

Artigo

Frost Risk and Rural Insurance in Brazil

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Abstract

In developing countries, such as Brazil, farmers are susceptible to extreme events. The Brazilian federal government created insurance programs to mitigate extreme event effects, such as frost, called “Programa de Subvenção ao Prêmio do Seguro Rural”. Frost is an atmospheric phenomenon that causes damage to plants due to low temperatures that exceed their resistance to freezing. This paper seeks to verify the risk level of frost in Brazil, connecting this information with farmers, who contracted Rural Insurance to protect themselves from this extreme event. To reduce possible biases in calculating the frost probability, this study uses two climatological databases. The majority of the Brazilian territory has very low probabilities of this phenomenon occurring. In the databases used to verify the probability of a temperature below 2 °C, the data proposed by Sheffield paper, show that, in part of the Brazilian territory, there is less chance of frost than Xavier's data. Regardless of the database used, in Brazil, there are farmers who contract frost insurance in areas where the risks are close to zero.

Keyword: frost, rural insurance, agricultural production.

Risco de Geadas e Seguro Rural no Brasil

Resumo

Em países em desenvolvimento, dentre os quais o Brasil, produtores rurais são susceptíveis a eventos extremos. O governo federal brasileiro criou programas de seguro rural para mitigar os efeitos desses eventos extremos, assim como a geada, um desses programas é intitulado “Programa de Subvenção ao Prêmio do Seguro Rural”. A geada é um fenômeno atmosférico que causa danos em plantas quando as baixas temperaturas excedem sua resistência ao congelamento. Este artigo procura verificar o nível de risco de geada no Brasil, ligando esses dados com as informações dos produtores que contrataram seguro rural contra esse tipo de sinistro. Para reduzir a possibilidade de vieses no cálculo do risco de geada, este artigo fez uso de duas bases de dados climatológicos com metodologias distintas. A maior parte do território brasileiro possui baixa probabilidade de ocorrência de geada. As bases de dados foram utilizadas para verificar a probabilidade de temperaturas abaixo de 2 °C, os dados propostos pelo artigo de Sheffield demonstram que, em parte do território brasileiro, há menor probabilidade de geada do que os dados apresentados por Xavier. Apesar das bases de dados utilizadas, no Brasil há produtores que contratam seguros contra geada em áreas onde há riscos próximos de zero para o evento.

Palavras-chave: geada, seguro rural, produção agrícola.

1. Introduction

Humanity is about to experience an unprecedented challenge. The world population increase allied to its affluence has generated an increase for food demand. If this demand continues at this rate, in 2050 it will be neces-

sary to have a 70% increase in food production in relation to 2009, adding a quantitative close to 1 billion of cereal tons and 200 million tons of meat (FAO, 2009). This implies a need to optimize the use of resources and reduce losses.

Added to this challenge we experience a period in which, in most parts of the globe, the extreme climatic events, such as: droughts, floods, strong winds and mini-droughts, have become more frequent and tend to increase. It is estimated that the costs associated with natural disasters resulting from these extreme events have increased 14 fold since 1950 (Sivakumar, 2014). These events added a strong variability in the agricultural productivity and consequently, in the farmer's income, being even possible to hinder the continuity of their activities due to the possible losses (Kollin and Schwab, 2009).

In developing countries, as in Brazil, the small-scale farmers are the most susceptible to these kinds of events, since these farmers have in agriculture their main means of subsistence. Therefore, there is an increase in the probability of a crop failure, debt, emigration and external dependency of food (Morton, 2007).

One of the extreme events that can cause crop failure is frost. Frost is an atmospheric phenomenon that causes damage to plants due to their exposure to low temperatures that surpass their resistance to freezing, that is, below the inferior basal temperature (Williams *et al.* 2008). Frost occurs when the energy balance is negative (Radiation Frost), preferably in stable atmospheric conditions with a clear sky, and/or due to the entrance of a cold air mass (Advective Frost) that reduces abruptly the air temperature (Snyder and Thompson, 1987; Kalma *et al.*, 1992; Melo-Abreu, 2016).

