Brazil had a standardized oral cancer mortality rate (OCMR) of 3.01 per 100,000 inhabitants, 5.1 for men, and 1.22 for women [2]. When evaluating the historical series between 2002 and 2013, the rate increased in the Northeast (6.9%) and decreased in the Southeast (-2.9%), with a stationary behavior for the other regions [3]. From 2000 to 2013, the annual rate trend was stationary for men and increasing for women (1.31%), with higher growth patterns for brown men (20.36%) and women (8.24%) [4].

The high OCMR may reflect a lower Human Development Index, lower investment in health services [5, 6], and delayed diagnosis and onset of treatment in more advanced clinical stages [7, 8]. Besides, the greater coverage of oral health services in primary health care (PHC) [5, 6, 8–11] and a higher number of Dental Specialty Centers (acronym in Portuguese, CEO) [10] are associated with lower OCMR. These results point to the importance of expanding the coverage of services at each point of the Health Care Network (HCN).

In 2004, the NOHP promoted the expansion of oral health teams in PHC, with the potential to carry out an active search for cases in the territory, and stimulated the implementation of CEO, with a mandatory provision of services for oral cancer diagnosis [12]. Also, NOHP has a national scope, interfacing with other policies, and including different health services systems components, such as infrastructure (facilities, equipment, medicines, and knowledge) and human resources (health workers), financing (financial contribution to the program in the federal budget, Social Security, social insurance, and private insurance), management and organization (organization of services and networks and implementation of actions and programs), and care model (how the provision of services and the work processes of health professionals are carried out) [13]. Therefore, we hypothesize that NOHP can affect the OCMR. However, there is a lack of evidence on whether the implementation of the NOHP in 2004 impacted the Brazilian OCMR trends in the last 15 years.

There are some studies on the trend of OCMR by regions [3, 4], but more current analyses, considering the pre and post-NOHP period, are scarce. We identified three studies analyzing the effect of some components of NOHP on OCMR. However, they did not include the pre-NOHP period [10] or did so for a very short period [9, 11]; they did not consider the stationarity and interruption components of the series; nor did they make effect assessments by macro-region [10, 11].

Therefore, to our knowledge, this is the first interrupted time series analysis with national OCMR data in Brazil using ARIMA (autoregressive integrated moving average), a popular model in the econometric field that allows analyzing the behavior of stationary and non-stationary series, and the effect of programs and policies on specific outcomes over time [14, 15]. The ARIMA model with input series is called an intervention model or interrupted time series model [14, 15]. In an intervention model, the input series is an indicator variable that contains discrete values that flag the occurrence of an event affecting the response series [14, 15]. This event is an intervention in or an interruption of the normal evolution of the response time series [14, 15]. This method has already been applied to investigate the impact of COVID-19 on dental service production indicators in a Brazilian state, for example [16].

Moreover, analyzing the effects of this policy over space-time in low- and middle-income countries context can assist us in planning and formulating strategies for more equitable health services regarding prevention, early diagnosis, treatment, and rehabilitation. This paper aims to analyze the temporal trends of OCMR for Brazil and macro-regions, and estimate the effect of NOHP on the OCMR.

Materials and methods

Study design and study area

This ecological, interrupted time series study [14] followed the STROBE statement. The units of analysis were the Brazilian macro-regions and Brazil. Brazil is the largest country of Latin America, with a Gross Domestic Product (GDP) per capita equal to 5,521 billion reais, and a Gini Index of household income per capita equal to 0.6086. Brazil is composed of 26 states and the Federal District, grouped into five regions with great socio-economic inequalities. The North and Northeast regions have a greater territorial extension, but are less populous and have a lower GDP. The Midwest, except the Federal District, also presents indicators of lower development. On the other hand, the Southeast and South regions are the most populous, the richest, with the most organized HCN and the best development indicators.

Ethics statement

This study was based on secondary data from Brazilian public domain databases, with no need to be approved by an Ethics Committee, according to Resolution No. 510/2016 of the National Board of Health.

Outcome and data availability

The time-dependent variable for this study was the OCMR, standardized by gender and age using the direct standardization technique. Oral cancer deaths were collected and classified according to the International Classification of Diseases (ICD-10), considering codes C-00 to C-10, from 1996 to 2019. The number of oral cancer deaths was collected from the Mortality Information System (acronym in Portuguese, SIM), openly available at https://datasus.saude.gov.br/transferencia-de-arquivos/. The denominator was the total population obtained from the Brazilian Institute of Geography and Statistics (acronym in Portuguese, IBGE), considering the 1991, 2000, and 2010 censuses, and inter-census projections. The data referring to the Brazilian population were gathered from the DATASUS, available at https://datasus.saude.gov.br/ populacao-residente. For this study, we calculated the OCMR for every 100 thousand inhabitants.

