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by

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1 Effect of storage tank size on the minimization of water distribution system cost and  
2 greenhouse gas emissions while considering time-dependent emissions factors

3

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9 Supplementary material:

- 10 1. Diurnal water demand curves for Case Studies 1 and 2.
- 11 2. Component costs and greenhouse gas emissions for the optimal solutions for Case  
12 Studies 1 and 2.

13

#### 14 **ABSTRACT**

15 The importance of reducing greenhouse gas (GHG) emissions, which have been linked to  
16 human-induced climate change, is gradually being recognized by water utilities. While multi-  
17 objective optimization has been applied by previous literature to minimize cost and GHG  
18 emissions associated with water distribution systems (WDSs), this has mainly been achieved  
19 by considering design options of pipe size and pump type. Little consideration has been given  
20 to the appropriate sizing of storage tanks. As such, this paper aims to investigate the effect of  
21 storage tank size on the minimization of cost and GHG emissions associated with WDSs.  
22 Increases in storage tank size are considered by increasing the tank reserve size (TRS); the  
23 portion of the storage tank available for system balancing purposes. As storage tanks are

24 critical to the operation of a WDS, it is necessary to accurately model the operation of a  
25 WDS. While electricity tariffs (ETs) are used to consider the time-dependency of pumping  
26 operational cost, no such consideration has been given to pumping operational GHG  
27 emissions. As such, time-dependent emissions factors are used to calculate pumping  
28 operational GHG emissions. In order to investigate the effect of TRS on the minimization of  
29 cost and GHG emissions associated with a WDS, the multi-objective optimization of two  
30 case study WDSs is performed. The results show that using different TRSs can affect the  
31 optimal pumping operational management of a WDS, and that increasing the TRS can result  
32 in GHG emissions reductions. However, using a very large TRS is likely to be associated  
33 with prohibitive costs.

34

35

36 **1 INTRODUCTION**

37 As water distribution systems (WDSs) can emit significant amounts of greenhouse gases  
38 (GHGs), they are contributors to human-induced climate change. In order to minimize this  
39 impact, the objective of minimizing greenhouse gas (GHG) emissions has recently been  
40 incorporated into the optimization of WDSs (Stokes et al. 2014b). This can be achieved both  
41 directly (Basupi et al. 2013; Basupi et al. 2014; Du et al. 2013; Kang and Lansey 2012;  
42 MacLeod and Filion 2011; Marchi et al. 2014; Roshani et al. 2012; Wu et al. 2010a; Wu et al.  
43 2012a; Wu et al. 2013; Wu et al. 2010b; Wu et al. 2012b) and indirectly by considering GHG  
44 emissions as part of a wider array of environmental objectives (Herstein et al. 2011; Herstein  
45 and Filion 2011; Herstein et al. 2009).

46

47 When optimizing WDSs, previous literature has focused on using pipe sizes and pump types  
48 as decision variables in order to find solutions of minimized cost and GHG emissions (Basupi  
49 et al. 2013; Basupi et al. 2014; Dandy et al. 2006; Du et al. 2013; Herstein et al. 2011;  
50 Herstein and Filion 2011; Herstein et al. 2009; Kang and Lansey 2012; MacLeod and Filion  
51 2011; Marchi et al. 2014; Roshani et al. 2012; Wu et al. 2010a; Wu et al. 2012a; Wu et al.  
52 2013; Wu et al. 2010b; Wu et al. 2012b). Both pipe size and pump type are important factors  
53 to consider, as they not only explicitly affect the cost and GHG emissions associated with a  
54 WDS's design, but also affect the hydraulic performance of a system, affecting pumping  
55 electrical energy requirements and therefore the cost and GHG emissions associated with the  
56 pumping operation of a WDS (Dandy et al. 2006; Herstein et al. 2011; Herstein et al. 2009;  
57 Roshani et al. 2012; Wu et al. 2010a; Wu et al. 2012a; Wu et al. 2013; Wu et al. 2010b; Wu  
58 et al. 2012b).

59

60 However, available storage is also an important factor that can affect the cost and GHG  
61 emissions associated with a WDS. Storage tanks, as well as providing emergency water  
62 storage for fires and system failures, are a critical link between a system's water source and  
63 demand. Without adequate storage, pumps must be operated to coincide with the occurrence  
64 of water demands, which may not be desirable when attempting to reduce pump energy usage  
65 (Batchabani and Fuamba 2012; Walski 2000). Hence, adequate storage size can benefit the  
66 minimization of cost and GHG emissions due to the greater flexibility and control of  
67 pumping operations they are able to provide.

68

69 An increased storage tank size can allow pumping to occur during low electricity tariff (ET)  
70 times, reducing the cost associated with electricity usage when a time-of-use pricing system  
71 is in place. However, using fewer pumps but for a greater proportion of the day is one way to  
72 reduce GHG emissions; reducing pump flow can reduce pipe velocities, leading to reduced  
73 pipe friction. This can reduce pump energy usage and therefore also reduce GHG emissions.  
74 Thus the need for larger storage sizes is diminished, as the difference between pump flow and  
75 system demand is reduced. Hence, the sizing of storage tanks can be critical when  
76 considering the minimization of, and trade-offs between, cost and GHG emissions, as the  
77 optimal size of a storage tank may be different when considering either cost or GHG  
78 emissions. Furthermore, storage tanks must be adequately sized to take full advantage of  
79 possible cost and GHG emissions reductions, while decreasing the likelihood of negative  
80 effects associated with over-sizing, such as increased tank capital cost and reduced water  
81 quality (Farmani et al. 2006; Gibbs et al. 2009).

82

83 However, while storage tank size has been considered with respect to minimizing WDS costs  
84 (Batchabani and Fuamba 2012; Farmani et al. 2006; Farmani et al. 2005; Lansey and Mays  
85 1989; Ostfeld and Tubaltzev 2008; Prasad 2010; Vamvakeridou-Lyroudia et al. 2007;  
86 Vamvakeridou-Lyroudia et al. 2005; Walters et al. 1999; Wu et al. 2010b), less consideration  
87 has been given to this issue when considering the minimization of GHG emissions (Basupi et  
88 al. 2013; Basupi et al. 2014; Herstein et al. 2011; Herstein and Filion 2011; Marchi et al.  
89 2014; Wu et al. 2010b). Additionally, little consideration has been given to the GHG  
90 emissions directly associated with storage tanks (Herstein et al. 2011; Herstein and Filion  
91 2011).

92

93 As noted above, the minimization of GHG emissions can be achieved by operating pumps at  
94 a consistent rate, thereby reducing excessive pipe velocities and frictional energy losses.  
95 However, the emissions intensity associated with electricity is not always static. Like ETs,  
96 emissions factors (EFs) that are used to calculate the GHG emissions associated with the use  
97 of electricity can also be time-dependent (Stokes et al. 2014a; Stokes et al. 2014b). This is  
98 due to the nature of the electricity grid used to supply a WDS with electricity during  
99 operation. Generally, an electricity grid is connected to multiple electricity generation  
100 sources, each with their own emissions intensity (e.g. high intensity fossil fuel electricity  
101 sources and low or zero intensity renewable energy electricity sources). As the contribution  
102 of each electricity generation source differs, the emissions intensity of electricity changes  
103 over time. With the increasing usage of renewable energy, such as wind farms, which are the  
104 fastest growing non-hydro renewable energy type, the emissions intensity of electricity can  
105 fluctuate to a significant extent (Stokes et al. 2014a). Currently, many regions globally use  
106 significant amounts of wind generation, including Denmark (28% of total electricity  
107 generation), Spain (22%), South Australia (27%) and several states in Germany (over 40%)

108 and the United States of America (up to 27%) (Stokes et al. 2014a). If the minimization of  
109 GHG emissions associated with the operation of a WDS is to be considered, then it is  
110 necessary to consider the time-dependency of EFs, as this can possibly affect the optimal  
111 operation of pumps and, as discussed previously, the optimal sizing of storage tanks.  
112 However, there has been little consideration to either long-term reductions of EFs, such as  
113 over the life of a WDS in response to climate change policies (Roshani et al. 2012; Wu et al.  
114 2012a), or the short term time-dependency of EFs, such as the fluctuation of EFs occurring  
115 each day (Ramos et al. 2011; Stokes et al. 2014a; Stokes et al. 2014b), with no application  
116 considering the optimal sizing of storage tanks.