Besides these classifications, from an agronomic point of view, two kinds of frost that cause damage to the production can be considered. One is the white frost, which occurs when the frost is accompanied by the formation of ice through the dew freezing. And the other is the black frost which occurs when the water vapor concentration is too low, therefore there is no dew to freeze, so without the previous ice formation there is a necrosis of the plant tissues. This necrosis gives a burnt aspect to the plant, which is why it is called black frost (Melo-abreu *et al.*, 2016).

Inouye (2000) shows that the climatic changes effects over the distribution and frequency of the frosts is uncertain, however, he shows that this event can occur in a bigger volume in a region and lower periodicity in others. This meteorological phenomenon results not only in economic losses but also in social losses and damages that inflate the food prices. Thus, principally affecting the less well-off layers of society where the small farmers are usually placed (Aguiar and Mendonça, 2004).

Concerning Brazilian cases, the frost is a preoccupation for the farmers in the center-south region of the country (Wrege *et al.*, 2018). There are historical reports that associate frost with calamities of national proportions. In 1975 in Paraná, for example, there was a frost which affected the state during decades, especially the coffee sector. For some researchers, the economy of this state can

be divided in: before and after the 1975 frost (Chaddad, 2017; Rodrigues and Pelegrini, 2017).

Thus, the presence of rural risk management tools is necessary, in order to guarantee the farmer's income and permanence in his activities when there are extreme climatic events.

The agricultural insurance reimburses the farmer when there is a significant loss of the crop due to a determined external event to the property, usually a climatic event. The agricultural productions of a region climatically homogenous have a tendency to suffer impacts similar to extreme climatic events. The special correlation between the productivity of a same culture and /or of a same region, considering the climatic patterns correlated to these regions geographically close, originates from a phenomenon known as a systemic risk.

When a determined extreme climatic phenomenon occurs, many farmers, in a vast territorial extension, could be affected severely impacting the insurance companies' activities. Therefore, there is generally a systemic risk in the agricultural insurances. This factor, besides the transactions' costs involved and the oligopolistic structure of the insurance in Brazil, makes the insurance more costly, inhibiting the small farmers from obtaining it.

Aiming at solving this issue, the Brazilian federal government created programs to mitigate the effects involved. Concerning insurance, one of the main mechanisms created is the "Programa de Subvenção ao Prêmio do Seguro Rural" (Subsidization Program for the Rural Insurance Premium) (PSR). Operationally the PSR pays part of the insurance costs of the agriculture farmers, thus reducing the costs involving the insurance acquisition. Therefore, the PSR was created, among other factors, with the purpose of universalizing the rural insurance access which, traditionally, has been little claimed by the Brazilian farmers compared to other countries in the development process.

So that the farmer acquires the most suitable insurance, the PSR requires that the farmer adequates himself to the parameters of Agricultural Zoning of Climatic Risk (ZARC). Because knowledge about the edaphoclimatic conditions in a determined region is extremely important for the crop cultivated there, since the delimitation of the climatically homogeneous regions can establish the ideal climatic conditions to explore the crop with a reduced risk of productivity loss. This is a mechanism that diminishes the chances of climatic adversities for determined crops since it indicates dates for planting and delimits regions that are suitable for agricultural production. So, the PSR subsidizes only cultures that are suitable for determined properties. However, the governmental program does not observe under which climatology conditions the property is exposed. This can generate distortions as some farmers acquire insurance against improbable or null risks.

Since Frost is not a phenomenon observed all over Brazil, it is not a preoccupation of all Brazilian farmers. In this context, this study aims at verifying the frost risks in Brazil and at which level the farmers who contracted the PSR are, in order to protect them from this extreme event.

