



1 **Economic impacts of drought risks for water utilities through**  
2 **Severity-Duration-Frequency framework under climate change**  
3 **scenarios**

4 Diego A. Guzmán<sup>1,2</sup>, Guilherme S. Mohor<sup>1</sup>, Denise Taffarello<sup>1</sup> and Eduardo M. Mendiondo<sup>1</sup>

5 <sup>1</sup> Department of Hydraulics and Sanitation - Sao Carlos School of Engineering, University of Sao Paulo - Sao  
6 Carlos, SP, 13566-590, Brazil

7 <sup>2</sup> Department of Civil Engineering, Pontificia Bolivariana University, Bucaramanga, STD, 681007, Colombia

8

9 *Correspondence to:* Diego A. Guzman (daga2040@hotmail.com)

10 **Abstract**

11 Climate variability and increasing water demands prioritize the need to implement planning  
12 strategies for urban water security in the long and medium term. However, actions to manage  
13 the drought risk impacts entail great complexity, such as the calculation of economic losses  
14 derived from the combination of severity, duration and frequency under uncertainties in the  
15 climate projections. Thus, new approaches of risk aversion are needed, as an integrated  
16 framework for resilience gap assessment, for water utilities to cope with droughts, thereby  
17 linking drivers of climate, hydrology and human demands. This paper aims to present the  
18 economic impacts of risk aversion for water utilities through a framework linking severity,  
19 duration and frequency (SDF) of droughts under climate change scenarios. This new model  
20 framework addresses the opportunity cost that represent the preparedness for risk aversion to  
21 cope with potential future impacts of droughts, involving a set of options for planning of  
22 water resources, under different demands and climate projections. The methodology  
23 integrates the hydrological simulation procedures, under radiative climate forcing scenarios  
24 RCP 4.5 and 8.5, from a regional climate model Eta-INPE, with time horizons of 2007-2040,  
25 2041-2070, and 2071-2099, linked to Water Evaluation and Planning system (WEAP)  
26 hydrologic model and under stationary and non-stationary water supply demand assumptions.  
27 The model framework is applied to the Cantareira Water Supply System for Sao Paulo  
28 Metropolitan Region, Brazil, with severe vulnerability to droughts. By using hydrological  
29 simulations with WEAP, driven by Eta-INPE Regional Climatic Model base line scenarios  
30 (1962-2005), were characterized the SDF curves. On the one hand, water tariff price  
31 associated to calibrated and modelled scenarios constitute supply/demand proxies of the water  
32 warranty time delimited by drought duration. Then, profit loss analysis scenarios are assessed



33 for the regional water utility. On the other hand, for drought resilience gap, results show water  
34 utility profit losses per period between 1.3% and 10.3% of the regional GDP in 2016.  
35 Although future economic impacts vary in a same order, non-stationary demand trends  
36 impose larger differences in the drought resilience gap, when the future securitization are  
37 linked to regional climate outputs.

38 **Key Words:** Climate change, Water Security, Severity-Duration-Frequency curves,  
39 Economic profit losses

#### 40 **1. Introduction**

41 Climate change, population growth and uncontrolled urban/industrial development make  
42 society more dependent on water (Montanari et al., 2013). The complex interaction between  
43 meteorological, terrestrial and socio-economic water distribution schemes are the main factors  
44 that define droughts (Lloyd-hughes, 2013; Van Loon et al., 2016a, 2016b; Wada et al., 2013).  
45 Thus, to face a prospective drought scenario, with the demand as a determinant anthropogenic  
46 factor requires society to rethink the way forward, mainly to reduce its vulnerability by  
47 mobilizing more water for its use, by expanding and making use of alternative sources or by  
48 regulating its demand (Falkenmark and Lannerstad, 2004; Kunreuther et al., 2013; Wanders  
49 and Wada, 2015).

50 In terms of drought, a hydrological drought is defined as a negative anomaly in surface and  
51 subsurface water levels (Van Loon, 2015; Wanders et al., 2017). These negative anomalies on  
52 the surface, related to a level of water demand can cause water systems to collapse and trigger  
53 strong socioeconomic impacts or the so-called socioeconomic drought (Mehran et al., 2015).  
54 Droughts may not be as apparent as floods, but have proven to be one of the most complex  
55 risks due to their slow development, strong and long lasting impacts such as broad geographic  
56 coverage (Bressers and Bressers, 2016; Frick et al., 1990; Smakhtin and Schipper, 2008; Van  
57 Lanen et al., 2013). Furthermore, various studies have shown that more severe and prolonged  
58 droughts are expected for the future, leading to greater economic consequences,  
59 environmental degradation and loss of human lives (Asadieh and Krakauer, 2017; Balbus,  
60 2017; Berman et al., 2013; Freire-González et al., 2017; Prudhomme et al., 2014; Shi et al.,  
61 2015; Stahl et al., 2016; Touma et al., 2015). Therefore, it is essential to create appropriate  
62 expectations about their potential impacts, aiming to mitigate catastrophes, reduce the risks of  
63 damage and build a more resilient community (Bachmair et al., 2016; Mishra and Singh,  
64 2010; Nam et al., 2015).



65 The need for a broader perspective in terms of comprehending and managing the impacts of  
66 drought requires actions to integrate their states or categories (Hao and Singh, 2015; Van  
67 Loon, 2015). This implies in studying droughts, understanding their propagation from  
68 meteorological phenomena, underground-surface dynamics and alterations of anthropogenic  
69 origin such as storage (Huang et al., 2017; Van Loon et al., 2016b; Wong et al., 2013).  
70 However, the most visible impacts on the water supply, energy generation, transport,  
71 recreation and water quality are strongly related to hydrological drought and not directly to  
72 meteorological drought (Van Lanen et al., 2016). Thus, we in this work addresses  
73 hydrological droughts as the main driver of direct economic impacts when water demand  
74 exceeds supply (Bressers and Bressers, 2016).

75 The availability of water supply new sources every day are more scarce, so the demand  
76 regulation is a strategy that is being considered by the supply companies to guarantee  
77 reliability during the drought (Zeff and Characklis, 2013). Among the demand control  
78 strategies are price-based policies ones, these seek to change the user's consumption pattern  
79 based on economic penalties or incentives (Millerd, 1984). However, the implementation of  
80 these strategies entails a great complexity in their planning and a high risk of utility losses for  
81 the water company.

82 The São Paulo Metropolitan Region (SPMR) located in the south east of Brazil, which has  
83 approximately 20 million inhabitants, is an important economic center in Latin America that  
84 influences approximately 12% of the Gross Domestic Product (GDP) in Brazil (Haddad and  
85 Teixeira, 2015). During the (2013-2015) period, the population of the SPMR experienced a  
86 significant reduction in water resources availability and decrease in the water supply  
87 (Coutinho et al., 2015; Nobre and Marengo, 2016; Taffarello et al., 2016b). Consequently, the  
88 2013-2015 water deficit had socioeconomic impacts such as widespread social protests,  
89 increases in food prices and energy tariffs in homes, industries and commerce (Hanbury,  
90 2015). The Federation of Industries of the State of Sao Paulo (FIESP) estimated that 60,000  
91 establishments, which represent almost 60% of the state's industrial GDP, are affected by a  
92 lack of water (Marengo et al., 2015). In addition, from 2014 to 2015, the Sao Paulo State  
93 Water Utility Company (SABESP) recorded an average annual liquid net income reduction of  
94 approximately 75% compared to 2016, leading to a major financial crisis in the company  
95 (GESP, 2016). Thus, as long as there are no systematic and detailed studies on the impact of  
96 drought on the regional economy, shaping financial planning policies is a complex and  
97 uncertain task that must be reinforced. Based on the severity and duration of the water deficit,



98 this article aims to assess the economic impacts of drought risks for water utilities through  
99 integrating a severity-duration-frequency framework under climate change scenarios. Also,  
100 this paper describes an academic exercise to manage drought financial planning for the  
101 SPMR, considering the perspective of the economic impact on the Sao Paulo Water Utility  
102 company.

103 The sections of this article outline interconnected methods and criteria, explained as follows.  
104 In Section 2, the text describes the study area (see Figure 1) and water crisis  
105 contextualization. Section 3 outlines the methodological approach starting with the  
106 hydrological modeling, characterization of the droughts using the threshold level method, the  
107 formulation of the SDF curves of the system and subsequently the links climatic, hydrological  
108 and economic aspects of the methodology (Figure 2). In Section 4, the results obtained are  
109 shown as financial drought planning scenarios. Finally, in Section 5, the discussion and  
110 conclusions are presented regarding the proposed approach.

## 111 **2. Study area and water crisis contextualization.**

112 The Cantareira Water Supply System, hereafter referred to as the Cantareira System, is  
113 located in the South-East of Brazil between the states of Sao Paulo and Minas Gerais (-46.9 to  
114 -45.7 longitude and -22.5 -23.5 latitude). The regional climate is classified as subtropical –  
115 sub-humid, with a maximum annual average temperature of 25 °C and a minimum annual  
116 average of 15 °C (Blain, 2010; Rodríguez-Lado et al., 2007). On the other hand, the rainfall in  
117 the Southeast of Brazil presents an annual cycle, with maximum rainfall from December to  
118 February (summer) and minimum rainfall from June to August (winter). The rainy season in  
119 the Cantareira System generally begins at the end of September and ends in March. In this  
120 period, on average 72% of the rainfall in the region is accumulated (Marengo et al., 2015). In  
121 hydrological terms, 2265 km<sup>2</sup> of drainage area into the system historically generates an annual  
122 mean tributary discharge of 38.74 m<sup>3</sup>/s, where the Jaguarí tributary contributes approximately  
123 46%. Structurally, the system consists of the damming and interconnection of five basins with  
124 a useful total storage volume of 988.8 hm<sup>3</sup>, arranged to transfer water from the Piracicaba  
125 River Basin to the Upper Tietê Basin (Fig. 1). Thus, the system had been configured to supply  
126 water to about 8.8 million people in the SPMR before the last acute crisis in 2013-2015 (De  
127 Andrade, 2016; Marengo et al., 2015; Nobre et al., 2016; Nobre and Marengo, 2016;  
128 PCJ/Comitês, 2016, 2006).

129 Previously in the SPMR, some water shortages were recorded. The first one was during 1953-  
130 1954, then from 1962 to 1963 (Nobre et al., 2016), which apparently motivated the



131 construction of the Cantareira system and the latest one was from 2000 to 2001 (Cavalcanti  
132 and Kousky, 2001). Thus, the system, designed to supply the increasing demand for water in  
133 the SPMR, began its partial operation in 1974 and its construction was completed in 1981  
134 with a 30-year permit to transfer up to 35 m<sup>3</sup>/s according to a periodic technical report (Mohor  
135 and Mendiondo, 2017; Taffarello et al., 2016a). Cantareira System is currently administered  
136 by SABESP, which mainly operates the water network in the SPRM, and with Government of  
137 the State of Sao Paulo as its main shareholder.

138 However, various studies have identified changes in trends in rainfall and temperature  
139 extremes, showing an increase in the intensity and frequency of days with heavy rainfall and  
140 longer duration of hot dry periods between rainfall events in South America and southeastern  
141 Brazil (Chou et al., 2014b; Dufek and Ambrizzi, 2008; Haylock et al., 2006; J. A. Marengo et  
142 al., 2009; Jose A. Marengo et al., 2009a, 2009b; Nobre et al., 2011; Zuffo, 2015). Although  
143 historically, the SPRM study area is not affected by droughts of the same order of Northeast  
144 Brazil, the SPRM is progressively becoming vulnerable to water shortages. Therefore, during  
145 the recent period of the acute crisis 2013/2015, SABESP were taken reactive measures, to  
146 control the consumption in the SPMR, such as (Marengo et al., 2015): Programmed water cut-  
147 offs; Bonuses and penalties to reduce and increase consumption, respectively; Extraordinary  
148 increases of water tariff cost; Network pressure reduction; Water use from the reservoirs´  
149 dead volume; Social awareness campaigns to inform people about shortages; Water  
150 distributed by tankers in the most critical areas of the city to provide the Basic Water  
151 Requirement (BWR) for human needs. Nevertheless, according to SABESP, there is currently  
152 a gradual system recovery, which enables the reestablishment of pre-crisis supply levels  
153 (SABESP, 2016a).

154

### 155 **3. Methodology**

156 The methodology was followed in three modules that are summarized in Figure 2. In the first  
157 module, the hydrological simulation was approached by the Water Evaluation and Planning  
158 tool (WEAP) (Yates et al., 2005a). The model was calibrated and validated, based on the  
159 available historical hydrometeorological information (2004-2015) for the study area. Then,  
160 from the calibrated hydrological model and the RCM Eta-INPE historical periods datasets, the  
161 base discharge scenarios were estimated. In the second module, in the TLM approach, the  
162 "threshold" had to be defined according to stationary and non-stationary assumptions of water  
163 demand in the SPMR. Afterwards by analyzing the duration series and extreme deficits  
164 through GEV (Generalized Extreme Value) distribution, the Severity-Duration-Frequency



165 curves (SDF) were developed (J. H. Sung and Chung, 2014). To complete the second module,  
166 the average water price is defined per each cubic meter of deficit, as a function of the supply  
167 warranty time during the hydrological drought events, to configure the baseline analysis  
168 scenarios. The final module evaluates through the baselines scenarios the Water Utility  
169 Company economic profit losses, under the hydrological model WEAP output datasets,  
170 driven by the Eta-INPE, RCPs and (2007-2040, 2041-2070, 2071-2099) scenarios, previously  
171 processed by the TLM approach. It should be clarified that, for the analysis under the non-  
172 stationary assumption, the growth of water consumption is represented in each projection time  
173 step, that is, to 2005-2040 correspond  $31 \text{ m}^3/\text{s}$ , to 2041-2070 correspond  $38 \text{ m}^3/\text{s}$  and to the  
174 period 2071-2099 correspond  $43 \text{ m}^3/\text{s}$ .

