Using Seismic Noise Levels to Monitor Social Isolation: An Example from Rio de Janeiro, Brazil

Fábio L. Dias¹, Marcelo Assumpção², Pedro S. Peixoto³, Marcelo B. Bianchi², Bruno Collaço², Jackson Calhau²

¹ National Observatory, Rio de Janeiro, RJ, Brazil <fabioludias@gmail.com>
² University of São Paulo, Seismology Center, São Paulo, Brazil
³ University of São Paulo, Institute of Mathematics and Statistics, Dept. Appl. Mathematics <ppeixoto@usp.br>

Corresponding author: Marcelo Assumpção (marcelo.assumpcao@iag.usp.br)

Key Points:

- Seismic noise in a seismographic station within Rio de Janeiro city correlates with mobile-phone isolation indexes.
- Seismic noise in Rio de Janeiro can be used as an approximate isolation index.

version R1, 2020 July 14
Abstract

Decrease of seismic noise level, after reduction of traffic due to the COVID-19 pandemia, has been observed worldwide. The possibility of using seismic noise as another proxy to estimate social isolation was tested with a station within Rio de Janeiro city. We used the isolation index measured from smartphone movement to calibrate the seismic noise levels and estimated an Isolation Seismic Index, ISI (% of the population at home), using the seismic noise energy. Noise levels best correlate with isolation measures in the frequency range 4-8Hz. Small differences between the smartphone and the ISI indexes are interpreted as differences in social activities and noise sources. All mobility indexes are proxies to the actual isolation. Although ISI does not measure the number of people outside, it measures the number of noise sources (vehicles, trains, factories, etc.) and can be used as additional information to interpret anomalies in other proxies.

Plain Language Summary

A seismic station within Rio de Janeiro city showed a drastic reduction of seismic noise after isolation measures imposed by the state government and city council. We show that the seismic noise level, due mainly to traffic, can be used as another proxy for the social isolation and can help interpret variations in the other indexes of people mobility.
1 Introduction

The continuous ground motion recorded at seismic stations is due to different sources of perturbation (noise sources). At long periods (1 to 50s) it is mainly produced by atmospheric oscillations and ocean waves; with ocean waves giving energy peaks around 5s and 10s (e.g., Yang and Ritzwoller 2008, Bormann, 2012; Juretzek and Hadziioannou, 2016). At high frequencies, above a 1 Hz, it is mainly produced by local perturbations, both natural, such as wind and storms, and anthropogenic, such as vehicles, factories, etc. (e.g., Diaz et al., 2020; Poli et al., 2020).

In the last decades, seismic noise has been used for many different purposes. Tomography using seismic noise is now a standard tool to investigate Earth's structure from local to global scale (e.g., Shapiro et al., 2005; Bensen et al., 2008; Ekström, 2013; Li et al., 2016). Polarization analyses of seismic noise can give information about atmospheric disturbances in the oceans (e.g., Stutzmann et al., 2009; Schimmel et al., 2011). High-frequency noise, even within cities, is also extensively used to map soil structure (e.g., Bonnefoy-Claudet, 2006a, Wathelet et al., 2020). Noise signals have also been identified from other anthropogenic activities such as crowds of people jumping at football matches (Diaz et al., 2017), dancing events (Green and Bowers, 2008), vibrations due to rapid mudflow downstream after a dam rupture (Aguirto-Detzel et al., 2016), or long term changes associated with economic growth (Hong et al., 2020). A good review of noise types recorded in the urban environment, like sub-way trains and marathons, is given by Diaz et al. (2020).

The most recent observation of variations in human-induced seismic noise is the significant decrease of noise levels due to social isolation policies imposed by governments to reduce the rate of transmission of the COVID-19 pandemia. Several Seismological Centers around the world have reported through their social media channels (like Facebook, Twitter) the noise reduction especially in
stations close to urban centers (Gibney, 2020; Poli et al., 2020). Examples from stations in cities like Milan, Los Angeles and Barcelona can be found on the National Geographic Magazine¹ website. In all those examples, it is possible to see the decrease of the ground displacement after mid-March imputed by the beginning of the lockdown in the cities. Another interesting feature is the difference of the noise levels between diurnal and nocturnal period and between weekdays and weekends.

