



# NEURAL NETWORK TECHNIQUES FOR NOWCASTING OF FOG AT GUARULHOS AIRPORT

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**LMA – Laboratório de Meteorologia Aplicada**



# Outlines

- **INTRODUCTION**
- **STUDY AREA**
- **DATA**
- **METHOD**
- **RESULTS**
- **FINAL COMMENTS**





## INTRODUCTION

- The takeoff and landing are the most dangerous phase of a flight;
- The weather condition is a critical factor for the aircraft controller takes any action;
- Statistically higher occurrence of the phenomenon to the restricted visibility is fog, over 90% (*Almeida, 2009*);
- Numerical weather prediction models can not be able to produce confident performance for nowcasting period.





# INTRODUCTION

➤ The present work mainly aims to train, test and validate *three different approaching* for fog nowcasting. This methods are as follows:

- Multiple Linear Regression (MLR);
- Probabilistic Neural Network (PNN);
- Generalized Regression Neural Networks (GRNN).





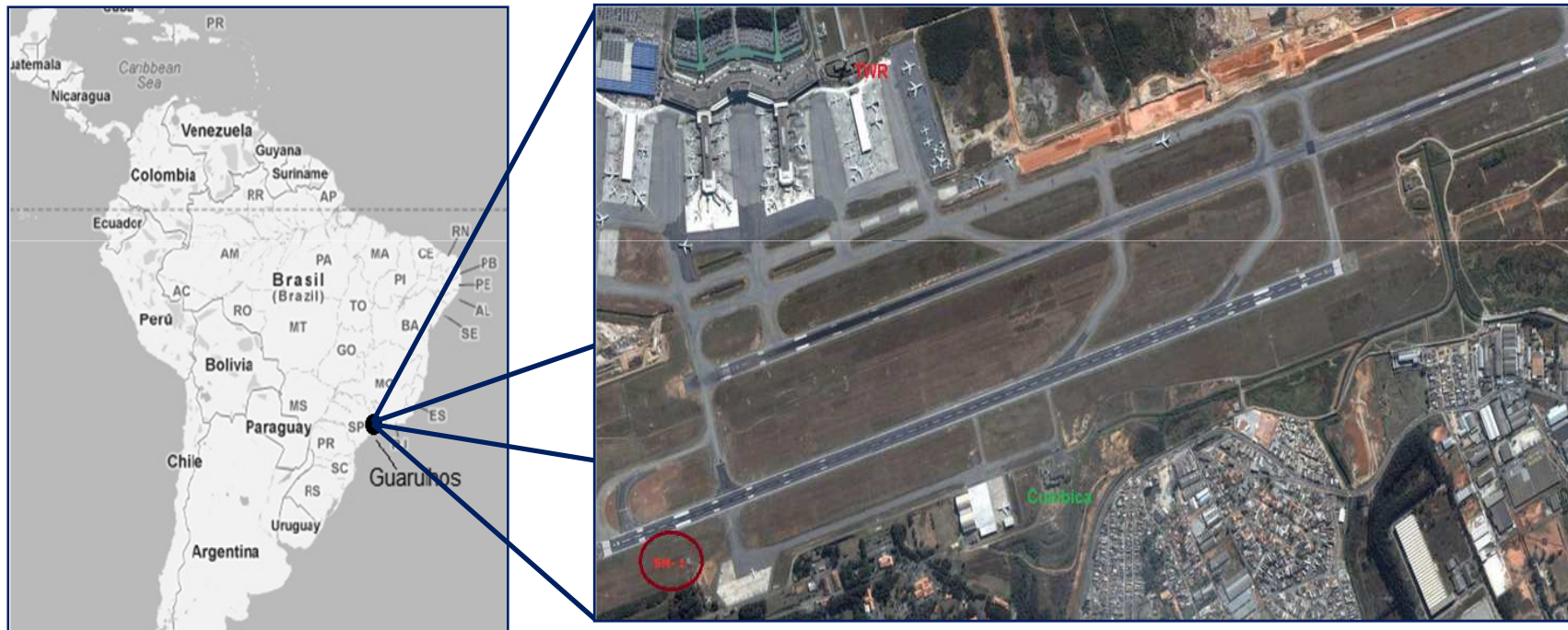
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# STUDY AREA

## Guarulhos International Airport






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## DATA

- ❑ Hourly meteorological observations from Meteorological Station of Guarulhos (SBGR); 
- ❑ Period: 1<sup>st</sup> of January, 1951 to 31<sup>st</sup> of March, 2007;
- ❑ Number of Observations: *450,243*.