175 The results of the methodology of Figure 2 can be seen as the opportunity cost, which would  
176 represent appropriate financial planning, considering the anticipation of drought events by  
177 implementing adaptation measures, supported economically by the forecast of the potential  
178 impacts. These impacts are shown as a set of potential scenarios involving climate  
179 uncertainty, human triggering factors and the prediction of extreme theory (Baumgärtner and  
180 Strunz, 2014; Wanders and Wada, 2015). Thus, the approach seeks to provide a planning  
181 water-security support analysis in areas highly dependent on surface water resources.

182 As a complement to Figure 2, the main variables that induce the change scenarios for this  
183 study are shown in Table 1.

### 184 **3.1. Climate and hydrological modeling**

185 Currently the RCM Eta-INPE (Brazilian National Institute for Space Research) plays an  
186 important role in providing information for local impact studies in Brazil and other areas in  
187 South America (Chou et al., 2014b). In order to assess the uncertainties of climate change  
188 impacts, the simulation results of the Eta-INPE model were used in this paper. The model is  
189 nested within the GCMs MIROC5 and HADGEM2-ES, forcing by two greenhouse gas  
190 concentration scenarios (RCPs) 8.5 and 4.5 [ $\text{W}/\text{m}^2$ ] used in AR5 (IPCC 5th Assessment  
191 Report); with a horizontal grid size resolution of  $20 \text{ km} \times 20 \text{ km}$  and up to 38 vertical levels  
192 through 30 years of time slices (periods) distributed as follows: 1961-2005 (as the baseline  
193 period), 2007-2040, 2041-2070 and 2071-2099 (Chou et al., 2014a, 2014b; Prudhomme et al.,  
194 2014). The climate projections of the Eta-INPE model was used to drive the WEAP Rainfall  
195 Runoff Model-soil moisture method (World Bank, 2017; Yates et al., 2005a). The WEAP,  
196 developed by the Stockholm Environment Institute US Center, is an integrated water resource



197 planning tool used to develop and assess scenarios that explore physical changes (natural or  
198 anthropogenic) and has been widely used in various basins throughout the world (Bhave et al.,  
199 2014; Esteve et al., 2015; Groves et al., 2008; Howells et al., 2013; Mousavi and Anzab,  
200 2017; Psomas et al., 2016; Purkey et al., 2008; Vicuna and Dracup, 2007; Viciña et al., 2011;  
201 Yates et al., 2005b). Climate-driven models, such as WEAP provide dynamic tools by  
202 incorporating hydroclimatological variables to analyze, in this case, a one-dimensional, quasi  
203 physical water balance model, which depicts the hydrologic response through the surface  
204 runoff, infiltration, evapotranspiration (Penman-Monteith equation), interflow, percolation  
205 and base flow processes (Forni et al., 2016).

206 The hydrological model comprises 16 sub-basins with a spatial resolution ranging from 67 to  
207 272 km<sup>2</sup> (see Table A-1 in supplementary material - section A), which defines the natural  
208 discharge produced by the Cantareira System. The observed hydrologic data (discharge and  
209 rainfall) were taken from HIDROWEB (the National Water Agency database [ANA]),  
210 SABESP and the São Paulo state Water and Electricity Department [DAEE]. A network of 52  
211 rain gauge stations and 11 discharge gauge stations were configured, with inputs and outputs  
212 by a monthly time-step. On the other hand, the meteorological data from 14 gauge stations  
213 (temperature, relative humidity, wind speed and cloudiness fraction) were taken from the  
214 National Institute of Meteorology and Center for Weather Forecasting and Climate Research  
215 (CPTEC) databases. For the basin characterization, we adopted the soil map from (De  
216 Oliveira et al., 1999) (1:500,000) and the land use map of 2010 from (Molin et al., 2015)  
217 (1:60,000).

218 The WEAP model was calibrated using an automatic PEST tool module (Doherty and Skahill,  
219 2006; Seong et al., 2015; Skahill et al., 2009; Stockholm Environment Institute (SEI), 2016)  
220 and manual techniques on a monthly basis. In the modeling process, a two-year warm-up  
221 period from 2004 to 2005 was established, for the calibration period from January 2006 to  
222 December 2010 and from January 2011 to August 2015 as the validation period. During this  
223 process, the following variables were calibrated: Kc (Crop Coefficient), SWC (Soil Water  
224 Capacity), DWC (Deep Water Capacity), RZC (Root Zone Conductivity) and PFD  
225 (Preferential Flow Direction). The chosen performance criteria, widely used in hydrologic  
226 applications, were the Volumetric Error Percent Bias (PBIAS), Standard Deviation Ratio  
227 (SDR), Nash-Sutcliffe Efficiency (NSE), NSE of the logarithmic of discharges (NSELog)  
228 which is more sensitive to low-flows, Coefficient of determination (R<sup>2</sup>) and Volumetric  
229 Efficiency (VE) criterion (Muleta, 2012).





230 The calibration and validation procedure of the hydrological model was carried out from  
231 upstream to downstream streams with historical discharge information (refers to the reservoirs  
232 inflows) from collected from ANA-HYDROWEB ([www.ana.gov.br](http://www.ana.gov.br)). Cantareira's reservoirs  
233 were set up as a single Equivalent System (ES), where the specific water demands are adapted  
234 (ANA and DAEE, 2004; PCJ/Comitês, 2006). This ES can be expressed as follows:

$$235 \quad ES_{Cantareira} = \sum_i^n QN_i - \sum_i^n WD_i \quad \text{Equation 1.}$$

236 where  $ES_{Cantareira}$  is the available water for withdrawal from the system,  $QN$  is the natural  
237 discharge from the reservoir  $i$  and  $WD$  is the specific water demand in each reservoir (such as  
238 the Piracicaba River demand).

239 It is worth noting the sub-basins areas are smaller than each cell of the adopted climate model  
240 (400 km<sup>2</sup>). Therefore, in order to adjust the dataset, the projections of the Eta-INPE scenarios  
241 had to be adapted from/to the original location of the gauge station, and corrected according  
242 to the observed historical climate conditions. The climate projections from Eta-HadGEM2-ES  
243 and Eta-MIROC5 under RCP 4.5 and 8.5 scenarios were used in the hydrologic model to  
244 evaluate the impacts and climate uncertainty in the discharge regime. The results can be seen  
245 in supplementary material – section B (Fig. B-1) and are represented as future time slices of  
246 30 years approximately: 2007-2040, 2041-2070 and 2071-2099, under the intermediary  
247 (pessimistic in this study) and optimistic RCP scenarios (IPCC, 2014).

### 248 3.2. SDF curve development

249 Following the flowchart of Figure 2, the Threshold Level Method (TLM) is traditionally used  
250 to estimate hydrological drought events from continuous discharge time series. TLM was  
251 originally called ‘Crossing Theory Techniques’ and it is also referred to as run-sum analysis  
252 (Hisdal et al., 2004; Nordin and Rosbjerg, 1970; Şen, 2015). Usually different values are used  
253 to define the threshold in hydrological drought analysis by the TLM approach (Tosunoglu and  
254 Kisi, 2016). In this study, two demand scenarios, approached as “threshold levels”, were used  
255 in the mean daily-monthly discharge data. Initially, a stationary demand of 31 m<sup>3</sup>/s was  
256 defined as the historical average demand and another non-stationary demand of 31 to 42 m<sup>3</sup>/s  
257 over time was defined as a hypothesis representative of the population growth in the SPRM  
258 (see Figure 3). These water demand values are consistent with the ANA/DAEE, 2004 study,  
259 according to the record and projection scenarios of the population growth of the IBGE<sup>1</sup>.

260

---

<sup>1</sup> Brazilian Institute of Geography and Statistics: <http://www.ibge.gov.br/home/>





261 Based on the time series of “severity” (or deficit, in m<sup>3</sup>) and duration (days) in the Cantareira  
 262 System, obtained from the hydrological modeling of the historical scenarios from the Eta-  
 263 INPE model (1962-2005), the SDF curves were constructed. To estimate the return periods of  
 264 drought events of a particular severity and duration, the block maxima GEV frequency  
 265 analysis distribution was used. In this case, the GEV distribution is useful because it provides  
 266 an expression that includes all three types of extreme value distributions (Tung et al., 2006).

267

268 In various studies addressing SDF curve development, the GEV distribution was consistent  
 269 with the data sets of extremes, where distributions that use three parameters were required to  
 270 express the upper tail data (J H Sung and Chung, 2014; Svensson et al., 2016; Todisco et al.,  
 271 2013; Zaidman et al., 2003). On the other hand, it is suggested that for other durations of  
 272 drought, other probability distribution functions can be explored (Dalezios et al., 2000;  
 273 Razmkhah, 2016). However, in this study we took advantage of the versatility of the GEV  
 274 distribution, considering its flexibility to fit a set of data through the expressions:

$$275 \quad F(x) = \exp \left[ - \left\{ 1 + \xi \left( \frac{x-\mu}{\sigma} \right) \right\}^{1/\xi} \right] \quad \xi \neq 0 \quad \text{Equation 2.}$$

$$276 \quad F(x) = \exp \left[ - \exp \left( - \frac{x-\mu}{\alpha} \right) \right] \quad \xi = 0 \quad \text{Equation 3.}$$

277 where the cumulative distribution function  $F(x)$  depends on  $\mu$  as a location parameter,  $\alpha$  as a  
 278 scale parameter and  $\xi$  as a shape parameter. Therefore, if,  $\mu + \alpha/\xi \leq x \leq \infty$  for  $\xi < 0$  is a Type  
 279 III (Weibull),  $-\infty \leq x \leq \infty$  for  $\xi = 0$  is a Type I (Gumbel), and  $-\infty \leq x \leq \mu + \alpha/\xi$  for  $\xi > 0$  is a  
 280 Type II (Fréchet) distribution (Stedinger et al., 1993).

281 In order to fill a considerable number of events per interval, droughts were classified into four  
 282 time intervals 31, 90, 180 and up to 365 days. Thus, considering the adoption of the GEV  
 283 distribution, the model parameters  $\xi$ ,  $\alpha$  and  $\mu$  for cumulative durations defined and return  
 284 periods of 2, 10 and 100 years were estimated using the Method of Maximum Likelihood  
 285 Estimator (MLE). The SDF curves of the hydrological drought in the Cantareira System are  
 286 shown in Figure 4. In addition, the adjusted parameters table and the diagnostic plots QQ-plot  
 287 and Return Level vs. Return Period for the GEV distribution can be seen in the supplementary  
 288 material as sections C and D.

289



290 **3.3. Water price and Hydrological drought relationship**

291 According to the flowchart of Figure 2, drought can be addressed as a somewhat unusual  
292 economic phenomenon in that it affects both supply (the source) and demand (users),  
293 especially in systems dependent on water from a single source (Moncur, 1987). As expected,  
294 episodes of water scarcity pose technical, legal, social and economic problems for managers  
295 of urban water systems. Traditionally to overcome these episodes, reservoirs play a key role  
296 in water supply and demand management, providing security against hydrological extremes  
297 (Mehran et al., 2015). However, when the water deficit intensifies, the structural measures are  
298 not enough and they must be accompanied by contingency measures.

299 In recent years, the Cantareira System played an important role to guarantee the water supply  
300 in the SPMR. Figure 5 shows the TLM analysis with a constant threshold under two discharge  
301 scenarios, a) monthly natural discharge and b) regulated discharge, where the regulated  
302 discharge is represented by the annual average aggregation of monthly natural discharges.  
303 Thus, without the reservoirs, i.e. withdrawals dependent on the instantaneous inflow, the  
304 average accumulated deficit over these 17 years would be 225% greater. Considering this  
305 assumption, the analysis showed two hydrological drought periods in 2000-2003 and 2010-  
306 2015 (Figure 5b); one with a lower and another with a higher deficit, respectively. While for  
307 the period from 2004 to 2009, a series of smaller droughts in both magnitude and frequency  
308 could be overcome by the reservoir system. On the other hand, in 2010-2015, the accumulated  
309 deficit, under the regulated scenario, would exceed the useful storage in 70%; while for the  
310 period 2000-2003, the accumulated deficit only reached 43% of the system's useful storage  
311 capacity. Therefore, it is clear that over a long period of deficit or strong multi-year droughts,  
312 the system of storage could be accompanied by contingency complementary measures.