National Observatory is a research institution located in an urban area in Rio de Janeiro City (Fig. 1). The test station, ON02, is installed in the lower floor of an office building on a 3.5-m tall underground pillar that reaches the local rock basement. It is a broadband station (100s-50 Hz response) recording at 100 sps. It showed a dramatic decrease in its noise level, especially during the day (Fig. 2).

Although this effect is better seen at ON02 station, which is inside a city, a few other stations of the Brazilian Seismic Network (Bianchi et al., 2018) closer to median-sized cities (less than 100.000 inhabitants) have also shown a clear decrease in their diurnal noise level. These observations suggest that noise levels could be used to help monitor the compliance with the social isolation policies. Here, we compare the seismic noise reduction with an isolation index, commonly used in Brazil, measured by monitoring the number of smart-phones that leave their homes. We show that the seismic noise energy has an excellent correlation with the smart-phone-derived isolation index.

2 Origin of the noise measured within Rio de Janeiro city.

The noise recorded by seismic stations near or within a city, at frequencies above 1 Hz, is commonly interpreted as due mainly to anthropic sources. The significant decrease in noise levels during the COVID-19 lockdown has enabled a clear determination that the "cultural noise" spans the

¹ https://www.nationalgeographic.com/science/2020/04/coronavirus-is-quieting-the-world-seismic-data-shows/ (last access 04/May/2020)
frequency range of 1-40 Hz, but mostly between 2 and 20 Hz (Diaz et al., 2020; Poli et al., 2020). Poli et al. (2020) showed that different cities have different spectra of anthropic noise, depending on the type of sources in the vicinity of the station. However, the noise character and type of sources remained the same before or during the lockdown, as shown by the constant average H/V spectral amplitude ratios.

The noise can be produced by a few weak local sources or by many energetic sources at longer distances. We cannot directly determine the dominant distances using a single station. Here we used polarization analysis to infer the possible origins of the noise recorded at ON02. It is usually accepted that most of the high frequency noise (despite not all) is composed of surface Rayleigh waves (e.g., Bonnefoy-Claudet et al., 2006a,b). We applied the time-frequency polarization analysis (Schimmel and Gallart, 2003; 2004; Schimmel et al., 2011) to identify the trains of elliptically polarized noise with retrograde particle motion in a vertical plane, for different frequency bands. The distribution of the directions of arrival of such Rayleigh-type noise are shown in Fig. 3.

For high frequencies (10-20 Hz) the predominant directions are NE and E, both before and during the quarantine. We interpret this high frequency noise as coming predominantly from the road traffic of the major highways and avenues close to the station, which run in a N-S direction just East of the National Observatory (such as "Av. Brasil" and "Red Line", leading to inter-state express-ways, Fig. 1). For intermediate frequencies (2-9 Hz), the incoming directions are more scattered among N, NE, E, SE and S. Only the W and SW directions have almost no contribution. This probably indicates noise sources from more distant traffic, up to several km maybe (Fig. 1b), with the lack of heavy traffic correlating with the hills and mountains W and SW of the Observatory (green color of national parks, Fig. 1). For lower frequencies, around 1 Hz, the dominant sources are to the South, which is interpreted as influence of the more distant oceanic microseisms.
No clear systematic difference was observed in the predominant directions before and during the quarantine. This is consistent with the findings of Poli et al. (2020) for stations in northern Italy where the noise character remains the same before and during the quarantine, only its amplitude changes. Although this polarization analysis is qualitative, it shows that a 2-9 Hz frequency band is convenient to sample traffic noise in a large area of the city. Significant contribution from local activity of the Observatory itself, below 20 Hz, can be discarded. The Observatory lies in a residential area, without operation of heavy equipment in the institution where only technical and research staff work. Working hours start at 09 AM, but the average noise in the range 4-14 Hz reaches its daily average about 05:30 AM local time (see Fig. S1 in the Supplementary Material), due to traffic in the neighborhood and the city in general. This discards a significant contribution from local activities of the Observatory.

3 The Social Isolation Index ($I_k$) and the Isolation Seismic Index (ISI)

We use the smart-phone isolation index to calibrate the noise level as a proxy for the number of noise sources in the city. We assume that the smart-phone movement away from home is directly proportional to the number of seismic sources (mainly cars, trains, buses, factories) operating during the day.

