

The Impact of Future Urban Scenarios on a Severe Weather Case in the Metropolitan Area of São Paulo

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Abstract In this work, convective parameters are applied, based on numerical simulations made with BRAMS model, to a severe weather case occurred in the Metropolitan Area of São Paulo (MASP). Scenarios of future urban area growth and increase of building heights were made to evaluate changes in convective parameters, rainfall, and in severe weather occurrence probability for the study region. Using factorial planning and factor separation methods, we found that the urban area growth predicted for 2030 is capable of increasing the amount of precipitation, mainly due to the land use change from rural to urban. In the scenario of building heights increasing, it was found a tendency for rainfall suppress. The urban area for 2030 is the major factor contributing to increase atmospheric instability when compared to other experiments. Also, we observed an increase in wind shear and consequently, a higher potential for severe weather occurrence. Vertical urban growing also causes an increase in atmospheric instability, but a decrease in wind shear. The interaction between urban area and building height factors show an increase in the area with precipitation and severe weather probability, nevertheless, weaker and dislocated to south than could be in an urban soil with low buildings.

Keywords Convective Parameters • Severe weather • Urban heat island

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26 **1 Introduction**

27 The Metropolitan Area of São Paulo (MASP) is under risk of intense weather events
28 every rainy season, which has as consequences strong winds, heavy precipitation and
29 hail. These events are responsible for tree falls, damaging houses, storages and vehicles,
30 for flooding and landslides (the last related to high accumulated precipitation). Therefore,
31 these phenomena can cost several material losses and even human lives [*E D Freitas et*
32 *al.*, 2009a]. According to Haddad and Teixeira [2015], in 2008, 749 flood points were
33 identified in the city of São Paulo and the direct loss in a conservative scenario was
34 calculated to be around US 14.0 million dollars for the city. Due to the indirect effects
35 within the long chain of production and income, the loss reaches more than US 72 million
36 dollars to the Brazilian economy.

37 Following the definitions of Johns and Doswell [1992] and Moller [2001], severe weather
38 is any type of storm capable of generating at least one of these phenomena: tornado,
39 strong surface winds, reaching speeds faster than 94 km h^{-1} , or hail diameter larger than
40 1,9 cm. Mills and Conquhoun [1998], in a quite similar way, define severe weather as a
41 storm capable of generating at least one of these phenomena: tornado, strong surface
42 winds, reaching speeds higher than 90 km h^{-1} , hail diameter larger than 2 cm or high
43 precipitation rates, sufficient to cause floods. In the case of the Metropolitan area of São
44 Paulo, a vulnerable area, most of intense weather cases have consequences similar to
45 severe weather event, these are cases related to high amounts of precipitation and strong
46 winds, being tornado occurrence observed only in the neighborhood. Other intense-
47 weather characteristic at MASP is the occurrence of lightning, which can interrupt energy
48 distribution and have consequences in several sectors of society [*Morales et al.*, 2010].
49 Nascimento [2004] used atmospheric soundings and numerical model profiles to verify
50 some convective-parameter skills to indicate severe weather conducting conditions, called
51 proximity soundings [*Brooks et al.*, 1994]. His results suggest promising utility for
52 convective parameters in southern Brazil, although their thresholds were based on middle
53 latitudes systems.

54 According to theoretical models, different kind of storms (isolated or organized) can have
55 distinct vertical structure and internal dynamic [*Cotton and Anthes*, 1992]. Also, the
56 severe weather forecast is complex because of the different scales related, in time and

57 space. Some synoptic conditions show developments from the microscale to the
58 mesoscale. Cotton and Pielke [1995] verified that Urban Heat Island (UHI) effect is a
59 factor that contributes to storm initiation, which usually adds to the effects of storm
60 generator systems, causing to the storms a higher degree of severity.

61 Silva Dias et al. [2013] indicate that UHI can interact with sea breeze and mountain-
62 valley circulations that arrive at the MASP by its southeastern portion, being some of the
63 factors responsible for precipitation extremes in the region. Climatic features, indicated
64 by climatic indexes, and local sea surface temperature, which explain a smaller fraction
65 of these events during the rainy season in comparison with the dry season, are other
66 factors found by the authors. The authors also suggest that UHI increasing and the role of
67 air pollution need to be taken into account to explain the observed trends in the increase
68 of higher precipitation amounts over the last eight decades analyzed in their study. The
69 UHI creates a strong convergence zone in a large portion of the MASP, and then,
70 accelerates the breeze front propagation toward the city center [*E D Freitas et al.*, 2007].
71 In the work of Freitas et al. [2007], the interaction between sea breeze and UHI
72 circulation was reproduced using the mesoscale model BRAMS [*S R Freitas et al.*, 2005]
73 coupled with the Town Energy Budget scheme – TEB [*Masson*, 2000]. With a similar
74 approach, Souza et al. [2016] studied Manaus urban evolution and verify that the growth
75 of urban area has direct relationship with the rising of precipitation intensity and amount.
76 Freitas et al. [2009a] suggest that, besides sea breeze and UHI, other kind of local
77 circulation, such as those generated by topography, also can have contribution to the
78 storms initiation. Rojas et al. [2018] used the Advanced Regional Prediction System,
79 ARPS [*Xue et al.*, 2000], coupled with the Tropical Town Energy Budget scheme, tTEB
80 [*Karam et al.*, 2010], to simulate the interaction among sea breeze, mountain-valley and
81 UHI circulation over MASP. They found that topography channels and directs the surface
82 acceleration vectors towards the MASP, which can intensify surface winds and its
83 interactions with other mesoscale features, contributing for development of severe
84 weather.

85 Aerosol it is an important component of urban atmosphere due to the large emissions of
86 pollution in the cities, which can lead to an increase in cloud condensation nuclei, as
87 mentioned by Kusaka et al [2014], and then decrease the mean droplet radius, inhibiting

88 precipitation [Kaufmann *et al.*, 2007; Rosenfeld, 2000]. On the other hand, there is the
89 hypothesis of convective invigoration, van der Heever and Cotton [2007], using a three-
90 dimensional model with bulk microphysics, argument that urban aerosol can enhance
91 convective precipitation. Similar results were obtained by Han *et al.* [2012], which
92 showed that aerosol intensify deep convection but delays initiation of precipitation.
93 Although aerosol importance, our focus in this paper will really on soil use impact on
94 instability associated with UHI.

95 A future urban area for 2030, predicted by Young [2013], motivated the question about
96 storm severity increase in an even larger urban area. Besides the urban area growth,
97 which can be a factor for more severity in the storms in the region, as shown by Silva
98 Dias *et al.* [2013], other acceptable hypothesis for future urban modification is the
99 vertical rising of a preexistent urban area, i. e. the change from small houses to higher
100 residential buildings. The current land use master plan and zoning ordinances of São
101 Paulo city motivate this hypothesis. This master plan allows construction of high
102 buildings in areas currently occupied by houses in residential areas. Therefore, the goal of
103 this paper is to verify the impact of different future land use scenarios on severe weather
104 systems in the MAPS, which can be used to generate discussions about city growth.

