

1 **Research Article**

2 **Is Precision Viticulture Beneficial for the High-Yielding**
3 **Lambrusco (*Vitis vinifera* L.) Grapevine District?**

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21
22 **Abstract:** The best Lambrusco wines are often obtained by blending a representative of the Lambrusco
23 family (i.e. Lambrusco Salamino) with a smaller fraction of Ancellotta, a teinturier variety possessing an
24 extraordinary quality of accumulating color. Due to the economic importance of the Lambrusco business
25 and the rising interest in precision viticulture, a two-year trial was carried out in seven vineyard plots
26 growing both the named varieties. A RapidEye satellite image taken on 9 August 2018, led to vigor maps
27 based on unfiltered normalized difference vegetation index (NDVI). In both the years, ground truthing was
28 performed on the test vines chosen within each vigor area for soil features, vegetative growth, yield,
29 grape, and final wine composition. For data pooled over sites and years, Ancellotta showed a very clear
30 response to NDVA-based vigor mapping as low vigor areas always achieved improved ripening in terms of
31 higher total soluble solids (+1.24 Brix), color and phenols (+0.36 mg/kg and + 0.44mg/kg, respectively),
32 and lower malate (-1.79 g/L) vs high vigor. Such a behavior was shown even in those cases where NDVI
33 of different vigor levels and pruning weight were not closely correlated and, most notably, low vigor
34 matched with a slightly higher yield as compared to high vigor plots. Overall, the high yielding Lambrusco
35 Salamino was less responsive in terms of vine performance and grape composition versus intra-vineyard
36 variability. This study highlights that, in Ancellotta, adjusting the vine balance toward ostensible lower

37 vigor (i.e pruning weight ≤ 1 kg/m) would result in a superior choice in terms of improved ripening and
38 wine profiles would not be detrimentally impacted by the yield level which, in fact, increased in some
39 cases.

40

41 **Key words:** grape composition, remote sensing, satellite imagery, spatial variability, vine capacity,
42 yield

43

Introduction

44 The essence of applying precision agriculture is that it takes into account in-field variability (McBratney
45 et al. 2005, Schieffer and Dillon 2014, Wolfert et al. 2017). Its characterization is left to a spatial and
46 temporal mapping of crop status, vegetative growth, yield, and fruit quality variables and paves the way
47 to the enticing prospect that the general negative traits usually bound to “variability” might turn into an
48 unexpectedly profitable scenario (Rudd et al. 2017, Shafi et al. 2019). In fact, once proper spatial in-field
49 variability is described and quantified the same can either be exploited through selective management
50 operations (Bramley et al. 2005) or by balancing it towards the most rewarding status through the
51 adoption, for instance, of variable rate technologies (Gatti et al. 2020).

52 The range of spectral, spatial, and temporal resolution now offered by combining the four main
53 categories of available sensors *viz.*, commercial off-the-shelf RGB (red-green-blue), multispectral,
54 hyperspectral, and thermal cameras and the flexibility allowed by main acquisition platforms, i.e. satellite,
55 aircraft, unmanned aerial vehicles, and proximal (i.e. tractor mounted) offer an already huge and still rising
56 array of possible precision agriculture applications (Maes and Steppe 2019, Matese et al. 2015). These
57 embrace drought stress, pathogen and wind detection, nutrient status, vegetative growth and vigor, and
58 yield prediction. Indeed, difficulties and opportunities related to the precision agriculture approach might
59 drastically change depending on having, for instance, a field crop forming a continuous green cover or an
60 orchard system typically featuring a discontinuous canopy where the rows alternate soil strips. Thus, it is
61 not surprising that a very high number of precision agriculture applications pertain to the vineyard
62 ecosystem (Hall et al. 2002, Matese et al. 2015) with the normalized difference vegetation index (NDVI)
63 being the most often used. When compared to the orchards of other fruit trees that also show a
64 discontinuous green cover, a vineyard is more prone to show intra-parcel variability for several reasons,
65 which are as follows: i) it is a high-value crop grown under a wide range of latitudes, altitudes, and slopes
66 that foster differential growth according to micro- or meso-climate variations and soil heterogeneity; ii)

67 variability in vigor is favored by the plasticity of the species that due to long and flexible canes can be
68 arranged under many different canopy geometries and trained to a multitude of training systems, and iii)
69 as shown in several previous studies, intra-vineyard spatial variability seems to be quite stable over time
70 (Kazmierski et al. 2011, Taylor and Bates 2013) and is mostly related to the patchiness in the soil's physico-
71 chemical features affecting water holding capacity, water infiltration rates, nutrient availability, uptake,
72 etc.