2. Material and Methods

To verify the frost probability, the minimum temperature was considered as the main variable to determine the event. The culture susceptibility to frost varies according to the species in the cultivar analyzed. According to Mota (1989), the temperature of -2 °C is the critical minimum on the plant, when the less resistant species, such as banana and rice, begin to suffer damages, while for the most resistant ones, such as the citric species, this threshold is - 4 °C. Sentelhas *et al.* (1995) showed that the temperature measured in the meteorological shelter is usually more elevated than the one measure on the plant. In Table 1, the estimation of the minimum temperatures measured in meteorological shelters can be seen, divided in three groups: the most resistant, the intermediary and the less resistant.

Therefore, the estimation of minimum temperatures can be used as a proxy for the frost risk. In this study, the frost risk will be measured through the probability of achieving the minimum temperature to cause damage to the crop, and these results will be confronted with the data from the agricultural insurance policies.

To calculate the frost probability, this study uses Xavier *et al.* (2013) and Sheffield *et al.* (2006) climatic data bases for all Brazilian territory. The use of two databases aims to reduce eventual biases that each one could present. In both, the annual minimum temperatures were extracted for the estimation of frost risk damaging to the cultivated crops.

Xavier *et al.* (2013) database presents itself as a high-resolution net (0,25° × 0.25°) with variables of daily precipitation, evapotranspiration, maximum and minimum temperatures, solar radiation, relative humidity and wind speed. Data from 735 meteorological stations were used, being the temporal series used by the authors from 1980 to 2010, and the interpolation being the balanced angular distance method. Now, Sheffield *et al.* (2006) database was composed through information from the *National Centers for Environmental Prediction - National Center for Atmospheric Research* (NCEP-NCAR) for modeling of precipitation variables, air temperature and radiation, and

these data also included meteorological variables since 1948.

Aiming at measuring the probability of a minimum temperature below a crop damage threshold, it was admitted that this is an extreme event and the extreme events distribution was applied, generally called Gumbel Distribution. This is a probability distribution model where the annual minimum values of a phenomenon are used, gradually organized. The Gumbel method is much used for the prevention of natural catastrophes and environmental statistics and its relevance is due to its impact, frequency and predictability prognostic.

The distribution of Gumbel's extreme values is represented by the following equation:

$$f(x) = \left[\frac{1}{\beta} \right] \times \exp \left[- \left(\frac{x-\alpha}{\beta} \right) - \exp - \left(\frac{x-\alpha}{\beta} \right) \right] \quad (1)$$

where α and β correspond to the distribution parameters (Thom, 1966).

To calculate the minimum probability of an x temperature, it is given by:

$$P(T \leq x) = \frac{1 \int_{-\beta}^x \exp \left[- \frac{x-\alpha}{\beta} - \exp - \left(\frac{x-\alpha}{\beta} \right) \right]}{\beta} dy \quad (2)$$

when one reduces the derivative of Eq. (2) we obtain:

$$P(T \leq x) = \exp \left[- \exp - \left(- \frac{x-\alpha}{\beta} \right) \right] \quad (3)$$

Although the Gumbel distribution use is not unanimous among researchers, the conclusions from the works of Camargo *et al.* (1993) and Astolpho *et al.* (2005) are highlighted. As the authors evaluated Gumbel's model for monthly and annual minimum temperatures, they obtained satisfactory results between the estimated and observed frequencies. Melo-abreu *et al.* (2016) also cite Gumbel's extreme values distribution to calculate frost probability. Wrege *et al.* (2018) also use Gumbel Distribution as a frost prediction model in Brazilian territory, obtaining satisfactory results.

Thus, the probability of temperatures equal or smaller than the limit for damage in each crop culture, was calculated using both databases shown. Besides this, the results were crossed with the geo-referenced data of farmers with insurance policies that cover frost sinister

Table 1 - Minimum temperature measured in shelter to cause culture damage.

Minimum temperature estimated in meteorological shelter		
4 °C (+) Sensitive more resistant	2 °C sensitive intermediary	0 °C (-) Sensitive Less resistant
Banana, Potato, Beans, Greenery, Papaya and Tomato	Coffee, Soy beans, Sugar cane, Mango and Wheat	Orange, Apple and Pear

Source: Adapted from INPE, 2019.

aiming at verifying if there is coherence in the insurance contracting. These last data were available by a covenant with the Supply, Livestock and Agricultural Ministry - MAPA (2017).