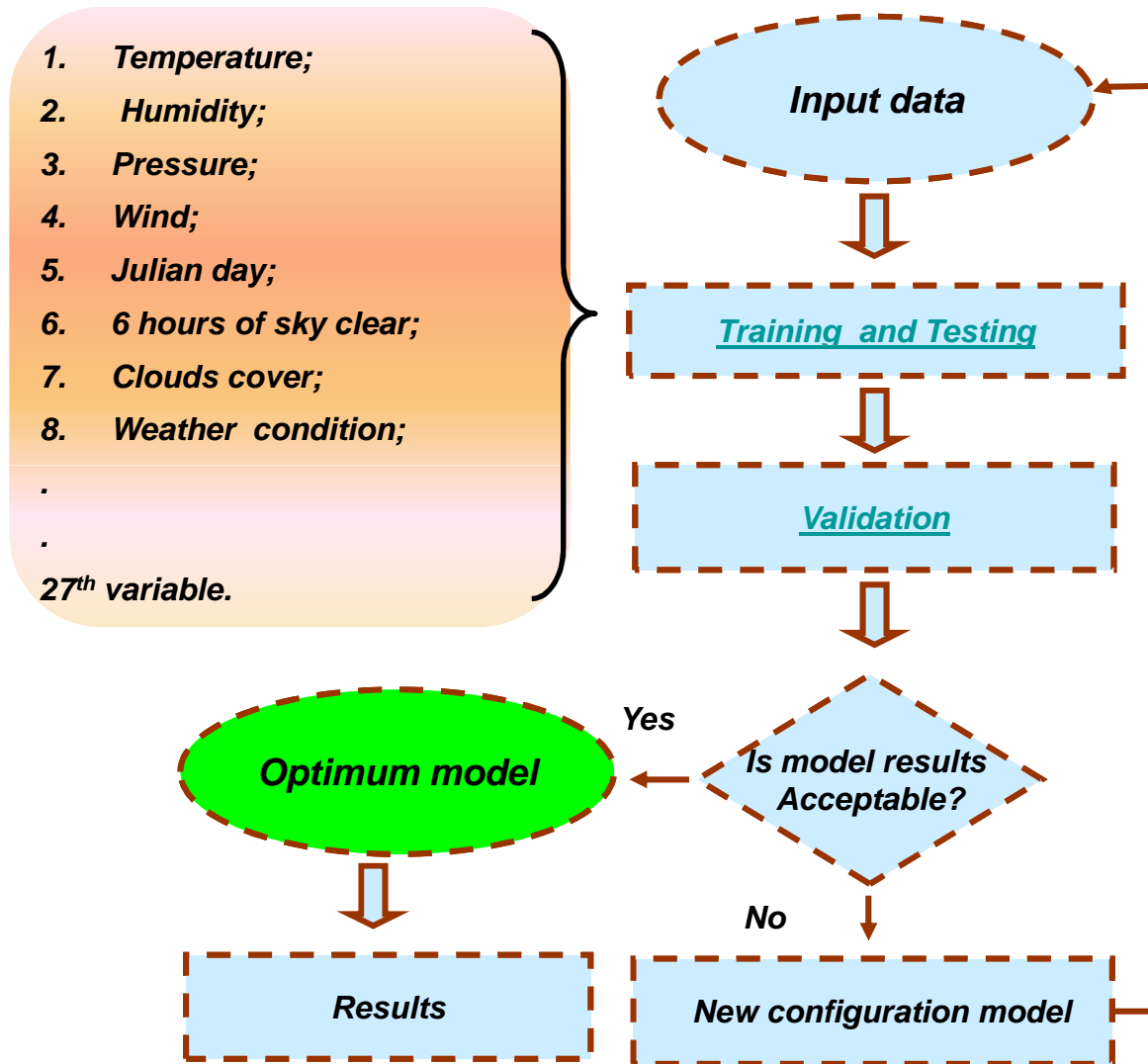


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# METHOD





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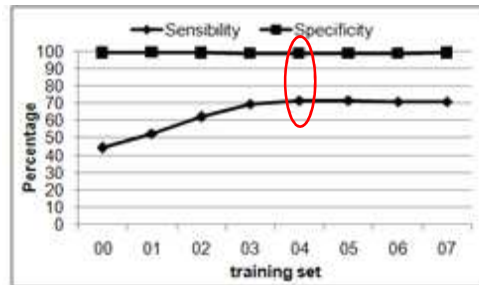
# RESULTS