73 Despite the above, when comparing the array of current precision viticulture applications and the
74 number of cases showing standard adoption of such techniques, the gap, at least in Italy, seems huge.
75 Among the several factors contributing to this, it is apparent that growers still do not have a complete
76 perception of the added value that precision viticulture or site-specific management can bring to their
77 businesses. A recent survey conducted among the grape growers of the Emilia-Romagna Region (A. Ulrici,
78 personal communication, 2020) and the collection of 353 responses to a submitted questionnaire has
79 shown that precision techniques were regarded as a priority topic by only 51 responders, whereas aspects
80 such as adaptation to climate change, new techniques for pest control, and automation/mechanization
81 were preferred by more than 100 growers. Part of the problem is that, despite a large number of
82 applications and subsequent vast publication activity on the subject (Bramley 2010, Matese et al. 2015),
83 the mapping derived from image acquisition is not always associated with proper ground truthing. This
84 means that the agronomic performance of vines falling in the vineyard parcels having different degrees
85 of vigor and yield potential need to be properly and carefully substantiated. A quite common mismatch is
86 that a given vigor level described as "high," "medium," or "low" might result in an agronomic counterpart
87 that is negating that meaning. A case in point, among several, is the one reported by Fiorillo et al. (2012)
88 who mapped a Sangiovese vineyard in Tuscany and reported an average one-year-old pruning weight of
89 498 g/m of cordon length for the high vigor (HV) plots that, indeed, according to a robust literature
90 (Kliewer and Dokoozlian 2005, Smart 1985) cannot be regarded as an expression of HV or excessive
91 vegetative capacity. Then, it was not surprising that the HV vines performed better than low vigor (LV)
92 vines in the Tuscany experiment having only 250 g of pruning weight/m. This assumption gains support
93 also from a 4-year study conducted by Bonilla et al. (2015) on cv. Tempranillo grown in the warm area of
94 La Rioja in Spain. It indicates that an NDVI-based HV vineyard parcel delivered notably improved grape
95 composition, especially as to anthocyanin concentration, over that of LV vines. The above findings suggest

96 that the labeling of vigor areas without site-specific ground truthing can lead to meaningless or even
97 deceiving information.

98 Another item deserving clarification is assessing when intra-vineyard spatial variability is high enough
99 to warrant some forms of exploitation (i.e., selective harvesting) or correction (i.e., adopting variable rate
100 applications to let convergence towards the most desired vigor or yield level. Evidence has been provided
101 (Schaepman-Strub et al. 2006, Tanda and Chiarabini 2019) that absolute values of NDVI cannot be directly
102 used to infer vigor simply because at the same NDVI value, quite different levels of vigor can be found due
103 to the interference of several factors such as ground resolution, modalities of image acquisition (i.e.,
104 zenital vs inclined), composition of mixels (a pixel having a varying contribution of canopy and soil
105 reflection patterns), floor management, pruning type, and row orientation.

106 An ideal and still unexplored wine district to be assessed in terms of spatial variability by satellite
107 imagery is the Lambrusco area, extending for about 15,590 ha primarily in the Provinces of Modena and
108 Reggio Emilia in the Emilia-Romagna Region, mostly established on flat terrains. Lambrusco is a fairly
109 unique product and is renowned as a crisp, vividly colored, and sparkling red wine. Currently, it is the most
110 sold wine in large-scale retail trade and the HORECA channel in Italy and also boasts of increasing export
111 trends to South America, Russia, and Canada (as found in <http://www.inumeridelvino.it>).

112 The purpose of this study was the following: i) to provide ground truthing, on a two-year basis, of NDVI-
113 based vigor maps created from satellite imagery in three different farms growing Lambrusco Salamino,
114 one of the best representative cultivars of the Lambrusco family and Ancellotta.; and ii) to determine if
115 and how assessed and ground truthed intra-vineyard variability should lead to a change in the current
116 cultural practices.

