

1 **Effect of site-specific irrigation management on grapevine yield and fruit quality**
2 **attributes**

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31 **Abstract** Spatial variation in yield and fruit composition has been observed in many
32 vineyards leading to low productivity. In this study, site-specific irrigation was applied in a
33 6.4 ha commercial vineyard (*Vitis vinifera* L. cv. Shiraz) block in the Sunraysia region of
34 Australia to improve production in low yielding areas of the block and decrease differences in
35 yield and quality between zones. The block was divided into three irrigation management
36 zones based on normalised difference vegetation index (NDVI). Data collected under uniform
37 irrigation management during seasons prior to site-specific irrigation management showed
38 that spatial variation in canopy cover, yield and fruit composition at the study site was
39 substantial. Water use efficiency and yield improvements were achieved by implementing
40 site-specific irrigation. Fruit composition results were varied; pH and titratable acidity showed
41 increased similarity between zones but other parameters maintained differences between
42 zones. These results lend support to the use of NDVI to determine irrigation management
43 zones.

44

45 *Keywords:* management zones, normalized difference vegetation index, canopy temperature,
46 Shiraz, water use efficiency

47

48 **Introduction**

49

50 Within-block spatial variation of various grapevine parameters, in particular yield, fruit
51 composition and remotely-sensed vegetation indices, has been investigated by Bramley
52 (2005), Bramley and Hamilton (2004) and Hall et al. (2003). The division of a vineyard block
53 into homogenous zones is sometimes recommended, depending on the degree of spatial
54 variation observed in the block, the spatial patterns and the persistence of these patterns over
55 time. Zonal harvesting can be employed so that uniform batches of fruit are kept separate

56 (Bramley et al. 2003). This approach may be considered reactive, in that inputs remain the
57 same and grape attributes are not manipulated. Alternatively, site-specific management of
58 irrigation in each zone could be employed. Site-specific management of irrigation aims to
59 maximise productivity. Such an approach will increase the efficient use of water and
60 potentially reduce the variability in yield and fruit quality across the block. Arnó et al. (2009)
61 provide a comprehensive summary of the numerous precision viticulture studies that
62 primarily examine spatial variability of grapevine and vineyard parameters and the mapping
63 and analysis of spatial data. However, few studies report the effects of site-specific crop
64 management within vineyards.

65 Boshoff (2010) investigated canopy cover and plant water status interactions and their
66 effects on yield, fruit composition and wine parameters and implemented three irrigation
67 regimes (low, moderate and dryland) over plots classified by canopy cover (high, medium and
68 low cover, indicated by the normalised difference vegetation index, NDVI, determined from
69 multispectral aerial imagery). He suggested that site-specific management of irrigation could
70 be used to manipulate yield and fruit quality within a block. However, it remains to be shown
71 that yield and/or fruit quality could be sufficiently manipulated to make irrigation system
72 modification a financially attractive option.

73 Simple, affordable and practical methods are needed to determine irrigation management
74 zones. Yield monitors have been used in vineyards; however, they are expensive and difficult
75 to use. Alternatively, significant correlations between NDVI and yield and quality parameters
76 have previously been reported (Best et al. 2005; Hall et al. 2011; Lamb et al. 2004). In
77 addition, Acevedo-Opazo et al. (2008) reported differences in plant water status between
78 vineyard zones defined using NDVI. Recently, Taylor et al. (2010) provided further support
79 of the use NDVI to define irrigation management zones by investigating grapevine cultivar,
80 soil type and canopy cover as drivers of spatial variation in grapevine water status. Their

81 analysis showed that cultivar had a dominant effect when vines were well watered while
82 canopy cover (determined from historical mid-season measurements of NDVI) and soil type
83 became more dominant as water restriction increased. It was concluded that canopy cover
84 would be an effective parameter for guiding sub-block sampling of plant water status and
85 irrigation management (Taylor et al. 2010).

86 The aim of this study was to evaluate the hypotheses that site-specific irrigation could
87 increase grapevine production in a low yielding area of a block and decrease differences in
88 yield and fruit composition between zones, thereby improving water use efficiency and
89 reducing overall block variability.

90

91 **Materials and Methods**

92

93 Study site and sampling design

94 The study site was a 6.4 ha commercial drip-irrigated Shiraz (*Vitis vinifera* L.) block (34.42°
95 S 142.28° E) planted in 1994 in the Sunraysia region of SE Australia. Vines were trained to
96 two bilateral cordons (vertically separated) and minimally pruned. Vine and row spacings
97 were 2.4 and 3 m, respectively, and rows were oriented east-west. Based on k-means cluster
98 analysis of historical yield and soil electrical conductivity data, a sample of 100 irregularly
99 spaced target vine locations was selected in a way so as to maximise the chance of adequately
100 representing the entire range of variation in the block (Goodwin et al. 2009). The block was
101 monitored using these 100 target vine locations over a five-year period for the seasons
102 2005/06 (YR-1), 2006/07 (YR-2), 2007/08 (YR-3), 2008/2009 (YR-4) and 2009/2010 (YR-5).

103

104 Yield and fruit composition

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106 Yield was measured on each of the 100 target vines immediately prior to commercial harvest
107 each season. A 50 cm (seasons YR-1, YR-2 and YR-3) or 100 cm (seasons YR-4 and YR-5)
108 section of the target vine was harvested. The section was located to one side of the vine
109 centred at the mid-point of the cordon.