Intervention or exogenous variable

The NOHP was the exogenous variable of this study. An intervention should meet the following criteria to be chosen in ARIMA models: it should be an action that can affect the outcome and a nationwide action if this is the unit of analysis [15]. In this sense, the document with the NOHP guidelines, which should be implemented throughout the national territory to expand coverage and access to oral health services, was published in 2004. This policy has guiding principles for the reorientation of oral health care models centered on PHC, expanded specialized services in the CEO and hospitals, primarily focused on diagnosis, treatment, and rehabilitation of oral cancer patients. Some evidence shows that the PNSB (mainly due to the expanded coverage of the Family Health Strategy–ESF) affects the reduction of dental caries [17] and the reduction in the percentage of individuals who never had a dentist [18]. PNSB's effects on oral cancer indicators are still hardly studied [11, 19].

Exploratory analysis

The decomposition of the series was conducted to study the trend and residual characteristics [14]. Seasonality analysis, however, was not considered as the time cycle was annual. The Prais-Winsten regression, which predicts first-order autocorrelation correction [20], was used to calculate the annual percentage change (APC) of the OCMR. The increase, decline, and stagnation trends were expressed as APC and considered stationary when the regression coefficient did not differ from zero (p>0.05).

ARIMA for the intervention effect analysis

This model is based on adjusting the observed values to reduce the difference between the values produced in the predicted model and the observed values to close to zero. This model can describe the behavior of stationary and non-stationary series. The most general form of the non-seasonal model is the ARIMA (p,d,q), where AR: (p = degree of the autoregressive part); d = degree of the first difference involved) and MA: (q = degree of the moving average part). The Box-Jenkins method for time series includes three steps: 1) Identification (Data Preparation and Model Identification); 2) Estimation and Testing; (Estimation and Diagnosis), and 3) Application (Prediction and Health Intervention) [15].

Data preparation included applying the stationarity test (*ur.kpss*) and estimating the number of differences (*ndiffs*). Identifying the ARIMA model started manually by estimating the p and q operators, which occurred from the assessment of data autocorrelation (ACF) and partial autocorrelation (PACF). The ACF identifies how much the information from the previous period is related to the following observation. The PACF evaluates the degree of correction of the current variable with its previous values while keeping the other values constant. The identification process was also automated by the *auto.arima* function, which indicates the best-fit model, considering a variation of the algorithm that combines unit root tests, Akaike's Information Corrected Criterion (AICc) minimization, and Maximum Likelihood Function (MLF) to obtain an ARIMA model. The smaller the value of the criterion, the better adjusted the model was; in other words, the model achieved the best adherence to the observed data [14, 15].

The following potential parameters were considered to diagnose the appropriate model to perform the forecast: i) RMSE (root mean squared error); ii) MAE (mean absolute error); and iii) MAPE (mean absolute percentage error). After estimating these parameters, the parsimony criterion was adopted to select the model with the fewest possible parameters and suitable for an adequate representation of the observed series. We also observed normality and autocorrelation between residuals.

The model application phase included the analysis of the effect of the NOHP on the OCMR. The intervention was addressed as a numerical variable, in which the value "0" corresponds to the pre-NOHP implementation years (1996–2004), and increasing values from 1 to 15 correspond to post-NOHP intervention years (2005–2019). The ARIMA model selected during the identification stage was adopted and applied, including the NOHP intervention. The regression coefficient (RC) values were evaluated to assess the intervention's effect. The model adequacy was adopted in the absence of spikes, autocorrelation, and partial autocorrelation, and application of the Box-Pierce test (alpha = 5%). We conducted analyses using RStudio version 4.2.0 software.

Results

OCMR had an increasing trend in the North, Northeast, and Midwest, a decreasing trend in the Southeast, and a stable trend in the South and Brazil (Table 1, Fig 1). We carried out one differentiation for the North, Northeast, Southeast, and Midwest non-stationary series. The South and Brazil did not require differentiation due to their stationary behavior.