3.1 The smart-phone index $I_k$

The Brazilian company In Loco (www.inloco.com.br) collects the positions of more than 37 million smart-phones, all over Brazil, when they are using their SDK (software development kit), which is present in many popular mobile apps. No personal information is gathered. The anonymized data collected by In Loco contain the physical locations where billions of visits to selected apps have occurred. The technology uses not only Global Positioning System (GPS) data, but also wireless and
other mobile sensors that combined allow a precision of meters for the locations. Based on the pattern of
similar positions outside working hours, it is possible to define their home or neighborhood location and
then measure the number of times each smartphone moves more than a few hundreds of meters away
from home or their neighborhood, for more than 5 min, within 24 hours. A more detailed explanation of
their methodology can be found in Peixoto et al. (2020). The In Loco isolation index is provided by the
company already in aggregated form, by cities, therefore totally preserving anonymity, since no
individual data was available for this research. The index measures the fraction of people that stay at
home and is defined as

\[ I_k = \frac{n_{k,\text{res}}^{\text{mov}}}{n_{k,\text{res}}} \]

where \( n_{k,\text{res}}^{\text{res}} \) is the estimated total number of city residents in the In Loco database, and \( n_{k,\text{mov}}^{\text{mov}} \) is the
number of smartphones used outside their home location in day \( k \). Before the lockdown decree, on
March 23, \( I_k \) was about 0.2 on average (Fig. 2), indicating that about 80\% of people used to be away
from home. For Rio de Janeiro city, the In Loco system captures \( \sim 10\% \) of the population (mainly the
more economically active individuals). The database is not a census of all individuals' locations, but it
has been shown to capture well the overall population mobility (Peixoto et al., 2020, Candido et al
2020).

3.2 The Isolation Seismic Index (ISI)

According to the definition, the fraction of people out of home is given by \( (1-I_k) \). We assume that
the number of noise sources (vehicles, trains, trucks, working factories) is proportional to \( (1-I_k) \) and they
are the main sources that contribute to the records at the station. That is, for a high-noise station within a
city, natural sources of noise (wind, rain, etc.) are usually insignificant. We also assume that the energy
of the seismic waves, for a frequency range of 2-20Hz, (dominated by anthropic noise) is proportional to
the square of the particle velocity. Therefore, we expect that \((1-I_k)\) should be proportional to the noise
"energy".

We measure the noise levels as follows: a) remove the instrument response and calculate the
power spectral density for the particle velocity for every 15min segment with overlap of 7.5 min; b) integrate the velocity power spectral density, in a certain frequency band, to estimate the \(\text{rms}\) particle
velocity for each segment; c) get the \(\text{rms}\) median value of for all segments between 07 AM and 06 PM
local time. Taking medians, instead of the averages, avoids the influence of spurious bursts of noise
from very local disturbances. These calculations were done with a script based on a code by Thomas
LeCocq (https://github.com/ThomasLecocq/SeismoRMS - last access Mat/2020).

We tested various frequency ranges and found that 4-8 Hz best correlates with the mobile-phone
isolation index (Fig. S2). This is consistent with our comparison of the polarization results with the
expected traffic: noise from this frequency range probably comes from more distant sources in the city
and are, therefore, more representative of the whole city where the isolation index \(I_k\) was obtained.

Fig. 4 compares the fraction of people staying out of their homes, \((1-I_k)\), with both the median
amplitude and energy (i.e., median amplitude squared) of the diurnal particle velocity (between 10h-21h
UTC, 07h-18h local time), for the best fitting band 4-8 Hz. It is clear, from the histogram shapes and
reduced errors in the fit (Fig. S2), that the square of the amplitudes has a better linear relation with the
\((1-I_k)\) index, compared with the amplitude, as expected. Therefore, we can estimate a calibration
constant with

\[
(1 - I_k) = C \cdot (A_k)^2
\] (1)
Fig. 4 also shows that the relation between $I_k$ and noise is different between weekdays, Saturdays and Sundays+Holidays. One possible interpretation is that on Sundays and holidays people leave home mainly using light vehicles; heavier sources of noise (trucks, trains, buses, working factories, etc.) are mainly operated on weekdays. Saturday is halfway between Sunday and workdays where factories and commerce are partially functioning.