3. Results and Discussion

The majority of rural insurance via PSR in Brazil are for soybean, corn 2nd harvest, grape, wheat, cultures that are considered medium sensitive to frost. It is also observed that, except for beans, the policies which were activated due to frost sinister are of these types of crops, according to Table 2. The temperature threshold for damages to these cultures is 2 °C (INPE, 2019).

As shown in the data, in 2016, only in the cultures of Coffee, Sugar Cane, Barley, Wheat, Grape and Corn 2nd harvest, known as little harvest corn, frost was activated. This last concentrates the majority of activations and also shows a greater activation percentage. In 2017, the activations were in similar cultures. In relation to 2016, there were no activations for sorghum and sugarcane, and there was only a single activation for forest. Now, the activation numbers were very distinct. Wheat begins to concentrate the greatest number of activations and, in percentage terms, barley stands out with an activation of 11,69% of the frost insurance. Despite not having activation data for 2018, it is possible to verify that the greater number of activations in the previous years does not show an increase in the demand for insurance in the following year. Since,

in cultures with greater activations, as elevated activations, such as wheat, corn 2nd harvest, barley and grape, had a reduction in the contracting in some of the years analyzed.

A large part of the cultures do not have activated insurance in any of the years analyzed, for example the summer cultures of soybean and corn 1st harvest. To understand if there are relevant frost risks for these farmers who do not activate the event, the probabilities of temperatures below 2 °C were calculated. In Fig. 1, the probability of temperatures below or equal to 2 °C are shown, using the Xavier *et al.* (2013) and Sheffield *et al.* (2006) databases, considering Gumel distribution.

In general, Sheffield *et al.* (2006) data are more optimistic regarding the extreme minimum temperatures probabilities. The main distinctions in the probabilities of temperatures below 2 °C are in the south coast of Brazil, where the Sheffield *et al.* (2006) data showed substantially smaller probabilities. There still is the south region of Minas Gerais State and also the south of Mato Grosso do Sul State, where the database provided by Xavier *et al.* (2013) shows a larger area with a probability above 50% of temperatures below 2 °C. The presented distinctions can be due to the information sources used by the authors, besides the period of time analyzed by Sheffield *et al.* (2006) being longer. However, according to what is shown in Fig. 2, the database has ample convergence with a great part of the analyzed pixels with differences close to 0.

Table 2 - Insurance that had coverage against frost per year, activation and culture.

Culture	Policies in 2016			Policies in 2017			Policies in 2018*
	Insured non activated	Insured activated	Activation percentage	Insured non activated	Insured activated	Activation percentage	Insured
Cotton	10	-	-	10	-	-	6
Rice	429	-	-	479	-	-	291
Oat	5	-	-	-	-	-	-
Potato	13	-	-	33	-	-	17
Coffee	717	14	1.92%	778	2	0.26%	769
Sugar Cane	679	7	1.02%	765	-	-	489
Barley	203	3	1.46%	136	18	11.69%	51
Beans	140	6	4.11%	151	7	4.43%	243
Forest	49	-	-	45	1	2.17%	42
Corn 1 st harvest	1.589	-	-	1.017	-	-	879
Corn 2 nd harvest	7.991	1211	13.16%	7.413	54	0.72%	11.482
Soybean	20.926	-	-	18.762	-	-	17.543
Sorghum	135	2	1.46%	37	-	-	7
Tomato	74	2	2.63%	64	1	1.54%	102
Wheat	6.076	147	2.36%	3.121	280	8.23%	3.948
Grape	1.111	129	10.40%	1.219	50	3.94%	1.095
Total	40.147	1521	3.65%	34.030	413	1.20%	36.955

*Until the moment of this research there was no data about the insurance activation in 2018.