117

118 In order to address the research gaps discussed above, there is a need to consider both optimal  
119 operational management and system design together with tank sizing options when  
120 considering the minimization of costs and GHG emissions associated with WDSs.  
121 Additionally, there is a need to consider the time-dependency of emissions factors associated  
122 with electricity used for pumping purposes. In order to address these shortcomings, the aims  
123 of this study are:

124 Aim 1. To investigate the effect of changing the storage tank balancing volume on  
125 optimal design and operational options when minimizing both the cost and GHG  
126 emissions for two case study WDSs with different levels of complexity.

127 Aim 2. To investigate the effect that using either time-varying EFs, represented by the  
128 use of an estimated 24-hour EF curve, or an average EF to calculate operational GHG  
129 emissions, has on both the options chosen during optimization and the cost and GHG  
130 emissions of the non-dominated solutions for the two case study WDSs used for  
131 objective 1.



132

133 The remainder of the paper is organized as follows. Two case study WDSs, which are  
134 minimized for costs and GHG emission while considering tank size variations and the use of  
135 time-dependent emissions factors, are introduced in the next section. This is followed by an  
136 outline of the methodology and specific details about the optimization algorithm used; the  
137 objectives of minimizing cost and GHG emissions; time-dependent emissions factors and  
138 storage tank sizing. Finally, the results from the optimization of the two case studies are  
139 presented and discussed, and conclusions are drawn.

140

141 **2 CASE STUDIES**

142 The first case study uses a two pump, single storage tank WDS (Figure 1) and considers the  
143 minimization of costs and GHG emissions associated with a new WDS. Therefore, the  
144 optimization of both design (pipes, pumps and storage tank) and operational management  
145 (pump schedule) options are considered. As shown in Figure 1, the pumping main is 600m  
146 long, the tank main is 300m long and the distribution network consists of 19x200m long  
147 pipes and 2x280m long (diagonal) pipes. This system is chosen as its single pressure zone,  
148 relative simplicity due to its small number of pipes, and single storage tank make it ideal for  
149 analyzing the complexity of design and operational control trade-offs, while still  
150 incorporating the fundamental complexity of a pumped WDS. The relatively small search  
151 space also makes the simultaneous optimization of both design and operational control  
152 options feasible. As shown in Figure 1, the first case study WDS consists of 23 pipes, one  
153 pumping station with two pumps and one storage tank.

154

155 The second case study uses a modified version of the D-town network from the Battle of the  
156 Water Networks II (Marchi et al. 2014; Salomons et al. 2012) (Figure 2) and considers the  
157 minimization of costs and GHG emissions associated with an existing WDS. Consequently,  
158 only operational management (pump scheduling) options of storage tanks of different sizes  
159 are considered as decision variables. As shown in Figure 2, the second case study WDS  
160 consists of 348 non-zero demand nodes, 443 pipes, 7 storage tanks and 12 pumps in 5  
161 pumping stations. The original BWN-II problem called for the infrastructure upgrade and  
162 operational management optimization of the WDS. As this paper is concerned only with the  
163 operational management of the system, the original D-Town WDS has been altered to  
164 accommodate the increased water demands of the upgrade problem, allowing the network to

165 be used without significant design issues that may influence pumping operations. The  
166 alterations include increasing the diameters of 4 pipes (IDs P22, P23, P100 and P995), which  
167 heavily restrict flows in the original design; placing an extra pump in addition to the original  
168 3 pumps in pumping station 1, which uses the same pump curve as the original pumps; and  
169 increasing the size of 3 of the 7 storage tanks (IDs T4, T5 and T7) to allow a minimum  
170 balancing storage size equivalent to 12 hours under average day water demand loadings. Pipe  
171 P22 is changed in diameter from 406mm to 610mm, pipe P23 from 508mm to 610mm, pipe  
172 P100 from 406mm to 610mm and pipe P995 from 152mm to 203mm. The increase in  
173 diameter is from 11.64m to 26.03m for tank T4, from 11.89m to 16.82m for tank T5 and from  
174 7.14m to 17.48m for tank T7. These alterations are among the most widely made changes by  
175 the participants of the BWN-II competition (Marchi et al. 2014). This system is chosen for its  
176 real-world complexity of having multiple tanks supplying multiple pressure zones, with the  
177 subsequent need to control multiple pump stations.

178

179 Water demand curves for both case studies are available as supplementary material. While  
180 pipe and storage tank requirements for fire and power outage scenarios are an important part  
181 of the design of a WDS, this study is concerned with the tradeoffs between costs and GHG  
182 emissions. Therefore, the additional pipe size and storage tank size requirements of fire and  
183 power outage were not taken into account.

184

185 **3 METHODOLOGY**

186 The methodology used to meet the aims outlined in the Introduction is outlined in Figure 3  
187 and is based on the Water distribution system Cost-Emissions Nexus (WCEN) conceptual  
188 framework introduced by Stokes et al. (2012; 2014b). As can be seen, the computational  
189 structure consists of a number of components that follow the traditional steps of evolutionary  
190 optimization, including the selection of design (O1) and operational (O2) options (i.e.  
191 decision variable values (Op2)), which have an impact on the water distribution system  
192 (WDS) and electrical energy generation (EEG) infrastructure components. The magnitude of  
193 these impacts on the objectives and constraints is then quantified in the analysis component  
194 (OF1, OF2, Cstr1, Cstr2), which drives the selection of the next generation of decision  
195 variable values via the selected multi-objective optimization algorithm (Op3) in the  
196 optimization component.

197

198 The impact of changing the storage tank balancing volume (Aim 1) and time-varying  
199 emissions factors (Aim 2) on the Pareto optimal solutions (Op4) is investigated via a number  
200 of scenarios / cases, which alter some of the inputs to the optimization, options and  
201 infrastructure components (Figure 3). In relation to Aim 1, different storage tank balancing  
202 volumes are represented by four different tank reserve size (TRS) scenarios (TRS1-TRS4) in  
203 order to observe the effect of tank volume for a set of known size intervals. In relation to  
204 Aim 2, two different emissions factor cases, including an estimated 24-hour (typical) time-  
205 varying EF curve (EEF), which represents the average diurnal change in emissions factors  
206 intensity over the time period of time-varying EFs, and an average EF (AEF), which  
207 represents the average value of the time-varying EFs, are used. Further details of the

208 optimization process, the way objectives and constraints are calculated and the TRS scenarios  
209 / EF cases are given in subsequent sections.

210

### 211 **3.1 Optimization Approach**

212 In order to find solutions of minimized costs and greenhouse gas (GHG) emissions, the state-  
213 of-the-art Borg Multi-Objective Evolutionary Algorithm (MOEA) (Hadka and Reed 2013) is  
214 used. Borg MOEA has been employed for its previously demonstrated superior performance  
215 when compared with more traditionally used evolutionary algorithms for a range of problems  
216 (Hadka and Reed 2013). Each case study WDS is optimized for each TRS scenario/EF case  
217 combination using a maximum solution evaluation limit of 100,000 evaluations (Eval, Figure  
218 3). Initial testing showed this maximum evaluation limit to allow for solution convergence.  
219 As a general recommendation made by Hadka and Reed (2013), initial and minimum  
220 population sizes of 100 solutions are used. (Pop, Figure 3). Initial testing showed that these  
221 values allow for solution convergence for both case studies. As the seed (Seed, Figure 3),  
222 which is used to initialize the pseudo random number generator to generate the initial  
223 population of solutions, influences the ability of the optimization algorithm to find non-  
224 dominated solutions, each case study WDS using each TRS scenario/EF case combination is  
225 optimized thirty times using thirty randomly chosen seeds, resulting in a total of 480  
226 optimization runs. All dominated solutions are disregarded from the final non-dominated set  
227 of solutions for each scenario.