The ARIMA models with the best fit were: (0,1,1) for North and Northeast; (4,1,0) for Southeast; (0,1,2) for Midwest; (0,0,0) for South and Brazil as they had stationary series, and there was no correlation between the lags (Table 2). After the series differentiation, we observed a decrease in spikes when estimating the autocorrelation and partial autocorrelation of the North, Northeast, Southeast, and Midwest. The residuals did not show autocorrelation and there was no significant peak in any lag, so the residuals were uncorrelated for the macroregions and Brazil. Additionally, when applying the Ljung-Box Test, p-values were higher than 0.05 for all the time series: North (p = 0.081); Northeast (p = 0.880); Southeast (p = 0.066);

Table 1. The field in ordination of the standard for the	Table 1. T	The trend in oral and oropharyngeal cancer standardized mor	rtality rates, and annual	percentage rate cha	1ge (APC) by	y macro-region, Brazil,	1996-2019
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Unit of Analysis	Coefficient	95%CI ^a	P-Value	R ^{2b}	APC ^c	Trend
North	0.128	0.036 to 0.220	0.009	25.92	34.43	Growing
Northeast	0.100	0.069 to 0.130	0.000	55.66	25.90	Growing
Southeast	-0.041	-0.050 to -0.032	0.000	79.63	-9.13	Decreasing
South	0.012	-0.031 to 0.057	0.563	35.3	2.945	Stable
Midwest	0.049	0.028 to 0.071	0.000	50.73	12.18	Growing
Brazil	-0.002	0062 to 0.001	0.296	71.03	-0.48	Stable

^A 95%CI: 95% Confidence Interval.

^B R²: Adjusted R squared.

^cAPC: Annual Percentage Change

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Unit of Analysis	Parameters	Log-L ^a	AIC ^b	AICc ^c	BIC ^d	RMSE ^e	MAE ^f	MAPE ^g
North	ARIMA (0,1,1)	- 47.85	101.71	102.97	105.11	1.77	0.99	29.23
Northeast	ARIMA (0,1,1)	- 6.02	18.05	19.31	21.46	0.30	0.19	5.71
Southeast	ARIMA (4,1,0)	10.89	- 9.79	- 4.54	- 2.97	0.13	0.09	1.99
Midwest	ARIMA (0,1,2)	- 10.47	26.93	28.2	30.34	0.36	0.27	7.46
South	ARIMA (0,0,0)	- 29.34	62.69	63.26	65.04	0.82	0.39	8.11
Brazil	ARIMA (0,0,0)	- 34.97	73.94	74.51	76.3	1.03	0.41	9.12

Table 2. Parameter estimates for selecting the ARIMA model, time series by macro-regions and Brazil, 1996-2019.

^aAIC: Akaike Information Criterion

^bAICc: Akaike Information Corrected Criterion

^cBIC: Bayesian Information Criterion

^dRMSE: Root Mean Square Error.

^eMAE: Mean Absolute Error

^fMAPE: Mean Absolute Percentage Error

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Midwest (p = 0.455); South (p = 0.949); Brazil (p = 0.980) (Fig 2). The parameters of the models and accuracy measures were adequate. Furthermore, the residuals did not correlate with each other since the p-values from the Box-Pierce Test were higher than 0.05 for all Brazilian macro-regions and Brazil.

The implementation of the NOHP was associated with an increased OCMR in the North (RC = 0.16; p = 0.022) and a decrease in the Southeast (RC = -0.04; p<0.001), but did not have any effect on OCMR over time in the other macro-regions and Brazil (Table 3).

Discussion

In this interrupted time series study involving all the 110,162 deaths due to oral cancer registered in the official Brazilian health system from 1996 to 2019, we observed that OCMR trends are not uniform across Brazilian regions. Besides, NOHP was not associated with a reduction in OCMR in Brazil, except for the Southeast.

Series decomposition, annual percentage change, and model estimation

In time trend analysis using the Prais-Winsten technique, OCMR tended to increase in the North, Northeast, and Midwest. These results agreed with another work, in which rates for potential years of life lost to this disease increased over time [21]. The results may also reflect



Fig 2. Graphs of the autocorrelation and partial autocorrelation functions after differentiation for selecting the ARIMA model, time series by macro-regions and Brazil, 1996–2019.