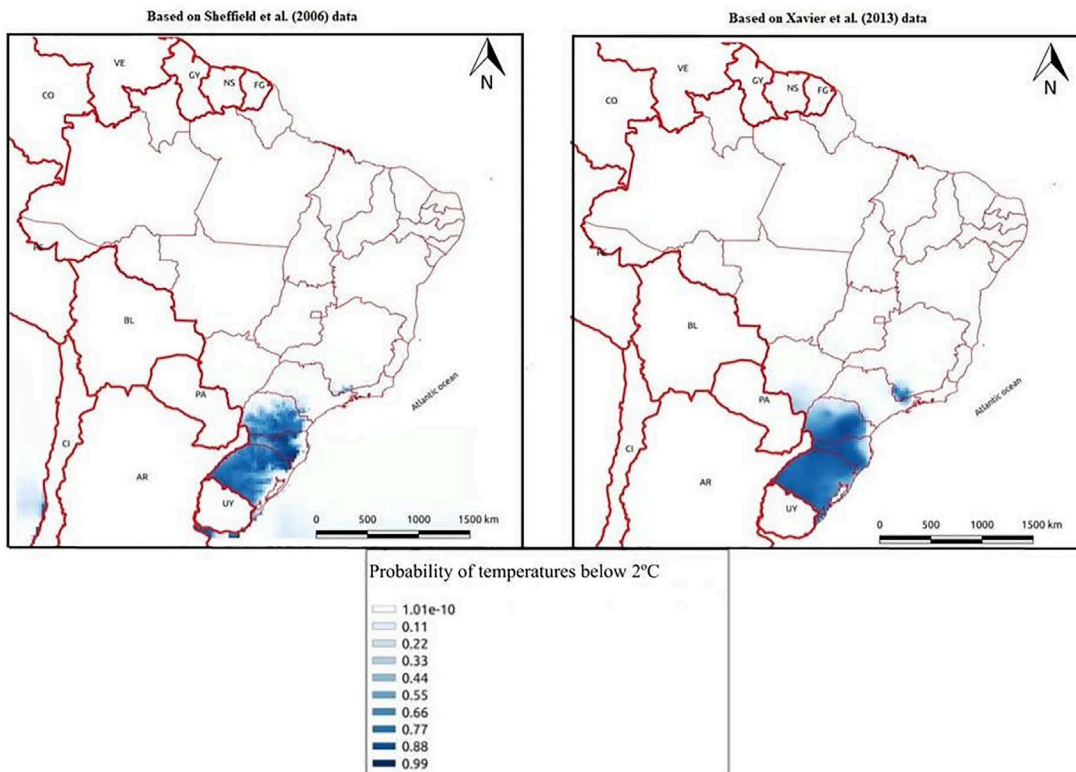


Figure 1 - Probability of temperatures below or equal to 2 °C according Xavier et al. (2013) and Sheffield et al. (2006) databases.

As can be seen in the Fig. 1, positive values indicate that the model based on Xavier et al. (2013) showed a greater probability of temperatures below probability 2 °C. The risk of minimum temperatures damaging to the medium sensitive cultivars are centered in the south of the country in specific parts of São Paulo, Mato Grosso do Sul and Minas Gerais States, confirming the study made by Aguiar and Mendonça (2004) and Wrege et al. (2018). However, the agricultural insurances, subsidized by PSR,

that cover frost risk, in 2016 and 2017 are spread throughout all Brazilian regions, as shown in Fig. 3.

As can be verified, many farmers provide themselves with policies that cover an event where the probability of it occurring is smaller than $1 \times 10^{-10}\%$, and also in many areas, temperatures below 2 °C have never occurred in the database history. And in 2017 and 2018 there was an expansion of insurance against frost in areas where there were very little probabilities of the phenomenon happening. This distortion is due to the fact that many policies cover multiple risks, the so-called “multirisk” (MAPA, 2017). Thus, this shows that the frost risks, additionally covered, are so rare that the inclusion of the sinister is irrelevant in the increase of the farmer's safety.

On Table 3, the risks of temperatures below 2 °C percentiles per farmer that contracted insurance that cover the frost extreme event, are shown.