105 Section 2 presents the experiments sets. Section 3 shows a storm case study and a control
106 experiment. Section 4 discusses sensitivity experiments with future scenarios of urban
107 growth and section 5 presents our conclusions.

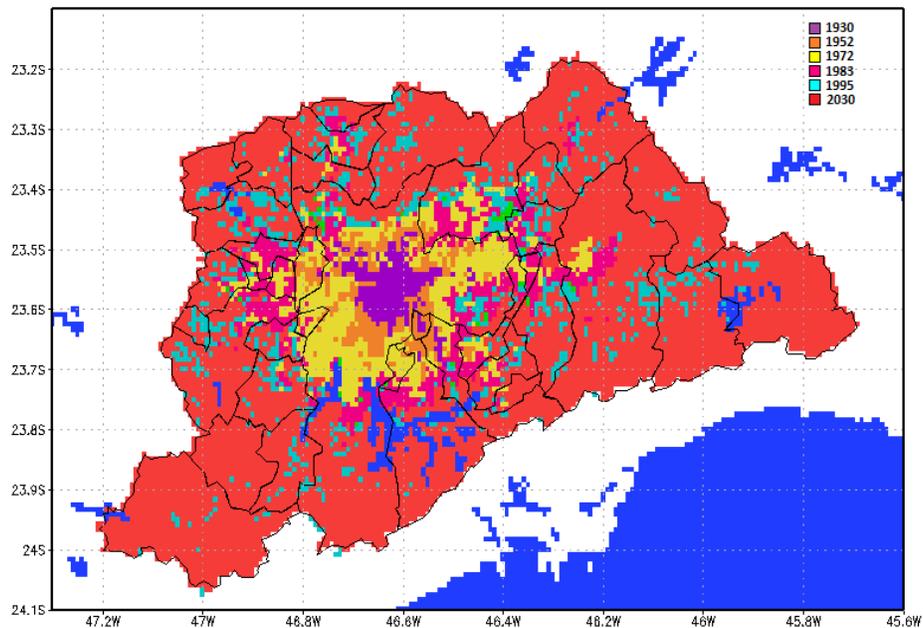
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109 **2 Model Experiments**

110 The Brazilian developments on the Regional Atmospheric Modeling System – BRAMS –
111 version 5.0 [S R Freitas *et al.*, 2009b] was used to simulate all experiments. The model
112 is coupled with the Town Energy Budget – TEB – scheme [Masson, 2000], which is
113 triggered when an urban type grid cell is present on a patch of land use data. This urban
114 parametrization aims to simulate turbulent fluxes as well as dynamic and thermodynamic
115 interactions between the cities and the atmosphere.

116 Land use data from U. S. Geological Survey (USGS) is used, although it was modified in
117 some experiments. Young [2013] generated an urban expansion model for MASP until
118 the year of 2030 in order to access environmental risk for the future. The expansion

119 model was generated from an interpolation from satellite imagery, considering a constant
120 annual urban growth rate and taking the pattern of land use observed between 2001 and
121 2008. This growth rate was applied to the algorithm: $P(t) = P_0(1+i)^t$; where, P_0 is Initial
122 Urbanization; $P(t)$ is growth after t years; i is unitary growth rate and t is time in years.
123 Applying this algorithm with an annual growth rate and the number of years, one can
124 project in the future. Thus, it was possible to obtain an urban area for 2030. Fig 1
125 extrapolates this prediction for all MASP limits, which will be used as one of our land
126 use future scenarios.



127
128 **Fig 1** Evolution of urbanization in MASP (historical survey until 1972 by Villaça (1978), for 1983 and
129 1995 the area may be found in CESAD (<http://www.cesadweb.fau.usp.br/index.php>)). Red is the
130 extrapolation of the predicted urban area for 2030, adapted from Young (2013).

131
132 To identify the effect of urban area expansion for 2030 and the effect of a future vertical
133 expansion on storms, we made experiments based on Factorial Planning [Barros Neto et
134 al., 1995] or Factor Separation [Stein and Alpert, 1993] method. This method allows
135 obtaining individual contributions of each parameter in the simulation/forecast of a
136 meteorological variable. In this work, for sensitivity experiments we use two parameters,
137 namely horizontal and vertical urbanization, thus, it is necessary to conduct four
138 simulations (since the number of experiments is equal to 2^n , where n is the number of

139 factors). Table 1 shows sets for the experiments. Experiment 1 is further called control
 140 experiment.

141

142 **Table 1** Factor Separation Experiments (Plus and minus symbols means the factor is included or excluded,
 143 respectively).

Experiment	Horizontal Urbanization	Vertical Urbanization	Precipitation-Accumulated
1	Current Area (-)	Current building height (-)	P1
2	2030's Area (+)	Current building height (-)	P2
3	Current Area (-)	Future building height (+)	P3
4	2030's Area (+)	Future building height (+)	P4

144

145 The current and 2030's areas are composed with two urban types; the central area,
 146 composed by high rising buildings (Urban 1) and its surrounding composed by houses
 147 and low commercial buildings (Urban 2). Table 2 and Table 3 show the parameters of
 148 urban areas over MASP for experiments with current and future building height.

149

150 **Table 2** Average parameters of urban areas for Experiments 1 and 2 (with current building height)

Parameter	Urban 1	Urban 2
Building height (m)	50	5
Roughness length (m)	3	0.5
Fraction occupied by buildings	0.5	0.7

151

152 **Table 3** Average parameters of urban areas for Experiments 3 and 4 (with future building height)

Parameter	Urban 1	Urban 2
Building height (m)	50	50
Roughness length (m)	3	3
Fraction occupied by buildings	0.5	0.5

153

154 The fraction occupied by buildings is defined as the average fractional area occupied by
 155 buildings in the grid cell. The roughness length was defined according to Grimmond and
 156 Oke [1999], which suggest roughness lengths ≥ 2 m for high-rise urban surfaces (building
 157 heights ≥ 20 m) and according to Masson [2000], which mentioned a review of
 158 experimental estimations of Wieringa [1993], where roughness length are approximately
 159 equal to 1/10 of the house or building heights.