110 A sample of berries was taken from harvested fruit of each vine to determine average berry
111 weight and fruit composition. Firstly, a random sub-sample of 150 berries was weighed to
112 determine average berry weight and then frozen and kept for analysis of tannins,
113 anthocyanins, and iron-reactive phenolics. The remaining berry sample was kept in cool-
114 storage and used, as soon as possible, for measurement of total soluble solids (TSS), pH and
115 titratable acidity (TA).

116 Berry juice TSS ($^{\circ}$ Brix), pH and TA (g tartaric acid equivalents/l) were measured after
117 crushing and centrifuging the fresh berry sample. TSS was measured using a refractometer. pH
118 and TA were measured using an autotitrator (titration with NaOH to pH = 8.2).

119 Whole berries were homogenised and anthocyanin concentration (mg malvidin-3-glucoside
120 equivalents/g berry fresh weight), tannin concentration (mg catechin equivalents/g berry fresh
121 weight) and iron-reactive phenolic concentration (mg catechin equivalents/g berry fresh
122 weight) determined by spectrophotometry after extraction with ethanol (Harbertson et al.
123 2003; Iland et al. 2000).

124

125 Water use efficiency

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127 Water use efficiency was calculated in terms of fresh weight yield (t) produced per unit of
128 water applied (ML), where water applied consisted of irrigation events and rainfall events
129 greater than 10 mm during the growing season (September–April, Table 1). Rainfall was
130 recorded by vineyard staff.

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132

133 *Normalised difference vegetation index*

134 Aerial spectral imagery data were captured using a digital multispectral camera (High
135 Resolution Airborne Multispectral System, SpecTerra Services Pty Ltd, Perth, WA, Australia)
136 flown at 1800 m (above ground level) by a commercial company (SpecTerra Services Pty
137 Ltd, Perth, WA, Australia) in seasons YR-1, YR-2 and YR-3. Spectra data were captured
138 simultaneously at four spectral bands of 20 nm bandwidth centred at 450 (Blue), 550 (Green),
139 675 (Red) and 780 (NIR) nm at a spatial resolution of 0.5 m. Data pre-processing (including
140 geo-referencing) was carried out by SpecTerra services. NDVI was calculated as $(\text{NIR} -$
141 $\text{Red})/(\text{NIR} + \text{Red})$. The pre-processed data were used to create maps (Fig. 1) with ArcView
142 GIS version 3.3, ESRI, Redlands, California, USA). Individual vine data was extracted for the
143 100 target vine locations.

144

145 *Canopy temperature*

146 Spatial variation in T_c was measured using temperature sensors mounted on an all-terrain
147 vehicle in YR-3 during veraison (7 January 2008 between 1300 and 1500 h, Australian
148 Eastern Standard Time). . Measurements were taken by driving slowly past the target vines
149 and continuously recording T_c at 10 Hz. T_c was measured with two infrared sensors (3600
150 ZLC, FoV 15°; Everest Interscience, Tucson, Arizona, USA) positioned no more than 30 cm
151 directly above the canopy. T_a was measured at 0.1 Hz with a temperature/humidity sensor
152 (HMP45A; Vaisala Oyj, Helsinki, Finland), positioned over well watered grass near the
153 grapevine site. The measurements were taken on a day with moderate evaporative demand
154 conditions (reference crop evapotranspiration = 7.4 mm, calculated as per Allen et al. 1998,
155 for well watered grass) and the vines had been irrigated from 0645 to 1330 h. $T_c - T_a$ data
156 were mapped (Fig. 2) with ArcView GIS (version 3.3, ESRI, Redlands, California, USA)

157

158 *Cluster analysis*

159 Multivariate classification using fuzzy c-means clustering algorithm (Bezdek 1981; Bezdek et
160 al. 1984) was undertaken to identify zones within the block with similar characteristics using
161 Management Zone Analyst software (MZA; version 1.0.1, University of Missouri-Columbia
162 and Agricultural Research Service, Columbia, MO, USA) as described in Fridgen et al.
163 (2004). Fuzzy c-means clustering is an iterative process that classifies data, minimising within
164 cluster variance and maximising between cluster differences for a given number of clusters. It
165 recognises the continuous nature of natural data by determining degrees of membership of
166 data points to different clusters ('fuzzy' cluster analysis) rather than assuming existence of
167 sharp boundaries between clusters ('hard' cluster analysis).

168 NDVI and T_c-T_a data were used to generate two to six clusters within the block. The
169 Mahalanobis distance metric was used to account for correlation between variates and to
170 avoid effects of different scales of NDVI and temperature data (Bezdek 1981; McBratney and
171 Moore 1985). Default values were used for the convergence criterion (0.0001) and maximum
172 number of iterations (300). Three zones appeared to be an acceptable compromise between
173 optimising clustering performance indices and minimising the number of clusters. Different
174 combinations of variables were explored and clustering was generally similar regardless of
175 the attributes included. However, clusters identified by using all variates (NDVI from YR-1,
176 YR-2 and YR-3 and T_c-T_a from YR-3) did not differ from those identified using only the
177 three seasons' NDVI data. Considering the practicalities of irrigation scheduling and the
178 existing irrigation infrastructure, three irrigation zones were identified: West, East and South
179 (Fig. 3), which had, respectively 36, 60 and four target vines. Clusters and irrigation
180 management zones were mapped with ArcView GIS (version 3.3, ESRI, Redlands, California,
181 USA; Fig. 3).