Training sets  $\Rightarrow$  best results (for 1<sup>a</sup>, 2<sup>a</sup> and 3<sup>a</sup> hour):

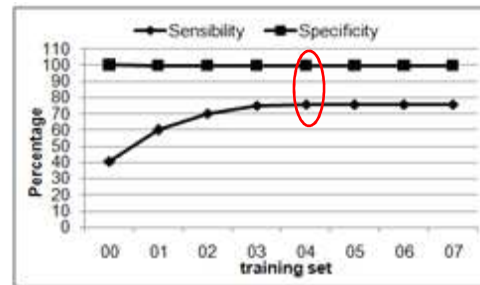
MLR - 04, 04, 06.

GRNN - 04, 05, 06.

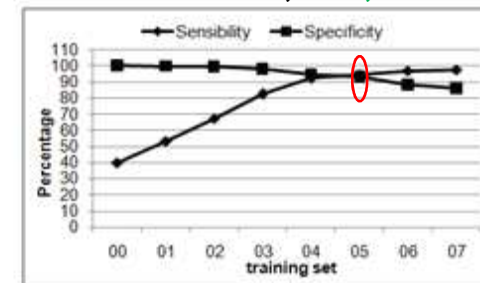
PNN - 05, 04, 04.



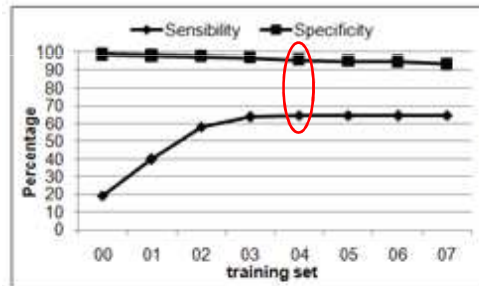
1st hour



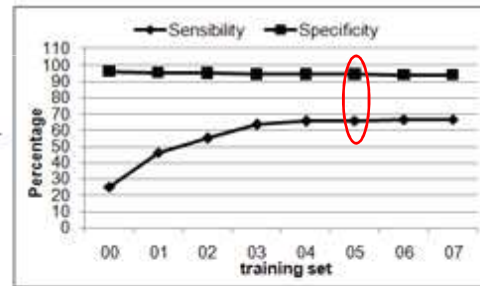
1st hour



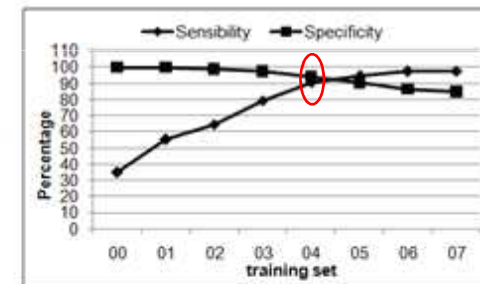
1st hour



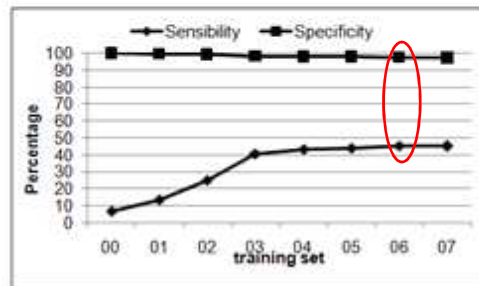
2nd hour



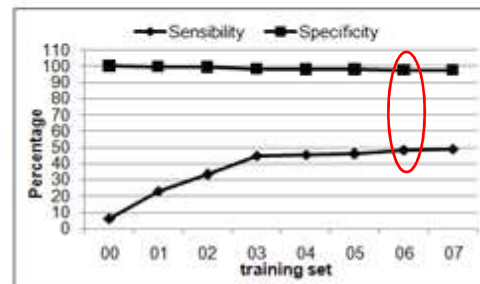
2nd hour



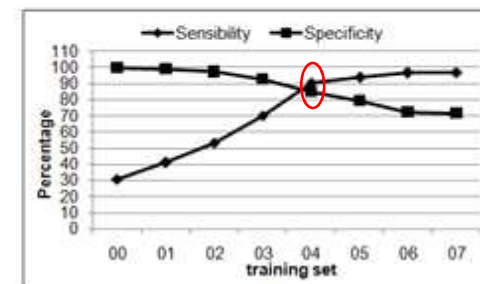
2nd hour



3rd hour



3rd hour



3rd hour

MLR

GRNN

PNN

# RESULTS

Hour	Approach	Dataset	Sensitivity(%)	Specificity (%)
1 <sup>st</sup>	MLR	04	70	99
	GRNN	04	75	97
	PNN	05	95	93
2 <sup>nd</sup>	MLR	04	64	95
	GRNN	05	69	95
	PNN	04	91	94
3 <sup>rd</sup>	MLR	06	46	96
	GRNN	06	49	97
	PNN	04	89	83



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## FINAL COMMENTS

Since 2009, the Probabilistic Neural Network (PNN) is presently using for fog nowcasting as part of a nowcasting system at Guarulhos International Airport.

Site - [http://www.redemet.aer.mil.br/rna\\_saida.php](http://www.redemet.aer.mil.br/rna_saida.php)



## FURTHER RESULTS

### Thunderstorms Nowcasting for Rio de Janeiro Region

Nowcasting	Sensitivity (%)	Specificity (%)
1 <sup>st</sup> hour	90	85
2 <sup>nd</sup> hour	88	86
3 <sup>rd</sup> hour	88	81



## FURTHER RESULTS

### Thunderstorms Nowcasting for Guarulhos region

	1 <sup>st</sup> hour	2 <sup>nd</sup> hour	3 <sup>rd</sup> hour
Sensitivity (%)	89	90	95
Specificity (%)	88	75	70



Questions?