117 **Materials and Methods**

118 **Plant material and experimental layout.** The experiment was carried out in 2018 and 2019 in three
119 farms located in the middle of the Po River Valley (Province of Reggio Emilia, Emilia-Romagna Region). For
120 each of them, two different red skin grape varieties of *Vitis vinifera* L., Ancellotta and Lambrusco Salamino
121 were chosen for a total of seven test parcels (three plots for Lambrusco Salamino and four plots for
122 Ancellotta). While general features of each vineyard are reported in Table 1, attention was given to
123 Ancellotta and Lambrusco Salamino due to their high acreage (4,635 and 4,085 ha for Lambrusco Salamino
124 and Ancellotta, respectively). Ancellotta and Lambrusco Salamino nicely complement each other in the

125 “Reggiano”, “Lambrusco Salamino di Santa Croce,” and “Lambrusco di Modena” DOC appellations where
126 Ancellotta is allowed up to 15%. Ancellotta is a well-known, deeply-colored complementary variety
127 bringing more color, structure, and roundness to the wine smoothing down the high acidity of the
128 Lambrusco Salamino grapes. Mapped vineyards ranged from 0.4 ha to 1.3 ha in size and were all vertically
129 shoot positioned (VSP) types (Table 1). However, pruning systems were different ranging from VSP spur-
130 pruned cordon at Pignagnoli to a traditional Sylvoz trellis at Sabbattini ending with a Casarsa system at
131 the Robuschi site. At Robuschi, data collection is limited to 2018 as very severe hail damage prevented
132 gathering reliable harvest data in 2019.

133 The minimum, mean, and maximum daily air temperature (°C) and daily rainfall (mm) from April 1 to
134 September 30 were measured in each season by a nearby weather station.

135 **Vigor mapping and soil sampling.** A multispectral remote image was taken on 9 August 2018, using a
136 satellite belonging to the RapidEye constellation and equipped with a 5 m ground resolution sensor. The
137 NDVI index was consequently calculated and vigor maps built according to the “equal area” algorithm
138 applied by the engineering company Studio TerraDat (Paderno Dugnano, Italy) resulting in the breakdown
139 of each parcel into three vigor classes corresponding to HV, MV, and LV (Figures 1 and 2). The ‘equal area’
140 criterion was preferred in maps segmentation due to its intrinsic ability to describe more effectively rapid
141 and/or irregular changes in natural data and phenomena (Zhou et al. 2007). Absolute values of NDVI
142 ranges for each parcel and vigor level are reported in the captions of Figures 1 and 2 for both the cultivars.
143 The NDVI utilizes only two reflectance values, taken at the same time and for the same target area,
144 according to the equation $NDVI = (\rho_{NIR} - \rho_R) / (\rho_{NIR} + \rho_R)$, where ρ is the spectral reflectance of the target
145 and the subscripts NIR and R denote the near-infrared (760–850 nm) and the red (630–685 nm) satellite’s
146 spectral bands, respectively. The NDVI is a number ranging between -1 and +1 and quantifies the relative
147 difference between the near-infrared reflectance “peak” and the red reflectance “trough” in the spectral
148 signature. For the highly vegetated targets, the vigor level is high and the NDVI value is close to unity,
149 while for the non-vegetated targets, the vigor level is low and the NDVI value is close to zero (negative
150 values rarely occur in natural targets).

151 For each cultivar x farm x vigor level combination (2 x 3 x 4 to yield 18 cases in total), a soil sample
152 down to 120 cm depth was taken with a Dutch auger in the central part of a given vigor area and the mid-
153 row alley on June 26 and 27, 2019. Each sampling point was geolocalized according to standard Datum
154 WGS, projection UTM, and fuse 32. Each soil observation was then classified based on the soil taxonomy

155 to the family level (Soil Survey Staff 2014). Soil subsamples from 0–40 cm depth were then taken at ten
156 different positions around six of the 18 drilled holes and then reunited in a single composed sample per
157 position. These soil samples were then processed for standard chemical-physical analyses as reported in
158 Table 1S.