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Unit of Analysis	Parameters	Log-L ^a	AIC ^b	AICc ^c	BIC ^d	RMSE ^e	MAE ^f	MAPE ^g	Coef. ^h	P-Value
North	ARIMA (0,1,1) with drift	-47.98	101.95	103.22	105.36	1.78	0.99	26.60	0.16	0.022
Northeast	ARIMA (0,1,1) with drift	-7.48	20.96	22.22	24.37	0.33	0.22	6.54	0.09	0.143
Southeast	ARIMA (4,1,0)	7.99	-3.99	1.26	2.83	0.16	0.12	2.51	-0.04	<0.001
Midwest	ARIMA (0,1,2)	-10.39	28.82	31.04	33.36	0.35	0.27	7.19	-0.03	0.301
South	ARIMA (0,0,0)	-29.11	64.64	65.84	68.17	0.81	0.44	7.94	0.02	0.495
Brazil	ARIMA (0,0,0)	-34.72	75.1	76.3	78.64	1.03	0.45	8.14	-0.03	0.479

Table 3. Relationship between the implementation of the Brazil National Oral Health Policy on the oral cancer mortality rate trends in the Brazilian macro-regions and Brazil, 1996–2019.

^aLog-L: Log-Likelihood

^bAIC: Akaike Information Criterion;

^cAICc: Akaike Information Corrected Criterion

^dBIC: Bayesian Information Criterion

^eRMSE: Root Mean Square Error.

^fMAE: Mean Absolute Error

^gMAPE: Mean Absolute Percentage Error

^hCoef.: Coeficient

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an improvement in the reporting and monitoring of deaths from oral cancer in the SIM over time [3, 21]. The trend's behavior and the highest APC may be related to the worse socioeco-nomic conditions of these regions *vis-à-vis* the South and Southeast. Furthermore, they suggest difficulties in accessing oral health services along the HCN.

The stable behavior for OCMR in the South and Brazil can be seen in other studies [3, 21], even with differences in periods and grouping formats of the anatomical sites. Although the South has the highest percentage of tobacco users (19.0%) [22] and the highest life expectancy [23] among the macro-regions of Brazil, we could assume that a better organization of work processes in PHC in this region [24] and the significant expansion of oral health services in PHC [25] may be contributing to the static OCMR in this region. In turn, the downward trend in OCMR for the Southeast may probably reflect the better quality of oral health services in this region, especially those of medium and high complexity, which allows for earlier diagnosis and treatment to be started promptly, corroborating the findings of other studies [3, 5, 21].

The intervention's effect

In interrupted series analysis, the NOHP was associated with an increased OCMR in the North and a decrease in the Southeast. We raised three hypotheses to explain these unusual results. Firstly, the policy, along with other initiatives, has contributed to improving the process of registering deaths in the SIM, especially in areas with the worst coverage of the system, such as in the North region of the country [26]. Thus, the increased OCMR after NOHP in the North region may mean an improvement in registration instead of more deaths. A previous study revealed the incompleteness of databases on the incidence, distribution, and clinical characteristics of oral cavity and oropharyngeal cancer in Latin America [27], in addition to the fact that, in Brazil, official data are probably underestimated [26, 27]. The monitoring of the treatment started only after Law N° 12.732/2012 [28] and feeding the Panel-Oncology panel is quite recent [29]. In addition, it is important to mention that oral cancer in Brazil is not a notifiable disease, so managers cannot adequately access data to support decision-making promptly.

Secondly, the non-reduction of OCMR, as expected after 15 years of the policy, may indicate that the care model in Brazil has not been effectively modified, that is, there are still challenges in the proper implementation of the NOHP. Some challenges are related to completeness; extension and improvement of care; integrated teamwork; working conditions; planning, monitoring, and evaluation of actions; stimulating people's participation and social control; intersectoral actions; universal access to services; and funding [30–32]. Ideally, the implementation of this policy should reduce OCMR in all macro-regions. However, the NOHP did not affect the Northeast, South, Midwest, and Brazil mortality rates, suggesting that the NOHP is not adequately implemented throughout the different national territories and that the oral health care model in Brazil is not capable of effectively impacting health indicators [30]. Although the NOHP is national, its implementation process is quite complex due to social inequalities, territorialization, the fact that the praxis of this policy occurs in the municipality, and that Brazil has more than five thousand municipalities. Therefore, universalizing and municipalizing access to oral health services is a significant challenge.

According to the NOHP, the biopsy of potentially malignant lesions is a procedure included in the PHC dentist's activities in Brazil, and Stomatology is a mandatory specialty within the CEOs. However, biopsy is rarely performed in PHC and not all CEOs in Brazil performed biopsy (82%), case registration (71.2%), and referral to anatomopathological study (86%), especially in the North and Northeast [33]. These aspects may evidence deficiencies in dentists' university education, in which educational actions are behaviorist, geared to specific age groups (5–12 years), dental caries control, and weak teaching-service integration [24, 34, 35]. Furthermore, strategies such as the active search for cases in the territory and intersectoral work must still be strengthened [34]. Some important Brazilian legal frameworks were only published in recent years, such as the Law N° 12.732/2012 [28] and the National Policy for Cancer Prevention and Control [36]. Therefore, NOHP's intersectionality with other health policies is still under construction. Nonetheless, NOHP's implementation may be hampered by the ongoing oral health definancing process in the SUS due to the enactment of the Constitutional Amendment N° 95 in 2016 [37].