160 According to Barros Neto et al. [1995], the main effect of urban expansion over
 161 precipitation is, by definition, the average of Urban Area Effects (UAE) in two levels of
 162 high-buildings area, given by:

$$UAE = \frac{1}{2}[(P2 - P1) + (P4 - P3)] , \quad (1)$$

163 where UAE is the effect of urban area growth and P1, P2, P3 and P4 are accumulated
 164 precipitation for experiments 1, 2, 3 and 4, respectively. Similarly, the effect of High-
 165 Buildings Area Expansion (HBAE) over precipitation is given by the average high-
 166 buildings area effect in two levels of urban area, given by:

$$HBAE = \frac{1}{2}[(P3 + P4) - (P1 + P2)] , \quad (2)$$

167 where HBAE is the effect of high-buildings area growth. The interaction between both
 168 parameters, UAE_HBAE, is given by:

$$UAE_HBAE = \frac{1}{2}[(P1 + P4) - (P2 + P3)] , \quad (3)$$

169 Stein and Alpert (1993) defined UAE and HBAE in a different way as the simply
 170 difference between a variable with the factor and other from control experiment (without
 171 the factor):

$$UAE = P2 - P1 \quad (4)$$

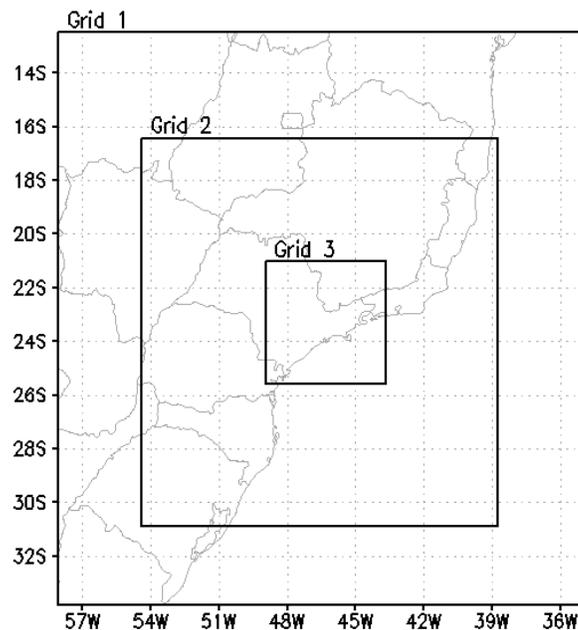
$$HBAE = P3 - P1 \quad (5)$$

172 The interaction between two factors, UAE_HBAE, is given by:

$$UAE_HBAE = P4 - (P2 + P3) + P1 \quad (6)$$

173 The storm case simulation was started at 00 UTC on February 14th, 2013 for a 24 hours
 174 integration period. Three nested grids with 16, 4 and 1 km of horizontal grid spacing, in a
 175 domain made with 150x150, 202x202 and 270x270 points, respectively, centered at 23°S
 176 and 46°W were used for the simulations. The grids location is given in Fig 2. In the
 177 vertical we applied 35 sigma-z type points, initially spaced by 50 m with an increasing
 178 factor of 1.2, until 1000 m, keeping this vertical grid spacing until the top of model
 179 domain. Global Forecast System (GFS) analysis with 0.5° of resolution were used as
 180 initial and boundary conditions. Shortwave and longwave radiation were treated accord
 181 with Chen and Cotton [1983] parameterization. Grell Ensemble [Grell and Devenyi,
 182 2002] formulation was used as cumulus parametrization while 3 levels of moisture

183 complexity [Meyers *et al.*, 1997; Walko *et al.*, 1995] was applied to parametrize
184 microphysical process. Eddy diffusion parametrization was based on Mellor and Yamada
185 [1982].



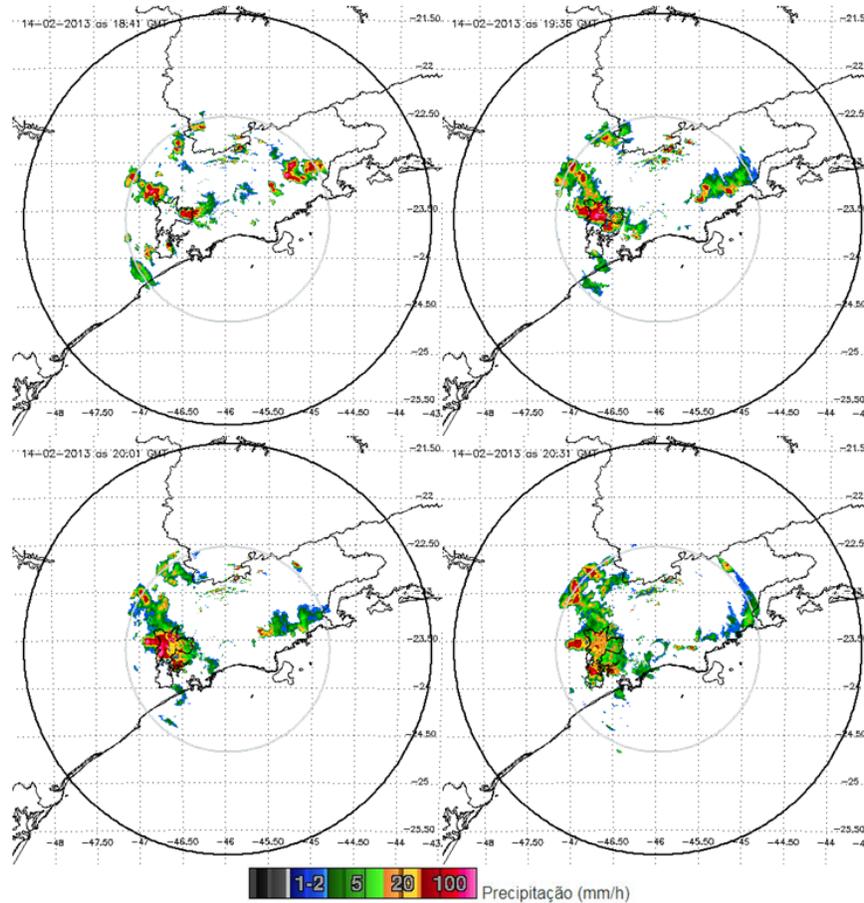
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Fig 2 Experiments grid location.

189 3 Storm Case Study and Control Experiment

190 The storm happened in São Paulo, on February 14th, 2013, draws our attention because its
191 explosive convection when arrived at MASP, which suggests the UHI and the urban area
192 effect. This Fig. shows the system crossing different land uses, changing from rural to
193 urban, with different types of urban structures, from low to high rising buildings. Carraça
194 and Collier [2007] studying a convective case in Manchester observed that a convective
195 cell was initiated by the sensible heat flux generated by the high-rise buildings in the
196 Manchester center. Fig 3 shows radar reflectivity for the storm and its evolution. At 18:45
197 GMT convection starts on the borders of São Paulo city, between 19:35 GMT and 20:00
198 GMT the system reaches its maximum reflectivity in the city center and after that, it starts
199 to decay, moving to southwest. This storm caused urban flooding which impaired the
200 traffic in roads and subway lines. Its heavy rain and strong winds were responsible for
201 closing MASP's airports (as observed by São Paulo civil defense,

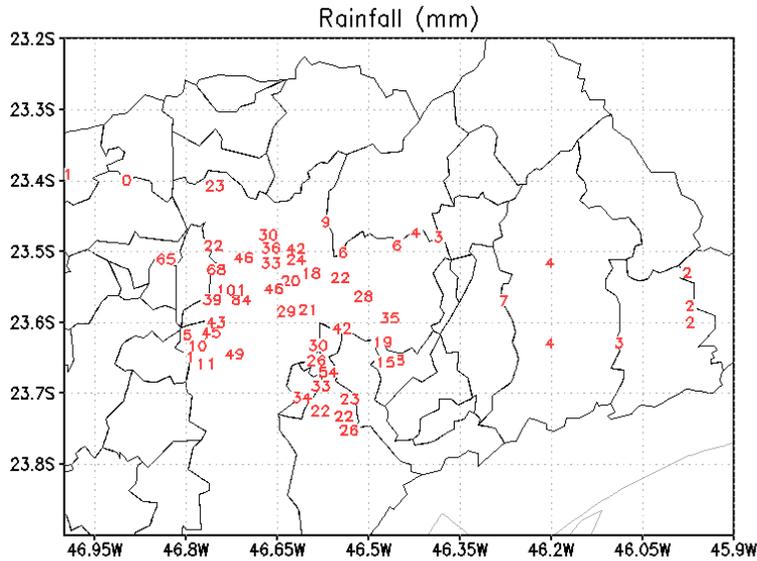
202 <http://www.defesacivil.sp.gov.br/>) and there were reports of hail in some
203 neighborhoods.



