

Predictive Modeling of COVID-19 Confirmed Cases Using Regressive Objective Regression Methodology

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ABSTRACT

The use of predictive models for the evolution of the pandemic is of great help in decision-making by the authorities. The fundamental objective of this work was to obtain through the Regressive Objective Regression, predictions of confirmed cases of COVID-19 in the Marta Abreu Teaching Polyclinic of the city of Santa Clara. In short-term modeling the model was significant at 19.7% with an error of 0.12. Variables dichotomies, saw tooth and saw tooth inverted and risk returned in 1.3, and 12 cases the trend is negative and not significant. We can conclude that a perfect result was obtained in the long term with the ROR methodology. The short-term ROR model depends on the cases of COVID-19 in the previous case, 3 cases back and 12 cases back without significant trend. The long-term model is perfect and depends on the cases of COVID-19 in 12 cases ago, with a negative trend.

KEY WORDS: CORONAVIRUS; COVID-19; MATHEMATICAL MODELING; ROR.

INTRODUCTION

The world has been involved in an epidemiological crisis caused by the new SARS-CoV-2 coronavirus that gave rise to the contagious and deadly disease COVID-19 (Cortellis, 2020; WHO, 2020). Since the first cases were diagnosed in the city of Wuhan, capital of Hubei province, China, the number of infected and dead people has been increasing, which led the World Health Organization (WHO) to declare a pandemic state for COVID-19 on March 11, 2020 (Sun et al., 2020; Wang et al., 2020; WHO, 2020).

According to the Research Group of Mathematical Models in Science and Technology: Development, Analysis, Numerical Simulation and Control (MOMAT) of the Institute of Interdisciplinary Mathematics of the Complutense University of Madrid, Spain, the application of the Be-

CoDiS (Between-Countries Disease Spread) model in the analysis of the COVID-19 pandemic numerically projects that this viral phenomenon will be present for a prolonged period of time in the world (Ivorra & Ramos, 2020).

Several models and methodologies have been applied in the study, analysis and modeling of COVID-19 in the world, where they stand out: Ordinary Differential Equation of First Order (EDOPO), linear type; Simple linear Regression model; Generalized Logistic Growth Model (GLM); Structured Susceptible-Exposed-Infected-Removed (SEIR)/SEIR model; the Bayesian Probability Mathematical Model; SIRD model (also employed in Cuba); Conceptual Model and the Simulation Model, among many others (Rue et al., 2017; Simpson et al., 2017; Osés et al., 2021a,b).

The main objective of the present research was to obtain, by means of the Objective Regressive Regression (ORR) methodology, predictions of confirmed cases of COVID-19

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in the "Marta Abreu" Teaching Polyclinic in the city of Santa Clara, Villa Clara province, Cuba.

MATERIAL AND METHODS

In the research, the daily data from January to March corresponding to the year 2021 of the number of positive cases to COVID-19 in the Teaching Polyclinic "Marta Abreu" of Villa Clara Cuba were used, from a total of 3 294 cases evaluated in consultation, 58 were positive.

The prognosis was carried out with the use of the methodology of Regressive Objective Regression (ROR) which has been implemented in different variables such as viruses and bacteria circulating in Villa Clara province. Objective Regressive Regression (ORR) modeling is based on a combination of Dummy variables with modeling (ARIMA), where two Dummy variables are created and the trend of the series is obtained; it requires few cases to be used and also allows the use of exogenous variables that make it possible to model and forecast in the long term, depending on the exogenous variable (Osés et al., 2020).

In the ROR methodology, in a first step, dichotomous variables DS, DI and NoC are created, where: NoC: Number of cases of the base, DS = 1, if NoC is odd; DI = 0, if NoC is even, when DI=1, DS=0 and vice versa. Subsequently, the module corresponding to the Regression analysis of the statistical package SPSS version 19.0 (IBM Company) is executed, specifically the ENTER method where the

predicted variable and the ERROR are obtained. Then the autocorrelograms of the ERROR variable will be obtained, paying attention to the maximums of the significant partial autocorrelations PACF. The new variables are then calculated according to the significant Lag of the PACF. Finally, these regressed variables are included in the new regression in a process of successive approximations until a white noise in the regression errors is obtained.