Thirdly, we resorted to the three-delay model [38] to hypothesize that a combination of factors may be necessary to reduce OCMR. This model provides a useful framework to examine factors influencing the timeliness of care. The first delay explores socioeconomic and cultural factors influencing a person's decision-making to seek care. The second delay is mainly influenced by structural factors necessary for reaching the healthcare facility. The third delay describes factors at the healthcare facility such as the availability and quality of the services.

Several factors may have favored the implementation of a differentiated care model for NOHP in the Brazilian Southeast, as we observed a decrease in OCMR after implementing the NOHP in this region. Specifically, these factors include higher education and income, and socioeconomic development in general, associated with good conditions of urban infrastructure, as well as the offer of qualified services in an integrated NHC. This finding aligns with trends previously observed in OCMR [3] and potential years of life lost in the Southeast [21].

Possibly, the increased availability of human and physical resources–such as the expansion of establishments offering oral health services–does not necessarily reflect effective access, corroborating previous findings [32]. Therefore, according to the Andersen and Newman model [39], this type of access depends on the external context, health system characteristics, individual factors, and health needs. These results may also reflect a late inclusion of the oral health team in the PHC [33] and difficulties operationalizing interprofessional work to operate in a network in most of Brazil [30, 32].

Thus, it is necessary to invest in changing work processes, which do not seem to be happening effectively throughout the national territory, even after the NOHP [31]. Furthermore, Brazil displays an incomplete epidemiological transition setting. So, the NHC needs to be organized to deal with acute and chronic conditions. However, the Unified Health System (SUS) operationalization is still very focused on meeting the acute conditions; and, perhaps, the Southeast region, more developed in Brazil, which is a reference for high-complexity treatment, is the best prepared to deal with oral cancer care, as identified in a study that analyzed the adequacy of work processes for oral cancer care [40].

Limitations and strengths

This work has some limitations, such as the possible underreporting of oral cancer deaths. However, these are the official data from the death notification systems in Brazil; and there is evidence of the suitability of this health information system, which has been improving over time, representing a useful and valid monitoring system in Brazil [20]. Besides, we analyzed annual time series with relatively few points over the time-period available in the SIM during the validity of the ICD-10. However, the low monthly distribution of oral cancer deaths and the absence of information regarding sex and age for death records in the SIM publicly available would hamper rate standardization. Our results cannot be imputed to the individual level, given the possibility of ecological fallacy.

However, this paper also has strengths as the OCMR were standardized by gender and age. The time series included the pre- (1996–2004) and post-NOHP (up to 2019). Also, using the more robust ARIMA method allows for working better with non-stationary series [14]. We did not identify studies that evaluated the relationship between the implementation of the NOHP and the OCMR, which reinforces the unprecedented results in this work. Conducting a time series study is an analytical tool that significantly contributes to health managers' work in the surveillance of OCMR, the evaluation of health interventions and policies, directing the activities to be developed, and the best way to distribute and allocate health resources [12, 14].

Conclusions

The implementation of the NOHP in 2004, with the expanded access to primary and specialized dental services in the country, has not yet managed to curb OCMR in Brazil. Although there has been observed an association of the policy with reduced mortality in the Southeast and an increase in the North region, it probably expresses an improvement in the quality of data recording rather than a direct effect. That is, even after 15 years, the Brazilian NOHP is not being effective in controlling OCMR. We recommend NOHP review, strengthening the oral HCN, incorporating oral cancer as a notifiable disease, adopting strategies for prevention, screening, and referral by the PHC, and providing opportunities for early treatment of the disease in Brazil, which may be also useful for other low- and middle-income countries contexts.