According to Table 2 in 2016, 10% of the farmers that contracted insurance that covers frost, did not effectively have the risk of such an event to occur, and more than half of the farmers, even considering the maximum risks of both databases, had less than 40% chance of damaging temperatures occurring. In 2017, there is an improvement in this scenario; however, even so, more than half of the farmers had less than 50% probability of being exposed to temperatures below 2 degrees centigrade. Yet, 2018 data represent a substantial increase in

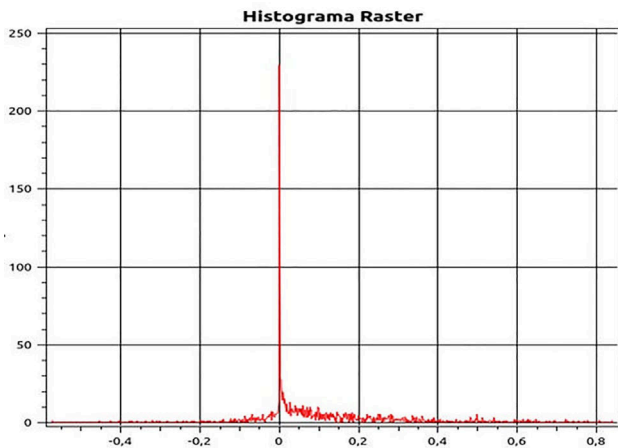


Figure 2 - Histogram of the differences between the results based on Xavier et al. (2013) and Sheffield et al. (2006).