159 **Vine assessment.** Each vigor zone was divided into three blocks. For each block x vigor combination
160 four vines were randomly chosen (36 vines in total for each vineyard, 12 vines for each vigor class) to
161 collect data for ground truthing assessment. Each season, at the time of harvest, cluster number, and yield
162 per vine were recorded for each individually tagged vine and the mean cluster weight was calculated
163 accordingly. At the time of winter pruning, the total cane number per vine was taken and cane fruitfulness
164 was calculated. In November 2018, before performing winter pruning, the node number for every vine
165 left on the two-year-old wood was taken and, after pruning, the same counting was made of the newly
166 maintained spurs or canes.

167 Each season, the harvest was done when the Brix concentration in grapes was higher than 20 and 18
168 Ancellotta and Lambrusco Salamino, respectively. At that time, a 200 berry sample was taken from each
169 tagged vine assuring that variability due to the cluster position within the plant and the berry position
170 within the cluster were represented. After weighing the whole sample, a 50-berry subsample was used to
171 measure the concentration of total anthocyanins and phenols after Iland (1988), and the final data were
172 expressed as mg/g of fresh berry mass. The remainder of each whole sample was crushed and the
173 resulting musts were immediately analyzed for Brix, pH, and titratable acidity (TA). Brix concentration was
174 determined using a temperature-compensating refractometer (RX-5000 ATAGO U.S.A., Bellevue, WA), pH
175 was assessed with a pH-meter CRISON GLP 22 (Crison, Barcelona, Spain), and TA was measured by titration
176 with 0.1 N NaOH to a pH 8.2 endpoint and expressed as g/L of tartaric acid equivalents.

177 The quantification of organic acids was performed injecting musts into HPLC after filtering through a
178 0.22µm polypropylene filter. The identification was performed by external calibration with standards and
179 concentration was calculated measuring the peak area and expressed in g/L. For this analysis, an Allure
180 Organic Acid Column, 300 × 4.6 mm, 5µm (Restek, Bellefonte, PA) was used. The separation was
181 performed in isocratic conditions using water, pH adjusted at 2.5 by adding ortho-phosphoric acid. The
182 column temperature was maintained at 30 ± 0.1 °C, 15µl of the sample was injected. The elution was
183 monitored at 200–700 nm and detected by UV–Vis absorption with DAD at 210 nm.

184 When the leaf fall was completed, the total cane number per vine was taken and the fresh weight of
185 the 1-year old wood was removed with pruning and recorded for both the main and lateral canes.
186 Thereafter, the vine fruitfulness was calculated as the clusters/cane ratio, whereas the Ravaz index was
187 calculated as the total yield-to-total pruning weight ratio (kg/kg).

188 **Microvinifications.** In two selected vineyards (LSSAB and ASAB2), 300 kg of grapes from HV and LV
189 blocks were harvested each year to conduct microvinifications in triplicate of single 100 kg batches at the
190 ASTRA laboratory (Tebano, Ravenna, Italy). After destemming and crushing, each batch was added with
191 sulfur dioxide (50 mg/L), ammonium phosphate (180 mg/L of nitrogen), and a suitable trade strain (30
192 g/100 Kg). The samples were then placed in a thermo-conditioned room (15–20°C) for the
193 fermentation/skin maceration phases and surveyed through the daily recording of the sugar content
194 (Babo) and temperature (°C). At 8–9% of alcohol content, the maceration was followed by sieving the solid
195 part (macerated peels and seeds) from the liquid phase (fermenting must). The raw wines were then
196 racked at the end of the fermentation process and added with sulfur dioxide (100 mg/L), gelatine (10
197 g/100 Kg), and bentonite (40 g/100 Kg). The wines were then stored at -5°C for not less than 3 weeks to
198 achieve tartaric stabilization. At the end of this phase, the stabilized wines were racked and newly added
199 with sulfur dioxide up to the maximum legal limit of 150 mg/L. Finally, the wines were filtered using
200 capsules of different materials and with different porosity of the membranes (up to 0.65 µm) to obtain a
201 limpid/shiny product.

202 **Statistical analysis.** Data were analyzed by a two-way analysis of variance (ANOVA) using Sigma Stat
203 3.5 (Systat Software Inc., San José, CA). The comparison of treatments was performed by Student–
204 Neuman–Keuls test at $P \leq 0.05$. Year \times treatment interaction was partitioned only in the case of F test
205 significance.