Ethical aspects: The research was subject to ethical standards, where all the information collected and provided was used only for the stated purpose. It did not involve physical or psychological affectations, in order to be able to generate new knowledge without violating the ethical principles established for these cases. On the other hand, all authors involved in the research, publication and dissemination of the results are responsible for the reliability and accuracy of the results shown (DHAMM, 2013).

RESULTS AND DISCUSSION

The great development acquired by different sciences, such as epidemiology, mathematics, statistics and computer science, has led to the generation of new techniques in emerging and recurrent procedures in the field of biostatistics and bioinformatics (spatial statistics, neural networks and functional data analysis, among others) to describe the importance of mathematical models in infectious diseases (Martí & Caylà, 2009).

Table 1. Descriptive statistics of confirmed patients at the "Marta Abreu" Polyclinic. Year 2021

	Descriptive statistic				
	N	Minimum	Maximum	Half	Typ. desv.
Risk COVID-19	3294	.00	1.00	.0176	.13154
N valid (according to list)	3294				
Positives MA	3	7	31	19.33	12.014
N valid (by list)	3				

Figure 1: Distribution of patients according to age. January-March 2021

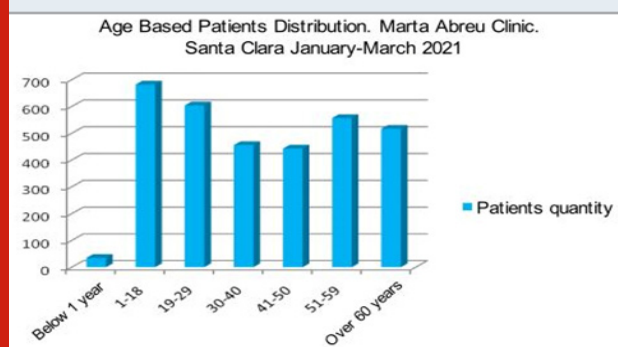


Table 1 calculated the descriptive statistics of the risk of contracting COVID-19, the value of zero was assigned if the PCR was negative, and if the PCR was positive, the value

of Risk 1; the mean value of this variable corresponds to 19.33 cases with a standard deviation of 12.01 cases.

The distribution according to age was irregular, with the highest value corresponding to patients aged 1 to 18 years, followed by those aged 19 to 29 years; children under 1 year of age were also present in the study (Figure 1).

COVID-19 cases were modeled in the short term using the ROR methodology. The model was significant at 19.7% with an error of 0.12 (Table 2). As can be seen in the table the Durbin-Watson statistic is close to 2, so we are in the presence of an adequate explanation of the variance using this model.

1. Predictor variables: Lag12Risk, Lag3Risk, Lag1Risk, DI, SD, NoC.
2. For regression through the origin (the model with no

intersection term), R-squared measures the proportion of the variability of the dependent variable explained by regression through the origin. The above CANNOT be compared with R-squared for models that include an intersection.

3. Dependent variable: RiskCOVID19
4. Linear regression through the origin

The ROR modeling of predictions obtained yielded very significant results for the study of the COVID-19 pandemic in the "Marta Abreu" Teaching Polyclinic, with a Fisher's

F of 22 significant at 100% (Table 3), thus proving that the sample variances are not equal.

Table 3. Analysis of variance of the model for COVID-19

1. Predictor variables: Lag12Risk, Lag3Risk, Lag1Risk, DI, SD, NoC.
2. This total sum of squares has not been corrected for the constant because the constant is zero for regression through the origin.
3. Dependent variable: COVID-19 risk.
4. Linear regression through the origin

Table 2. Summary of the model using Objective Regressive Regression

Model	Summary of model ^{c,d}				
	R	R squared ^b	R-squared corrected	Standard error of estimation	Durbin-Watson
1	.197a	.039	.037	.12352	2.009

Table 3. Analysis of variance of the model for COVID-19

Model	ANOVA ^{c,d}				
	Sum of squares	gl	Quadratic mean	F	Sig.
Regression	2.019	6	.336	22.052	.000a
Residual	49.981	3276	.015		
Total	52.000b	3282			

1. Dependent variable: COVID-19 risk.
2. Linear regression through the origin

Next, the model was run only with Lag12 Risk in order to have a long-term valuation by entering the Step POSITIVE variable in the model, obtaining a model that explains 100% of the variance of the model (Table 5).