182

183 Irrigation management

184 The block was irrigated via two sub-mains aligned north-south, one located in the east and the
185 second in the west, and single laterals within each row. Emitters were spaced at 0.6 m
186 intervals and emitter rates were approximately 2 L/hr. The West irrigation management zone
187 corresponded to the area irrigated by the central sub-main, while the East zone was irrigated
188 by the eastern sub-main. The South zone was irrigated by the eastern sub-main and was
189 created by installing taps in each drip-line of the rows within this zone prior to the YR-5
190 season.

191

192 Irrigation volumes were calculated from vineyard records (YR-1, YR-2 and YR-5) and
193 flow meter readings (YR-2 and YR-3). In YR-1 to YR-4, irrigations were run simultaneously
194 from both sub-mains with typical mid-season run-times of six to eight hours. Occasional
195 additional irrigations were applied to the West zone in YR-1 to YR-4, but irrigation in the east
196 and South zones did not differ during this time (Table 1).

197 In YR-5, the South management zone received two irrigations early in the season, the
198 taps were then turned off and the South was not irrigated again until mid-December; from
199 then the South zone was irrigated with the East zone. The East and West zones were irrigated
200 uniformly until November. From November to late-February the frequency of irrigation was
201 increased in the West management zone. Typically, the East zone would be irrigated once
202 during each irrigation cycle for six hours while the West zone would be irrigated twice for
203 three hours each irrigation. When fertigations or heat-related irrigations were scheduled the
204 entire block was irrigated uniformly. From late-February, the block was irrigated uniformly.
205 Consequently, East and West zones received similar irrigation volumes in YR-5 (4.5 ML/ha),
206 while the South zone received less irrigation (3.7 ML/ha). Irrigation volumes applied to each
207 zone in each season are summarised in Table 1.

208

209 Statistical analysis

210

211 Summary statistics (mean, median, range, CV, spread) were used as exploratory tools to
212 examine the nature of data distribution, identify any extreme outliers and determine the gross
213 variation. The 'spread' was estimated as $[(\text{max} - \text{min}) / \text{median}] * 100$ (Bramley 2005).

214 To evaluate if site-specific irrigation helped modify yield and fruit composition in different
215 zones as we had hypothesized, a one-way analysis of variance (ANOVA) model, with zone as
216 a (fixed effect) classification factor, was fitted to the data for each attribute in each season.
217 The East zone was considered to be analogous to a control treatment, since the strategy for
218 irrigation management of this zone was essentially unchanged throughout the study. Thus,
219 comparisons were made between mean values of the East and West zones and the East and
220 South zones for each attribute (yield and fruit composition measures) within seasons using
221 Dunnett's test (IBM SPSS Statistics, SPSS Inc., Chicago, USA). Statistical comparisons
222 among the means of a particular zone under different irrigation managements were not made
223 as these comparisons cannot be unequivocally claimed as arising from irrigation
224 managements due to the confounding of irrigation management effects with the season
225 effects.

226 A valid application of ANOVA requires random (independent) samples of observations.
227 This assumption is unlikely to be satisfied in these types of studies. An alternative to get more
228 accurate inferences would be the use of restricted maximum likelihood (ReML) which can
229 explicitly account for the underlying spatial dependence. For our data, the inferences from
230 ReML analysis (not shown) using a first order autoregressive spatial model were close to
231 those from ANOVA. We therefore present here the results from only the ANOVA approach.

232

233 **Results**

234 Normalised difference vegetation index and canopy temperature

235

236 NDVI patterns across the block were consistent in YR-1, YR-2 and YR-3, with low NDVI in
237 the west and high NDVI in the south of the block (Fig. 1). Correspondingly, Tc - Ta data
238 indicated high canopy temperatures in the west and low canopy temperatures in the south.

239

240 Site yield and fruit composition

241

242 Mean yield and fruit composition values for the entire site in YR-5 were generally within the
243 range of mean values seen in previous years, except that pH was higher and TA was lower
244 than in YR-1, YR-2, YR-3 and YR-4 (Table 2). Mean yields were highest and berry weights
245 were lowest in YR-3 (Table 2). Within-season variability was particularly high for yield and
246 anthocyanins and was lowest for juice pH and TSS (Table 2). CV and spread values suggest
247 that variability of yield and, to a lesser extent, berry fresh weight, TA and anthocyanins,
248 tended to be smaller in YR-5, compared to previous seasons (Table 2).