206 Results

207 The weather course registered over 2018 and 2019 (Figure S1) provided a good example of variability
208 over years. The year 2018 was quite standard for the area with a total GDD of about 2,000 °C from April 1
209 to September 30, moderate cumulative rainfall (276 mm) over the same period, and a quite long, hot, and
210 rainless period in summer until harvest. On the other hand, the year 2019 was un-seasonally cold and wet
211 until the end of May. Several rainstorms occurred also during the summer providing a remarkable 542
212 mm of total precipitation between April 1 and September 30.

213 Composite soil samples taken at 6 positions over different sites to represent either cultivar and vigor
214 level variability showed that although soils sampled at Sabbattini had overall higher sand fraction than
215 the other two sites, all of the samples shared features of no apparent limiting factors for root
216 development, abundant organic matter, and adequate total nitrogen availability (Table S1). Table S2 has
217 the details about soil horizon depths and the structures of eight out of 16 deep soil trenches that, at a
218 preliminary visual assessment, showed some kind of variation along the vertical profile. Most notably, in
219 both cultivars, the soil humidity status that was checked at the time of sampling indicated a humidity
220 status closer to the 1 (dry) category in the LV plots, whereas, in the HV plots, it approximated the 2 (slightly
221 humid) category with the status of “humid” (rank 3) scored at position 12 and a depth of 110–120 cm.

222 Despite large differences in retained bud load, cluster number and yield/ m of the row due to different
223 pruning system (spur-pruned cordons vs. long hanging canes held on a Casarsa trellis), the different vigor
224 zones mapped through NDVI calculation at Pignagnoli and Robuschi did not result in any significant
225 difference in terms of pruning weight, yield components, and the Ravaz index (Table 2). At Pignagnoli, no
226 significant year x vigor interactions occurred either. Despite the vigor results being quite well balanced
227 across the two sites (PW ranged from 630 to 800 g/m of cordon length), the high node fruitfulness of
228 Ancellotta explains tendentially high Ravaz index values.

229 A different scenario occurred at Sabbattini’s locations where, in parcel 1, NDVI corresponded with
230 pruning weight that was significantly improved in the MV and HV treatments with both exceeding the 1.5
231 kg/m threshold. Interestingly though, some yield components followed a somewhat unrelated or inverse
232 relationship, whereby the yield/m was not related to NDVI, and the cluster weight decreased linearly
233 moving from LV to HV. Consequently, the Ravaz index was the highest in LV (8.36 kg/kg) and the lowest
234 in HV (5.47 kg/kg).

235 At Sabbattini 2, a relationship between yield/m and NDVI was observed as in the HV vines the yield/m
236 was 40% lower than the level in LV vines that was set at 5.64 kg/m (data averaged over the two seasons).
237 The specific yield components involved in such a response were cane fruitfulness and, in turn, the cluster
238 number/m that in HV was quite lower (31) than in MV and HV (44 and 46, respectively). Pruning weight
239 did not vary with NDVI levels; however, a significant year x vigor interaction occurred for this variable
240 (Figure 3) indicating that, in 2018, pruning weight of HV (1.4 kg/m) largely exceeded values recorded in
241 MV and LV in both settings at about 1 kg/m. The Ravaz index variation also matched the mapped vigor
242 levels as it ranged from a maximum of 6.45 kg/kg in LV to a minimum of 3.15 in HV (Table 2). In terms of

243 year effects, it was quite evident that at the Sabbattini site, 2018 was a sort of a responsive season and
244 2019 a nonresponsive season.

245 Fruit composition variables vs NDVI based vigor levels at the different sites for the Ancellotta cultivar
246 indicates that, in general and regardless of the specific location, causal relationships were higher in
247 number and magnitude (Table 3) as compared to vegetative and yield variables.

248 At Pignagnoli, despite cane pruning weight and yield showing no apparent correlation with NDVI, LV
249 vines had higher Brix, tartrate/malate ratio and phenols than HV, and conversely lower TA and malic acid.
250 Overall, MV vines behaved quite similarly to HV vines. There were also significant year x vigor interactions
251 for TA, pH, and malic acid (Figure 3), showing that while in the quite dry 2018 season (Figure S1) these
252 variables had scant variation across vigor levels, in the overall cool and rainy 2019, HV vines retained
253 considerably higher TA, and especially malic acid, as compared to both MV and LV.