The good correlation between $I_k$ and noise energy allows us to define an "Isolation Seismic Index", ISI, as:

$$1 - ISI_k = C \cdot (A_k)^2$$

where coefficient $C$ can have three values: $C = C_W$ for working weekdays, $C_{Sa}$ for Saturdays and $C = C_{SH}$ for Sundays and holidays. Based on Fig. 4, we obtained $C_W = 0.00120$, $C_{Sa} = 0.00166$, $C_{SH} = 0.00219$. One interpretation of the $C$ values is that for the same noise amplitude, we must expect less isolation (i.e., higher $1 - I_k$) on the weekend than on the weekdays.

In Fig. 4, we also show the histograms of the difference (in percentage) between the measured index $(1 - I_k)$ by the In Loco company and the ISI value predicted by the coefficient $C$ using the amplitude and energy of the signal. The histograms for the energy, in all situations, are more concentrated around zero than histograms for the amplitude, reinforcing the better agreement of the energy and isolation index. Another conclusion is that the difference between $I_k$ and ISI is concentrated within $\pm 20\%$. The $rms$ fit, in percentage, in Fig. 4b, is $11\%$. For example, if the noise level indicates a seismic isolation index of $0.40$ (i.e., $40\%$ isolated, $60\%$ outside), the expected uncertainty would be $6.6\%$ ($11\%$ of $0.60$).

Fig. 5 shows the Isolation Seismic Index for Rio de Janeiro city (blue line) compared to the *In Loco* smart-phone Isolation Index $I_k$. The ISI level on the weekdays after the lockdown decree matches the smart-phone derived index quite well, as well as the variation between weekends and weekdays.
3 Discussion

A detailed comparison between ISI and $I_k$ indexes (Fig. 5) shows that, despite the overall excellent agreement (using only two parameters, $C_W$ and $C_{SH}$; for Saturday, we used the average between $C_W$ and $C_{SH}$), small inconsistencies are observed which can help interpretation of social isolation and mobility patterns.

In the week of March 16 to 20 (Monday to Friday), the seismic index continues in the same level as the previous working weeks, whereas the $I_k$ index shows that many people had already started to stay at home. One possible interpretation is that, before the city council decree imposing severe isolation after March 22 (closing all shops, restaurants, commerce, etc.) many people had already started reducing their social activities due to the previous state decree of March 16, prohibiting large gatherings, closing cinemas, theater, sports, schools, and even inter-state bus trips. These early isolation steps, however, may not have affected industries, commerce, services and municipal public transportation, which maintained the number of heavy seismic noise sources in the same level, until the definite lockdown on the Monday 23.

4 Conclusions

The government quarantine, due to the COVID-19 pandemic, drastically reduced the mobility of the population and commercial activity. Owing to those restrictions the noise level recorded at seismographic stations close to urban centers decreased significantly. Here, we show this effect at station ON02 situated at an urban area of Rio de Janeiro city. We compared the average particle-velocity recorded by that station with the social isolation index ($I_k$), measured through smart-phone location monitoring, and showed that both are closely related: the noise level decreases as the social isolation
The correlation is good enough to allow an "Isolation Seismic Index" to be defined, after calibration with the smart-phone derived index.

The Isolation Seismic Index does not measure directly the number of people outside, but estimates the number of active noise sources such as trains, buses, vehicles, and factories, and so can be used as additional information to interpret anomalies in the other proxies.

Acknowledgments,

We thank company In Loco for their raw isolation indexes. FLD benefited from Petrobras grant 2017/00159-0 and MA from Brazilian National Research Council grant 301284/2017-2. PSP acknowledges FAPESP (São Paulo State Research Foundation) grant 16/18445-7. Figure 2 was made using Thomas Lecocq code https://github.com/ThomasLecocq/SeismoRMS (last access 04/May/2020).

Data for the Rio de Janeiro station ON.ON02 is available at the database of the Brazilian Seismographic Network: www.rsbr.gov.br. In Loco isolation indexes can be viewed at their site www.inloco.com.br.