228

229 For the first case study WDS, the design is optimized for the minimization of *construction*  
230 costs and GHG emissions. As part of this case study, 24 discrete decision variables are  
231 considered, including 23 pipes (pumping main, tank main and distribution system) and one

232 pump (with both pumps being restricted to the same type). Design options for these decision  
233 variables include 12 pipe diameters and 11 pump types. For both case studies, the operations  
234 of the WDSs are optimized for the minimization of operational costs and GHG emissions.  
235 Operational optimization of pumping schedules consists of 8 continuous, independent  
236 decision variables for each pump (4 on times and 4 off times). For each pump scheduling  
237 decision variable, options range from 0 to 86,400 (seconds per day). This form of scheduling  
238 allows each pump to be switched on and off a maximum of 4 times each day (chosen as a  
239 compromise between an efficient number of decision variables and pumping flexibility for  
240 effective objective function optimization), without the need to discretize pump scheduling  
241 options into specific time segments. For the first case study, the operation of both of the  
242 system's pumps is optimized, while the operation of eight of the second case study's 12  
243 pumps are optimized, with the remaining 4 pumps running continuously.

244

### 245 **3.2 Calculation of Objectives and Constraints**

246 As stated previously, the two objective functions include (1) the economic cost and (2) the  
247 climate change impact, measured as the released mass of GHG emissions, associated with the  
248 water distribution system (WDS). In order to enable these objective function values to be  
249 calculated, an extended period simulation, using the EPANET 2.0 (Rossman 2000) hydraulic  
250 simulation program (EPS, Figure 3), is performed. For the first case study where 24 hour (one  
251 day) long water demand curve, time-dependent emissions factors and electricity tariff  
252 structures are used, a 24 hour long EPS is employed. For the second case study where 168  
253 hour (one week) long water demand curve and electricity tariff structures are used, a 168 hour  
254 long EPS is employed. For both case studies, an additional 24 hour "warm up" time is  
255 employed to reduce the effects of initial conditions. This allows calculation of pump

256 electrical energy usage, which is then converted into costs and GHG emissions associated  
257 with (i) pumping operations, using operational cost analysis (OCA, Figure 3) and emissions  
258 factor analysis (EFA, Figure 3) respectively, and (ii) design, using design cost analysis  
259 (DCA, Figure 3) and embodied energy analysis (EEA, Figure 3), respectively.

260 Hydraulic simulation (EPS, Figure 3) is also used to calculate any violation of constraints  
261 (Cstr1 and Cstr2, Figure 3). A solution is deemed feasible if:

- 262 1. The zero and non-zero demand node pressures are maintained above 0m (Marchi et al.  
263 2014) and 20m (Water Services Association of Australia 2002), respectively, during  
264 the EPS period (Cstr1, Figure 3). These pressure limits are chosen to prevent  
265 cavitation in the pipe network and to allow for the operation of most water demanding  
266 appliances (e.g. washing machines), respectively.
- 267 2. The total volume of water pumped into the system from the source is equal to or  
268 above the total volume consumed by all demand nodes during the EPS period (Cstr2,  
269 Figure 3).

270

### 271 *3.2.1 Calculation of Economic Costs*

272 For the first case study, where design optimization is performed, construction costs are  
273 associated with the cost of pipes, pumps and storage tank used to construct the WDS. For the  
274 second case study, where only operational optimization is considered, the construction costs  
275 associated with increasing the storage tanks (for each TRS scenario) are considered as the  
276 sole construction cost component. For the first case study, pipes are priced according to their  
277 length and chosen diameter and pump costs incorporate both the initial pump station cost and  
278 pump replacement cost. Both pipe and pump costs used in this study can be found in Wu et al

279 (2010b). For the first case study, pump replacement is considered every 20 years (Wu et al.  
280 2010b). For both case studies, costs associated with each TRS are based on investigation  
281 costs for ground level concrete storage tanks used by South Australia's primary water utility  
282 company, SA Water (SA Water, unpublished data, January 2014). Refer to Table 1 for  
283 storage tank cost information for each TRS scenario.

284

285 For both case studies, operational costs associated with the WDSs are evaluated, and are due  
286 to the cost of electricity being used for pumping. In order to calculate electricity costs, an  
287 electricity tariff (ET, Figure 3) is used to convert the amount of electrical energy consumed  
288 into an economic cost. A peak/off-peak ET is used for both case studies. The peak ET, used  
289 between the hours of 7am and 11pm, is valued at 0.121 AUD per kilowatt hour (\$/kWh). The  
290 off-peak ET, used between 11pm and 7am, is valued at 0.037 \$/kWh. As the electricity tariff  
291 paid by the water utility in South Australia is undisclosed, applicable peak/off-peak ET rates  
292 used in this paper are taken from the SA Power Networks' (previously ETSA Utilities)  
293 Network Tariffs for FY2009 rate 2 business rate for South Australia (SA) (ETSA Utilities  
294 2009). The cost of electricity is calculated by multiplying the energy (kWh) consumed for  
295 pumping purposes over the extended period simulation (EPS) by the appropriate ET rate  
296 (\$/kWh).

297

### 298 *3.2.2 Calculation of GHG Emissions*

299 For the first case study, construction GHG emissions associated with the pipes and storage  
300 tank used to construct the WDS are considered. For the second case study, where operational  
301 optimization only is considered, the only construction GHG emissions considered are those



302 associated with the embodied energy of increasing the storage tank sizes. In order to calculate  
303 construction GHG emissions, embodied energy analysis is used (EEA, Figure 3). The  
304 embodied energy, as megajoules per kilogram (MJ/kg), of a product is multiplied by an  
305 appropriate emissions factor (EF), as metric tonnes of carbon dioxide equivalents per  
306 megajoule (t CO<sub>2</sub>-e/MJ), and the product's mass (t), to calculate its associated GHG  
307 emissions (t CO<sub>2</sub>-e).

308

309 For the first case study, pipe unit mass data from Wu et al. (2010b) are used and an embodied  
310 energy value of 40.2 MJ/kg for ductile iron cement mortar lined (DICL) pipes is used  
311 (Ambrose et al. 2002). An EF of 0.16 kg CO<sub>2</sub>-e/MJ is used to calculate pipe GHG emissions.  
312 This value is based on the average emissions factor value for electricity generation sources in  
313 South Australia for the period of January 2011 to February 2012 (converted from t CO<sub>2</sub>-  
314 e/MWh to t CO<sub>2</sub>-e/MJ). This value is used as no up-to-date pipe production specific  
315 emissions factor data are available for SA. Pipe GHG emissions are an estimate only, as other  
316 factors besides the manufacturing of the materials (e.g. transportation and installation) are not  
317 considered. It is noteworthy that pipe materials account for 35-45% of embodied energy, with  
318 trenching material, excavation and transportation accounting for the remainder (Prosser et al.  
319 2013).

320

321 For both case studies, GHG emissions associated with the TRS are based on the balancing  
322 volume of the storage tank/s, and are calculated by considering the mass of reinforced  
323 concrete required for each TRS. Each storage tank is assumed to be circular in plan, with a  
324 200mm thick reinforced concrete base and a 150mm thick reinforced concrete wall. The  
325 dimensions of each tank are based on standard reinforced concrete storage tank designs from

326 several Australian tank manufacturers for tanks with similar applied hydrostatic forces. As  
327 for pipes, the TRS GHG emissions are an estimate only, as other factors besides the  
328 manufacturing of the materials (e.g. transportation and installation) are not considered.