Supporting information

S1 File. (XLSX)

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Author Contributions

- **Conceptualization:** Elisa Miranda Costa, João Ricardo Nickenig Vissoci, Erika Barbara Abreu Fonseca Thomaz.
- **Data curation:** Elisa Miranda Costa, Elisa Santos Magalhães Rodrigues, Mariana Borges Sodré Lopes.
- **Formal analysis:** Elisa Miranda Costa, Elisa Santos Magalhães Rodrigues, Francenilde Silva de Sousa, Felipe Bezerra Pimentel, Erika Barbara Abreu Fonseca Thomaz.
- **Investigation:** Elisa Miranda Costa, Francenilde Silva de Sousa, João Ricardo Nickenig Vissoci, Erika Barbara Abreu Fonseca Thomaz.
- Methodology: Elisa Miranda Costa, Felipe Bezerra Pimentel, João Ricardo Nickenig Vissoci, Erika Barbara Abreu Fonseca Thomaz.
- Supervision: Erika Barbara Abreu Fonseca Thomaz.
- Writing original draft: Elisa Miranda Costa.
- Writing review & editing: Elisa Miranda Costa, Elisa Santos Magalhães Rodrigues, Francenilde Silva de Sousa, Felipe Bezerra Pimentel, Mariana Borges Sodré Lopes, João Ricardo Nickenig Vissoci, Erika Barbara Abreu Fonseca Thomaz.

References

- Kocarnik JM, Compton K, Dean FE, Fu W, Gaw BL, Harvey JD, et al. Cancer incidence, mortality, years of life lost, years lived with disability, and disability-adjusted life years for 29 cancer groups from 2010 to 2019: a systematic analysis for the global burden of disease study 2019. JAMA Oncol. 2022; 8(3):420– 44. https://doi.org/10.1001/jamaoncol.2021.6987 PMID: 34967848.
- Instituto Nacional de Câncer José Alencar Gomes da Silva. Taxas de mortalidade por câncer, brutas e ajustadas por idade pelas populações mundial e brasileira, por 100.000, segundo sexo, faixa etária, localidade e por período selecionado. Rio de Janeiro: INCA; 2020.
- 3. Perea LME, Peres MA, Boing AF, Antunes JLF. Trend of oral and pharyngeal cancer mortality in Brazil in the period of 2002 to 2013. Rev Saude Publica. 2018; 52:10. https://doi.org/10.11606/S1518-8787. 2018052000251 PMID: 29412371.
- Cunha ARD, Prass TS, Hugo FN. Mortality from oral and oropharyngeal cancer in Brazil, between 2000 and 2013: trends by sociodemographic strata. Cien Saude Colet. 2020; 25(8):3075–3086. https://doi. org/10.1590/1413-81232020258.31282018 PMID: 32785543.
- Cunha AR, Bigoni A, Antunes JLF, Hugo FN. The impact of inequalities and health expenditure on mortality due to oral and oropharyngeal cancer in Brazil. Sci Rep. 2021; 11(1):12845. <u>https://doi.org/10. 1038/s41598-021-92207-x PMID: 34145332</u>.
- Vargas DGM, Probst LF, da Cunha AR, et al. Inclusion of oral health teams in primary health care promotes early diagnosis of oral and oropharyngeal cancers: a nationwide study. BMC Oral Health. 2021; 21(1):312. https://doi.org/10.1186/s12903-021-01664-3 PMID: 34144686.
- Abrahão R, Perdomo S, Pinto LF, Carvalho FN, Dias FL, Podestá JR, et al. Predictors of survival after head and neck squamous cell carcinoma in South America: the interchange study. JCO Glob Oncol. 2020; 6(6):486–99. https://doi.org/10.1200/GO.20.00014 PMID: 32213095.
- Lima AMC, Meira IA, Soares MSM, Bonan PRF, Mélo CB, Piagge CSLD. Delay in diagnosis of oral cancer: a systematic review. Med Oral Patol Oral Cir Bucal. 2021; 26(6):e815–e824. https://doi.org/10. 4317/medoral.24808 PMID: 34704975.
- Rocha TAH, Thomaz EBAF, da Silva NC, et al. Oral primary care: an analysis of its impact on the incidence and mortality rates of oral cancer. BMC Cancer. 2017; 17(1):706. https://doi.org/10.1186/ s12885-017-3700-z PMID: 29084516.
- Cunha ARD, Prass TS, Hugo FN. Mortality from oral and oropharyngeal cancer in Brazil: impact of the National Oral Health Policy. Cad Saude Publica. 2019; 35(12):e00014319. https://doi.org/10.1590/ 0102-311X00014319 PMID: 31800779.
- 11. Freire AR, Freire DEWG, Araújo ECF, de Lucena EHG, Cavalcanti YW. Influence of Public Oral Health Services and Socioeconomic Indicators on the Frequency of Hospitalization and Deaths due to Oral

Cancer in Brazil, between 2002–2017. Int J Environ Res Public Health. 2020; 18(1):238. https://doi.org/ 10.3390/ijerph18010238 PMID: 33396190.