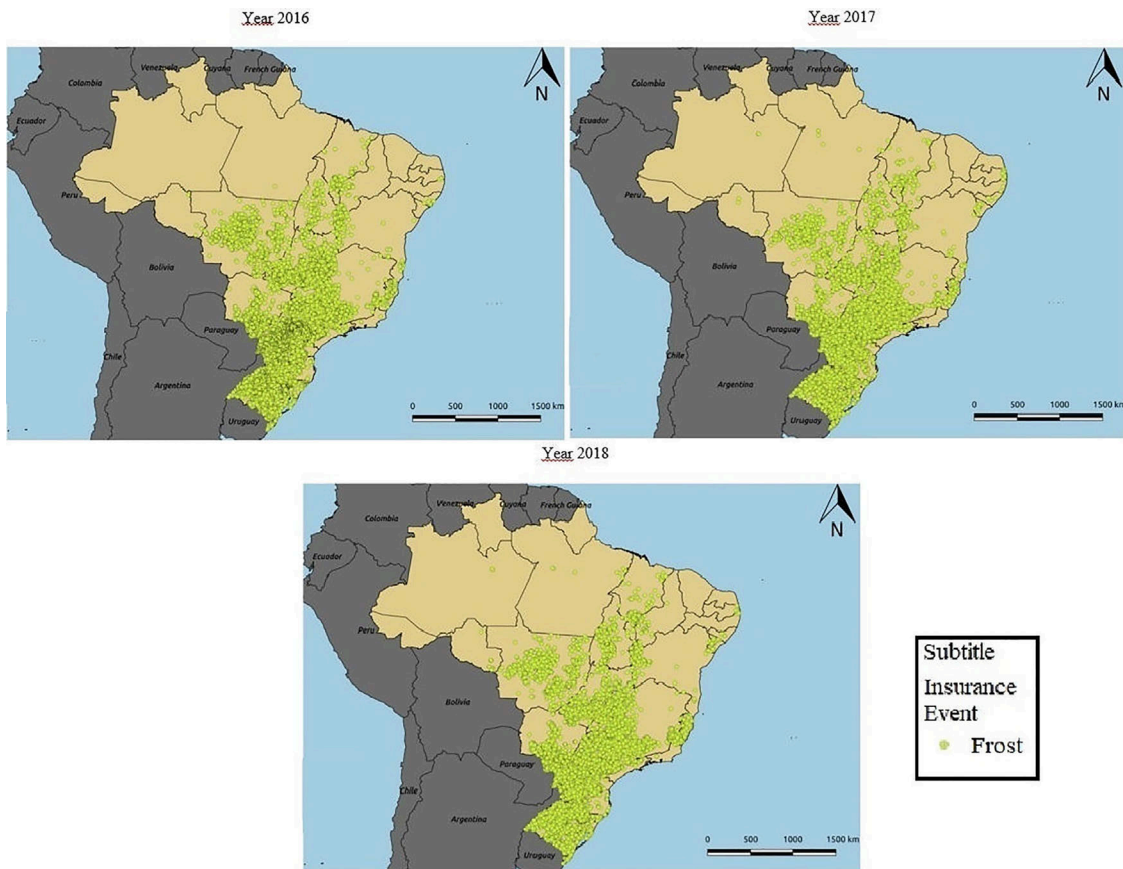


Figure 3 - Properties that have policies that covered frost sinister. Source: MAPA (2018).

Table 3 - Probability of temperatures below 2 °C per farmer that contracted insurance that covers the frost in 2016.

		Percentiles Year 2016						
		5	10	25	50	75	90	95
Weighted Average	Xavier	>0.0000	>0.0000	0.1218	0.3622	0.7466	0.8644	0.8811
	Sheffield	>0.0000	>0.0000	0.0249	0.2098	0.6604	0.8193	0.8566
	Maximum	>0.0000	>0.0000	0.1267	0.3907	0.7677	0.8674	0.8863
Tukey Test	Xavier			0.1218	0.3622	0.7466		
	Sheffield			0.025	0.2098	0.6604		
	Maximum			0.1267	0.3907	0.767		
		Year 2017						
Weighted Average	Xavier	0.0296	0.0892	0.1852	0.5056	0.8193	0.8650	0.8785
	Sheffield	0.0002	0.0109	0.0742	0.2595	0.6962	0.8271	0.8596
	Maximum	0.0380	0.1057	0.1978	0.5187	0.8211	0.8681	0.8864
Tukey Test	Xavier			0.1852	0.5056	0.8193		
	Sheffield			0.0742	0.2595	0.6962		
	Maximum			0.1978	0.5187	0.8211		
		Year 2018						
Weighted Average	Xavier	>0.0000	>0.0000	0.1218	0.2687	0.6279	0.8523	0.8679
	Sheffield	>0.0000	>0.0000	0.0299	0.1506	0.5211	0.8016	0.8463

(continued)

Table 3 - continued

		Percentiles Year 2016						
		5	10	25	50	75	90	95
Tukey Test	Maximum	>0,0000	>0.0000	0.1277	0.2867	0.6326	0.8593	0.8730
	Xavier			0.1218	0.2687	0.6279		
	Sheffield			0.0299	0.1506	0.5211		
	Maximum			0.1277	0.2867	0.6326		

insurance in areas where the risk of frost is smaller. In fact, more than 50 percent of the farmers who were covered against frost had less than 30% chances of being exposed to temperatures that, potentially, could generate damage to production.

To verify the model effectiveness, the average for risks per culture was calculated comparing groups that activated or that were not affected by the frost sinister. To avoid these biases due to low data volume, only the cul-

tures with more than 30 activations in the analyzed year were considered. In this analysis 2018 was not included because of the lack of data about activation up to the time of this research. Therefore, the calculations consider wheat, corn 2nd harvest and grape; the results are shown in [Table 4](#).

According to the data shown in [Table 4](#), the models point out higher probabilities of temperatures below 2 °C for the policies which were activated. The only exception

Table 4 - Probability of temperatures below 2 degrees Celsius and insurance activation.