329

330 As with the calculation of GHG emissions associated with DICL pipes, TRS GHG emissions  
331 are calculated using embodied energy. An embodied energy value of 0.95 MJ/kg is used,  
332 based on the value given for general strength construction concrete by Hammond and Jones  
333 (2008). As with the calculation of GHG emissions for DICL pipes (discussed above), an EF  
334 of 0.16 kg CO<sub>2</sub>-e/MJ is used to calculate TRS GHG emissions. Refer to Table 1 for TRS  
335 scenario GHG emissions information.

336

337 For both case studies, GHG emissions associated with the operation of the WDSs are  
338 evaluated, and are due to generation of electricity used for pumping purposes (EEG, Figure  
339 3). In order to calculate operational GHG emissions, an emissions factor (t CO<sub>2</sub>-e/MWh) (EF,  
340 Figure 3) is used to convert the amount of electrical energy consumed into associated GHG  
341 emissions. Operational GHG emissions are calculated by multiplying the energy (kWh)  
342 consumed for pumping purposes over the extended period simulation (EPS) by the  
343 appropriate EF (t CO<sub>2</sub>-e/MWh). A detailed discussion of the operational EFs used in this  
344 study is provided below.

345

346 In order to be able to directly compare design and operations, present value analysis (PVA) is  
347 used to convert all future values (being either costs or GHG emissions) to a present value. In  
348 order to use PVA, a discount rate must be selected. Previous WDS GHG emissions

349 optimization literature has used a conventional economic rate of 8% and a GHG emissions  
350 discount rate of zero (Roshani et al. 2012; Wu et al. 2010a; Wu et al. 2010b; Wu et al.  
351 2012b). Consequently, these values are chosen for this study. It is noted that, while GHG  
352 emissions are a physical and not an economic property, their production does lead to both  
353 present benefits (e.g. the production of electricity) and future costs (e.g. the increase in  
354 atmospheric CO<sub>2</sub> levels). Hence, PVA can be used to weight the desire between increasing  
355 present benefits and reducing future costs (Simpson 2008). As with the calculation of GHG  
356 emissions for DICL pipes (discussed above), an EF of 0.16 kg CO<sub>2</sub>-e/MJ is used to calculate  
357 TRS GHG emissions. Based on values used in previous studies (Wu et al. 2010a; Wu et al.  
358 2012a; Wu et al. 2013; Wu et al. 2010b; Wu et al. 2012b), a project life of 100 years is  
359 assumed for pipes, and is consistent with industry practice in Australia (Water Services  
360 Association of Australia 2002) and is used for calculating both electricity costs and GHG  
361 emissions and pump replacement costs. It is noted that a design life of 100 years may be  
362 considered excessive and may increase the level of uncertainty in the results.

363

### 364 **3.3 Emissions Factor Cases**

365 As stated previously, two emissions factor (EF) cases, using an estimated 24-hour EF curve  
366 (EEF, Figure 3) and an average EF (AEF, Figure 3), are used for the evaluation of operational  
367 GHG emissions. The estimated 24-hour EF curve case considers the diurnal time-dependency  
368 of emissions factors associated with the use of electricity. The average EF case represents the  
369 current standard of operational GHG emissions evaluation in the WDS optimization  
370 literature, where the time-dependency of emissions factors associated with the use of  
371 electricity is not considered. Both the estimated 24-hour EF curve and average EF (see Figure  
372 4) are obtained using time-varying EF data that are developed from raw electrical energy

373 generation data collected for each generation source supplying electrical energy to the South  
374 Australian electricity grid from February 2011 to January 2012 (Australian Energy Market  
375 Operator 2013). As discussed by Stokes et al. (2014a), the magnitude and timing of wind  
376 energy, which effects the time-variations of EFs, can affect the optimal operation of a WDS  
377 when considering the minimization of GHG emissions. The proportion of wind energy  
378 considered in this study is representative of wind energy penetration in several regions  
379 globally where wind generation has been widely adopted (Stokes et al. 2014a). For this study,  
380 the time-varying EFs, with an average value of 0.574 t CO<sub>2</sub>-e per MWh, are calculated from  
381 electricity generated by wind farms (27%), gas-turbines (open-cycle, combined cycle) and  
382 gas fired steam turbines (49%) and coal fired steam turbines (24%). The proportion of  
383 electricity being produced by each generation type is responsible for the temporal fluctuations  
384 in the time-varying EF data. On average over the period from January 2011 to February 2012,  
385 the proportions of generation fuel sources at low EF times (between 20:00 and 8:00) were  
386 from wind (30%), gas (45%) and coal (25%) and at high EF times (between 8:00 and 20:00)  
387 were from wind (22%), gas (54%) and coal (24%). A detailed methodology for the  
388 calculation of time-dependent emissions factors is presented by Stokes et al. (2014a) and is  
389 therefore used in this paper.

390

### 391 **3.4 Tank Reserve Size Scenarios**

392 As stated previously, the TRS is the volume of water in the storage tank/s able to be used for  
393 system balancing purposes. Each storage tank's TRS is calculated as the volume of water  
394 required to supply the system under average-day demand for a specified length of time (e.g.  
395 the 6 hour TRS will hold enough balancing storage to supply the WDS for 6 hours). For the  
396 second case study, which uses multiple storage tanks, the TRS for each tank is the volume

397 required to supply the demand for that tank's district metering area (DMA). The TRS  
398 volumes and associated cost and GHG emissions for each TRS scenario used for each case  
399 study are detailed in Table 1. The TRS volumes are altered by changing the diameter of each  
400 tank. The lower and upper water levels of each tank are not altered, as this would alter the  
401 hydraulic properties of the system.

402

403 **4 RESULTS & DISCUSSION**

404

405 **4.1 Effect of Tank Reserve Size on Optimal System Design and Operation while using**  
406 **the Estimated 24-hour Emissions Factor Curve**

407

408 *4.1.1 Minimization of Costs and GHG emissions*

409 The results for both case studies show that, when using the estimated 24-hour EF curve  
410 (EEF), increasing the tank reserve size (TRS) can result in reduced total GHG emissions. For  
411 case study 1, using the 12 hour TRS results in solutions with lower GHG emissions and  
412 similar costs, compared to using either the 3 or 6 hour TRSs (Figure 5a). For example, while  
413 solution EEF12.18 (12 hour TRS, lower GHG emissions solution) and solution EEF3.13 (3  
414 hour TRS, lower GHG emissions solution) have similar costs (\$6.48M and \$6.49M  
415 respectively), solution EEF12.18 has GHG emissions 1.7 kt CO<sub>2</sub>-e (3.7%) lower than those  
416 for solution EEF3.13, with GHG emissions of 42.9 kt CO<sub>2</sub>-e and 44.6 kt CO<sub>2</sub>-e respectively.  
417 For case study 2, using the 6 hour TRS results in solutions with reduced GHG emissions  
418 compared to using the original TRS (Figure 6a). However, using a TRS that is too large can  
419 also result in increased costs. For case study 1, using the 24 hour TRS results in significantly  
420 increased costs, with little benefit to reducing GHG emissions, compared to using the 12 hour  
421 TRS. For case study 2, using the 12 or 24 hour TRSs results in significantly increased costs,  
422 with no additional reductions in GHG emissions (Figure 6a). Component costs and GHG  
423 emissions for the optimal solutions for both case studies are available as supplementary  
424 material.