- 12. Brasil. Ministério da Saúde. Diretrizes da Política Nacional de Saúde Bucal. Brasília: MS; 2004. http:// 189.28.128.100/dab/docs/publicacoes/geral/diretrizes_da_politica_nacional_de_saude_bucal.pdf
- 13. Souza LE, Bahia L. Componentes de um sistema de serviços de saúde: população, infra- estrutura, organização, prestação de serviços, financiamento e gestão. In: Paim JS, Almeida-Filho N. (org.). Saúde Coletiva: Teoria e Prática. Rio de Janeiro: Med Book; 2014.
- Bernal JL, Cummins S, Gasparrini A. Interrupted time series regression for the evaluation of public health interventions: a tutorial. Int J Epidemiol. 2017; 46(1):348–355. <u>https://doi.org/10.1093/ije/dyw098</u> PMID: 27283160.
- Schaffer AL, Dobbins TA, Pearson SA. Interrupted time series analysis using autoregressive integrated moving average (ARIMA) models: a guide for evaluating large-scale health interventions. BMC Med Res Methodol. 2021; 21(1):58. https://doi.org/10.1186/s12874-021-01235-8 PMID: 33752604.
- Sousa FS, Costa EM, Rodrigues ESM, Lopes MBS, Thomaz EBAF. Efeitos da pandemia de COVID-19 nos serviços odontológicos da Atenção Primária no Maranhão, Brasil. Cien Saude Colet. <u>http:// cienciaesaudecoletiva.com.br/artigos/efeitos-da-pandemia-de-covid19-nos-servicos-odontologicosda-atencao-primaria-no-maranhao-brasil/18680?id=18680
 </u>
- Silva JV, Machado FC, Ferreira MA. Social Inequalities and the Oral health in Brazilian Capitals. Cien Saude Colet. 2015; 20(8):2539–48. https://doi.org/10.1590/1413-81232015208.12052014 PMID: 26221819.
- Galvão MHR, Roncalli AG. Does the implementation of a national oral health policy reduce inequalities in oral health services utilization? The Brazilian experience. BMC Public Health. 2021; 21(1):541. https://doi.org/10.1186/s12889-021-10586-2 PMID: 33740941.
- Lima HL, Costa EM, Andrade LD, Thomaz EB. Spatial-temporal analysis of hospitalizations with death caused by oral cancer in Brazil and its correlation with the expansion of healthcare coverage. Med Oral Patol Oral Cir Bucal. 2023; 28(1):e1–e8. https://doi.org/10.4317/medoral.25470 PMID: 36565219.
- Antunes JLF, Cardoso MRA. Using time series analysis in epidemiological studies. Epidemiol Serv Saúde 2015; 24(3):565–76 https://doi.org/10.5123/S1679-49742015000300024
- Perea LME, Boing AC, Peres MA, Boing AF. Potential years of life lost due to oropharyngeal cancer in Brazil: 1979 to 2013. Rev Saude Publica. 2019; 53:67. <u>https://doi.org/10.11606/s1518-8787.</u> 2019053001054 PMID: 31483007.
- Instituto Brasileiro de Geografia e Estatística. Pesquisa Nacional por Amostra de Domicílios: Tabagismo. Rio de Janeiro: IBGE; 2008. https://www.ibge.gov.br/
- Camargos MCS, Gonzaga MR, Costa JV, Bomfim WC. Disability-free life expectancy estimates for Brazil and Major Regions, 1998 and 2013. Cien Saude Colet. 2019; 24(3):737–747. <u>https://doi.org/10. 1590/1413-81232018243.07612017</u> PMID: 30892496.
- Casotti E, Contarato PC, Fonseca ABM, Borges PKDO, Baldani MH. Atenção em saúde bucal no Brasil: reflexões a partir da avaliação externa do PMAQ-AB. Saúde Debate. 2014; 38:140–157.
- Brasil. E-Gestor Atenção Básica, 2020. Cobertura de Saúde Bucal. https://egestorab.saude.gov.br/ paginas/acessoPublico/relatorios/relHistoricoCoberturaSB.xht ml. (2022 mar. 30 date last acessed).
- Queiroz BL, Gonzaga MR, Vasconcelos AMN, Lopes BT, Abreu DMX. Comparative analysis of completeness of death registration, adult mortality and life expectancy at birth in Brazil at the subnational level. BMC Population Health Metrics. 2020; 18(Suppl.1):11. https://doi.org/10.1186/s12963-020-00213-4 PMID: 32993681.
- Curado MP, Johnson NW, Kerr AR, Silva DRM, Lanfranchi H, Pereira DL, et al. Oral and oropharynx cancer in South America: incidence, mortality trends and gaps in public databases as presented to the Global Oral Cancer Forum. Trans Res Oral Oncol. 2016; 1:1–7. <u>https://doi.org/10.1177/</u> 2057178X16653761
- 28. Brasil. Lei nº 12.732, de 22 de novembro de 2012. Dispõe sobre o primeiro tratamento de paciente com neoplasia maligna comprovada e estabelece prazo para seu início. Diário Oficial da União 2012. https://bvsms.saude.gov.br/bvs/saudelegis/gm/2013/prt0876_16_05_2013.html
- 29. França MADSA, Nery NG, Antunes JLF, Freire MDCM. Timeframe for initiating oral cancer treatment in Brazil since approval of new legislation in 2012: time trend, 2013–2019. Cad Saúde Pública. 2021; 37: e00293220. https://doi.org/10.1590/0102-311X00293220 PMID: 34730694.
- Costa-Junior SD, Araujo PG, Frichembruder K, Hugo FN. Brazilian Oral Health Policy: metasynthesis of studies on the Oral Health Network. Rev Saude Publica. 2021; 55:105. https://doi.org/10.11606/ s1518-8787.2021055003454 PMID: 34932695.