249

250 Zone yield, water use efficiency and fruit composition - analysis of variance

251

252 In seasons YR-1 to YR-4, yield in the West zone was consistently lower than that in the East
253 (and South) zone (Table 3). In YR-5, yield in the West was similar to that in the East zone
254 and higher than in the previous four seasons. Yield in the South zone was similar to that in the
255 East zone in all seasons. Berry fresh weight was lower in the West than the East in YR-2 and
256 YR-4 but was similar in other seasons (Table 3). Berry fresh weight in the South zone was
257 significantly higher than that in the East in YR-1 to YR-4, (Table 3). This difference was

258 maintained in YR-5 even though berry weight was lower in the South than in previous
259 seasons. By contrast, crop loads (i.e. berry number, calculated from yield and berry weight)
260 were significantly lower in the West (765 – 2213 berries/m²) than the East (2362 – 4234
261 berries/m²) in YR-1 to YR-4, but were similar in YR-5 (2607 berries/m² in the West cf. 2905
262 berries/m² in the East). Crop loads were similar in East and South zones in all seasons except
263 YR-3 when crop load in the South (2859 berries/m²) was lower than that in the East (4234
264 berries/m²).

265 Water use efficiency mirrored yield results in terms of differences between zones in YR-1
266 to YR-4 with water use efficiency in the East higher than that in the West and similar to that
267 in the South (Table 3). In YR-5, water use efficiency was similar in the East and West zones
268 but was higher in the South zone than the East.

269 In each season, juice TSS, pH, anthocyanins, iron-reactive phenolics and tannins were
270 generally highest in the West zone and lowest in the South zone, while TA was highest in the
271 South zone and lowest in the West (Table 3). Juice TSS, pH, TA and anthocyanins were
272 significantly different between zones in seasons YR-1 to YR-4 (Table 3). By contrast, in YR-
273 5, pH was not significantly different between zones and TA in the East and West zones was
274 similar. Differences between zones in TSS and anthocyanins were maintained. Iron-reactive
275 phenolics and tannins exhibited significant differences between zones in YR-2, YR-3 and
276 YR-5 (Table 3) and the trends in each of these seasons was similar (i.e. highest in the West
277 zone and lowest in the South zone).

278

279 **Discussion**

280

281 Observations of variable vine vigour and evidence of areas of water stress within a vineyard
282 block led to implementation of site-specific irrigation management in an attempt to improve

283 production in low yielding areas of the block and reduce variability of yield and fruit
284 composition. Irrigation in the initial two seasons of the study was considered to be ‘uniform’
285 across the block. Water stress and low vine vigour and yield were common in the West zone.
286 Excessive vine vigour existed within the South zone; yield and berry weight were high and
287 quality parameters (iron-reactive phenolics, anthocyanins and tannins) within this area were
288 generally poor compared to the East and West zones. The East zone produced moderate yields
289 with intermediate quality parameters. Lateral water movement from neighbouring orange and
290 avocado blocks planted on slopes north and south of the site may have provided additional
291 water to the vigorous grapevines. It was also thought that the sandy soil and sloping aspect of
292 the western side of the block limited water availability and contributed to water stress and
293 subsequent low canopy cover.

294 Increases in irrigation applied to the West in YR-3 and YR-4 were modest (less than 8 %
295 of total water applied to East and South zones). Differences in yield, berry weight and water
296 use efficiency between East and West zones were maintained, suggesting that the small
297 number of additional irrigations had little impact on productivity. Furthermore, canopy
298 temperature data indicated that vines in the West zone continued to experience greater water
299 deficits than vines in the South zone.

300 Analysis of NDVI and $T_c - T_a$ data and consideration of practicalities of the irrigation
301 infrastructure supported the establishment of a third irrigation management zone (South) and
302 changes to the scheduling of irrigation in the West and South irrigation management zones in
303 YR-5. NDVI is linearly related to canopy cover (Trout et al. 2008), and canopy cover has
304 been shown to be a major determinant of grapevine water use (McClymont et al. 2009;
305 Williams and Ayars 2005). Furthermore, Grant et al. (2007) and Möller et al. (2007) showed
306 that grapevine T_c is inversely correlated with leaf conductance and plant water status and
307 suggested that thermal imaging could be used to detect water stress and aid scheduling of

308 irrigation. In this study, multivariate cluster analysis of NDVI data from three seasons was
309 used to account for temporal variability and reveal areas with persistently high or low canopy
310 cover and hence high or low water use. Although the inclusion of T_c-T_a in the cluster analysis
311 did not alter the identified clusters, the data showed that T_c-T_a varied across the site despite
312 measurements being taken immediately after an irrigation event. The spatial pattern of T_c-T_a
313 supported the belief that large vines were accessing water in addition to irrigation and that
314 water availability was limited for some vines due to soil type or root development. Initiation
315 of irrigation was delayed for the South zone (historically characterised by vigorous vines with
316 low T_c-T_a) and more frequent irrigations were applied to the West zone (characterised by
317 small vines with higher T_c-T_a) to improve temporal water availability.

318 The aim of improving production and reducing yield variability was achieved by site-
319 specific irrigation management. Site-specific irrigation helped increase yield and water use
320 efficiency in the West zone relative to the East zone. This change appears to have been driven
321 by increased crop load in the West zone and low berry weight in the East zone. With the
322 understanding that the approach to irrigation management in the East zone was similar in all
323 five seasons, these results suggest that an improvement in yield and water use efficiency was
324 achieved by better irrigation management in the West zone.

325 The aim of the vineyard manager was to produce small berries. In this respect, the
326 reduction of berry weight in the South zone (possibly related to irrigation cut-off during the
327 initial berry development phase) under site-specific irrigation in YR-5 (1.44 g compared to
328 1.53 to 1.80 g in YR-1 to YR-4) was seen as positive. The ability to withhold irrigation
329 throughout the initial berry development phase, as occurred in YR-5, provides the grower
330 with greater control of berry size in the South zone.