313 Urban drought management programs incur costs that must be assumed to overcome the  
314 water crisis with equity (Molinos-Senante and Donoso, 2016). SABESP in the SPMR, for  
315 example, through price-based policies controlled the consumption rates of water users when  
316 the hydrological deficit scenarios were presented in the Cantareira System (Millerd, 1984,  
317 SABESP, 1996, Iglesias and Blanco, 2008), see Figure 6. Thus, during the 2014/2015 drought  
318 in SPMR, reactive economic contingencies were implemented, such as increased water tariff  
319 costs, extra fees and price incentives, which had a detrimental effect on the company's profit  
320 margin, which provides the water resource. (GESP, 2016). Although the relationship between  
321 the Water Deficit and the tariff Adjustment Rate show a relatively low Pearson correlation



322 coefficient “ $r_{xy}$ ” of 0.398, this may be useful given the lack of information regarding drought  
323 and its economic impacts on the study area.

324 In Brazil, each state-owned sanitation company has its own water charging policy, where the  
325 vast majority use block tariffs as a pricing policy, including SABESP (De Andrade Filho et  
326 al., 2015; Mesquita and Ruiz, 2013; Ruijs et al., 2008). In Sao Paulo State, the tariff policy  
327 system is regulated by Decree 41.446/96, also for services provided by SABESP. For the  
328 water tariff setting, several factors are taken into account, such as service costs, debtors  
329 forecast, expenses amortization, environmental and climatic conditions, quantity consumed,  
330 sectors and economic condition of the user (SABESP, 1996). These sectors are divided into  
331 residential, industrial, commercial or public, and the value that is charged for the service is  
332 always progressive. In other words, there is a standard minimum consumption with a fixed  
333 value and, based on that, such factors vary the consumption ranges (SABESP, 2016b). From  
334 the total water withdrawn from the Cantareira System, urban use is predominant in SPRM,  
335 where approximately 49% of the total is for household needs, 31% for industrial needs and  
336 20% for irrigation (Consórcio/PCJ, 2013). In this study, we consider the water-withdrawal for  
337 domestic and industrial use in the SPMR, because the direct dependence of these sectors on  
338 the SABESP water supply network, as well as the supply priority that these sectors have  
339 according to Brazilian law.

340 The water price formation study is not part of this work as it entails a complex  
341 microeconomic analysis, due to the diversity of variables in the process (Garrido, 2005).  
342 Additionally, the financial exposure does not always exhibit a strong correlation with weather  
343 indices (Zeff and Characklis, 2013). Therefore, in order to establish a water appraisal for the  
344 economic analysis, an empirical relationship between the water tariff and its availability  
345 according to the drought duration was developed. For this, the TLM analysis here presented  
346 was performed from the monthly discharge series during from 2000 to 2016 (Figure 6a),  
347 aiming to associate the resulting information with the previously obtained SDF curves. Thus,  
348 the top part of Figure 7 shows the drought duration and the annual tariff adjustment with a  
349 Pearson correlation coefficient “ $r_{xy}$ ” of 0.402 between them, while the lower part represents  
350 the volume deficit for each drought duration. Based on Figure 7, it can be observed that from  
351 greater drought durations and deficits, there is expected an increase in the water tariff for the  
352 following period. On the contrary, the smaller deficits are overcome with the water stored in  
353 the system and the increase in tariffs is a consequence of the annual Consumer Price Index  
354 (CPI) and other tariff updates according to the law.



355 According to the relationship established between the drought duration and the tariff  
356 adjustments, assigning the average water price for this study requires some additional  
357 assumptions explained as follows: (i) based on the current average rates for the domestic and  
358 industrial sectors that range from US\$ 2.27 to US\$ 4.48 per m<sup>3</sup>, respectively (SABESP,  
359 2016c), an average price was established for the analysis of US\$ 3.38 per m<sup>3</sup>, assuming that  
360 this value is given considering normal supply conditions, (ii) from the four intervals of  
361 drought duration considered for the SDF curve construction and the water tariff adjustments  
362 of the analyzed period (min. 3.15% to max. 18.9%, see Figure E-1 in supplementary material  
363 - section E), the water prices were established as a function of the drought duration by the  
364 "supply warranty time percentage" as shown in Table 2.

365 Based on the assumptions shown in Table 2, the demand curve for the Cantareira System was  
366 constructed as a function of the supply warranty time percentage (Figure 8). In this demand  
367 curve, the reservoir network is considered to ensure water supply and provides resilience  
368 during droughts of smaller magnitudes and duration. Overall, the curve represents the  
369 inelastic behavior of the Price Elasticity of Demand (PED); showing closer intervals as water  
370 supplies are reduced due to drought and higher prices imposed to try to reduce demands.  
371 Hence a successful price-based rationing policy, requires a progressive increase if the demand  
372 becomes predominantly inelastic (Mays and Tung, 2002), as the proposed hypothesis  
373 establishes in this case. More studies of price elasticity and water scarcity can be found in  
374 (Freire-González et al., 2017; Mansur and Olmstead, 2012; Ruijs et al., 2008).

375 From the drought events studied, i.e in 2000/2001 (Cavalcanti and Kousky, 2001), in  
376 2014/2015 (Nobre et al., 2016), which significantly affected the water supply, the TLM  
377 analysis showed the interdependence between annual events (Figure 6b). Consequently, the  
378 main impacts derived from water supply problems in the SPRM appear to be related to multi-  
379 year drought events and medium to high severity such as the recent event. Therefore, based  
380 on the 2000/2016 drought severity-duration-rate adjustment scenarios, three water supply  
381 warranty scenarios were established (see Figure 8): 100% water availability, water availability  
382 with storage dependency and water deficit with extra fees and other savings measures as a  
383 good management practice to prevent strong impacts.

384 Thus, the baseline scenarios were configured to estimate the projections of the loss of  
385 economic profits in the water utility company, due to the financial cost of the drought periods.  
386 These scenarios are represented by the Severity-Duration-Impact curves, which are shown in



387 Figure 9, under different recurrence events, climate projections and demand variability  
388 scenarios. Each pair of lines in Figures 9 a. b. (continuous and dashed) show the range of  
389 uncertainty associated with the considered change variables.

390 The final step of the methodology (see Figure 2) calculated the impacts in terms of the  
391 drought financial planning through the management horizons (2007-2040, 2041-2070 and  
392 2071-2099). This calculation was carried out for the cumulative drought duration periods  
393 greater than 180 days, considering that from this duration, the supply begins to show  
394 important dependence of the Cantareira reservoir System.

#### 395 **4. Results and discussions**

396 The results section will be divided into: (i) hydrological modeling, (ii) SDF curves and (iii)  
397 economic results under climate changes.

##### 398 **4.1. Hydrological modeling**

399 The hydrological model structure performed in monthly time steps, calibrated and validated  
400 following a manually and automatic procedure. To improve the calibration procedure,  
401 multiple statistical evaluation criteria were used, aiming to reduce the specific bias of any of  
402 these, given the characteristics of the modeled series (Kumarasamy and Belmont, 2017). The  
403 performance criteria of calibration and validation periods are shown in Table 3. The colors in  
404 the Table 3 represent the classifications suggested by (Moriasi et al., 2007) and are as follows:  
405 green for “very good” ( $NSE > 0.75$ ;  $PBIAS < \pm 10\%$ ;  $RSR < 0.50$ ), yellow for “good or  
406 satisfactory” ( $0.75 > NSE > 0.5$ ;  $\pm 10\% < PBIAS < \pm 25\%$ ;  $0.50 < RSR < 0.60$ ), red for  
407 “unsatisfactory” ( $NSE < 0.5$ ;  $PBIAS > \pm 25\%$ ;  $RSR > 0.70$ ). Moreover, the correlation  
408 coefficient ( $R^2$ ) and the VE criterion values close to 1.0 mean that the prediction dispersion is  
409 equal to that of the observation (Krause and Boyle, 2005; Muleta, 2012). Additionally, the  
410 hydrographs for calibration and validation periods are shown in Figure 10. It is important to  
411 note that in the validation period (2011-2015), part of the recent drought event was simulated.

412 Individual watershed hydrological modelling performance ratings are presented in  
413 supplementary material - section A, Table A-1; also several statistical criteria were considered  
414 to evaluate the calibration process, where each criterion covers a different aspect of the  
415 resulting hydrograph. This is important because analyzing multiple statistics can provide an  
416 overall view of the model based on a comprehensive set of indexes on the parameters  
417 representing the statistics of the mean and extreme values of the hydrograph (Moriasi et al.,  
418 2007). Five basins were modeled within the Jaguarí-Jacaré sub-system (Sub B-F28, B-F23,



419 B-F25, Jaguarí and Jacareí). This sub-system represents approximately 46% of the total  
420 available water and showed the best modelling performance statistics, compared to the other  
421 subsystems.

#### 422 **4.2. SDF curves**

423 Using the traditional frequency analysis, the severity-duration-frequency curves for two  
424 threshold levels and two RCMs discharge outputs were developed as shown in Fig. 4. For the  
425 SDF curves configuration, the Generalized Extreme Values (GEV) function was used. Thus,  
426 from the SDF results it can be observed that:

427 According to the fit data set (supplementary material - section C), the shape parameter ( $\xi$ )  
428 varies with the drought duration, therefore for a drought interval of more than 180 days, the  
429 Probability Distribution Function (PDF) Type I presents a better fit, even for the two  
430 proposed demand scenarios. On the other hand, droughts with duration intervals of less than  
431 90 days, under stationary and non-stationary demand scenarios, had a better fit to FDP Type  
432 III (see Tables D-1 to D-4 in supplementary material - section D). Moreover, the fit diagnostic  
433 plots "Empirical quantile vs Model quantile" (QQ-plot) and "Return level vs Return period"  
434 (RR-plot) show the relationship between the model, the data fit and prediction capacity  
435 (supplementary material - section C). Thus, in terms of the quantiles, the QQ-plot shows the  
436 data trend to follow the model line in most cases. While the predictive capacity of the model,  
437 represented by the RR-plot, shows a decrease as the return period increases.

#### 438 **4.3. Economic impacts under climate change**

439 Based on the methodological approach (see Figure 2), the potential economic impacts were  
440 calculated, produced by hydrological droughts greater than 180 days. These impacts are  
441 presented considering the climate, demand, time and recurrence scenarios. Thus, the net  
442 present value (NPV) of the economic detriment to the water utility company and the  
443 percentage difference (Dif. %) between the demand scenarios are shown in Tables 4, 5 and 6  
444 for each period.

445

446 From the results in Tables 4, 5 and 6, it can be observed that the economic impact is higher  
447 for higher return periods as well as the step of stationary demand to non-stationary demand, as  
448 expected. In addition, it is not possible to observe a differentiated trend in the results, when  
449 they are forced by two different radiative scenarios over time. However, the scenarios nested  
450 within HadGEM-ES, on average, presented lower values or with less economic impact, when  
451 compared to the nested scenarios within MIROC5. Overall, the loss of economic profit from



452 2041 to 2070 showed lower values compared to the other two periods analyzed, probably due  
453 to a more optimistic climate scenario in terms of surface water availability.

454 In Figure 11a, the box plot shows the dispersion of the economic impacts grouped under each  
455 climate model by time periods. Results related to the MIROC5 model present a greater  
456 dispersion than those related to the HadGEM-ES model. In this case, the upper extreme  
457 values are related to the MIROC5 model, while the lower extreme values are similarly  
458 distributed between the models. On the other hand (Figure 11b), the difference, in percentage,  
459 related to the MIROC5 model show higher magnitudes and more stable differences over time  
460 than those related to the HadGEM-ES model, denoting an impact-driven differentiation  
461 between climatic models. Moreover, it can be observed in Figure 11 that, in response to the  
462 growing projected demand, it will be expected an increase, in terms of the average percentage  
463 of differences, for different time periods and for both climatic models.

464 In general, these results show the high complexity of the SPRM's drought risk and the  
465 fragility of local GDP heavily dependent on water for their development. In the specific  
466 impacts on the company's economy, the results showed losses per period between US\$ 7929  
467 and US\$ 64582 million; these values, compared to the Gross Domestic Product (GPD),  
468 represent an amount of between 1.3% and 10.3% of the last GDP in the state of São Paulo in  
469 2016. As a consequence, the direct economic impacts on the water utility company, added to  
470 other inherent problems to water shortage, can lead to a financial crisis with serious  
471 repercussions in local economies.

## 472 **5. Conclusions and recommendations**

473 This paper developed a methodology with application to assess economic impacts of drought  
474 risks for water utilities through a framework under climate change scenarios. The SDF  
475 framework has linked climate, hydrology and economy factors, using Sao Paulo Metropolitan  
476 Region dependence on the Cantareira Water Supply System, Brazil. In this paper, we consider  
477 these results preliminary, but with valuable information for a water utility interested in the  
478 drought risk losses. Thus, the expected profit loss over the long-term would serve as the initial  
479 estimate for financial contingency arrangements as insurance schemes, or community  
480 contingency funds. In general, the SDF framework here developed can be proposed as a  
481 planning tool to mitigating drought-related revenue losses as well as being useful for  
482 development of water resource securitization strategy in sectors that depend on water to  
483 sustain their economies.





484 Methodologically, first we characterized the hydrological droughts through the SDF curves,  
485 from the hydrological modeling by the baseline period of the RCM. Second, the SDF was  
486 coupled with a local water demand development based on the supply warranty time  
487 percentage during the drought events. Under these assumptions, an empirical drought  
488 economic impact curve was setup, representing the Water Utility Company profit losses due  
489 to the impossibility of supplying demand during hydrological drought periods. Additionally,  
490 our results could elicit further implications for drought risk reduction and management.