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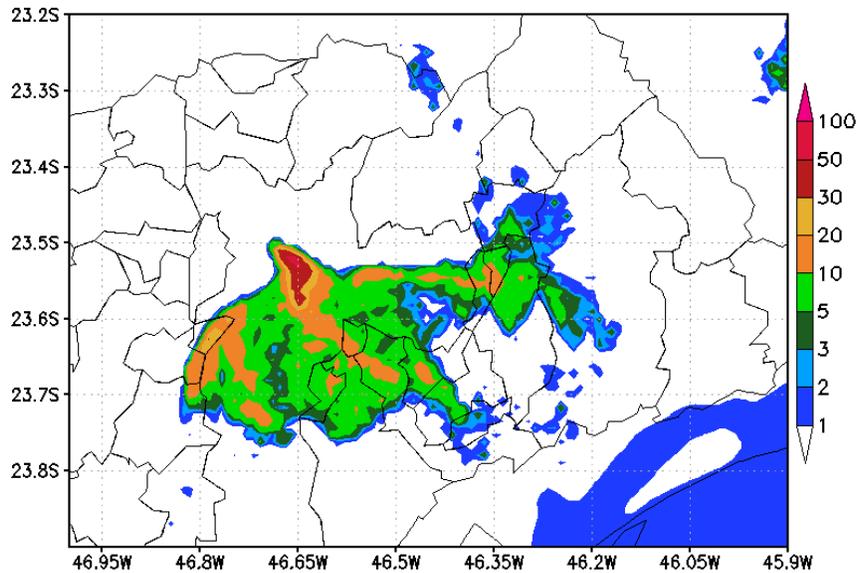
Fig 3 Reflectivity on CAPPI3km of Salesópolis radar. Fonte: <http://radar.iag.usp.br>

207 This was an interesting intense weather event in the metropolitan area, since it was an
208 isolated convective cell that intensify as it moves toward the urban area. Fig 4 and Fig 5
209 compare observed and simulated accumulated precipitation. In the observations, we
210 found accumulated values of 101 mm and 84 mm observed in less than 2 hours, as
211 informed by the São Paulo state flood warning system (SAISP, “*Sistema de Alerta a*
212 *Inundações do Estado de São Paulo*”) rain gauges. The control experiment,
213 correspondent to Experiment 1 in table 1, succeeds to obtain a maximum peak close to
214 the observed, although it was lightly displaced. If we compare all the stations, there is a
215 little tendency for rain underestimation on the control experiment, which is acceptable,
216 given the high variability of the observed precipitation in a such short space.



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Fig 4 Accumulated rainfall (mm) during the event of February 14th, 2013, from SAISP (<https://www.saisp.br/>) and INMET (www.inmet.gov.br/) rain gauge stations.



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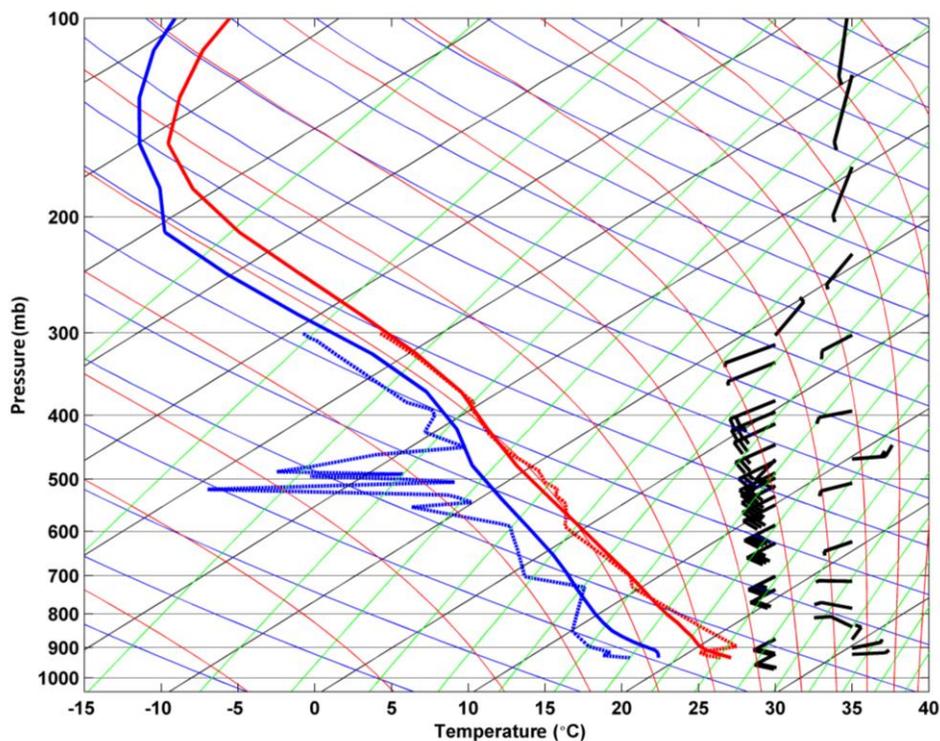
Fig 5 Precipitation accumulated (mm) during the event of February 14th, 2013, from Control Experiment (Experiment 1 in table 1).

224

225 The synoptic condition during this event was characterized, in low levels of the
226 atmosphere, by a low-pressure center on northern Argentina and Paraguay, forcing moist
227 and heat convergence since western Amazonia, where it is channelized by the Andes,
228 until the Southern Brazil. After that, circulation went to a frontal zone located on South
229 Atlantic, which also contributed to the moisture flow. In high levels, a diffluent area on

230 Brazilian side and a short-wave trough on northern Argentina, provided a weak support
231 with cyclonic vorticity advection to the MASP. However, the surface South Atlantic
232 Subtropical High (SASH) still keeping an anticyclonic circulation over São Paulo State.
233 Temperatures were high and there was contribution of warm and moist advection coming
234 from the ocean and northeastern Brazil. This configures a pre-frontal synoptic pattern
235 over the MASP, with winds from northwest.

236 Fig 6 shows a comparison between the Campo de Marte – SP atmospheric sounding and
237 a profile extracted from the Control Experiment run near to the launching location. There
238 was a large variation on sounding's mid-level dew point, which was not well represented
239 by the simulation, which presented a moister profile in general. For temperature, the
240 experiment represents the sounding's average behavior, but it is almost 1 °C warmer on
241 the surface. Simulated wind profile is mainly from west and lightly underestimates the
242 observation in intensity.