331 Differences between zones in berry pH and TA lessened when site-specific irrigation was
332 adopted and irrigation frequency increased in the West zone. The mechanisms for these

333 changes are unclear and they may not be entirely attributable to site-specific irrigation.
334 However, pH and TA are influenced by temperature, bunch exposure, leaf shading and crop
335 load (Jackson and Lombard 1993). Measures of vegetative growth were not made in YR-4
336 and YR-5 but visual observations suggested that variability in canopy size was less
337 pronounced in YR-5, when irrigation frequency increased in the West zone, than in previous
338 years. This visually observed decrease in differences in canopy development between zones
339 possibly contributed to decreased differences in exposure, shading and crop load and
340 consequently greater similarity in pH and TA. Adjustment of canopy size in response to site-
341 specific irrigation appeared, as yet, to be insufficient to reduce zonal differences and overall
342 site variability in attributes such as TSS, anthocyanins, iron-reactive phenolics and tannins.
343 Alternatively, factors other than water availability may exert a predominant influence on
344 spatial patterns of these attributes.

345 Our analysis suggests that NDVI is a useful tool for delineation of irrigation management
346 zones to increase overall productivity. Furthermore, identification of management zones by
347 cluster analysis is a simple process using freeware such as MZA (Fridgen et al. 2004).
348 Various commercial companies provide multi-spectral images and associated vegetation
349 indices (e.g. NDVI and PCD) to the viticulture industry in Australia at reasonable cost.
350 However some additional data handling is required to extract NDVI for individual vine
351 locations.

352 While irrigation management zones were closely aligned with clusters identified by
353 multivariate analysis, there was an imperfect agreement between the zones and clusters.
354 Factors such as the position of existing sub-mains and valves, the fertigation system and
355 irrigation requirements of other blocks influenced where the zones were located and how they
356 were managed. This compromised the capacity to decrease site variability, however, such

357 practical considerations, including the costs associated with modifying the irrigation
358 infrastructure, are critical components in precision management.

359 Additional changes to irrigation scheduling practices could be implemented in future
360 seasons to manipulate particular vine and berry attributes. For example, regulated deficit
361 irrigation could now be imposed in the South zone to improve fruit quality without causing
362 excessive water stress in the West zone. Determination of factors, other than water supply,
363 influencing yield and fruit composition at this site could enable the development of additional
364 management practices (for example, nutrition) that would further reduce variability or
365 improve yield. Nevertheless, this study provides an assessment of the effect of site-specific
366 irrigation and demonstrates that site-specific irrigation can help improve production and
367 reduce variability of grape yield.

368

369 **Conclusion**

370

371 Modification of irrigation scheduling practices within three irrigation management zones of a
372 vineyard block, increased yield of a previously low production area and enabled reduced
373 water application in a high vigour area. Across site variability in yield, as indicated by the CV
374 and spread, decreased under site-specific irrigation management. By contrast, little impact on
375 variability of fruit composition parameters was observed. Continued monitoring is necessary
376 to observe the long-term impact on fruit composition. We conclude that site-specific irrigation
377 management at this vineyard helped improve resource use efficiency by increasing yield and
378 decreasing irrigation volumes.

379

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388

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444 **Table 1** Irrigation and effective rainfall in YR-1 (2005/2006), YR-2 (2006/2007), YR-3 (2007/08), YR-4
 445 (2008/2009) and YR-5 (2009/2010) growing seasons (September-April). Effective rainfall was defined as events
 446 greater than 10 mm. n = number of irrigation events.

Season	I (mm(n))			Rain (mm)
	West	East	South	
YR-1	420 (64)	414 (62)	414 (62)	134
YR-2	358 (52)	338 (48)	338 (48)	68
YR-3	494 (79)	458 (73)	458 (73)	88
YR-4	512 (81)	469 (74)	469 (74)	74
YR-5	455 (100)	447 (73)	373 (56)	136

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 448 **Table 2** Summary statistics for yield and fruit quality attributes at a Shiraz vineyard in four seasons with uniform
 449 irrigation management (YR-1, YR-2, YR-3 and YR-4) and one season with site-specific irrigation management
 450 (YR-5). Units: titratable acidity (g tartaric acid equivalents/l); iron-reactive phenolics (mg catechin equivalents/g
 451 berry fresh weight); anthocyanins (mg malvidin-3-glucoside equivalents/g berry fresh weight); tannins (mg
 452 catechin equivalents/g berry fresh weight)