425

426 *4.1.2 Optimal Pumping Operational Management*

427 When a sufficiently large TRS is used, pumping operational optimization can help to  
428 minimize pumping operational costs and GHG emissions by moving pump usage to off-peak  
429 electricity tariff (ET)/lower EF times of the day. This effect is seen when both cost  
430 minimization (Figures 7a and 8a) and GHG emissions minimization (Figures 7c and 8c) are  
431 prioritized. Conversely, when using the 3 hour TRS (case study 1, Figures 7a and 7c) or  
432 original TRS (case study 2, Figures 8a and 8c), the developed solutions for both case studies  
433 have pump schedules that show less regard to the off-peak ET/low EF times of the day.  
434 Instead, pump usage is maintained in order to stop the small storage tank/s from emptying.  
435 These results suggest that moving pumping to the off-peak ET/low EF times of the day is an  
436 effective way to reduce pumping operational costs/GHG emissions, respectively. However,  
437 for the presented case studies, while this strategy works to reduce total GHG emission, it does  
438 not reduce total costs. Instead, increasing the TRS and hence storage tank cost can result in  
439 increased total costs.

440

441 As a zero GHG emissions discount rate is used, the small increase in construction GHG  
442 emissions associated with an increase in TRS is outweighed by the high present value of  
443 pumping operational GHG emissions reductions. However, as a high (8%) economic discount  
444 rate is used, the increase in construction costs associated with an increase in TRS outweighs  
445 the low present value of pumping operational cost reductions. Therefore, the values of both  
446 GHG emissions and economic discount rates used to evaluate the present worth of pumping  
447 operational GHG emissions and costs, respectively, may significantly alter the benefits of  
448 increasing the TRS.

449

### 450 4.1.3 Optimal Design

451 The results for the first case study show that while the choice of pipe diameters has a  
452 significant effect on the costs and GHG emissions of solutions, pipe sizes do not change  
453 significantly when using different TRSs. As such, the results suggest that the choice of TRS  
454 does not have a significant effect on the choice of pipe diameters. Additionally, the results  
455 show that the same pump type is chosen for all solutions, regardless of TRS, suggesting that  
456 pump type is not a significant factor to utilizing different TRSs. For the lower cost solutions,  
457 smaller pipe diameters are used to reduce construction costs at the expense of a small  
458 increase in pumping operational costs (an effect of the previously discussed high economic  
459 discount rate). For lower GHG emissions solutions, pipe diameters are increased to reduce  
460 pumping operational GHG emissions at the expense of a small increase in construction GHG  
461 emissions (an effect of the previously discussed zero GHG emissions discount rate). These  
462 results suggest that the selection of larger pipe diameters is more heavily influenced by the  
463 need to reduce pipe frictional losses in order to reduce pump electrical energy consumption  
464 and therefore pumping operational GHG emissions, instead of by the need to fill the storage  
465 tank more quickly to utilize the TRS balancing volume.

466

### 467 **4.2 Effect of Tank Reserve Size on Optimal System Design and Operation while using** 468 **the Average Emissions Factor**

469 The results for both case studies suggest that using the average emissions factor (EF), instead  
470 of the estimated 24-hour EF curve, reduces the benefit of using a larger TRS in relation to  
471 minimizing GHG emissions. For the first case study, by using the average EF, increasing the  
472 storage tank beyond the smallest TRS results in similar or higher costs and GHG emissions  
473 (Figure 5b). For the second case study, by using the average EF, any benefits from increasing



474 the TRS with regard to reducing GHG emissions are not as large as when the estimated 24-  
475 hour EF curve is used (Figure 6b). For both case studies, similar to when the estimated 24-  
476 hour EF curve is used to evaluate solutions, using the average EF to develop solutions while  
477 using the smallest TRS results in pump schedules that are developed to keep the storage  
478 tank/s from emptying (e.g. Figures 7b and 7d for case study 1 and Figures 8b and 8d for case  
479 study 2). For solutions developed while using the larger TRSs, pump usage is moved towards  
480 off-peak ET times of the day in an attempt to reduce pumping operational costs. However,  
481 pumping operational GHG emissions are minimized by pumping more consistently  
482 throughout the day in order to reduce pipe frictional energy losses (e.g. Figure 7d for case  
483 study 1 and Figure 8d for case study 2). This occurs because the average EF does not  
484 consider the time-dependency of EFs and hence the only way to reduce pumping operational  
485 GHG emissions is to reduce pump energy usage. As such, greater trade-offs between costs  
486 and GHG emissions and reduced benefits to reducing GHG emissions by using a larger TRS  
487 are seen when using an average EF than when using time-dependent EFs to evaluate pumping  
488 operational GHG emissions.

489

### 490 **4.3 Discussion of Real World Implications**

491 The general characteristics of the results suggest that increasing TRS can help to reduce GHG  
492 emissions. This is achieved by utilizing the larger water storage to move the majority of  
493 pumping operations to only the off-peak ET/low EF times of the day. However, this can only  
494 reduce GHG emissions to a certain extent, as past a certain TRS, the reduction in pumping  
495 operational GHG emissions will be outweighed by an increase in construction GHG  
496 emissions associated with the larger TRS itself. Additionally, using a larger TRS significantly  
497 increases construction costs, which in some cases could be prohibitively high. The general

498 characteristics of the results also suggest that the selection of economic and GHG emissions  
499 discount rate values is important. In general, decreasing the economic/GHG emissions  
500 discount rate can increase the benefit of using a larger TRS with respect to minimizing cost  
501 and GHG emissions.

502

503 However, the above findings are only applicable when the estimated 24-hour EF curve is  
504 used, as when the average EF is used, decreased or no benefits associated with using a larger  
505 TRS are seen. Instead, the results suggest that using a smaller TRS may be beneficial to the  
506 minimization of costs and GHG emissions. Additionally, the results suggest that using the  
507 average EF increases the trade-offs between costs and GHG emissions of the developed  
508 solutions, as pump schedules prioritizing the minimization of costs move pumping to off-  
509 peak ET times, while pump schedules prioritizing the minimization of GHG emissions pump  
510 more consistently throughout the day. As such, it is suggested that when designing a WDS,  
511 the engineer should use the best available EF data when analyzing TRS requirements.

512

513 The general characteristics of the results suggest that when the emissions intensity of  
514 electricity fluctuates on a daily basis, there may be benefit to selecting a larger TRS in order  
515 to reduce GHG emissions. These benefits are due to the larger TRSs' ability to store water for  
516 longer periods without pumping, therefore allowing for an operational management strategy  
517 whereby pumping is moved to the low EF times of the day. As shown by Stokes et al.  
518 (2014a), the effectiveness of this strategy increases as the magnitude of time-dependent EF  
519 fluctuations increase, such as when large amounts of wind generation capacity are present  
520 within an electricity grid. As many regions around the world, such as in Denmark, Spain and  
521 several states in Germany and the United States of America, have wind generation capacity at

522 similar or higher levels than the South Australian electricity grid used in this study (Stokes et  
523 al. 2014a), considering the use of increased tank volumes may be beneficial for reducing the  
524 carbon footprints of water utilities in these regions.

525

526 It should be noted that the results presented in this paper are case study dependent. For  
527 example, this study is focused on the time-of-use of pumping, with the resultant minimization  
528 of costs and GHG emissions being dependent on the timing and structure of the electricity  
529 tariff and time-dependent emissions factors used. As these properties are regionally  
530 dependent, results are likely to be affected by the region where the study originates, and it is  
531 therefore important to consider this dependency. While timing of the case study time-  
532 dependent emissions factors align with those of the electricity tariffs, this may not always be  
533 the case. Increased differences between these are likely to increase the tradeoffs between  
534 pumping costs and GHG emissions and potentially affect the optimal choice of storage tank  
535 size. Additionally, the costs and GHG emissions associated with the storage tank can affect  
536 the resulting minimization of costs and GHG emissions of using a different TRS, and must  
537 therefore be carefully considered. While the costs and GHG emissions associated with each  
538 TRS used in this paper are calculated using the assumption of a ground level, circular  
539 reinforced concrete structure, other storage tank designs are in use by different water utilities  
540 and this can change the costs and GHG emissions associated with the storage tank.