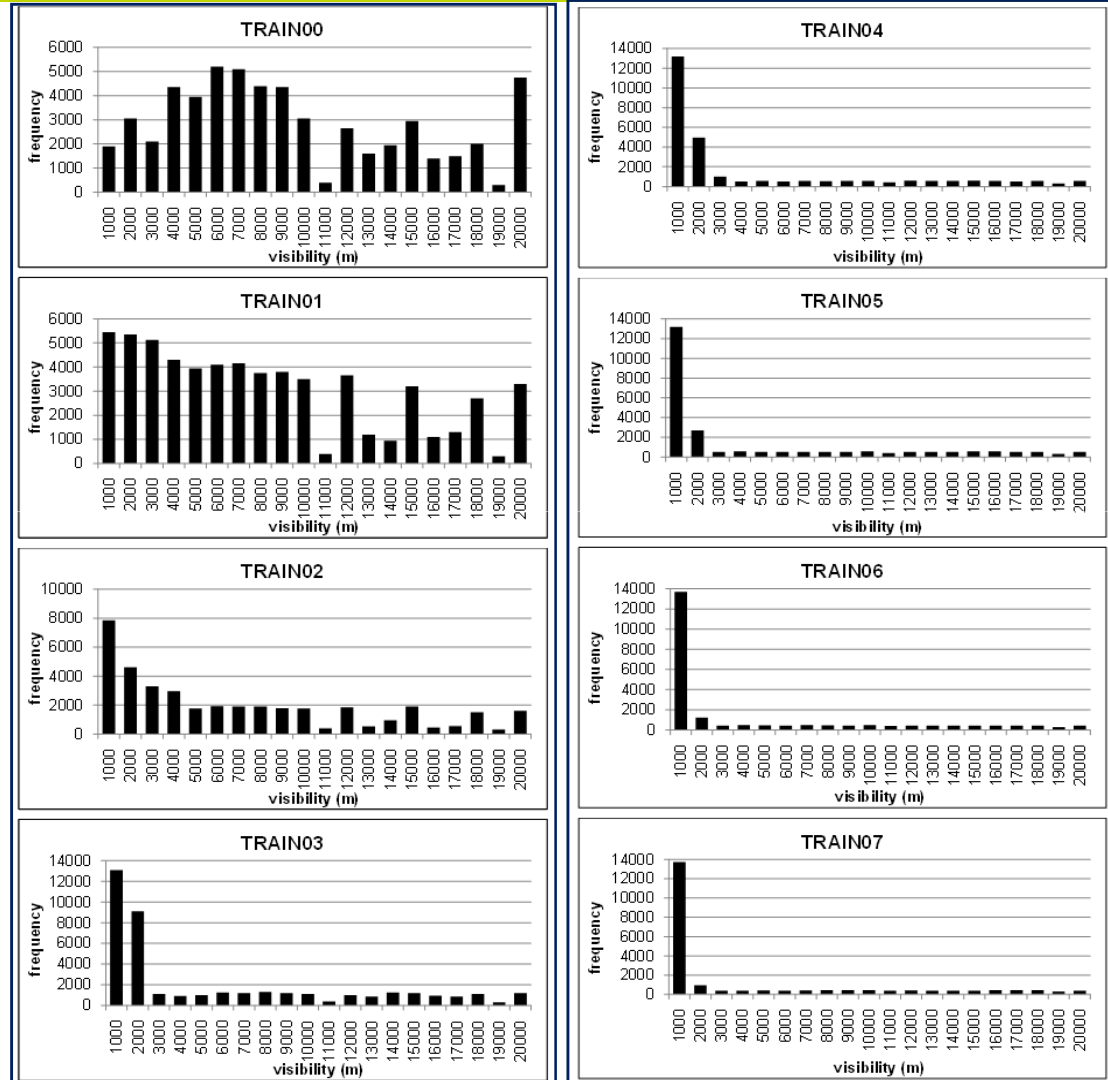


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# METHODS

In order to train the networks (PNN and GRNN), **eight training sets were created.**

These datasets were slightly modified by increasing proportionally the number of **FOG and low visibilities events**



## Validation Criterion

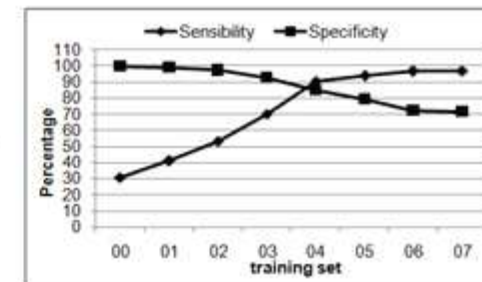