491 On the one hand, this SDF framework could help analyzing the impacts from key drivers, like  
492 climate, land use and water withdrawal rates in complex or recurrent drought patterns. Also,  
493 this SDF framework could couple interdisciplinary studies, with better relationships towards  
494 the nexus of water security, energy security and food security. Thus, we recommend future  
495 research of SDF framework linked to: Palmer's drought indices (Rossato et al., 2017), model-  
496 based framework to disaster management (Horita et al., 2017), ecosystem-based assessment  
497 for water security modeling (Taffarello et al., 2017), effectiveness of drought securitization  
498 under climate change scenarios (Mohor and Mendiondo, 2017). Moreover, SDF framework is  
499 capable of integrating actions towards: dynamic price incentive programs related to wise  
500 human-water co-evolution patterns, water-sensitive programs under deep cultural features,  
501 socio-hydrological observatories for water security, feasibility analysis of the economic  
502 impacts of implementing new technologies for water economy and flow measurement,  
503 leakage control, detecting and legalizing illegal connections and water reuse, among others.  
504 Furthermore, dissimilarities pointed from climate scenarios (see i.e. Figure 11) would suggest  
505 a set of possibilities to face the uncertainty. For instance, that SDF framework would guide  
506 the decision-making of water utility profits to cope with economic impacts of drought risks in  
507 long and medium term.

508 For further studies, it should be considered: that despite having achieved an acceptable  
509 performance, the inclusion of more gauge stations could not only improve calibration  
510 performance but also cover a larger sample space of events, increasing the confidence of  
511 projections. On the other hand, in order to have a methodological comparative standard, more  
512 regional studies of SDF curves need to be implemented, considering the spatialized analysis  
513 and broader statistics methods. Finally, it is a fact that the reliability of SDF curve estimates  
514 depends on the quality and extent of the records used, or in this case, the capacity of regional  
515 climate models to reproduce the observed distribution of extreme events.



516 **Acknowledgments**

517 The authors thank the support of several agencies of Brazil and Colombia: the Administrative  
518 Department of Science, Technology and Innovation (COLCIENCIAS) Doctoral Program  
519 Abroad, CAPES-PROEX-1650/2017/23038.013525/2017-30, CAPES Pró-Alertas  
520 #88887.091743/2014-01, CNPq #307637/2012-3, CNPq #312056/2016-8 PQ and CNPq  
521 #465501/2014-1 and FAPESP 2014/50848-9 Water Security of the INCT-Climate Change II.  
522 The Sao Paulo State Water Utility Company, SABESP, kindly provided relevant information  
523 for this study. All co-authors declare no conflict of interest.

524

525 **References**

526 ANA, DAEE. Subsídios para a Análise do Pedido de Outorga do Sistema Cantareira e Para a  
527 Definição das Condições de Operação dos seus Reservatórios. Estado de São Paulo,  
528 2004.

529 Asadih, B., Krakauer, N.Y. Global change in flood and drought intensities under climate  
530 change in the 21st century. *Hydrol. Earth Syst. Sci.* 1–22, 2017.

531 Bachmair, S., Svensson, C., Hannaford, J., Barker, L.J., Stahl, K. A quantitative analysis to  
532 objectively appraise drought indicators and model drought impacts. *Hydrol. Earth Syst.*  
533 *Sci.* 20, 2589–2609. doi:10.5194/hess-20-2589-2016, 2016.

534 Balbus, J. Understanding drought's impacts on human health. *Lancet Planet. Heal.* 1, e12.  
535 doi:10.1016/S2542-5196(17)30008-6, 2017.

536 Baumgärtner, S., Strunz, S. The economic insurance value of ecosystem resilience. *Ecol.*  
537 *Econ.* 101, 21–32. doi:10.1016/j.ecolecon.2014.02.012, 2014.

538 Berman, J.D., Ebisu, K., Peng, R.D., Dominici, F., Bell, M.L. Articles Drought and the risk of  
539 hospital admissions and mortality in older adults in western USA from 2000 to 2013 : a  
540 retrospective study. *Lancet Planet Heal.* 1, e17–e25. doi:10.1016/S2542-5196(17)30002-  
541 5, 2013.

542 Bhave, A.G., Mishra, A., Raghuvanshi, N.S. A combined bottom-up and top-down approach  
543 for assessment of climate change adaptation options. *J. Hydrol.* 518, 150–161.  
544 doi:10.1016/j.jhydrol.2013.08.039, 2014.

545 Blain, G.C., 2010. Precipitação pluvial e temperatura do ar no Estado de São Paulo:



- 546 periodicidades , probabilidades associadas , tendências e variações climáticas.  
547 Universidade de São Paulo.
- 548 Bressers, H., Bressers, N. Governance for Drought Resilience Land and Water Drought  
549 Management in Europe. springer Open, AG Switzerland. doi:10.1007/978-3-319-29671-  
550 5, 2016.
- 551 Cavalcanti, I.F.A., Kousky, V.E. Drought in Brazil During Summer and fall 2001 and  
552 Associated Atmospheric Circulation Features. *Rev. Climanálise* 1, 1–10, 2001.
- 553 Chou, S.C., Lyra, A., Mourão, C., Dereczynski, C., Pilotto, I., Gomes, J., Bustamante, J.,  
554 Tavares, P., Silva, A., Rodrigues, D., Campos, D., Chagas, D., Sueiro, G., Siqueira, G.,  
555 Marengo, J. Assessment of Climate Change over South America under RCP 4.5 and 8.5  
556 Downscaling Scenarios. *Am. J. Clim. Chang.* 3, 512–527. doi:10.4236/ajcc.2014.35043,  
557 2014a.
- 558 Chou, S.C., Lyra, A., Mourão, C., Dereczynski, C., Pilotto, I., Gomes, J., Bustamante, J.,  
559 Tavares, P., Silva, A., Rodrigues, D., Campos, D., Chagas, D., Sueiro, G., Siqueira, G.,  
560 Nobre, P., Marengo, J. Evaluation of the Eta Simulations Nested in Three Global  
561 Climate Models. *Am. J. Clim. Chang.* 3, 438–454. doi:10.4236/ajcc.2014.35039, 2014b.
- 562 Consórcio/PCJ. Sistema Cantareira : Um Mar de Desafios. Compilado de Textos, Informações  
563 e Subsídios voltados a Renovação da Outorga do Sistema Cantareira. Sao Paulo, 2013.
- 564 Coutinho, R.M., Kraenkel, R.A., Prado, P.I. Catastrophic Regime Shift in Water Reservoirs  
565 and São Paulo Water Supply Crisis. *PLoS One* 1–14. doi:10.1371/journal.pone.0138278,  
566 2015.
- 567 Dalezios, N.R., Loukas, A., Vasiliades, L. Severity-duration-frequency analysis of droughts  
568 and wet periods in Greece. *Hydrol. Sci. J.* 45. doi:10.1080/02626660009492375, 2000.
- 569 De Andrade, C. Managing Water ( In ) security in Brazil- Lessons from a Megacity,  
570 International Development. London, 2016.
- 571 De Andrade Filho, M., Ortiz, J., de Oliveira, M. Water Pricing in Brazil: Successes, Failures,  
572 and New Approaches, in: Dinar, A., Pochat, V., Albiac-Murilo, J., Farolfi, S., Saleth, R.  
573 (Eds.), *Water Pricing Experiences and Innovations*. Springer International Publishing  
574 Switzerland, Springer Cham Heidelberg New York Dordrecht London, p. 485.  
575 doi:10.1007/978-3-319-16465-6, 2015.



- 576 De Oliveira, J.B., Camrargo, M., Rossi, M., Filho, B.C. Mapa Pedológico do Estado de São  
577 Paulo, 1 Edition. ed. Embrapa, IAC, Campinas, 1999.
- 578 Doherty, J., Skahill, B.E. An advanced regularization methodology for use in watershed  
579 model calibration. *J. Hydrol.* 564–577. doi:10.1016/j.jhydrol.2005.11.058, 2006.
- 580 Dufek, A.S., Ambrizzi, T. Precipitation variability in São Paulo State, Brazil. *Theor. Appl.*  
581 *Climatol.* 93, 167–178. doi:10.1007/s00704-007-0348-7, 2008.
- 582 Esteve, P., Varela-Ortega, C., Blanco-Gutiérrez, I., Downing, T.E. A hydro-economic model  
583 for the assessment of climate change impacts and adaptation in irrigated agriculture.  
584 *Ecol. Econ.* 120, 49–58. doi:10.1016/j.ecolecon.2015.09.017, 2015.
- 585 Falkenmark, M., Lannerstad, M. Consumptive water use to feed humanity – curing a blind  
586 spot. *Hydrol. Earth Syst. Sci. Discuss.* 1, 7–40. doi:10.5194/hessd-1-7-2004, 2004.
- 587 Forni, L.G., Medellín-Azuara, J., Tansey, M., Young, C., Purkey, D., Howitt, R. Integrating  
588 complex economic and hydrologic planning models\_ An application for drought under  
589 climate change analysis. *Water Resour. Econ.* 16, 15–27. doi:10.1016/j.wre.2016.10.002,  
590 2016.
- 591 Freire-González, J., Decker, C., Hall, J.W. The Economic Impacts of Droughts: A Framework  
592 for Analysis. *Ecol. Econ.* 132, 196–204. doi:10.1016/j.ecolecon.2016.11.005, 2017.
- 593 Frick, D.M., Bode, D., Salas, J.D. Effect of Drought on Urban Water Supplies. I: Drought  
594 Ananalysis. *J. Hydraul. Eng.* 116, 733–753, 1990.
- 595 Garrido, R. Price Setting for Water Use Charges in Brazil Price Setting for Water Use  
596 Charges in Brazil. *Int. J. Water Resour. Dev.* 21, 99–117.  
597 doi:10.1080/0790062042000316839, 2005.
- 598 GESP. Relatório da Administração 2016 - Companhia de Saneamento Básico do Estado de  
599 São Paulo - SABESP. Sao Paulo, 2016.
- 600 Groves, D.G., Yates, D., Tebaldi, C. Developing and applying uncertain global climate  
601 change projections for regional water management planning. *Water Resour. Res.* 44, 1–  
602 16. doi:10.1029/2008WR006964, 2008.
- 603 Haddad, E.A., Teixeira, E. Economic impacts of natural disasters in megacities: The case of  
604 floods in Sao Paulo, Brazil. *Habitat Int.* 45, 106–113.



- 605       doi:10.1016/j.habitatint.2014.06.023, 2015.
- 606       Hanbury, S. “Brazil’s Worst Drought in History Prompts Protests and Blackouts”, in The  
607       Guardian, 23 January 2015. Available at: [http://www.theguardian.com/world/2015/](http://www.theguardian.com/world/2015/Jan/23/brazil-worst-drought-history)  
608       Jan/23/brazil-worst-drought-history. Accessed on: 28/2/15, 2015.
- 609       Hao, Z., Singh, V.P. Drought characterization from a multivariate perspective : A review. J.  
610       Hydrol. 527, 668–678. doi:10.1016/j.jhydrol.2015.05.031, 2015.
- 611       Haylock, M.R., Peterson, T.C., Alves, L.M., Ambrizzi, T., Anuncia???, Y.M.T., Baez, J.,  
612       Barros, V.R., Berlato, M.A., Bidegain, M., Coronel, G., Corradi, V., Garcia, V.J.,  
613       Grimm, A.M., Karoly, D., Marengo, J.A., Marino, M.B., Moncunill, D.F., Nechet, D.,  
614       Quintana, J., Rebello, E., Rusticucci, M., Santos, J.L., Trebejo, I., Vincent, L.A. Trends  
615       in total and extreme South American rainfall in 1960–2000 and links with sea surface  
616       temperature. J. Clim. 19, 1490–1512. doi:10.1175/JCLI3695.1, 2006.
- 617       Hisdal, H., Tallaksen, L.M., Clausen, B., Peters, E., Gustard, A. Hydrological Drought  
618       Characteristics, in: Tallaksen, L.M., Van Lanen, H.A.J. (Eds.), Hydrological Drought:  
619       Processes and Estimation Methods for Streamflow and Groundwater. Elsevier:  
620       Developments in Water Science, Oslo, Norway, p. 449, 2004.
- 621       Horita, F.E.A., de Albuquerque, J.P., Marchezini, V., Mendiondo, E.M. Bridging the gap  
622       between decision-making and emerging big data sources: An application of a model-  
623       based framework to disaster management in Brazil. Decis. Support Syst. 97, 12–22.  
624       doi:10.1016/j.dss.2017.03.001, 2017.
- 625       Howells, M., Hermann, S., Welsch, M., Bazilian, M., Segerström, R., Alfstad, T., Gielen, D.,  
626       Rogner, H., Fischer, G., Velthuizen, H. Van, Wiberg, D., Young, C., Roehrl, R.A.,  
627       Mueller, A., Steduto, P. energy and water strategies. Nat. Publ. Gr. 3, 621–626.  
628       doi:10.1038/nclimate1789, 2013.
- 629       Huang, S., Li, P., Huang, Q., Leng, G., Hou, B., Ma, L. The propagation from meteorological  
630       to hydrological drought and its potential influence factors. J. Hydrol. 547, 184–195.  
631       doi:10.1016/j.jhydrol.2017.01.041, 2017.
- 632       Iglesias, E., Blanco, M. New directions in water resources management:The role of water  
633       pricing policies. Water Resources Researach. Vol. 44, W06417,  
634       doi:10.1029/2006WR005708, 2008.