The data used here (daily noise median amplitudes, and $I_k$ indexes) are available at a Zenode repository (https:www.....)

References


Bormann, P. (2002), Seismic signals and noise, in *IASPEI New Manual of Seismological Observatory Practice*, vol. 1, edited by P. Bormann, chap. 4, pp. 1–33, GeoForschungsZentrum, Potsdam, Germany.


Shapiro, N. M., Campillo, M., Stehly, L., & Ritzwoller, M. H. (2005), High-resolution surface-wave tomography from ambient seismic noise. Science, 307(5715), 1615-1618.


FIGURE LEGENDS:

Fig. 1.

a) Location of the National Observatory (red triangle) in the Rio de Janeiro metropolitan area, with the seismic station ON.ON02. The station is located ~4 km NW of the busiest city center. White lines are the main access highways (BR040, BR101,BR116).  
b) Street type in Rio de Janeiro: red lines are highways, blue main avenues, gray local streets. Green lines are rail tracks. Note N-S running "Brasil Avenue" and "Red Line" just East of the station, and fewer busy streets to the West and SW. Green-shaded areas are hills and city parks of Rio de Janeiro. Figure 1b uses data from Wikimedia Maps and Open Street Map project available at https://maps.wikimedia.org/. Federal Highways in Fig. 1a from GeoLogística, Brazil (https://geo.epl.gov.br/portal/home/).
Fig. 2. Vertical component particle velocity at ON.ON02 in Rio de Janeiro city (01/Fev to 20/Apr/2020). Comparison of seismic noise level (blue and dark blue lines, in nm/s, left scale) with the "In Loco" Social Isolation Index ($I_k$, red line, fraction of the population staying at home). Note that we plot $(1-I_k)$ which measures the percentage of people outside. The light blue line is hourly medians of the seismic noise showing higher levels during the day and lower at night. The dark blue curve shows daily median amplitudes (07:00 to 18:00 Local Time). Background color shows weekdays in green and Saturday and Sundays in white. Dates in the horizontal axis are plotted at the beginning of the day (00:00 Local Time). Weekends have lower seismic noise both at day and night compared to weekdays. The dashed and dot-dashed green vertical lines are the dates of the Social Isolation Decree by the state government (16/March) and city council (23/March), respectively. Solid and dotted vertical lines are the Sunday Carnival and Good Friday holidays. After the isolation decrees, daytime noise on weekdays reduced from averages of about 26 nm/s to 21 nm/s, while the number of people outside decreased from about 80% to less than 50% in the first lockdown week. Plotting script by Thomas Lecocq (Belgian Observatory, https://github.com/ThomasLecocq, last access 04/May/2020).

Fig. 3. Arrival directions of Rayleigh waves at ON02 for various frequency bands. Left and right columns show directions before and after the isolation decrees, respectively. Processed periods are Monday-Thursday 7AM to 6 PM local time for two weeks. No consistent difference is observed before or during the quarantine.
Fig. 4. Relation between the average diurnal noise (07-18 hs local time) and the fraction of people outside (1-I_k). top left) average amplitude, bottom left) average "energy" (velocity squared). I_k is the In Loco isolation index (fraction of people staying at home); therefore (1-I_k) is fraction of people outside. Black circles are weekdays, red are Sundays and Holidays, and blue are Saturdays or bridges. Note the clear linear relation between energy and (1- I_k). During weekdays the number of heavy noise sources (trucks, trains, working factories) is relatively higher than on Sundays and Holidays, for the same number of people outside. Saturday plots at midway between weekdays and Sundays. The histograms show the relative errors (in percentage) of the seismic "outside index" (1- ISI) in relation to the smartphone index. Smaller errors are seen for the energy (bottom histogramas) compared with the amplitude (top).

Fig. 5. Comparison of the Social Isolation Index (red line for the city of Rio de Janeiro) with the Isolation Seismic Index, ISI (blue line). The days annotated in the horizontal axis are Sundays. The vertical short green lines show the Carnival (Tuesday, February 25) and the Good Friday (April 10) holidays. The two vertical green lines indicate the dates of the state and city council isolation decrees.
Figure 2.
Figure 3.
Figure 4.
Figure 5.