243
244 **Fig 6** Sounding of Campo de Marte – SP (wind barbs on the left and dashed lines) and profile for the same
245 lat/lon from Experiment 1 (wind barbs on the right and full lines). Temperature (°C, red color) and Dew
246 point (°C, blue color).

247 We calculated convective parameters for the sounding and the Control Experiment
248 profiles. A Convective Available Potential Energy, CAPE (Moncrieff and Miller, [1976],

249 with the air parcel ascended from surface has 797 J kg^{-1} for the sounding and 2418 J kg^{-1}
250 for the experiment. As explained for instability, CAPE is very sensitive with surface
251 differences and, therefore, a warmer temperature and a moister dew point in the surface
252 causes a higher CAPE in the experiment run. It also underestimates the Convective
253 Inhibition (CIN) that has a value of -120 J kg^{-1} for the sounding and none for the
254 experiment. It is important to notice that the experiment could not dry enough and it
255 affects the instability parameters. Bulk Richardson Number (BRN) shear, defined as the
256 magnitude of the difference between the 0-6-km density-weighted mean wind and the
257 density-weighted mean wind of the lowest 0.5 km [Evans and Doswell, 2001], has a 16.9
258 $\text{m}^2 \text{ s}^{-2}$ for the sounding and 10.7 for the experiment. Storm-Relative Helicity performed
259 for the first 3 km of atmosphere (SRH), as defined by Rasmussen and Blanchard [1998],
260 has $-50.7 \text{ m}^2 \text{ s}^{-2}$ for the sounding and $-31.5 \text{ m}^2 \text{ s}^{-2}$ for the experiment. Differences in BRN
261 shear and SRH can be explained because sounding has stronger winds around 450 mb (\approx
262 6 km), the same occurs close to 700 mb (\approx 3 km), this must cause a higher shear and
263 elevate these parameters in the sounding.

264 CAPE and Lifted Index (LI) based on the air parcel ascended from surface [Galway,
265 1956] are plotted before the storm is generated (figure not shown), in an environment
266 similar to the proximity soundings [Brooks et al., 1994; Brooks et al., 2003]. There is a
267 very unstable area in the center of MASP, following the sea breeze front and where it
268 reaches the central area with the hottest temperatures. Those high temperatures induce
269 local low pressure and generate convergence over the central area, which accelerate the
270 sea breeze front until it reaches the center of the urban region [E D Freitas et al., 2007;
271 Khan and Simpson, 2001]. We found CAPE values as high as 4000 J kg^{-1} and a LI values
272 of $-7.5 \text{ }^\circ\text{C}$, which is a thermodynamic profile favorable to the development of severe
273 storm, including possible supercell, such as the sounding found by Nascimento [2004]
274 from western Paraná (Brazil State), that also had large values of supercell composite
275 parameter (SUP) and energy-helicity index (EHI). CIN was observed and reach minimum
276 values of -10 J kg^{-1} , showing low inhibition to convection.

277 BRN shear and SRH (figure not show), which represent the amount of shear in the first 6
278 km of the atmosphere and the helicity (directional shear) in the first 3 km of atmosphere,
279 respectively, is present following the sea breeze front. Close to MASP center, BRN shear

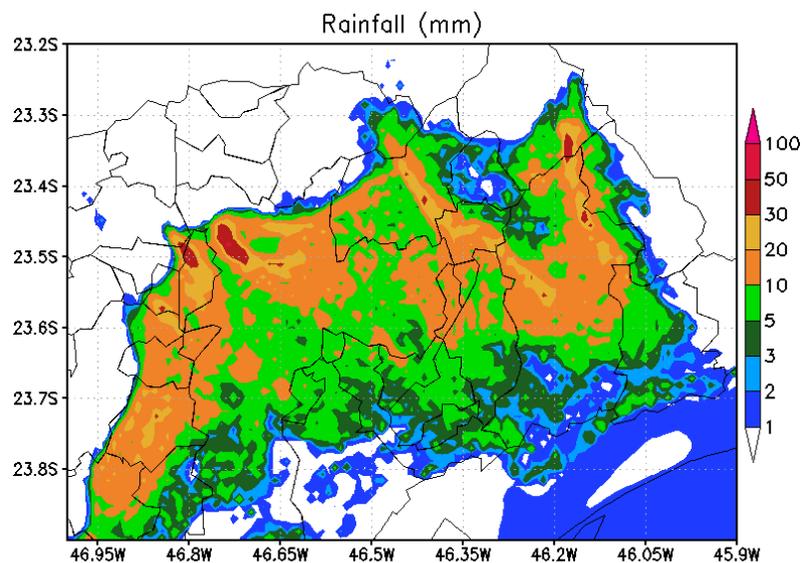
280 reaches $30 \text{ m}^2\text{s}^{-2}$, above the threshold of $20 \text{ m}^2\text{s}^{-2}$, observed in severe weather
281 environments (tornadic or not, Nascimento 2004). Thus, beside intense in
282 thermodynamics, the event fast grew upscale maintain itself longer than an isolated cell.
283 SRH reaches $-50 \text{ m}^2\text{s}^{-2}$, which is weak when compared to the threshold of $-150 \text{ m}^2\text{s}^{-2}$ that
284 favour tornadic supercells [Mills and Colquhoun, 1998].

285

286 **4 Sensitivity Experiments with Future Urban Growth**

287 4.1 Current building height in 2030's area

288 Fig 7 shows precipitation accumulated (mm) during the event of February 14th, 2013, for
289 Experiment 2 that increase the area expansion, but keeps constant the buildings height.
290 Comparing with current scenario (Experiment 1), in Fig 5, the wider urban area also has a
291 precipitation spread in a larger area, which enhance the precipitation volume over MASP.
292 This result is in agreement with those found by other authors who tested the urban land
293 use impacts around the world, like in Carrió et al. [2010], Rozoff et al. [2003], Pathirana
294 et al. [2014]; Mölders and Olson [2004], Zhong and Yang [2015], Souza et al [2016] and
295 Freitas et al. [2009a].



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Fig 7 Accumulated precipitation (mm) during the event of February 14th, 2013, for Experiment 2.

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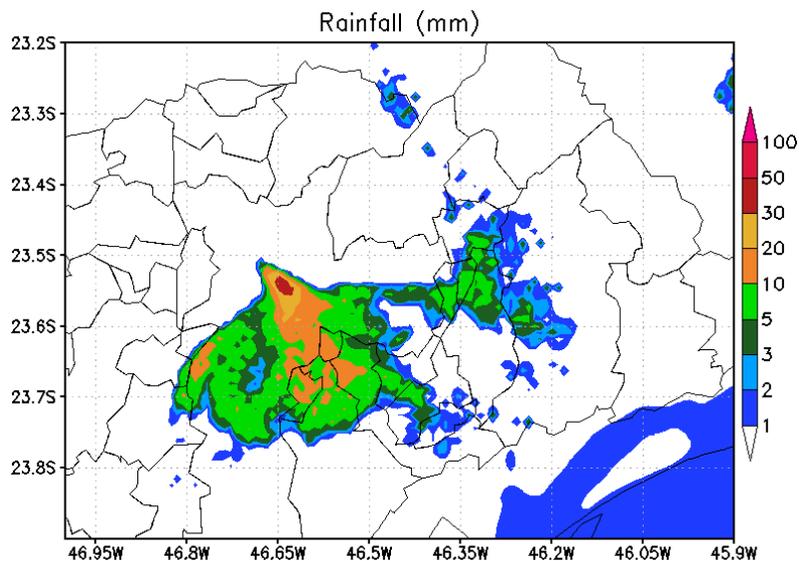
299 There is a huge increase in the amount of precipitation taking the difference between the
300 Experiment 2 and Experiment 1. On Experiment 2, temperature near to the surface (not

301 shown) increases on places where land use changes to urban type. Thus, the sea breeze
302 front reaches these places earlier, especially on east side of MASP, and drops the air
303 temperature where it passes through. Wind at 10 m (not shown), had its magnitude
304 increased.