- 635 IPCC. Climate Change 2014 Synthesis Report Summary Chapter for Policymakers, 2014..
- 636 Krause, P., Boyle, D.P. Comparison of different efficiency criteria for hydrological model  
637 assessment. *Adv. Geosci.* 5, 89–97. doi:10.5194/adgeo-5-89-2005, 2005.
- 638 Kumarasamy, K., Belmont, P. Multiple domain evaluation of watershed hydrology models.  
639 *Hydrol. Earth Syst. Sci. Discuss.* 1–32. doi:10.5194/hess-2017-121, 2017.
- 640 Kunreuther, H., Heal, G., Allen, M., Edenhofer, O., Field, C.B., Yohe, G. Risk management  
641 and climate change. *Nat. Clim. Chang.* 3, 447–450. doi:10.1038/nclimate1740, 2013.
- 642 Lloyd-hughes, B. The impracticality of a universal drought definition. *Theor. Appl. Climatol.*  
643 117, 6007–611. doi:10.1007/s00704-013-1025-7, 2013.
- 644 Mansur, E.T., Olmstead, S.M. The value of scarce water: Measuring the inefficiency of  
645 municipal regulations. *J. Urban Econ.* 71, 332–346. doi:10.1016/j.jue.2011.11.003, 2012.
- 646 Marengo, J.A., Ambrizzi, T., da Rocha, R.P., Alves, L.M., Cuadra, S. V., Valverde, M.C.,  
647 Torres, R.R., Santos, D.C., Ferraz, S.E.T. Future change of climate in South America in  
648 the late twenty-first century: Intercomparison of scenarios from three regional climate  
649 models. *Clim. Dyn.* 35, 1089–1113. doi:10.1007/s00382-009-0721-6, 2009a.
- 650 Marengo, J.A., Jones, R., Alves, L.M., Vlaverde, M.C. Future change of temperature and  
651 precipitation extremes in South America as derived from the PRECIS regional climate  
652 modeling system. *Int. J. Climatol.* 4. doi:10.1002/joc.1863, 2009.
- 653 Marengo, J.A., Rusticucci, M., Penalba, O., Renom, M. An intercomparison of observed and  
654 simulated extreme rainfall and temperature events during the last half of the twentieth  
655 century: Part 2: Historical trends. *Clim. Change* 98, 509–529. doi:10.1007/s10584-009-  
656 9743-7, 2009b.
- 657 Marengo, J.A., Nobre, C.A., Seluchi, M., Cuartas, A., Alves, L.M., Mendiondo, E.M.,  
658 Obregón, G., Sampaio, G. A seca e a crise hídrica de 2014-2015 em São Paulo. *Rev.*  
659 *USP* 116, 31–44. doi:10.11606/issn.2316-9036.v0i106p31-44, 2015.
- 660 Mays, L.W., Tung, Y.-K. Economics for Hydrosystems, in: *Hydrosystemas Engineering and*  
661 *Management*. McGraw-Hill, pp. 23–50, 2002.
- 662 Mehran, A., Mazdiyasn, O., Aghakouchak, A. A hybrid framework for assessing  
663 socioeconomic drought: Linking climate variability, local resilience, and demand. *J.*



- 664 Geophys. Researsearch Atmos. 7520–7533. doi:10.1002/2015JD023147.Received, 2015.
- 665 Mesquita, A.M., Ruiz, R.M. A financial economic model for urban water pricing in Brazil.  
666 Urban Water J. 9006, 85–96. doi:10.1080/1573062X.2012.699073, 2013.
- 667 Millerd, F.W. The Role of Pricing in Managing the Demand for Water. Can. Water Resour. J.  
668 / Rev. Can. des ressources hydriques 9, 7–16. doi:10.4296/cwrj0903007, 1984.
- 669 Mishra, A.K., Singh, V.P. A review of drought concepts. J. Hydrol. 391, 202–216.  
670 doi:10.1016/j.jhydrol.2010.07.012, 2010.
- 671 Mohor, G.S., Mendiondo, E.M. Economic indicators of hydrologic drought insurance under  
672 water demand and climate change scenarios in a Brazilian context. Ecol. Econ. 140, 66–  
673 78. doi:10.1016/j.ecolecon.2017.04.014, 2017.
- 674 Molin, P.G., Tomas, F., Souza, D., Molin, P.G., Tomas, F., Souza, D., Sampaio, J.V.,  
675 Aparecida, A. Mapeamento de uso e cobertura do solo da bacia do rio Piracicaba , SP :  
676 Anos 1990 , 2000 e 2010. Sao Paulo, 2015.
- 677 Molinos-Senante, M., Donoso, G. Water scarcity and affordability in urbanwater pricing: A  
678 case study of Chile. Utilities Policy. <http://dx.doi.org/10.1016/j.jup.2016.04.014>, 2016.
- 679 Moncur, J.E.T. Urban water pricing and drought management. Water Resour. Res. 23, 393–  
680 398. doi:10.1029/WR023i003p00393, 1987.
- 681 Montanari, A., Young, G., Savenije, H.H.G., Hughes, D., Wagener, T., Ren, L.L.,  
682 Koutsoyiannis, D., Cudennec, C., Toth, E., Grimaldi, S., Blöschl, G., Sivapalan, M.,  
683 Beven, K., Gupta, H., Hipsey, M., Schaefli, B., Arheimer, B., Boegh, E., Schymanski,  
684 S.J., Di Baldassarre, G., Yu, B., Hubert, P., Huang, Y., Schumann, A., Post, D.A.,  
685 Srinivasan, V., Harman, C., Thompson, S., Rogger, M., Viglione, A., McMillan, H.,  
686 Characklis, G., Pang, Z., Belyaev, V. “Panta Rhei—Everything Flows”: Change in  
687 hydrology and society—The IAHS Scientific Decade 2013–2022. Hydrol. Sci. J. 58,  
688 1256–1275. doi:10.1080/02626667.2013.809088, 2013.
- 689 Moriasi, D.N., Arnold, J.G., Van Liew, M.W., Binger, R.L., Harmel, R.D., Veith, T.L. Model  
690 evaluation guidelines for systematic quantification of accuracy in watershed simulations.  
691 Trans. ASABE 50, 885–900. doi:10.13031/2013.23153, 2007.
- 692 Mousavi, S.J., Anzab, N.R. Multi-Objective Optimization-Simulation for Reliability-Based  
693 Inter-Basin Water Allocation. Water Resour. Manag. doi:10.1007/s11269-017-1678-6,





- 694 2017.
- 695 Muleta, M.K. Model Performance Sensitivity to Objective Function during Automated  
696 Calibrations. *J. Hydrol. Eng.* 17, 756–767. doi:10.1061/(ASCE)HE.1943-5584.0000497,  
697 2012.
- 698 Nam, W.-H., Hayes, M.J., Svoboda, M.D., Tadesse, T., Wilhite, D.A. Drought hazard  
699 assessment in the context of climate change for South Korea. *Agric. Water Manag.* 160,  
700 106–117. doi:10.1016/j.agwat.2015.06.029, 2015.
- 701 Nobre, C.A., Marengo, J.A. Water crises and megacities in Brazil: Meteorological context of  
702 the São Paulo drought of 2014-2015 (No. Posted on October 17, 2016 in Climate  
703 Change, Environment, Urban Water, Water Security), Global Water Forum, 2016..
- 704 Nobre, C.A., Marengo, J.A., Seluchi, M.E., Cuartas, A., Alves, L.M. Some Characteristics  
705 and Impacts of the Drought and Water Crisis in Southeastern Brazil during 2014 and  
706 2015. *J. of Water Resour. Prot.* 8, 252–262. doi:10.4236/jwarp.2016.82022, 2016.
- 707 Nobre, C.A., Young, A.F., Marengo, J.A., Nobre, A.D., Ojima, R. Vulnerabilidades Das  
708 Megacidades Brasileiras Às Mudanças Climáticas : Região Metropolitana, 2011.
- 709 Nordin, C.F., Rosbjerg, D.M. Applications of Crossing Theory in Hydrology. *Int. Assoc. Sci.*  
710 *Hydrol.* 6024, 27–43. doi:10.1080/02626667009493929, 1970.
- 711 PCJ/Comitês. Relatório da situação dos recursos hídricos 2016 UGRHI 05 - Bacias  
712 hidrográficas dos rios Piracicaba , Capivari e Jundiáí ano base – 2015, 2016.
- 713 PCJ/Comitês. Fundamentos da Cobrança pelo Uso dos Recursos Hídricos nas Bacias PCJ.  
714 Sao Paulo, 2006.
- 715 Prudhomme, C., Giuntoli, I., Robinson, E.L., Clark, D.B., Arnell, N.W., Dankers, R., Fekete,  
716 B.M., Franssen, W., Gerten, D., Gosling, S.N., Hagemann, S., Hannah, D.M.  
717 Hydrological droughts in the 21st century , hotspots and uncertainties from a global  
718 multimodel ensemble experiment. *PNAS* 111. doi:10.1073/pnas.1222473110, 2014.
- 719 Psomas, A., Panagopoulos, Y., Konsta, D., Mimikou, M. Designing water efficiency  
720 measures in a catchment in Greece using WEAP and SWAT models. *Procedia Eng.* 162,  
721 269–276. doi:10.1016/j.proeng.2016.11.058, 2016.
- 722 Purkey, D.R., Joyce, B., Vicuna, S., Hanemann, M.W., Dale, L.L., Yates, D., Dracup, J.A.



- 723 Robust analysis of future climate change impacts on water for agriculture and other  
724 sectors: a case study in the Sacramento Valley. *Clim. Chang.* 87, 109–122.  
725 doi:10.1007/s10584-007-9375-8, 2008.
- 726 Razmkhah, H. Preparing stream flow drought severity-duration-frequency curves using  
727 threshold level method. *Arab. J. Geosci.* 9, 1–10. doi:10.1007/s12517-016-2528-1, 2016.
- 728 Rodríguez-Lado, L., Sparovek, G., Vidal-Torrado, P., Dourado-Neto, D., Macías-Vázquez, F.  
729 Modelling Air Temperature for the State of Sao Paulo, Brazil. *Sci. Agric.* 64, 460–467,  
730 2007.
- 731 Rossato, L., Marengo, J.A., Angelis, C.F. De, Bassi, L., Pires, M. Impact of soil moisture over  
732 Palmer Drought Severity Index and its future projections in Brazil. *Brazilian J. Water*  
733 *Resour.* 22, 2017.
- 734 Ruijs, A., Zimmermann, A., Berg, M. Van Den, Paulo, S. Demand and distributional effects  
735 of water pricing policies. *Ecol. Econ.* 6, 506–516. doi:10.1016/j.ecolecon.2007.10.015,  
736 2008.
- 737 SABESP. DECRETO Nº 41.446 de 16 Dezembro de 1996 (Regulamento do sistema tarifário  
738 dos serviços prestados pela Companhia de Saneamento Básico do Estado de São Paulo -  
739 SABESP), 1996.
- 740 SABESP, C. de S.B. do E. de S.P. Relatório de Sustentabilidade 2016, 2016a.
- 741 SABESP, C. de S.B. do E. de S.P. Informações Financeiras e Operacionais / Tabela com os  
742 últimos reajustes. Sabesp Site.  
743 <http://www.sabesp.com.br/CalandraWeb/CalandraRedirect/?temp=4&proj=investidoresnovo&pub=T&db=&docid=9AA0FF2088FBF0A8832570DF006DE413&docidPai=AB82F8DBCD12AE488325768C0052105E&pai=filho10> (accessed 8.10.17), 2016b.
- 746 Şen, Z. *Applied Drought Modeling , Prediction , and Mitigation.* Elsevier, 2015.
- 747 Seong, C., Her, Y., Benham, B.L. Automatic Calibration Tool for Hydrologic Simulation  
748 Program-FORTRAN Using a Shuffled Complex Evolution Algorithm. *Water* 503–527.  
749 doi:10.3390/w7020503, 2015.
- 750 Shi, P., Wang, J., Xu, W., Ye, T., Yang, S., Liu, L., Fang, W., Liu, K., Li, N., Wang, M.  
751 *World Atlas of Natural Disaster Risk.* doi:10.1007/978-3-662-45430-5\_17, 2015.