254 Albeit limited to a single season (2018), the outcome from Robuschi's plot mirrored what was
255 reported for Pignagnoli, as lack of any relationship between cane pruning weights and yield vs NDVI did
256 not prevent LV vines from reaching better maturity than either MV or HV, including total anthocyanins
257 (Table 3). Must composition at harvest at Sabbattini site 1 had an overall good correspondence with the
258 higher cane pruning weights measured in HV plots. Although Brix was not significantly affected, HV had
259 higher TA and malic acid, as well as lower total phenols than MV and LV. A quite similar response was
260 seen at Sabbattini site 2 where, for data pooled over the two seasons, HV vines originated decidedly less
261 mature grapes for most of the fruit ripening variables, including also total anthocyanins and phenols
262 concentration. TA showed a significant year x vigor interaction, confirming that in the wet and cooler
263 2019, TA of HV stayed above the 12 g/L threshold (Table 3).

264 Despite large variability in bud load/m, cluster number/m, yield/m, and Ravaz index, in no case were
265 there differences among NDVI-based vigor levels for vegetative and yield variables in the Lambrusco
266 Salamino cultivar (Table S3). At Pignagnoli, must composition at harvest was somewhat more responsive
267 to vigor levels, and interestingly, HV concurrently had higher TA and total anthocyanins than MV and LV
268 (Table 4). Single-year data (2018) of must composition at harvest available at Robuschi did not indicate
269 any consistent difference in ripening, whereas at Sabbattini differences were limited to lower Brix in HV
270 vs MV and LV and a reduced tartrate/malate ratio, primarily driven by slightly higher malic acid retained
271 in HV (Table 4).

272 Final wines composition for grapes taken from Sabbattini vineyards and representative of LV and HV
273 is reported in Table 5. The responsiveness of Ancellotta to the described intra-vineyard variability was
274 confirmed, overall. In both vintages and regardless of the quite sharp differences in the weather course
275 of each season, the true final alcohol content in LV was 1.22 and 1.56 Brix higher than that measured in
276 HV vines, and most importantly, highly desirable traits such as total anthocyanins and color intensity were
277 associated with lower vigor zones. Similar effects, although lower in magnitude, were seen for the wine
278 variables of Lambrusco Salamino.

279 Discussion

280 NDVI interval calculated over different sites and cultivar was between 0.160 and 0.325, i.e. quite far
281 from saturation. Similar to the case presented in Ledderhof et al. (2016) we have worked in vineyards
282 having grassed interrows at the time of image acquisition and ground resolution used (5 m) indeed
283 included both vine and soil pixels. Though, our NDVI ranges were very close to those calculated by the
284 above authors on 3 x 3 m and 5 x 5 m resampled images that were also cleaned to isolate pure vine pixels
285 only. Likely reason is that NDVI disturbance due to grassed inter-rows is high when the vineyard floor is
286 covered with dense vegetation, whereas under our operational condition vegetation was quite weak with
287 several yellow spots.

288 Over cultivars, out of seven tested vineyard plots, in only one case (Sabbattini 1 – Ancellotta) did NDVI
289 based vigor levels reflect a significant variation in one-year-old pruning mass. This outcome feeds two
290 possible hypotheses; either that “low”, “medium”, and “high” were overall representative of a scant
291 whole plot variability, or conversely that pruning weight might not be sensitive enough to detect vigor
292 differences.

293 About the first hypothesis, soil samples taken at different vigor plots showed, within each cultivar,
294 mild variation in terms of texture, nutritional status, and chemical variables (Table S1). However, in both
295 cultivars, soil profile investigated until 120 cm depth and classified for the status of the different horizons
296 showed that, in HV plots, soils were slightly deeper and more humid at the time sampling was made,
297 therefore potentially accounting for a somewhat different vine vegetative expression (Table S2).