305

306 4.2 Future building height in the current area

307 Fig 8 shows accumulated precipitation (mm) during the event of February 14th, 2013, for
308 Experiment 3 that maintains the area, but change the height of the buildings. Experiment
309 3 decreases the amount of rainfall, including the maximum in more than 20 mm,
310 compared with Experiment 1. Although there is not big differences between these
311 experiment results, as we saw in Experiment 2.



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Fig 8 Accumulated precipitation (mm) during the event of February 14th, 2013, for Experiment 3.

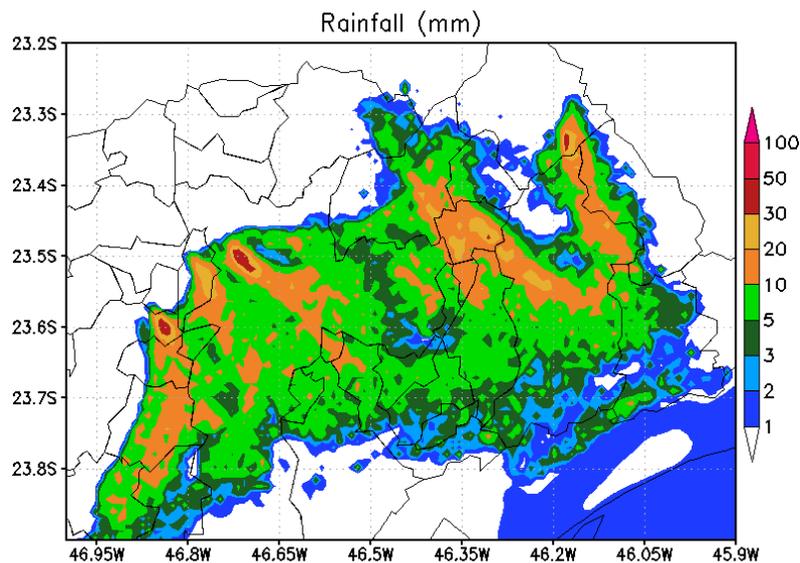
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315 Taking the difference between the Experiment 3 and Experiment 1, we see a very similar
316 result for temperature, except on city center, where Experiment 3 has the maximum
317 temperature near to the surface (not shown) decreased. Also, there is an area with
318 increased temperatures, due to the blockade of the sea breeze front, indicating that it does
319 not reach as far as in Experiment 1. 10 m height wind has a decreased intensity on central
320 city due to the roughness in the area.

321

322 4.3 Future building height in 2030's area

323 Fig 9 shows accumulated precipitation (mm) during the event of February 14th, 2013, for
324 Experiment 4. Comparing with Experiment 1 this scenario presents precipitation in a
325 larger area, increasing precipitated volume over MASP. There is a rising in temperature
326 on regions with new urban land use. On east side of MASP, the sea breeze front reaches
327 the MASP center earlier. 10 m height wind has its intensity decreased due to higher
328 roughness. Experiment 4 decreases the amount of rainfall compared to Experiment 2.
329 There is an increase in temperature, which indicates the sea breeze did not reach the same
330 place in Experiment 2. 10 m wind decreased intensity over all RMSP, except in the
331 center, due to building roughness.



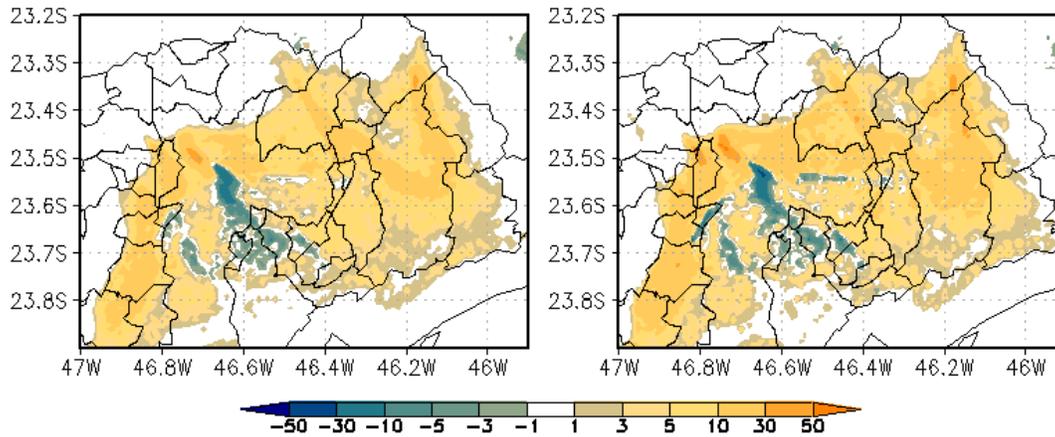
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333 **Fig 9** Accumulated precipitation (mm) during the event of February 14th, 2013, for Experiment 4.

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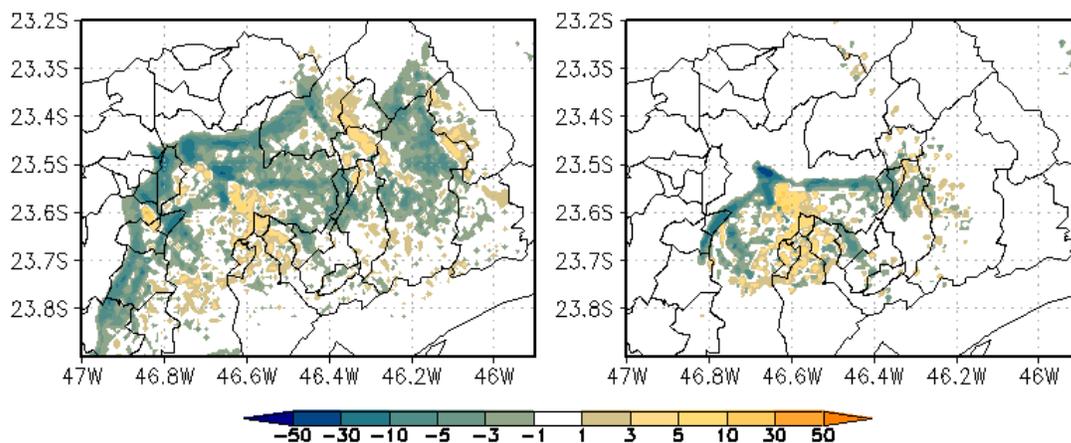
335 4.4 Application of Factorial Planning/Factor Separation Method