- 752 Skahill, B.E., Baggett, J.S., Frankenstein, S., Downer, C.W. Environmental Modelling &  
753 Software More efficient PEST compatible model independent model calibration.  
754 Environ. Model. Softw. 24, 517–529. doi:10.1016/j.envsoft.2008.09.011, 2009.
- 755 Smakhtin, V.U., Schipper, E.L.F. Droughts: The impact of semantics and perceptions. Water  
756 Policy 10, 131–143. doi:10.2166/wp.2008.036, 2008.
- 757 Stahl, K., Kohn, I., Blauhut, V., Urquijo, J., De Stefano, L., Acacio, V., Dias, S., Stagge, J.H.,  
758 Tallaksen, L.M., Kampragou, E., Van Loon, A.F., Barker, L.J., Melsen, L.A., Bifulco,  
759 C., Musolino, D., De Carli, A., Massarutto, A., Assimacopoulos, D., Van Lanen, H.A.J.  
760 Impacts of European drought events: Insights from an international database of text-  
761 based reports. Nat. Hazards Earth Syst. Sci. 16, 801–819. doi:10.5194/nhess-16-801-  
762 2016, 2016.
- 763 Stedinger, J.R., Vogel, R.M., Foufoula-Georgio, E. Frequency Analysis of Extreme Events,  
764 in: Maidment, D.R. (Ed.), Handbook of Hydrology. McGraw-Hill, New York, p. 1,  
765 1993.
- 766 Stockholm Environment Institute (SEI). Tutorial Water Evaluation And Planning System  
767 (WEAP), 2016..
- 768 Sung, J.H., Chung, E. Development of streamflow drought severity – duration – frequency  
769 curves using the threshold level method. Hydrol. Earth Syst. Sci. 3341–3351.  
770 doi:10.5194/hess-18-3341-2014, 2014.
- 771 Svensson, C., Hannaford, J., Prosdocimi, I. Statistical distributions formonthly aggregations  
772 of precipitation and streamflow in drought indicator applications. Water Resour. Manag.  
773 999–1018. doi:10.1002/2016WR019276.Received, 2016.
- 774 Taffarello, D., Guimarães, J., de Sousa Lombardi, R.K., do Carmo Calijuri, M., Mendiondo,  
775 E.M. Hydrologic Monitoring Plan of the Brazilian Water Producer/PCJ Project. J.  
776 Environ. Prot. (Irvine,. Calif). 7, 1956–1970. doi:10.4236/jep.2016.712152, 2016a.
- 777 Taffarello, D., Samprogna Mohor, G., do Carmo Calijuri, M., Mendiondo, E.M. Field  
778 investigations of the 2013–14 drought through quali-quantitative freshwater monitoring  
779 at the headwaters of the Cantareira System, Brazil. Water Int. 8060, 1–25.  
780 doi:10.1080/02508060.2016.1188352, 2016b.
- 781 Taffarello, D., Srinivasan, R., Mohor, G.S., B, J.L. Modelling freshwater quality scenarios



- 782 with ecosystem-based adaptation in the headwaters of the Cantareira system , Brazil.  
783 Hydrol. Earth Syst. Sci. Discussion, 2017.
- 784 Todisco, F., Mannocchi, F., Vergni, L. Severity – duration – frequency curves in the  
785 mitigation of drought impact: an agricultural case study. Nat. Hazards 1863–1881.  
786 doi:10.1007/s11069-012-0446-4, 2013.
- 787 Tosunoglu, F., Kisi, O., 2016. Joint modelling of annual maximum drought severity and  
788 corresponding duration. J. Hydrol. 543, 406–422. doi:10.1016/j.jhydrol.2016.10.018,  
789 2016.
- 790 Touma, D., Ashfaq, M., Nayak, M.A., Kao, S., Diffenbaugh, N.S. A multi-model and multi-  
791 index evaluation of drought characteristics in the 21st century. J. Hydrol. 526, 196–207.  
792 doi:10.1016/j.jhydrol.2014.12.011, 2015.
- 793 Tung, Y., Yen, B.-C., Melching, C. Hydrosystems Engineering Reliability Assessment and  
794 Risk Analysis, 1 ed. ed. McGraw-Hill. doi:DOI: 10.1036/0071451587, 2006.
- 795 Van Lanen, H.A.J., Laaha, G., Kingston, D.G., Gauster, T., Ionita, M., Vidal, J.P., Vlnas, R.,  
796 Tallaksen, L.M., Stahl, K., Hannaford, J., Delus, C., Fendekova, M., Mediero, L.,  
797 Prudhomme, C., Rets, E., Romanowicz, R.J., Gailliez, S., Wong, W.K., Adler, M.J.,  
798 Blauhut, V., Caillouet, L., Chelcea, S., Frolova, N., Gudmundsson, L., Hanel, M.,  
799 Haslinger, K., Kireeva, M., Osuch, M., Sauquet, E., Stagge, J.H., Van Loon, A.F.  
800 Hydrology needed to manage droughts: the 2015 European case. Hydrol. Process. 30,  
801 3097–3104. doi:10.1002/hyp.10838, 2016.
- 802 Van Lanen, H.A.J., Wanders, N., Tallaksen, L.M., Van Loon, A.F., Van Lanen, C.H.A.J.  
803 Hydrological drought across the world: impact of climate and physical catchment  
804 structure. Hydrol. Earth Syst. Sci. 1715–1732. doi:10.5194/hess-17-1715-2013, 2013.
- 805 Van Loon, A.F. Hydrological drought explained. Wiley Interdiscip. Rev. Water 2, 359–392.  
806 doi:10.1002/wat2.1085, 2015.
- 807 Van Loon, A.F., Gleeson, T., Clark, J., Van Dijk, A.I.J.M., Stahl, K., Hannaford, J., Di  
808 Baldassarre, G., Teuling, A.J., Tallaksen, L.M., Uijlenhoet, R., Hannah, D.M., Sheffield,  
809 J., Svoboda, M., Verbeiren, B., Wagener, T., Rangelcroft, S., Wanders, N., Van Lanen,  
810 H.A.J. Drought in the Anthropocene. Nat. Geosci. 9, 89–91. doi:10.1038/ngeo2646,  
811 2016a.



- 812 Van Loon, A.F., Stahl, K., Di Baldassarre, G., Clark, J., Rangelcroft, S., Wanders, N.,  
813 Gleeson, T., Van Dijk, A.I.J.M., Tallaksen, L.M., Hannaford, J., Uijlenhoet, R., Teuling,  
814 A.J., Hannah, D.M., Sheffield, J., Svoboda, M., Verbeiren, B., Wagener, T., Van Lanen,  
815 H.A.J. Drought in a human-modified world: Reframing drought definitions,  
816 understanding, and analysis approaches. *Hydrol. Earth Syst. Sci.* 20, 3631–3650.  
817 doi:10.5194/hess-20-3631-2016, 2016b.
- 818 Vicuña, S., Dracup, J.A. The evolution of climate change impact studies on hydrology and  
819 water resources in California. *Clim. Change* 82, 327–350. doi:10.1007/s10584-006-  
820 9207-2, 2007.
- 821 Vicuña, S., Garreaud, R.D., Mcphee, J. Climate change impacts on the hydrology of a  
822 snowmelt driven basin in semiarid Chile. *Clim. Chang.* 105, 469–488.  
823 doi:10.1007/s10584-010-9888-4, 2011.
- 824 Wada, Y., Van Beek, L.P.H., Wanders, N., Bierkens, M.F.P. Human water consumption  
825 intensifies hydrological drought worldwide. *Environ. Res. Lett.* 8, 34036.  
826 doi:10.1088/1748-9326/8/3/034036, 2013.
- 827 Wanders, N., Van Loon, A.F., Van Lanen, H.A.J. Frequently used drought indices reflect  
828 different drought conditions on global scale. *Hydrol. Earth Syst. Sci.* 1–16, 2017.
- 829 Wanders, N., Wada, Y. Human and climate impacts on the 21st century hydrological drought.  
830 *J. Hydrol.* 526, 208–220. doi:10.1016/j.jhydrol.2014.10.047, 2015.
- 831 Wong, G., Van Lanen, H.A.J., Torfs, P.J.J.F. Probabilistic analysis of hydrological drought  
832 characteristics using meteorological drought Probabilistic analysis of hydrological  
833 drought characteristics using. *Hydrol. Sci. J.* 58, 253–270.  
834 doi:10.1080/02626667.2012.753147, 2013.
- 835 World Bank. Lesotho WEAP Manual. World Bank Washington, DC License: Creative  
836 Commons Attribution CC BY 3.0 IGO. doi:10.1596/26026, 2017.
- 837 Yates, D., Purkey, D., Sieber, J., Huber-Lee, A., Galbraith, H. WEAP21—A Demand-,  
838 Priority-, and Preference-Driven Water Planning Model Part 1: Model Characteristics.  
839 *Water Int.* 30, 501–512. doi:10.1080/02508060508691894, 2005a.
- 840 Yates, D., Purkey, D., Sieber, J., Huber-lee, A., Galbraith, H., Yates, D., Iwra, M., Institute-  
841 boston, S.E. WEAP21 – A Demand- , Priority- , and Preference-Driven Water Planning



842 Model Part 2 : Aiding Freshwater Ecosystem Service Evaluation. *Water Int.* 30, 37–41.  
843 doi:10.1080/02508060508691894, 2005b.

844 Zaidman, M.D., Keller, V., Young, A.R., Cadman, D. Flow-duration-frequency behaviour of  
845 British rivers based on annual minima data. *J. Hydrol.* 277, 195–213.  
846 doi:10.1016/S0022-1694(03)00089-1, 2003.

847 Zeff, H.B., Characklis, G.W. Managing water utility financial risks through third-party index  
848 insurance contracts. *Water Resour. Res.* 49, 4939–4951. doi:10.1002/wrcr.20364, 2013.

849 Zuffo, A.C. Aprendizados das crises da água: O que faremos com eles? Lessons learnt from  
850 water crises: What can we do about them? Apresentação em Mesa Redon. no XXI Simp.  
851 Bras. Recur. Hídricos. Brasília 22-27. [http://eventos.abrh.org.br/xxisbrh/programacao-](http://eventos.abrh.org.br/xxisbrh/programacao-mr.php)  
852 [mr.php](http://eventos.abrh.org.br/xxisbrh/programacao-mr.php) (accessed 8.1.17), 2015.

853

854

855

856

857

858

859

860

861

862

863

864

865

866

867

868 **Tables.**869 **Table 1.** Description of variables

Scenarios' variables	Description
RCM Scenarios	Eta-Model nested in the GCMs: <ul style="list-style-type: none"> <li>• MIROC5</li> <li>• HADGEM2-ES</li> </ul>
RCP Scenarios [W/m <sup>2</sup> ]	Forcing by two greenhouse gas concentration scenarios: <ul style="list-style-type: none"> <li>• 4.5 as optimistic scenario</li> <li>• 8.5 as pessimistic scenario</li> </ul>
RMSD Water Demand Scenarios [m <sup>3</sup> /s]	<ul style="list-style-type: none"> <li>• Stationary Demand (SD) 31 m<sup>3</sup>/s</li> <li>• Non-Stationary Demand (NSD) 31 to 42 m<sup>3</sup>/s</li> </ul>
Return period analysis Scenarios [Rp]	Rp = {2, 10, 100} years; drought severity (deficit m <sup>3</sup> ) and duration (days) scenarios.

870

871 **Table 2.** Main assumptions for establishing the tariff water price according to the drought duration.

Drought Duration Interval (days)	Water Tariff Adjustment adopted (%)	Average price (US\$/ m <sup>3</sup> )	Scenario of Supply warranty for SPRM	Supply warranty time percentage (%)*
(0, 31)	0	3.38	100% water availability	1
(0, 90)	6	3.58	100% water availability	0.34
(0, 180)	10	3.71	Water availability with storage dependency	0.17
> 365	17	3.95	Water deficit (multi-year droughts)	0.084

872 \* As [100% Supply warranty time during 31 days / Analysis Scenario of Supply warranty time (days)]

873

874 **Table 3.** The Cantareira Equivalent System (ES) performance criteria for Calibration-Validation periods. \*Cal.

875 =Calibration period and Val. =Validation period. The calibration and validation performance criteria for each

876 basin in the system can be found in the "Complementary Material" - supplementary material - section A. – Table

877 A-1.

Cantareira Equivalent System	Area (km <sup>2</sup> )	VE		NSE		NSE <sub>Log</sub>		RSR		R <sup>2</sup>		PBIAS (%)	
		Cal.	Val.	Cal.	Val.	Cal.	Val.	Cal.	Val.	Cal.	Val.	Cal.	Val.
	2265.0	0.91	0.80	0.95	0.90	0.94	0.74	0.21	0.38	0.96	0.92	-3.40	-12.36

878

879

880

881

882

883

884

885

886

887



888 **Table 4.** Economic profit loss projection scenario for the period 2007-2040 (x10<sup>6</sup> US\$)

RCM scenario	RCP scenario	Demand scenario	2007-2040					
			Rp <sub>2</sub>	Dif.%	Rp <sub>10</sub>	Dif.%	Rp <sub>100</sub>	Dif.%
<i>Eta-MIROC5</i>	4.5	SD	13818	17.13	19696	27.18	22965	32.61
		NSD	16674		27049		34079	
	8.5	SD	19953	16.73	28443	26.82	33035	32.54
		NSD	23961		38865		48971	
<i>Eta-HADGEM</i>	4.5	SD	14713	8.80	25254	13.36	32242	14.61
		NSD	16132		29146		37758	
	8.5	SD	13667	8.62	23440	13.15	29761	14.54
		NSD	14956		26990		34825	

889 **Note: SD: stationary and NSD: non-stationarity**

890

891 **Table 5.** Economic profit loss projection scenario for the period 2041-2070 (x10<sup>6</sup> US\$)

RCM scenario	RCP scenario	Demand scenario	2041-2070					
			Rp <sub>2</sub>	Dif.%	Rp <sub>10</sub>	Dif.%	Rp <sub>100</sub>	Dif.%
<i>Eta-MIROC5</i>	4.5	SD	10168	50.28	14487	56.34	16788	59.84
		NSD	20453		33178		41799	
	8.5	SD	8733	61.61	12498	66.09	14378	69.06
		NSD	22747		36855		46476	
<i>Eta-HADGEM</i>	4.5	SD	10232	30.44	17550	33.91	22316	34.98
		NSD	14710		26555		34321	
	8.5	SD	8544	36.24	14645	39.41	18594	40.26
		NSD	13399		24170		31125	