Attribute	Season	n	Mean	Median	Min	Max	CV (%)	Spread (%)
Yield (kg/m ²)	YR-1	99	3.21	2.85	0.79	7.46	43	234
	YR-2	100	2.32	2.17	0.17	6.89	64	310
	YR-3	100	3.61	3.37	0.91	8.66	46	230
	YR-4	100	3.39	3.27	1.33	8.36	39	215
	YR-5	100	2.95	2.81	1.09	5.54	30	159
Berry fresh weight (g)	YR-1	100	1.24	1.23	0.69	1.95	19	102
	YR-2	100	1.25	1.24	0.84	2.12	18	104
	YR-3	100	1.05	1.05	0.45	1.84	22	133
	YR-4	100	1.28	1.25	0.76	1.87	14	89
	YR-5	100	1.08	1.07	0.73	1.65	18	86
Total soluble solids (° brix)	YR-1	100	24.05	24.40	19.10	26.10	6	29
	YR-2	100	24.27	24.65	18.60	28.30	7	39
	YR-3	100	23.18	23.45	17.00	26.20	8	39
	YR-4	100	23.87	24.00	19.90	26.50	5	28
	YR-5	99	24.10	24.21	19.99	27.03	6	29
Juice pH	YR-1	100	3.89	3.91	3.50	4.18	4	17
	YR-2	100	3.69	3.72	3.30	4.01	5	19
	YR-3	100	3.82	3.82	3.33	4.25	5	24
	YR-4	100	3.90	3.90	3.68	4.12	3	11
	YR-5	100	3.99	3.99	3.72	4.31	3	15
Titratable acidity	YR-1	100	4.23	4.09	3.35	6.61	18	80

(g /l)	YR-2	100	4.73	4.30	3.37	8.54	25	120
	YR-3	99	4.90	4.71	3.52	8.79	19	112
	YR-4	99	5.35	5.20	4.03	8.56	14	87
	YR-5	100	3.98	3.91	2.77	5.90	13	80
	YR-1	100	4.53	4.51	3.01	6.65	15	81
Iron-reactive phenolics (mg/g)	YR-2	100	5.81	5.61	3.80	8.40	17	82
	YR-3	100	4.79	4.67	3.32	7.72	17	94
	YR-4	100	4.23	4.15	3.13	5.47	12	56
	YR-5	100	4.94	5.00	3.22	7.21	17	80
	YR-1	100	1.31	1.39	0.32	1.82	24	107
Anthocyanins (mg/g)	YR-2	100	1.54	1.54	0.62	2.44	28	118
	YR-3	100	1.39	1.42	0.41	2.13	31	121
	YR-4	100	1.38	1.43	0.54	2.29	23	122
	YR-5	100	1.37	1.41	0.65	2.06	26	100
	YR-1	100	1.64	1.64	1.10	2.31	16	74
Tannins (mg/g)	YR-2	100	2.79	2.69	1.27	4.60	22	124
	YR-3	100	2.41	2.35	1.40	3.94	19	108
	YR-4	100	1.99	2.02	1.16	2.80	17	81
	YR-5	100	2.55	2.64	1.24	3.94	24	102
	YR-1	99	5.85	5.15	1.42	13.61	43	237
Water use efficiency (t/ML)	YR-2	100	5.67	5.35	0.39	16.98	65	310
	YR-3	100	6.52	6.17	1.67	15.86	48	230
	YR-4	100	6.11	6.02	2.28	15.40	41	218
	YR-5	100	5.07	4.78	1.84	9.60	31	162

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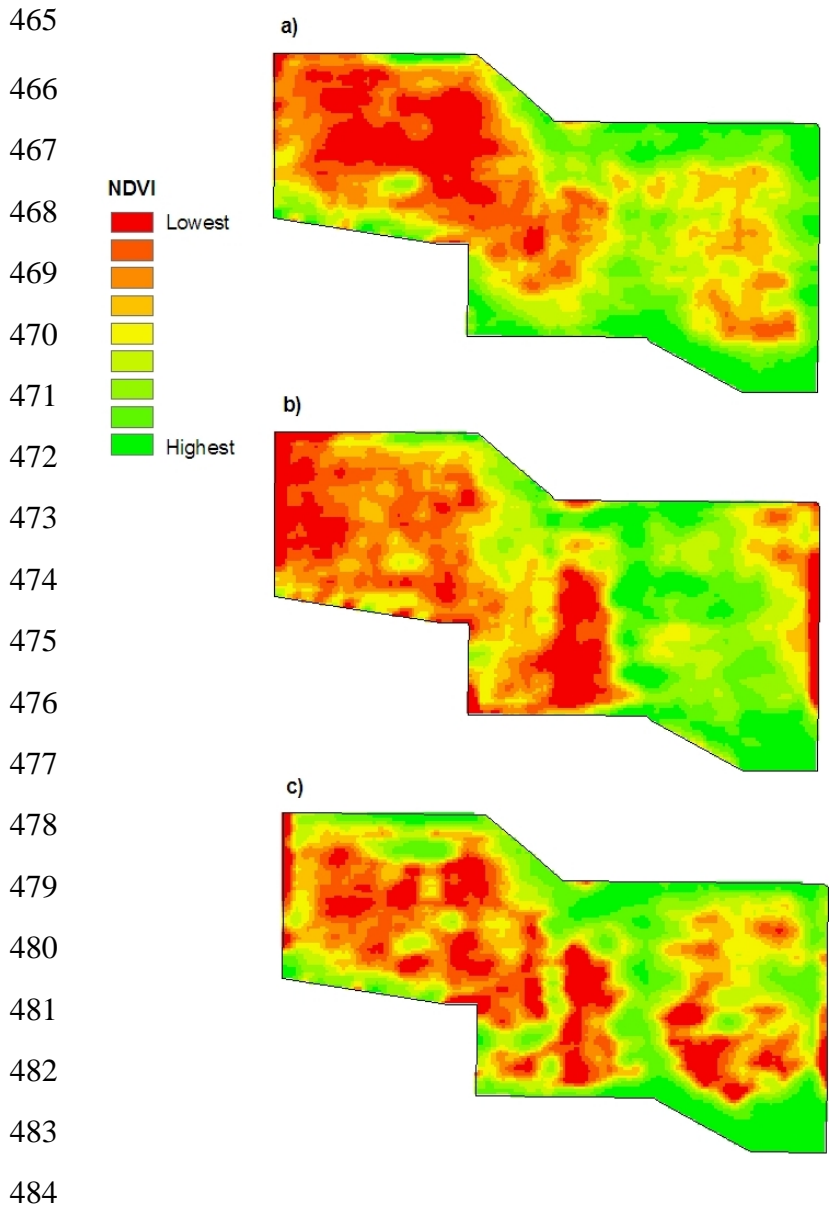
456 **Table 3** Estimates of irrigation zone (East, West and South) means for yield and fruit quality attributes, based on
457 one-way analysis of variance, at a Shiraz vineyard in four seasons with uniform irrigation management (YR-1,
458 YR-2, YR-3 and YR-4) and one season with site-specific irrigation management (YR-5). Units: titratable acidity
459 (g tartaric acid equivalents/l); iron-reactive phenolics (mg catechin equivalents/g berry fresh weight);
460 anthocyanins (mg malvidin-3-glucoside equivalents/g berry fresh weight); tannins (mg catechin equivalents/g
461 berry fresh weight). Means followed by a different letter (within a row) are significantly different from the
462 control (East) at the 0.05 probability level according to Dunnett's test