1. Predictor variables: Step2133, Step1656, Step1655, Step1652, Step1644, Step1336, Step75, Step74, Step14, Step POSITIVE, DS, DI, Lag12Risk, NoC.
2. For regression through the origin (the model with no intersection term), R-squared measures the proportion of the variability of the dependent variable explained by regression through the origin. The above CANNOT be compared to R-squared for models that include an intersection.

The ROR model in question is made up of the following variables, DI and DS which are dichotomous variables, saw tooth DS and inverted saw tooth DI and of the regressed risk in 1,3 and 12 cases (Lag1 Risk; Lag3 Risk and Lag12 Risk). The trend is negative and not significant (Table 4).

Table 4. Results of the application of the ROR model plus trend

Model	Coeficientes ^{a,b}					
	Unstandardized coefficients	Typified coefficients				Sig.
	B	Error tip.	Beta	t		
	DS	.016	.005	.091	3.316	.001
	DI	.016	.005	.091	3.315	.001
	Tendency	-2.591E-6	.000	-.039	-1.136	.256
	Lag1Risk	.116	.017	.116	6.719	.000
	Lag3Risk	.057	.017	.057	3.326	.001
	Lag12Risk	.065	.016	.069	3.988	.000

1. Dependent variable: COVID-19 risk.
2. Linear regression through the origin

we are dealing with a perfect model, i.e., the result of the variables is equal.

Table 6 shows the analysis of variances using Fisher's test (F). In the results, Fisher's F can't be seen, which infers that

1. Predictor variables: Step2133, Step1656, Step1655, Step1652, Step1644, Step1336, Step75, Step74,

- Step14, Step POSITIVE, DS, DI, Lag12Risk, NoC.
- 2. This total sum of squares has not been corrected for the constant because the constant is zero for regression through the origin.
- 3. Dependent variable: COVID-19 risk.
- 4. Linear regression through the origin

Epidemic modeling is historical and has been refined with the advancement of science and technologies, demonstrating the essential role of mathematics in indicating where the disease may move and giving suggestions on how to decide (Guinovart, 2020). COVID-19 disease has been recognized as a global threat, in which predictive models for the epidemiological trend of its prevalence and incidence have

been being used worldwide (Osés et al., 2018; Prades, 2020; Osés et al., 2021c).

In the present research article, predictions were exposed for the cases confirmed to COVID-19 in the "Marta Abreu" Teaching Polyclinic. The increase in the number of children and adolescents infected by the new coronavirus in the mentioned health area showed that they are as susceptible to the disease as the rest of the population. Children and older adults should follow the same biosecurity measures as those prescribed by the Ministry of Public Health for the entire population. Coinciding with the daily reports of MINSAP, the highest number of cases was reported in females (MINSAP, 2021).

Table 5. Model run with Lag12 in the long term

Modelo	Summary of model ^{c,d}				
	R	R squared ^b	R-squared corrected	Standard error of estimation	Durbin-Watson
1	1.000 ^a	1.000	1.000	.0000	1.696

Table 6. Analysis of Variance of the model for COVID-19

Model	ANOVA ^{c,d}				
	Sum of squares	gl	Quadratic mean	F	Sig.
Regression	52.000	14	3.714	.	. ^a
Residual	.000	3268	.000		
Total	52.000 ^b	3282			

The results of the present investigation coincide with those obtained in a similar study conducted in the province of Cienfuegos by Medina (2020); where logistic and exponential models (specifically the Gompertz growth model) were used to obtain estimates. They state that the statistical prediction models obtained gave very significant results for the study of the COVID-19 pandemic in Cuba, which also agrees with the results obtained by other authors in this regard (Medina et al., 2020).

CONCLUSION

The application of ROR modeling provides Public Health authorities and decision makers with information on the short- and medium-term behavior of variables of great interest for understanding the spread of SARS-CoV2. With the use of the ROR methodology, it was possible to predict the future number of positive cases in the "Marta Abreu" health area, making this model a valuable practical tool for correct and timely decision making.

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