892 **Note: SD: stationary and NSD: non-stationarity**

893

894 **Table 6.** Economic profit loss projection scenario for the period 2007-2040 (x10<sup>6</sup> US\$)

RCM scenario	RCP scenario	Demand scenario	2071-2099					
			Rp <sub>2</sub>	Dif.%	Rp <sub>10</sub>	Dif.%	Rp <sub>100</sub>	Dif.%
<i>Eta-MIROC5</i>	4.5	SD	14698	53.45	20956	59.20	24237	62.47
		NSD	31575		51367		64582	
	8.5	SD	7929	60.23	11338	64.93	13017	68.04
		NSD	19938		32332		40734	
<i>Eta-HADGEM</i>	4.5	SD	8508	49.19	14569	51.80	18459	52.81
		NSD	16743		30225		39116	
	8.5	SD	16553	22.40	28392	26.31	36213	27.39
		NSD	21329		38532		49873	

895 **Note: SD: stationary and NSD: non-stationarity**

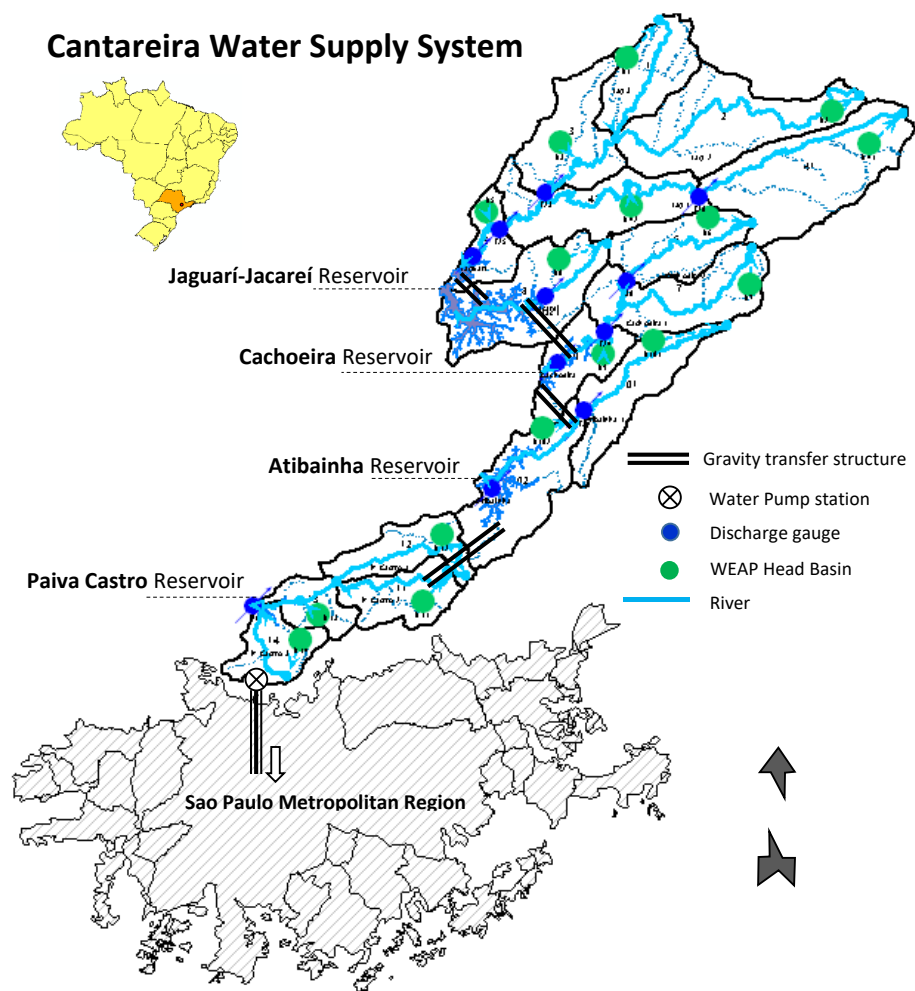
896

897

898

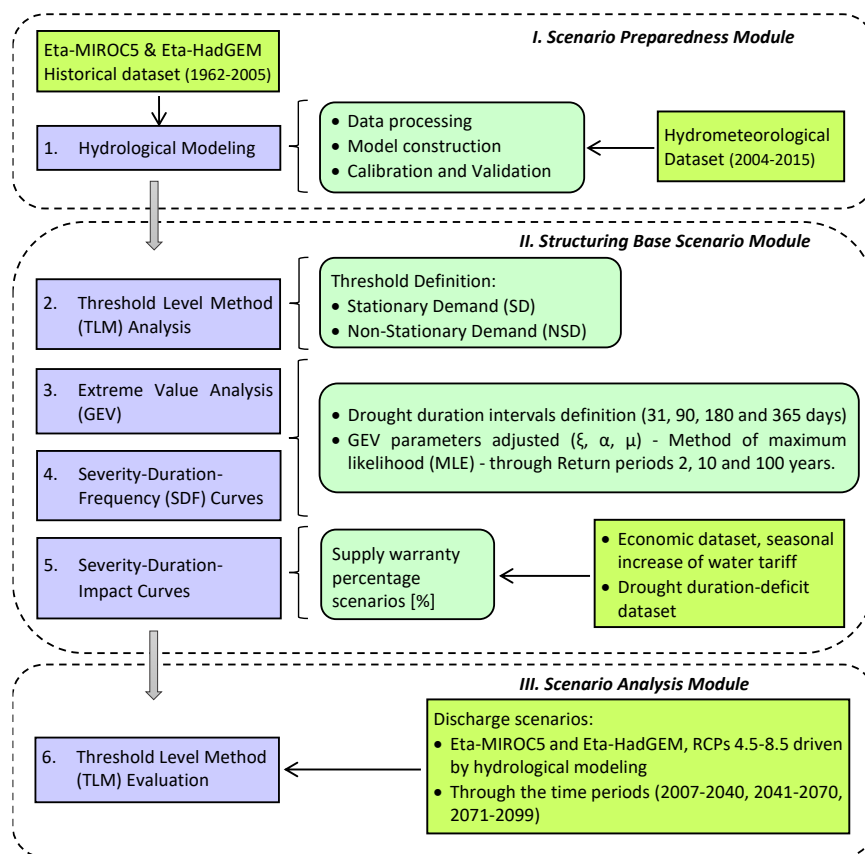


899 **Figures.**



900

901 **Figure 1.** System structure composition and catchment areas: Jaguari-Jacareí, Cachoeira, Atibainha and Paiva  
902 Castro watersheds.



903

904 **Figure 2.** Methodology flowchart and main inputs.

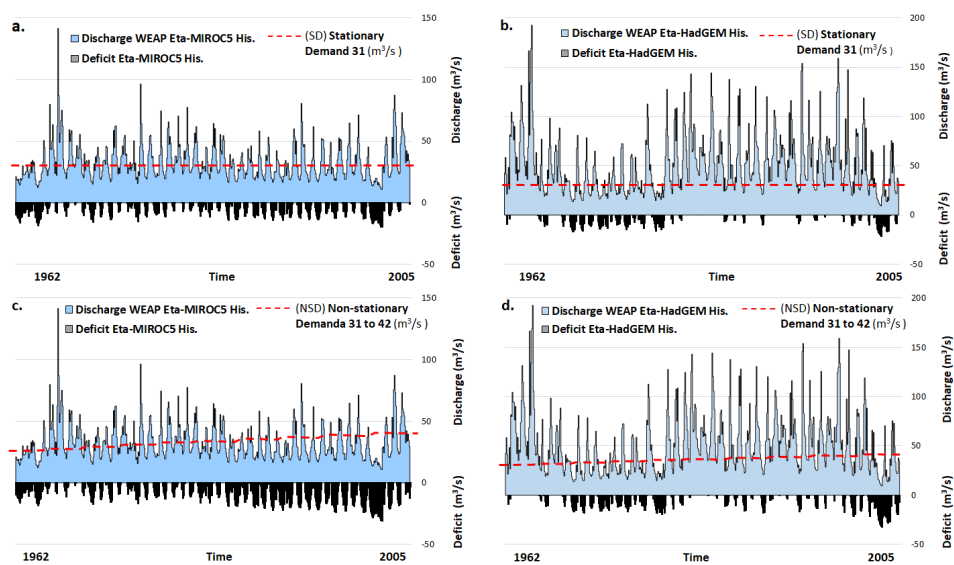
905

906

907

908

909



910

911 **Figure 3.** TLM Evaluation from historical discharge WEAP-Eta scenarios, under Stationary (SD) and Non-  
912 Stationary Demand (NSD) assumptions as the “threshold level”: a. 31 m<sup>3</sup>/s and Eta-MIROC5. b. 31 m<sup>3</sup>/s and  
913 Eta-HadGEM. c. 31 to 42 m<sup>3</sup>/s and Eta-MIROC5. d. 31 to 42 m<sup>3</sup>/s and Eta-HadGEM.

914

915

916

917

918

919

920

921

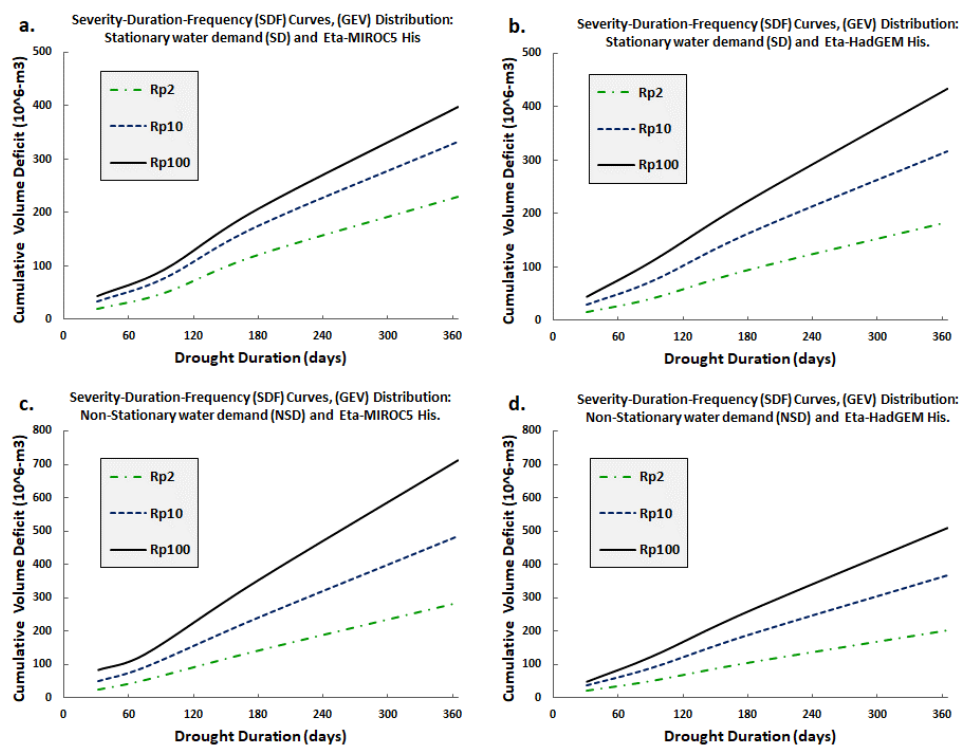
922

923

924

925

926



927

928 **Figure 4.** SDF curves under stationary and non-stationary demand assumptions and historical discharge WEAP-  
929 Eta scenarios: a. (SD) 31 m<sup>3</sup>/s and Eta-MIROC5. b. (SD) 31 m<sup>3</sup>/s and Eta-HadGEM. c. (NSD) 31 to 42 m<sup>3</sup>/s and  
930 Eta-MIROC5. d. (NSD) 31 to 42 m<sup>3</sup>/s and Eta-HadGEM.

931

932

933

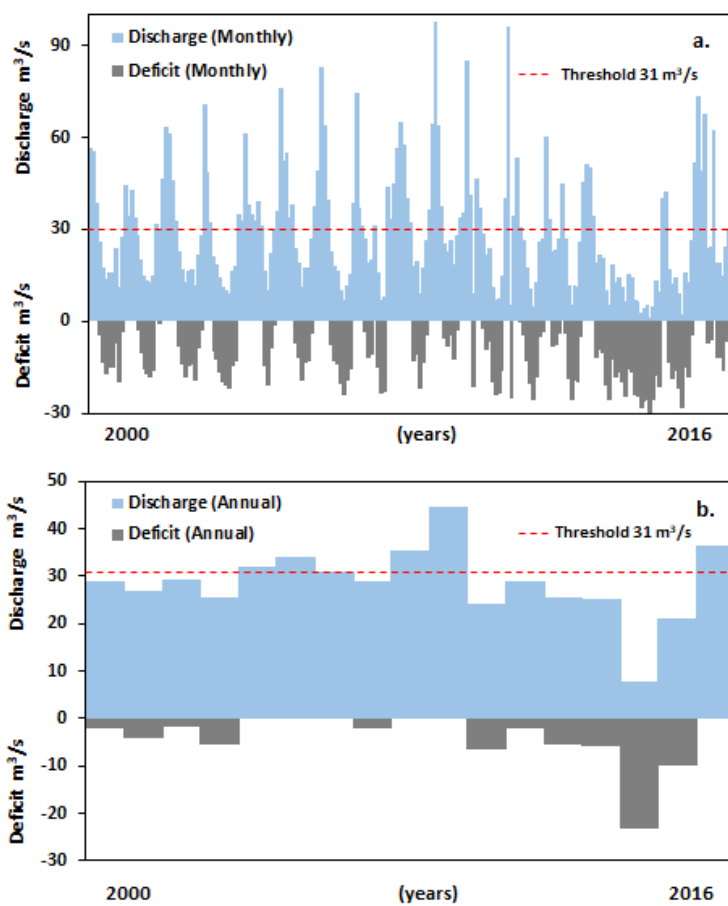
934

935

936

937

938



939  
940 **Figure 5.** TLM analysis under two discharge scenarios, 2000-2016 period. a) Monthly average discharge and b)  
941 Annual average discharge.