541

542 While the results of this study relate to the minimization of costs and GHG emissions, the  
543 effect of TRS on water quality and system reliability have not been considered. For example,  
544 longer water detention times associated with larger storage volume can increase water age  
545 and consequently reduce water quality, due to the degradation of residual disinfectant which

---

546 can lead to microbiological growth (Walski 2000). Conversely, a larger storage volume can  
547 also increase the reliability of a WDS, due to additional water being available in the event of  
548 pump failure or pipe burst (Walski 2000). These factors are important and should also be  
549 considered when selecting the size of water storage tanks.

550

551 **5 SUMMARY**

552 In this paper, the effect of changing tank reserve size (the volume of water used for hydraulic  
553 balancing under normal conditions) on the optimal design and operational of water  
554 distribution systems for the minimization of costs and GHG emissions is considered (refer to  
555 Aim 1). Additionally, this effect is investigated when using either an estimated 24-hour  
556 emissions factor curve, which allows consideration of the time-dependency of EFs, or an  
557 average EF, which does not (refer to Aim 2).

558

559 In summary, the results show that when the emissions intensity of electricity fluctuates during  
560 each day, using a larger TRS can help to reduce GHG emissions. While this reduction may  
561 not be large, with the results suggesting GHG emissions reductions of 2-4% for a new WDS,  
562 they occur with no increase in cost. This occurs because the larger TRS allows pumping to be  
563 moved to the low EF times of the day, which is also when the off-peak tariff is in effect. As  
564 previously discussed, when larger EF fluctuations are seen, such as when large amounts of  
565 wind generation capacity are installed within an electricity grid, the effect of moving  
566 pumping to low EF times of the day is intensified and therefore resulting reductions of GHG  
567 emissions could be increased (Stokes et al. 2014a). However, these results are not seen when  
568 an average EF is used to evaluate pumping operational GHG emissions. As such, the general  
569 characteristics of the results suggest that when time-varying EF fluctuations occur over each  
570 day, using a larger EF may help to reduce GHG emissions. However, when these fluctuations  
571 do not occur, or are not considered when evaluating pumping operational GHG emissions, no  
572 cost or GHG emissions reduction benefits will result from increasing the TRS.

573

574 While water quality was not considered in this study, it is an important factor that can be  
575 affected by storage tank size. As such, water quality analysis could also be considered as an  
576 objective for selecting storage tank size.

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582

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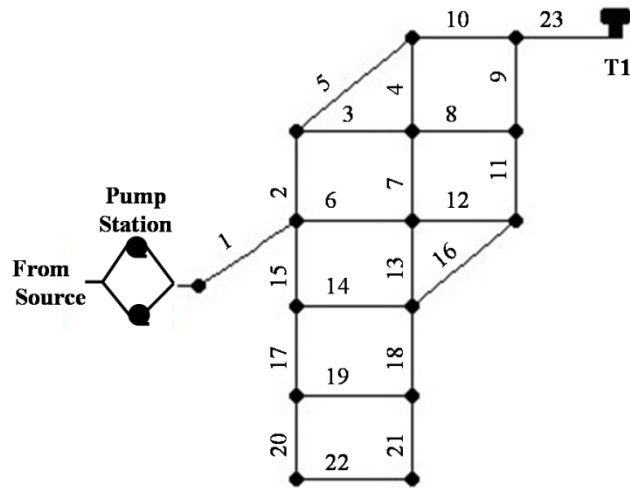
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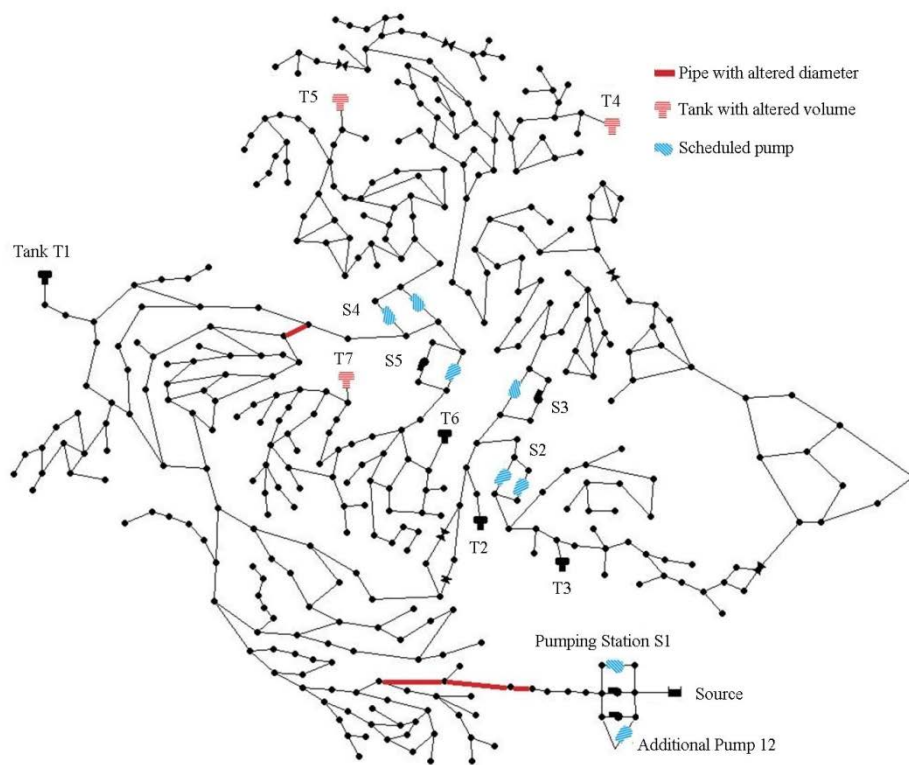
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723

724 Figure 1. The two pump, one tank WDS used for the first case study, with pipe identification  
 725 numbers shown

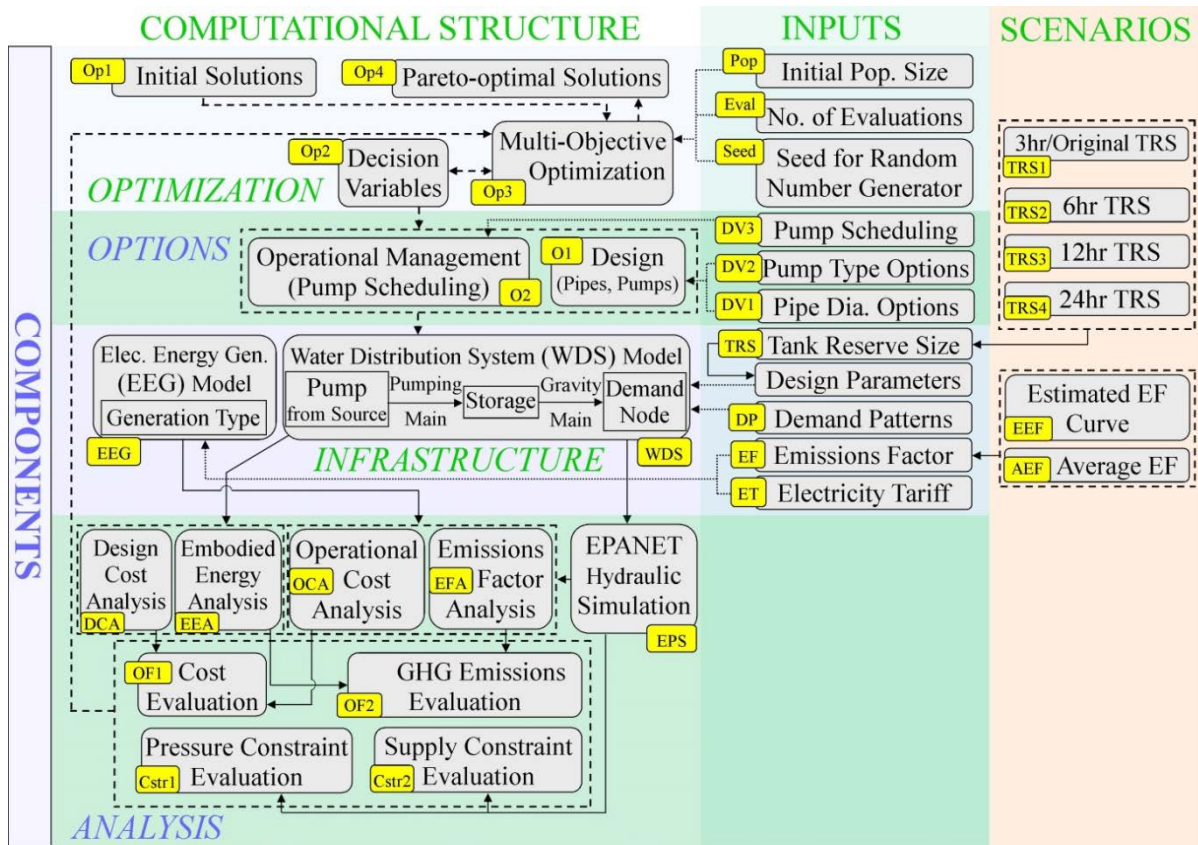
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728 Figure 2. The D-town WDS, modified from the original Battle of the Water Networks II  
 729 system, as used for the second case study