Attribute	Season	West	East	South	95 % CI of the differences from the control (East)	
					West - East	South - East
Yield (kg/m ²)	YR-1	2.43b	3.60a	4.44a	0.59, 1.75	-3.58, 1.90
	YR-2	0.86b	3.07a	4.09a	1.79, 2.63	-3.41, 1.37
	YR-3	2.33b	4.32a	4.61a	1.37, 2.61	-2.57, 1.99
	YR-4	2.62b	3.77a	4.50a	-1.72, -0.58	-0.67, 2.13
	YR-5	2.80a	2.96a	3.98a	-0.02, 0.01	-0.002, 0.07
Berry fresh weight (g)	YR-1	1.194b	1.237b	1.791a	-0.047, 0.133	-0.869, -0.240
	YR-2	1.101b	1.311a	1.759a	0.130, 0.289	-0.980, 0.084
	YR-3	1.040b	1.014b	1.601a	-0.119, 0.067	-0.931, -0.243
	YR-4	1.196c	1.314b	1.574a	-0.199, -0.038	0.062, 0.456
	YR-5	1.094b	1.040b	1.457a	-0.030, 0.137	0.212, 0.622
Total soluble solids (° brix)	YR-1	24.11a	24.21a	21.10b	-0.46, 0.65	2.10, 4.12
	YR-2	25.48a	23.74b	21.45b	-2.36, -1.13	-1.83, 6.41
	YR-3	24.52a	22.55b	20.40b	-2.66, -1.29	-2.95, 7.26
	YR-4	24.15a	23.80a	22.32a	-0.87, 0.16	-1.41, 4.35
	YR-5	24.90a	23.92b	21.74c	0.22, 1.74	-4.04, -0.31
Juice pH	YR-1	3.95a	3.87b	3.59c	-0.13, -0.03	0.14, 0.42
	YR-2	3.84a	3.63b	3.37c	-0.27, -0.16	0-12, 0.39
	YR-3	3.94a	3.77b	3.49c	-0.24, -0.10	0.03, 0.52

	YR-4	3.97a	3.86b	3.82b	0.06, 0.14	-0.14, 0.05
	YR-5	3.98a	4.00a	3.89a	-0.08, 0.03	-0.25, 0.03
Titratable acidity (g/L)	YR-1	3.781c	4.365b	5.998a	0.314, 0.853	-2.892, -0.375
	YR-2	3.852c	5.044b	7.563a	0.853, 1.531	-4.752, -0.286
	YR-3	4.261b	5.144a	7.048a	0.563, 1.203	-4.407, 0.598
	YR-4	4.966b	5.511a	6.374a	0.230, 0.861	-2.279, 0.553
	YR-5	3.939b	3.926b	5.192a	-0.211, 0.236	0.722, 1.811
Iron-reactive phenolics (mg/g)	YR-1	4.374a	4.614a	4.681a	-0.556, 0.076	-0.707, 0.841
	YR-2	6.747a	5.339b	4.367c	1.097, 1.719	-1.733, -0.211
	YR-3	5.206a	4.604b	3.781b	0.245, 0.959	-1.698, 0.051
	YR-4	4.278a	4.221a	3.837a	-0.191, 0.307	-0.993, 0.226
	YR-5	5.385a	4.764b	3.565c	0.260, 0.982	-2.083, -0.315
Anthocyanins (mg/g)	YR-1	1.481a	1.231b	0.852c	-0.379, -0.121	0.205, 0.553
	YR-2	1.966a	1.326b	0.848c	0.512, 0.768	-0.792, -0.165
	YR-3	1.772a	1.196b	0.760b	-0.713, -0.439	-0.135, 1.008
	YR-4	1.547a	1.312b	0.816b	-0.359, -0.111	-0.060, 1.051
	YR-5	1.541a	1.306b	0.725c	0.084, 0.385	-0.950, -0.213
Tannins (mg/g)	YR-1	1.646a	1.644a	1.564a	-0.124, 0.128	-0.389, 0.229
	YR-2	3.390a	2.490b	1.998b	0.694, 1.104	-0.996, 0.010
	YR-3	2.634a	2.299b	1.942b	0.133, 0.537	-0.852, 0.139
	YR-4	1.946a	2.037a	1.783a	-0.252, 0.071	-0.649, 0.141
	YR-5	2.896a	2.404b	1.583c	0.236, 0.748	-1.448, -0.195
Water use efficiency (t/ML)	YR-1	4.39b	6.58a	8.11a	-0.579, -0.223	-0.189, 0.679
	YR-2	2.02b	7.57a	10.09a	-1.076, -0.762	-0.084, 0.682
	YR-3	4.00b	7.91a	8.44a	-0.431, -0.244	-0.173, 0.283
	YR-4	4.47b	6.95a	8.29a	-0.070, -0.030	-0.023, 0.075
	YR-5	4.75b	5.08b	7.81a	-0.023, 0.009	0.014, 0.095