336 Fig 10 shows the contribution of the urban area growth to the accumulated precipitation
337 on 14th February, 2013, while Fig 11 shows the contribution of high-buildings area
338 growth and Fig 12 the interaction between these two factors. We see that urban area
339 growth is capable to increase the amount of precipitation over new urban areas. In areas
340 with old urban use, it is not clear, but there is a weak tendency of rainfall increasing. It
341 shows that the change in urban use from rural to urban is determinant to rainfall increase.
342 The rainfall induced by high-building area growth shows a decrease in precipitation, also

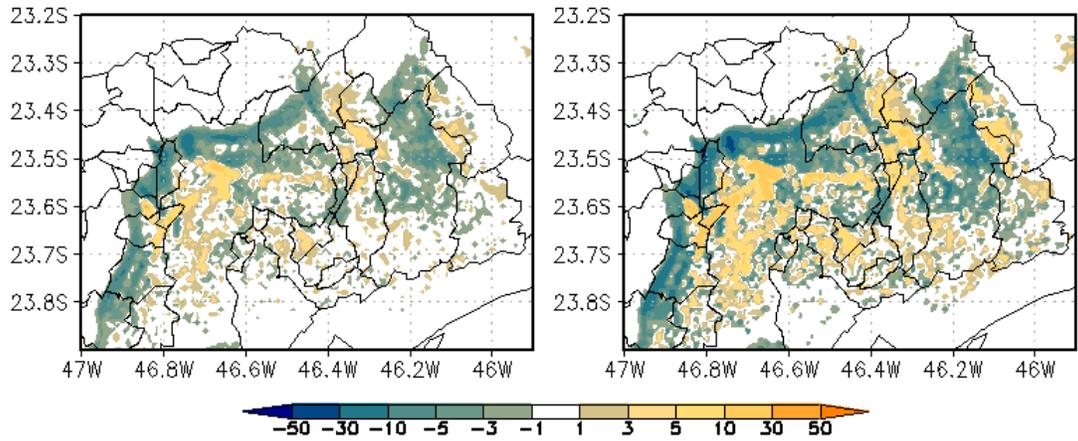
343 confines it to southern areas. The interaction between these factors shows a behavior
344 between this two factors, it increases the amount of precipitation but less and southern
345 than UAE.



346 **Fig 10** Precipitation induced by urban area growth (UAE). Factorial Planning (left) and Factor Separation
347 (right).
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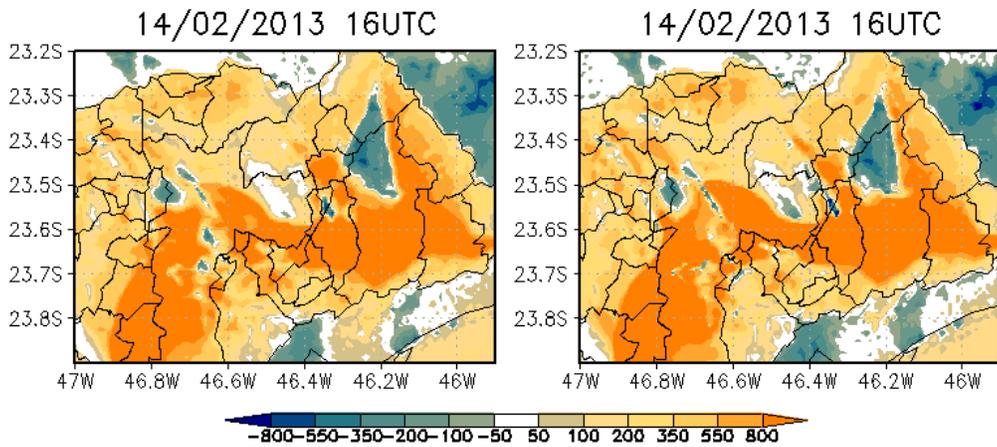


349 **Fig 11** Precipitation induced by high-building area growth (HBAE). Factorial Planning (left) and Factor
350 Separation (right).
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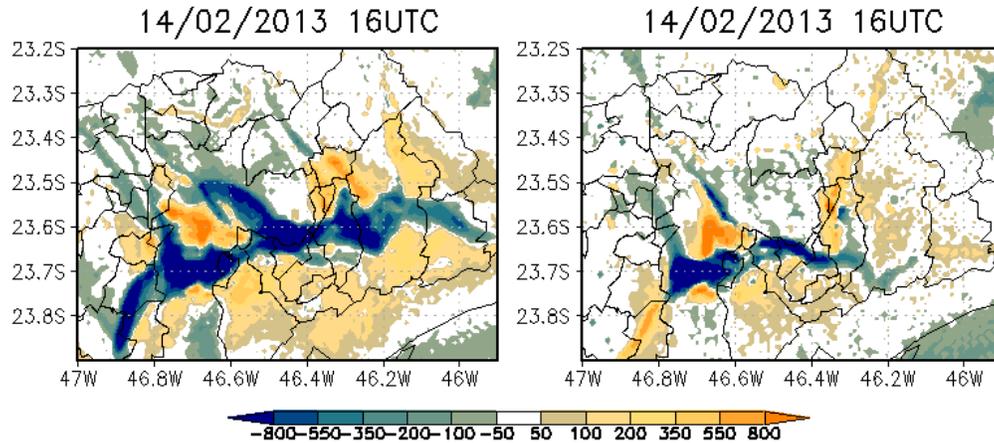


352
 353 **Fig 12** Precipitation induced by the interaction between urban area growth and high-building area growth
 354 (UAE_HBAE). Factorial Planning (left) and Factor Separation (right).

355 Fig 13 shows CAPE induced by urban area growth, while Fig 14 shows CAPE induced by
 356 high-buildings area growth and Fig 15 shows the interaction between these two factors.
 357 We see that both factors and its interaction contribute to increase CAPE. Although,
 358 the building barrier affects the sea breeze front, which brings more instability to the
 359 MASP. This drops CAPE on places it could be higher.

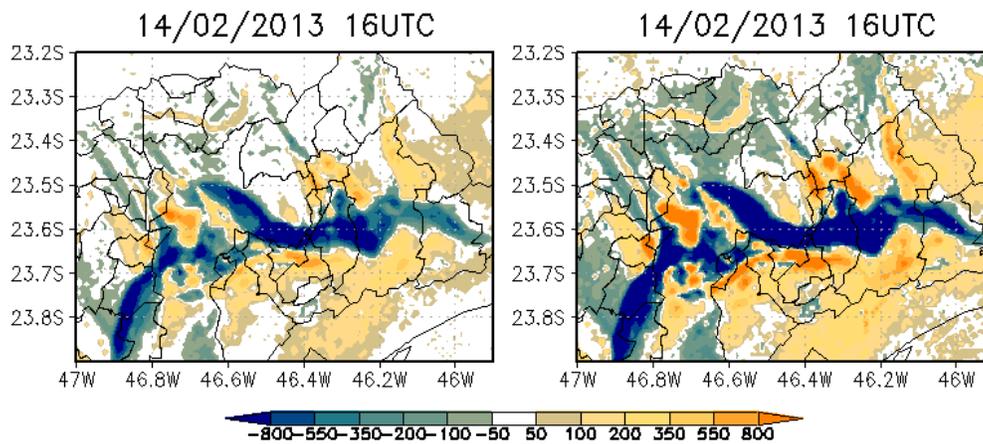


360
 361 **Fig 13** CAPE induced by urban area growth (UAE). Factorial Planning (left) and Factor Separation (right).