- Scherer CI, Scherer MD. Advances and challenges in oral health after a decade of the "Smiling Brazil" Program. Rev Saude Publica. 2015; 49:98. <u>https://doi.org/10.1590/S0034-8910.2015049005961</u> PMID: 26815162.
- Raymundo ML, Freire AR, Gomes-Freire DE, Silva RO, Araújo EC, Ishigame RT, et al. Trend of hospitalized cases of oral cancer in Brazil and its relationship with oral health coverage in public health system between 2009 and 2017. Med Oral Patol Oral Cir Bucal. 2021; 26(1):e78–e83. <u>https://doi.org/10.</u> 4317/medoral.24009 PMID: 33247574.
- 33. Goes PSA. Relatório do 2º ciclo da avaliação externa do Programa de Melhoria do Acesso e da Qualidade dos Centros de Especialidades Odontológicas. PMAQ-CEO: resultados principais. São Paulo: FOUSP; 2021. https://www.ufpe.br/cecol/publicacoes
- Noro LRA, Landim JR, Martins MCA, Lima YCP. The challenge of the approach to oral cancer in primary health care. Cien Saude Colet. 2017; 22(5):1579–1587. <u>https://doi.org/10.1590/1413-81232017225.12402015 PMID: 28538928.</u>
- Finkler M, Caetano JC, Souza Ramos FR. Teaching-service integration in the change process in Dentistry training. Interface-Comunic, Saude, Educ. 2011; 15(39):1053–1067.
- 36. Brasil. Portaria nº 874, de 16 de maio de 2013. Institui a Política Nacional para a Prevenção e Controle do Câncer na Rede de Atenção à Saúde das Pessoas com Doenças Crônicas no âmbito do Sistema Único de Saúde (SUS). <u>https://bvsms.saude.gov.br/bvs/saudelegis/gm/2013/prt0874_16_05_2013</u>. html
- 37. Brasil. Emenda Constitucional nº 95, de 15 de dezembro de 2016. Altera o Ato das Disposições Constitucionais Transitórias, para instituir o Novo Regime Fiscal, e dá outras providências. <u>https://www.planalto.gov.br/ccivil_03/constituicao/emendas/emc/emc95.htm</u>
- Thaddeus S, Maine D. Too far to walk: maternal mortality in context. Soc Sci Med. 1994; 38(8):1091– 1110. https://doi.org/10.1016/0277-9536(94)90226-7 PMID: 8042057.
- Andersen RM. Revisiting the behavioral model and access to medical care: does it matter? J Health Soc Behav. 1995; 36(1):1–10. PMID: 7738325.
- 40. Thomaz EBAF, Costa EM, Queiroz RCS, et al. Advances and weaknesses of the work process of the oral cancer care network in Brazil: A latent class transition analysis. Community Dent Oral Epidemiol. 2022; 50(1):38–47. https://doi.org/10.1111/cdoe.12711 PMID: 34967970.