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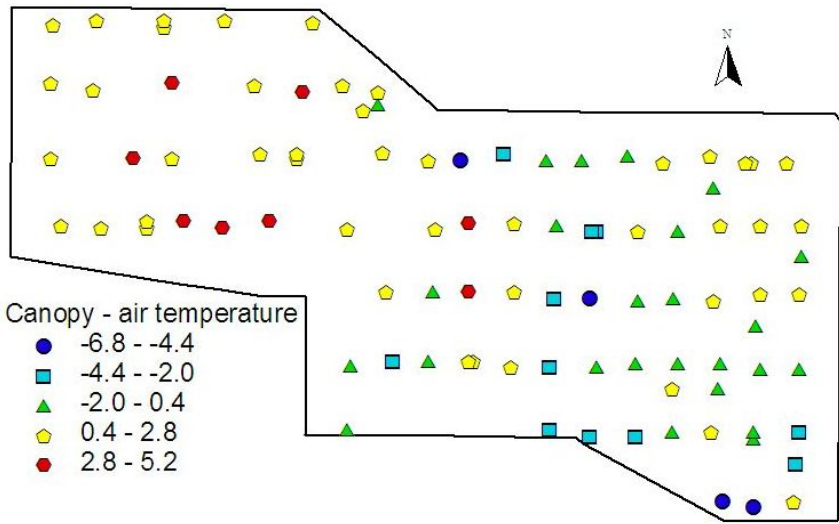
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485 **Fig. 1** Relative normalised difference vegetation index (NDVI) at the study site in three consecutive seasons **a)**
 486 YR-1, **b)** YR-2 and **c)** YR-3. NDVI was derived from aerial imagery data collected at veraison. A
 487 neighbourhood statistical procedure was used to derive these maps without the removal of non-vine data points

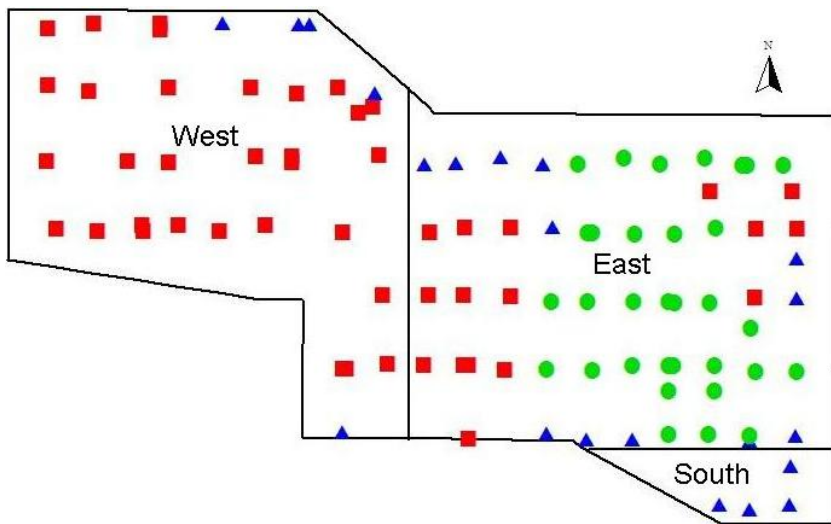
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511 **Fig. 2** Spatial variation in canopy – air temperature (°C) for 94 vines on 7 January 2008 (during veraison) in
 512 season YR-3. Canopy temperature measurements were taken in the mid-afternoon from directly above the
 513 canopy using infrared sensors mounted on an all-terrain vehicle. Air temperature was monitored over nearby,
 514 well watered grass

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534 **Fig. 3** Site-specific irrigation management zones (East, West and South) within the study block. Points indicate
 535 the target vines used for the measurement of yield and fruit composition. The results of the multivariate cluster
 536 analysis of normalized difference vegetation index (NDVI) are indicated by squares, circles and triangles
 showing classification to three clusters