942

943

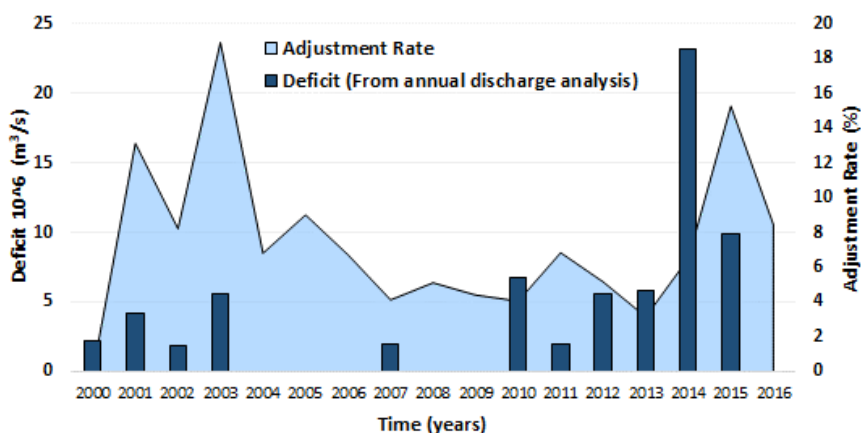
944

945

946

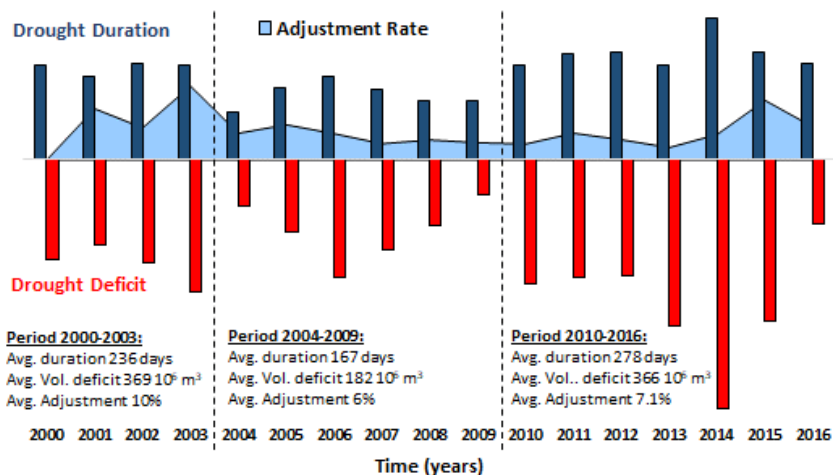
947

948



949  
 950 **Figure 6.** Co-evolution of the drought deficit and price adjustment rates (SABESP – Cantareira System) during  
 951 2000-2016 period. Note: deficits defined from TLM analysis under a demand threshold of 31 m<sup>3</sup>/s and annual  
 952 average discharge

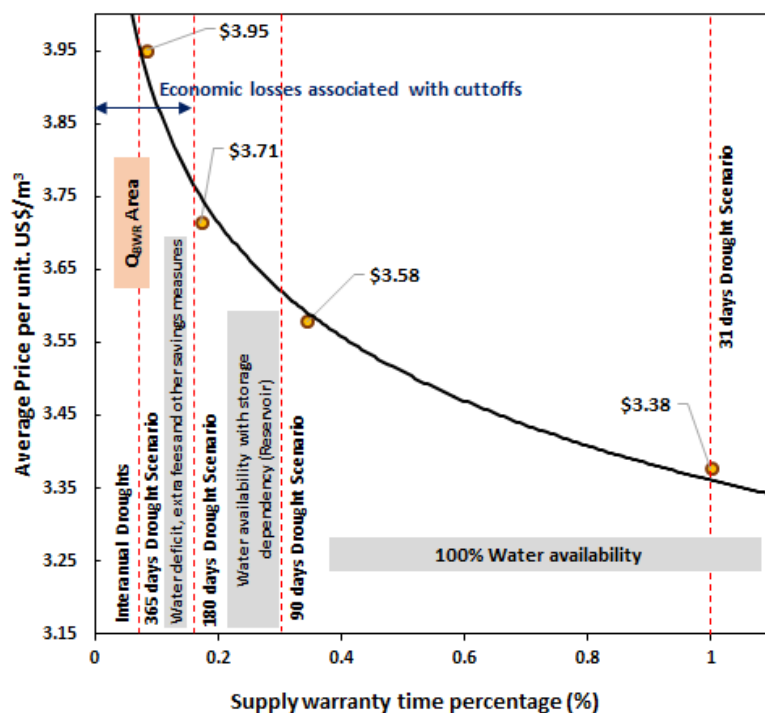
953



954  
 955 **Figure 7.** Empirical relationship between Cantareira System drought duration “blue-bar in days” [derived from  
 956 monthly average discharge analysis], Cantareira System drought deficit “red-bar in 10<sup>6</sup>-m<sup>3</sup>” [assessed from  
 957 monthly average discharge analysis] and annual price adjustment rates under variate hydrological conditions in  
 958 percentage.

959

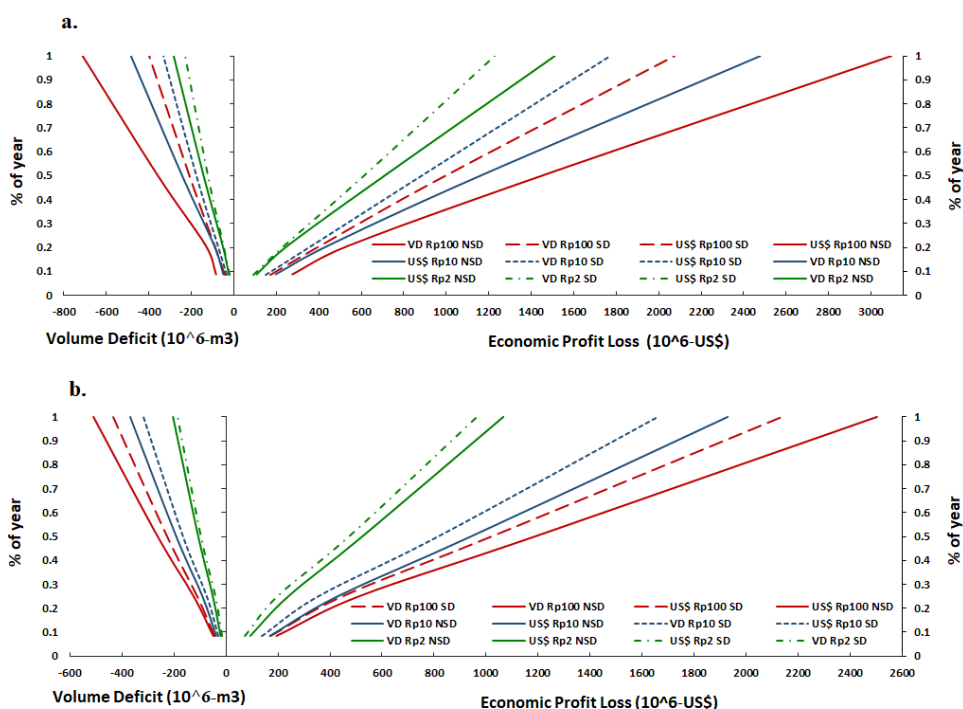
960



961  
 962  
 963  
 964  
 965  
 966  
 967  
 968  
 969  
 970  
 971  
 972  
 973  
 974  
 975

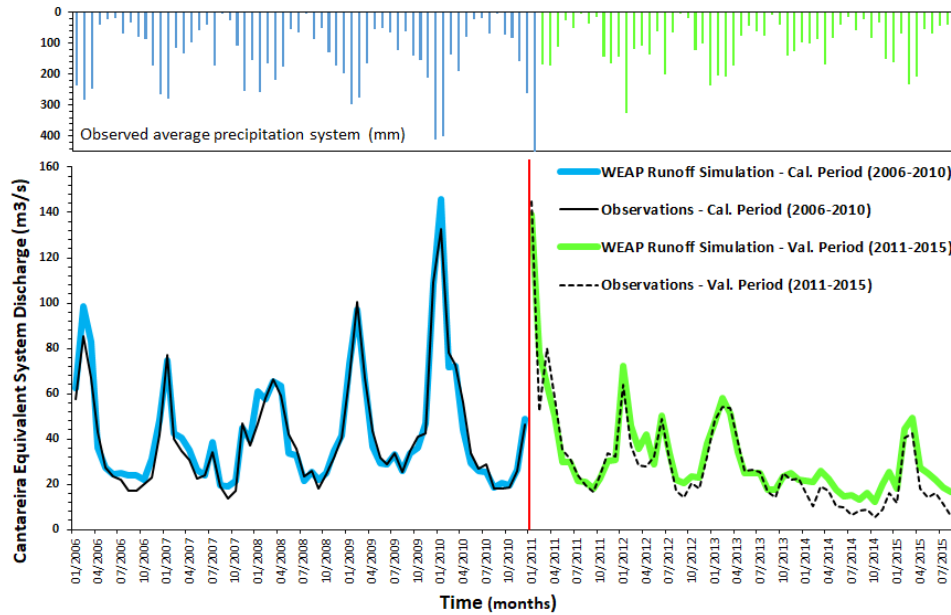
Figure 8. Cantareira System demand curve based on the supply warranty time percentage





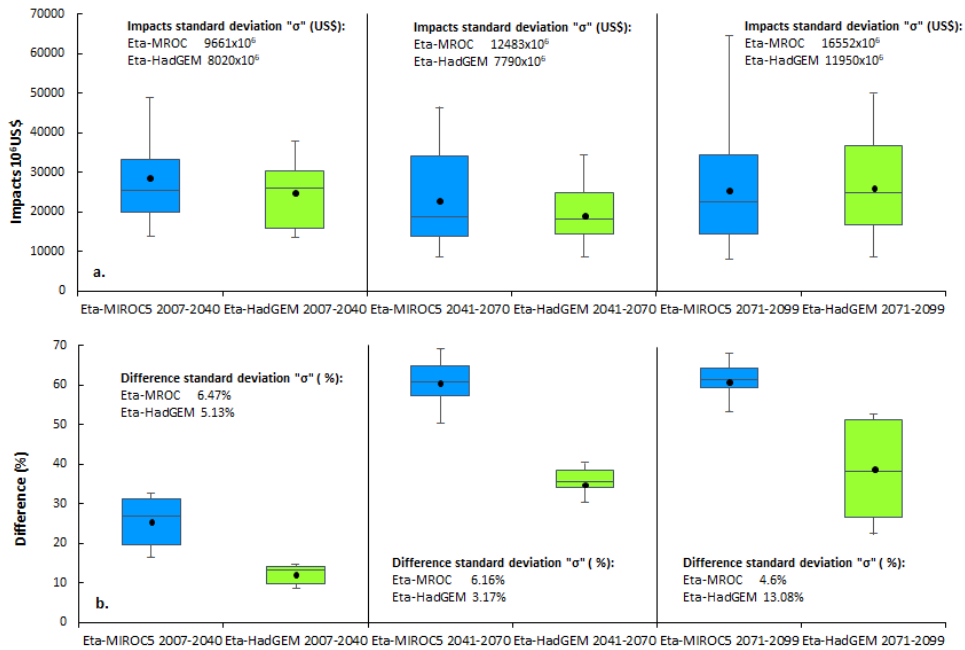
976  
 977 **Figure 9.** Severity-Duration-Impact curves. Sector **a.** Severity-Duration-Frequency-Profit Loss under the  
 978 historical *Eta-MIROC5* scenario. Sector **b.** Severity-Duration-Frequency-Profit Loss under the historical *Eta-*  
 979 *HadGEM* scenario. Note: *SD* and *NSD* are the stationary or non-stationary demands, respectively; “*VD*” is the  
 980 volume deficit, under return period of 2, 10 and 100 years; % of year is the drought event duration in relation to one  
 981 year.

982  
 983  
 984  
 985  
 986  
 987  
 988  
 989  
 990  
 991



992

993 **Figure 10.** WEAP Hydrographs, Calibration period (2006-2010) and Validation period (2011-2015)



994

995 **Figure 11.** Box plots with impacts and relative differences between climate change scenarios. Sector a:  
 996 Economic impacts under time periods of climate change scenarios. Sector b: Percentage difference between the  
 997 demand scenarios under time periods of climate change scenarios.