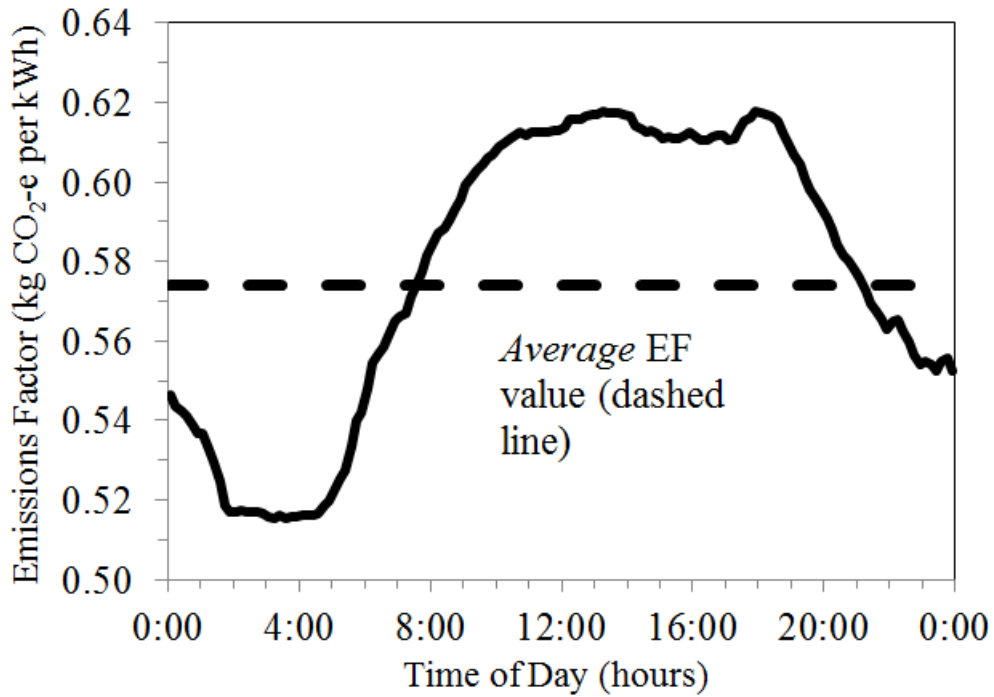
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732 Figure 3. Outline of the methodology used for the multi-objective optimization of the case  
 733 study WDSs for the minimization of costs and GHG emissions

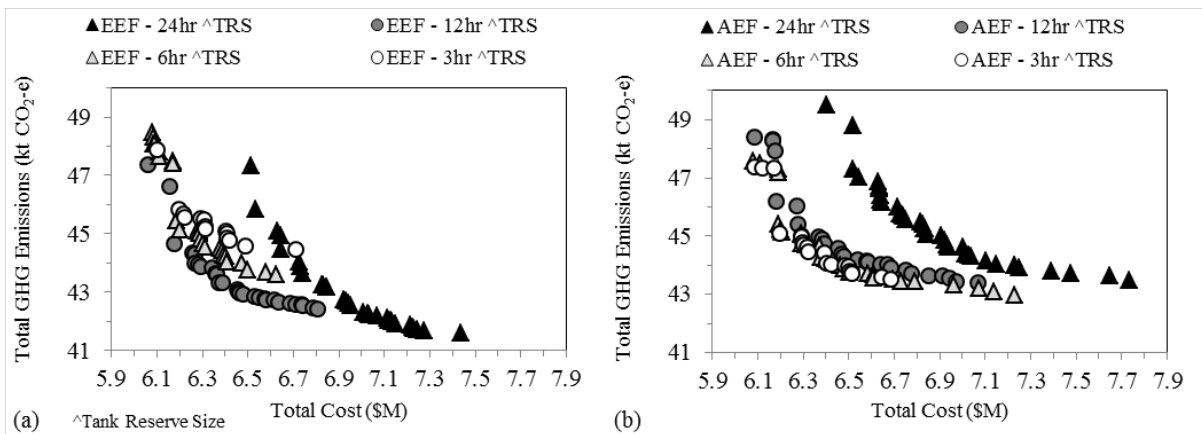
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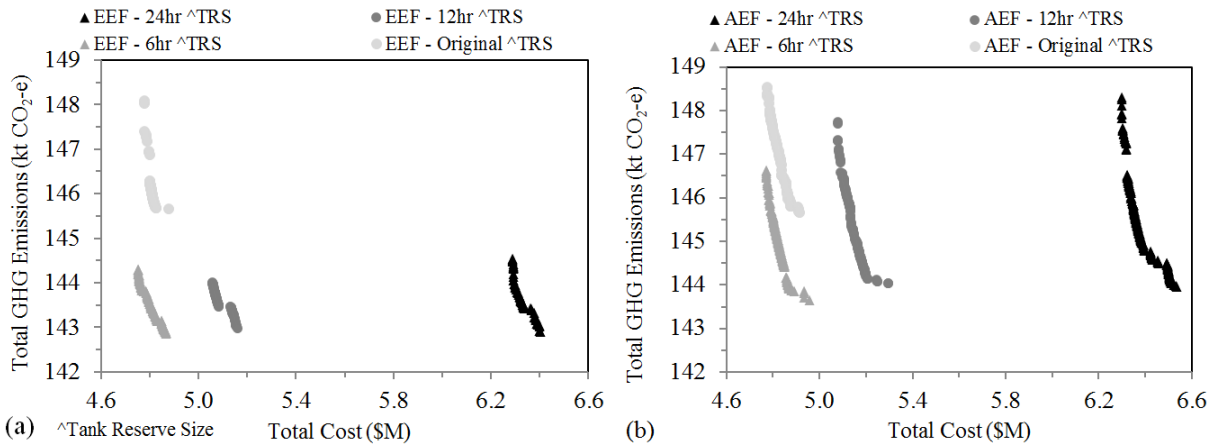
736 Figure 4. Estimated 24-hour EF curve [taken from Stokes et al. (2014a)] used to calculate  
 737 operational GHG emissions associated with the use of electricity (solid line). The average EF  
 738 value is shown for comparison (dashed line).