362
363
364

Fig 14 CAPE induced by high-building area growth (HBAE). Factorial Planning (left) and Factor Separation (right).

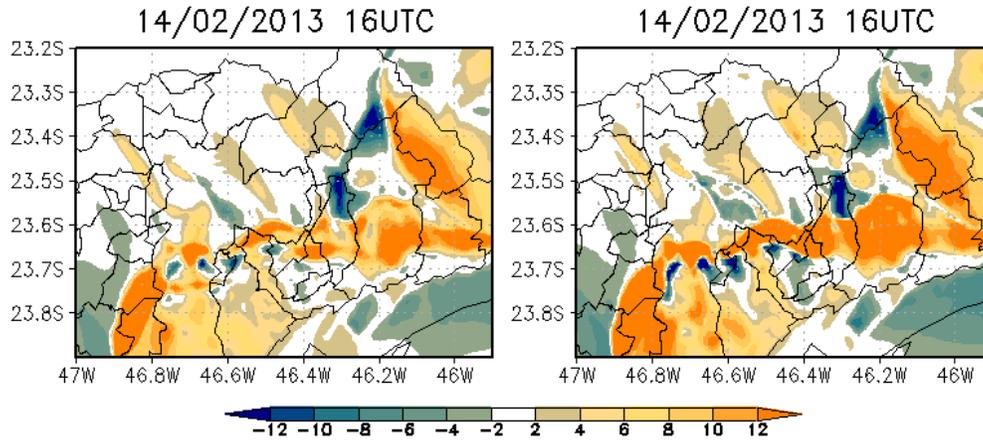


365
366
367

Fig 15 CAPE induced by the interaction between urban area growth and high building area growth (UAE_HBAE). Factorial Planning (left) and Factor Separation (right).

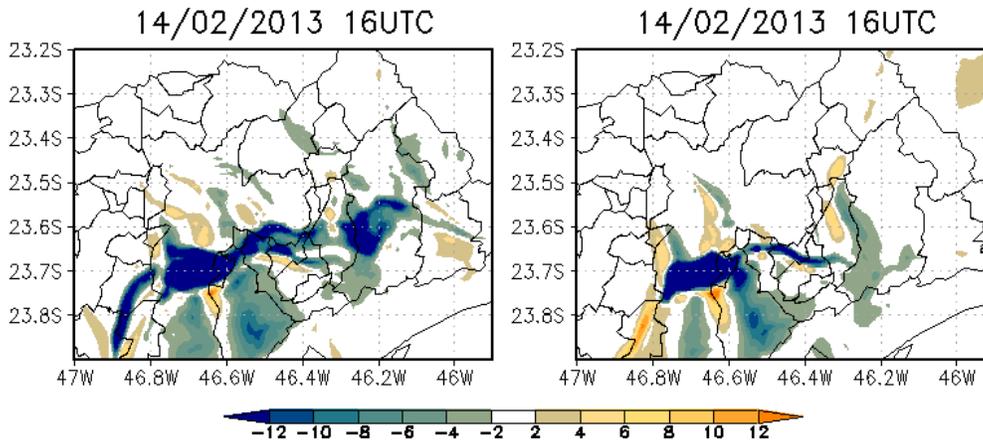
368 LI induced by urban area growth (figure not shown) has again a raise in instability with
369 smaller values, all over new urban area. LI induced by high-buildings area growth (figure
370 not shown) increased LI where sea breeze front does not reach. The interaction between
371 these two factors (figure not shown) also shows the same.

372 BRN shear induced by urban area growth (Fig 16) has a tendency to increase in MASP.
373 The sea breeze front it is a source of shear, due to its circulation. Therefore, HBAE
374 decreases shear on MASP centre, where it blocks the front. The interaction between these
375 two factors shows an increase in shear due to UAE and a decrease on sea breeze front
376 blockade.



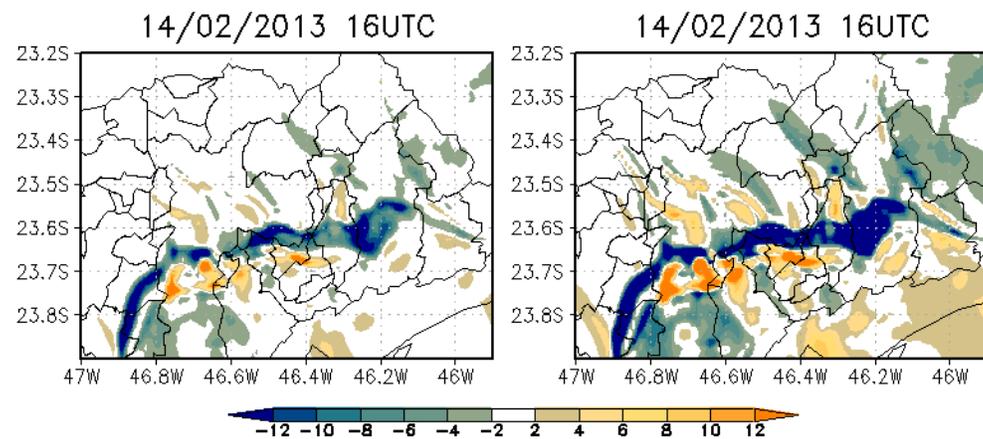
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378
379

Fig 16 BRN shear induced by urban area growth (UAE). Factorial Planning (left) and Factor Separation (right).



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Fig 17 BRN shear induced by high-building area growth (HBAE). Factorial Planning (left) and Factor Separation (right).



383
384
385

Fig 18 BRN shear induced by the interaction between urban area growth and high building area growth (UAE_HBAE). Factorial Planning (left) and Factor Separation (right).

386

387 **6 Conclusions**

388 In the environment just before the storm, extremely unstable profiles were obtained, with
389 some degree of organization and low probability of tornadic supercells, as expected for
390 this storm case.

391 The factorial planning and factor separation methods show that 2030's urban area is
392 capable to increase the amount of precipitation over MASP. It indicates that change rural
393 to urban land use is determinant for this increase. On the other hand, the high-building
394 area growth brings a tendency for precipitation suppress. The interaction between these
395 factors show a behaviour in the middle of these two effects, it increases area with
396 precipitation less than could be in an urban soil with low buildings.

397 Both factors generate instability due to its sources of latent and sensible heat and the
398 building barrier blocks the source of instability and shear that sea breeze front brings.
399 Then, the interaction of the factors favours severity on southern places.

400

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407

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