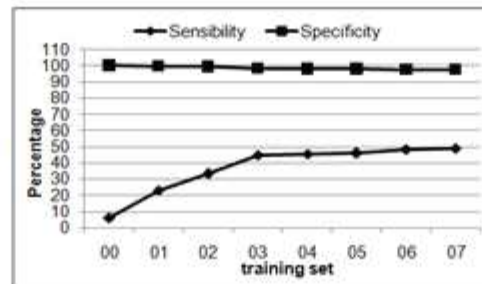
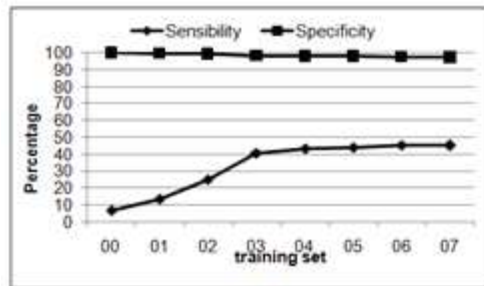
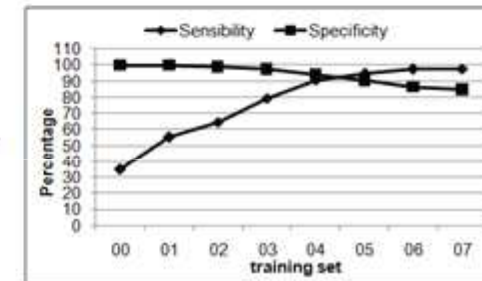
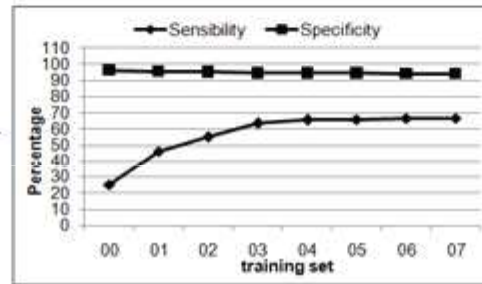
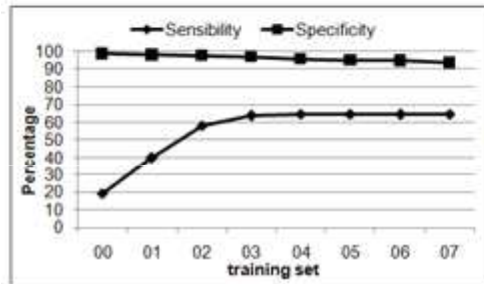
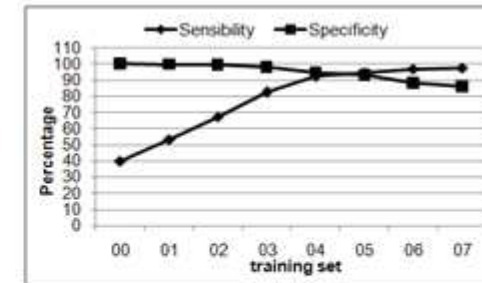
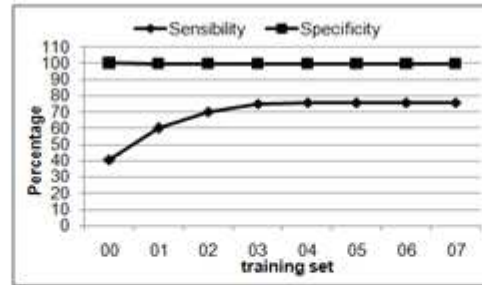
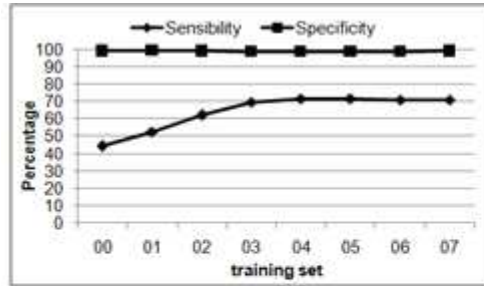
It is based on the sensitivity and specificity statistics.