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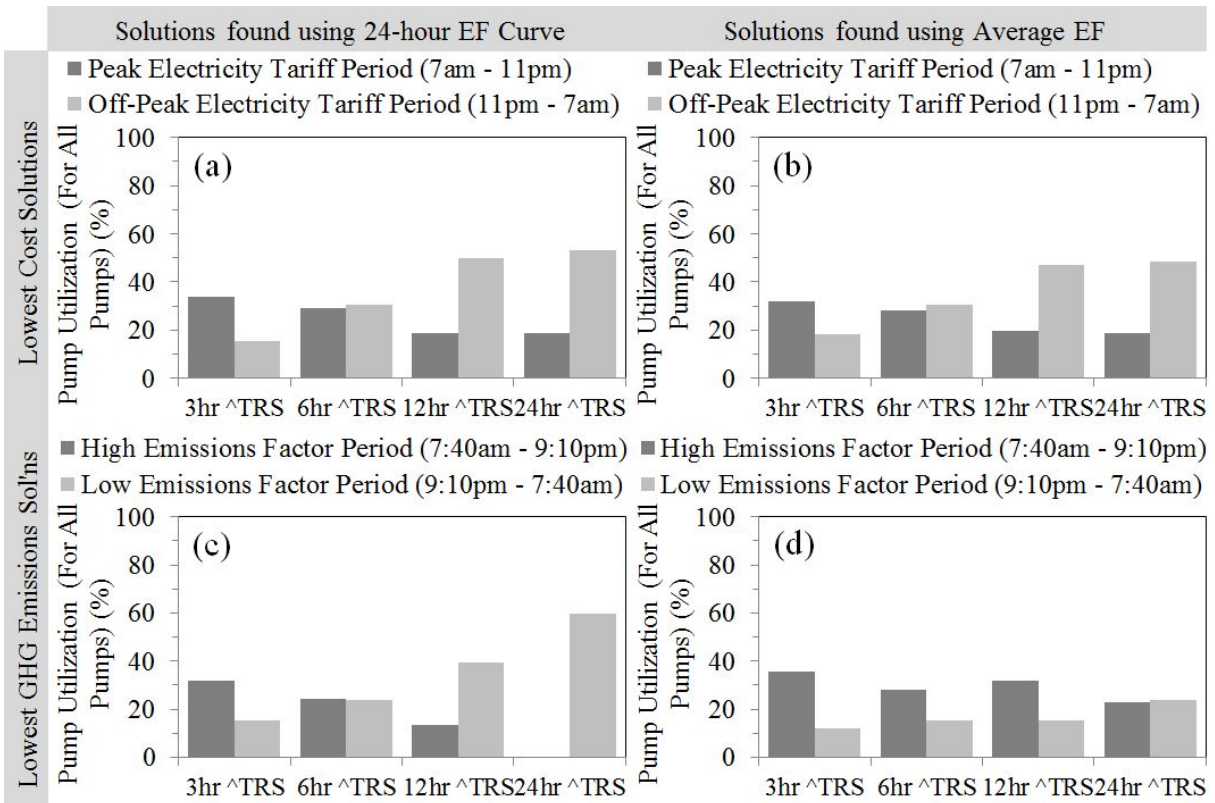
741 Figure 5. Case study 1 non-dominated solutions for each TRS scenario using (a) the  
 742 estimated 24-hour EF curve and (b) the average EF to evaluate pumping operational GHG  
 743 emissions



745

746 Figure 6. Case study 2 non-dominated solutions for each TRS scenario using (a) the  
 747 estimated 24-hour EF curve and (b) the average EF to evaluate pumping operational GHG  
 748 emissions

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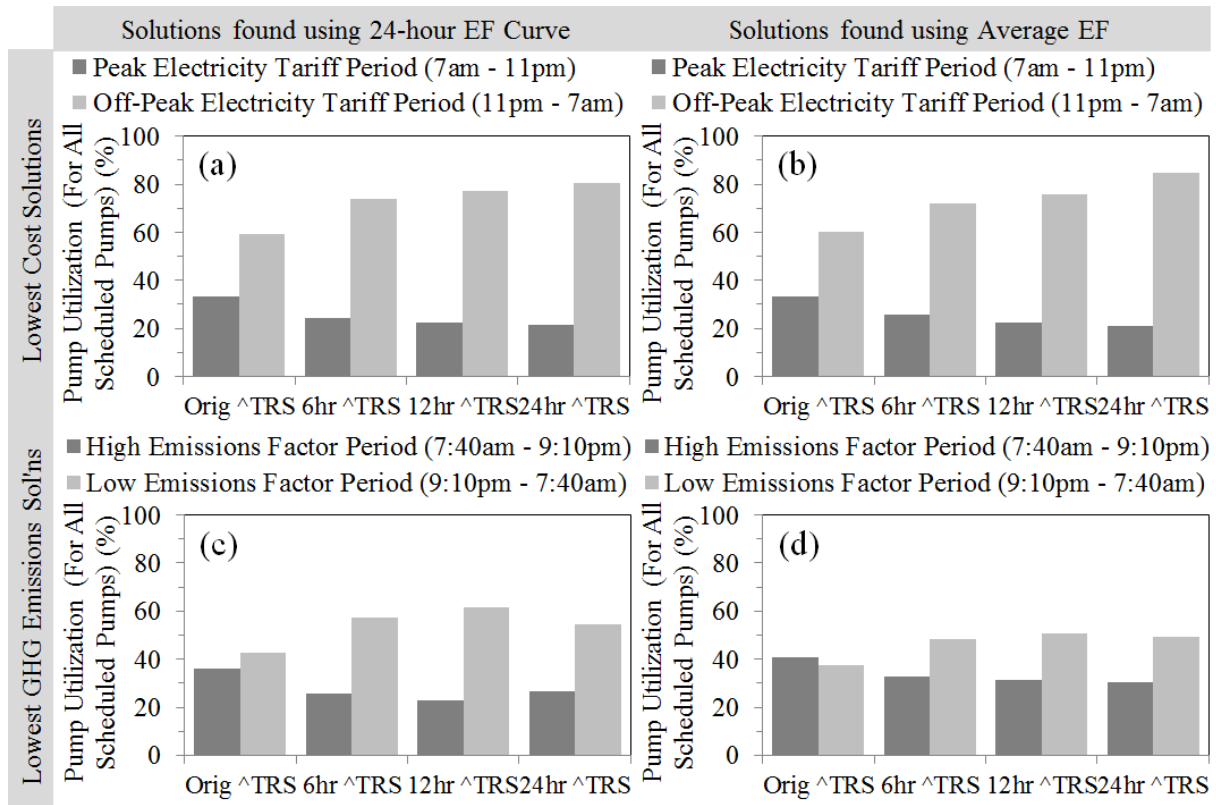


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751 Figure 7. Pump utilization for lowest cost solutions (a, b) and lowest GHG emissions  
 752 solutions (c, d) for the first case study, found while using the estimated 24-hour EF curve (a,  
 753 c) and the average EF (b, d)

754



755

756 Figure 8. Pump utilization for lowest cost solutions (a, b) and lowest GHG emissions  
 757 solutions (c, d) for the second case study, found while using the estimated 24-hour EF curve  
 758 (a, c) and the average EF (b, d)

759

760 Table 1. Tank reserve size volumes and associated costs and GHG emissions for each tank  
 761 reserve size scenario used for each case study. Tank volumes do not include emergency or  
 762 fire storage.

Case Study 1				Case Study 2			
TRS^ Scenario	Tank Volume (m <sup>3</sup> )	Estimated Cost (\$M)	Estimated Emissions^^ (kt CO <sub>2</sub> -e)	TRS^ Scenario	Vol. of Tank(s) (m <sup>3</sup> )	Estimated Cost (\$M)	Estimated Emissions^^ (kt CO <sub>2</sub> -e)
3 hour	754	0.93	0.02	Original*	9500	1.96	0.29
6 hour	1496	1.02	0.04	6 hour	11083	2.15	0.34
12 hour	3017	1.20	0.07	12 hour	14017	2.50	0.43
24 hour	6026	1.55	0.12	24 hour	24560	3.74	0.69

^Tank Reserve Size

^^Based on the embodied energy of materials used to construct the storage tank

\*Based on tank sizes of the original D-town WDS for the Battle of the Water Networks II, which gives a TRS of 2.5 hours

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