		Year 2016			
There was insurance activation	Model	Culture	N	Average	Standard Deviation
No	Maximum risk	Corn 2 nd harvest	7991	0.2013	0.2227
		Wheat	6076	0.6181	0.2515
		Grape	1111	0.8492	0.0299
	Xavier	Corn 2 nd harvest	7991	0.1951	0.2207
		Wheat	6076	0.5981	0.2637
		Grape	1111	0.8361	0.0237
	Sheffield	Corn 2 nd harvest	7991	0.1193	0.1731
		Wheat	6076	0.5379	0.2606
		Grape	1111	0.7973	0.0945
Yes	Maximum risk	Corn 2 nd harvest	1211	0.3175	0.1676
		Wheat	147	0.6642	0.1890
		Grape	129	0.8719	0.0358
	Xavier	Corn 2 nd harvest	1211	0.3037	0.1702
		Wheat	147	0.6460	0.2042
		Grape	129	0.8547	0.0383
	Sheffield	Corn 2 nd harvest	1211	0.2082	0.1571
		Wheat	147	0.5975	0.2063
		Grape	129	0.7891	0.0939
		Year 2017			
No	Maximum risk	Corn 2 nd harvest	7137	0.3140	0.2062
		Wheat	3121	0.6048	0.2722
		Grape	1219	0.8487	0.0297
	Xavier	Corn 2 nd harvest	7122	0.3059	0.2069
		Wheat	3113	0.5802	0.2891

(continued)

Table 4 - continued

		Year 2016				
There was insurance activation	Model	Culture	N	Average	Standard Deviation	
Yes	Sheffield	Grape	1219	0.8352	0.0231	
		Corn 2 nd harvest	6810	0.1950	0.1791	
		Wheat	3119	0.5333	0.2687	
	Maximum risk	Grape	1219	0.8018	0.0929	
		Corn 2 nd harvest	54	0.5898	0.1741	
		Wheat	280	0.6422	0.17445	
	Xavier	Grape	50	0.8678	0.0331	
		Corn 2 nd harvest	54	0.5711	0.1728	
		Wheat	280	0.6291	0.1744	
	Sheffield	Grape	50	0.8485	0.0230	
		Corn 2 nd harvest	54	0.5026	0.2394	
		Wheat	280	0.5761	0.1956	
			Grape	50	0.8581	0.0483

was in the Grape culture for the risks calculated with the Sheffield data for 2016. However, carrying out the t test for independent samples, all the culture crossings, database and year showed a significant 1%, excepting this case that showed a p-value of 0.11. Thus, the results support the strength of the frost risk prediction model using Gumbel distribution of the extreme minimum temperatures, as already observed by Camargo *et al.* (1993), Astolpho *et al.* (2005), Melo-abreu *et al.* (2016) and Wrege *et al.* (2018).

4. Conclusions

Frost is a phenomenon that brings economical losses in agricultural production. In Brazil, in a great part of its territory, the probabilities of this phenomenon occurring are extremely small. The results show that in the states of Rio Grande do Sul, Santa Catarina, Paraná and parts of São Paulo, Minas Gerais and Mato Grosso do Sul there are relevant probabilities of frost.

In the database used to verify the probability of temperatures below 2 °C, a critical temperature critical that could cause damages in great part of the cultures cultivated in the country, the data proposed by Sheffield *et al.* (2006) showed, in part of the Brazilian territory, fewer probabilities than the data elaborated by Xavier (2013). Nevertheless, there is a great convergence in the results of both works. The use of these data and the Gumbel distribution show satisfactory results to preview frosts. In the analyzed cultures, in 2016 and 2017, it was observed that the average of probabilities for temperatures below two degrees centigrade, in those properties that did not activate insurance against frost, was significantly smaller.

Still concerning rural insurances, the contracting of insurances that cover this sinister are all over the country, including areas where the risk is near zero. The multirisk

insurance modality ends up ensuring properties with practically no risk against frost. In general, few cultures have activated the insurance in the studied years, standing out corn 2nd harvest, wheat and grape, in 2016 and, barley, wheat and grape in 2017. Comparing the data of 2016 and 2017, a slight evolution is observed, with contracts with risks a little higher. However, there was a decrease in the activation percentage in this biennial; in this same period, there is a reduction of the contracts that have coverage against frost.

Future studies should analyze if in other climatological risks the probability of occurring a sinister risk for insured ones is low, and if this occurs in multi-risks insurance. Furthermore, other models of frost probability detection can be used, aiming at improving, and potentially, subsidizing the information of the one contracting the rural insurance.

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