*Sensitivity* is the ability of the model to correctly classify the desired event or *the percentage of true-positive*;

*Specificity* is the ability of the model to correctly classify the non-event or *the percentage of true-negative* (Wilks, 2006)

Sensitivity	Specificity	Performance
high	high	optimum
high	low	overestimated
low	high	underestimated
low	low	bad

# VALIDATION



MLR

GRNN

PNN





01 DEZ 2004 IEPV 105-78

**COMANDO DA AERONÁUTICA**  
DEPARTAMENTO DE CONTROLE DO ESPAÇO AÉREO  
DIVISÃO DE METEOROLOGIA AERONÁUTICA

**OBSERVAÇÃO METEOROLÓGICA À SUPERFÍCIE**

NÚMERO SINÓTICO \_\_\_\_\_ ESTACIÓN \_\_\_\_\_ CLASSE \_\_\_\_\_ LATITUDE \_\_\_\_\_ LONGITUDE \_\_\_\_\_ W  
HORA LOCAL CORRESPONDENTE AO MERIDIANO DE \_\_\_\_\_ W  
PARA CONVERTER PARA UTC, SOMAR SE \_\_\_\_\_ HORAS DECLINAÇÃO MAGNÉTICA \_\_\_\_\_ W FOLHA \_\_\_\_\_

DIA \_\_\_\_\_ MÊS \_\_\_\_\_ ANO \_\_\_\_\_ ALTITUDE DA ESTACIÓN \_\_\_\_\_ METROS (NÍVEL MÊDIO DO MAR)

TIPO	HORA LOCAL	VENTO				VISIBILIDADE			R V R			CONDIÇÕES										PRESSÃO			TEMPERATURA E UMIDADE RELATIVA		PRECIPITAÇÃO		OBSERVAÇÕES	INDICATIVO																																	
		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		PISTA		TIPO	DURAÇÃO																																				
		DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL	DIR	VEL			DIR			VEL																																
1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64

VERIFICADO POR \_\_\_\_\_ EM \_\_\_\_\_ / \_\_\_\_\_ / \_\_\_\_\_ CORRIGIDO POR \_\_\_\_\_ EM \_\_\_\_\_ / \_\_\_\_\_ / \_\_\_\_\_

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Microsoft Excel - SBGR\_FORM78

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	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
1	HORA	MINUTO	VISIBIL	CG	CG	QTONUVE	TIPONUVE	ALTYNUVE	DRONUVE	QTONUVE	TIPONUVE	ALTYNUVE	DRONUVE	QTONUVE	TIPONUVE
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