298 With regard to pruning weight being a good predictor of vine vigor and/or vegetative capacity, older
299 work (Bates 2008) has shown, in Concord, a close correlation between pruning weight and total leaf area.
300 However, when it comes to the correlation between NDVI and pruning weight, the literature is anything

301 but unanimous. Indeed, previous work showing a high correlation between NDVI levels and pruning
302 weight has been reported (Gatti et al. 2017, 2018, Vélez et al. 2019), although somewhat opposite results
303 were also published, showing poor correlation or no correlation (Ferrer et al. 2020, Ortega-Blu and
304 Molina-Roco 2016), or other vegetative indices having higher correlation (i.e., trunk circumference as
305 reported by Trought and Bramley (2011). It has also been proposed (Bramley et al. 2019) that reliability
306 of a given vigor parameter might depend upon the pruning type and especially bud load. In theory, moving
307 from a low to high bud load, the latter being representative of either mechanical or minimal pruning, due
308 to the increasing number of either main and lateral canes, wood maturation might get worse, leading to
309 significant self-pruning before the record of winter pruning is actually taken. An additional error is also
310 caused by the fact that, quite typically, the removed pruning mass does not take into account shoot mass
311 previously removed with trimming, which usually has a stronger impact in severely pruned training
312 systems that are conducive to high vigor of individual shoots. However, such a rationale is not confirmed
313 in our study, since the three chosen vineyards adopt different pruning systems covering a large variation
314 either for pruning length (short in spur-pruned cordons and long in Sylvoz and Casarsa trellises) and bud
315 load (Table 1). Moreover, in all the experimental sites considered as part of this study, canopy trimming
316 was performed several times over the season, leading to a much more standardized canopy shape and
317 volume at the end of the growing season, and especially at veraison when satellite imagery was acquired.
318 According to Taylor et al. (2013) this evidence suggests that bigger differences in plant growth and vigor
319 within the selected sites might be registered by mapping vineyards at different phenological phases, such
320 as before fruit-set or before trimming. Though, it should also be considered that even a nadir NDVI
321 determination performed at canopy growth completion on a VSP trellis still offers room to accommodate
322 variation in vine size mostly due to canopy thickness and, depending upon degree of laterals emission
323 after last trimming, colonization of some interrow spacing. Conversely, it is unlikely that variation is due
324 to canopy function as the image targets to top canopy section representing also the youngest canopy part
325 whose senescence process has not likely commenced yet.

326 On the other hand, despite pruning weight measurement being a quite straightforward procedure, it
327 is time consuming, and it could also be that sample size is not adequate to represent whole block
328 variability (Panten and Bramley 2012). The issue could be overcome by using on-the-go proximal imaging
329 acquisition to estimate pruning weight (Kicherer et al. 2017, Millan et al. 2019), for comparison with NDVI
330 images taken at full canopy earlier the same season. Previous work (Taylor et al. 2013) had confirmed the

331 soundness of this approach although it was apparent that proximal sensing focused on the supporting
332 wire of the trellis led to saturation problems which diminished when the target was a canopy area
333 featuring still growing shoots.

334 A quite peculiar aspect of our work when considering the response of Ancellotta was that, though the
335 NDVI derived vigor levels had, with few exceptions, poor correlation with either pruning weight or yield,
336 the overall grape composition response was, regardless of training systems, pruning type, and bud load,
337 in favor of the low vigor status. In fact in LV, Brix, malic acid, tartaric/malate ratio, total anthocyanins and
338 phenols in all cases showed a relative change in terms of “improved” ripening as compared to HV (i.e.,
339 higher TSS, color, phenols, and tartare/malate ratio and lower malic), and in 18 cases out of 20 paired
340 comparisons (4 locations x 5 variables), such difference was significant. Pooling Ancellotta data over
341 different locations revealed that, to promote maturity, the Ravaz index should stay around 9-10 kg/kg and
342 pruning weight should not exceed 1 kg/m of cordon length.

343 However, the response observed on LV- Ancellotta is quite different from that of other studies where
344 low vigor was likewise associated with enhanced maturity. This has been reported for several conditions
345 and varieties, including for Barbera (Ferrer et al. 2020, Gatti et al. 2018, Kotsaki et al. 2020, Song et al.
346 2014), although in these studies low vigor also paralleled considerably lower yield. Our data show that—
347 in terms of grand means over sites—LV- Ancellotta had a yield of 7.47 ± 1.19 kg/m vs. 6.91 ± 1.05 kg/m
348 and 5.98 ± 1.15 in MV and HV, respectively. These data look extremely promising for local growers,
349 especially in terms of the economic sustainability of a precision approach; improving maturity under no
350 change, or even a slight increase in yield, is a very desirable outcome and represents a very good example
351 of how intra-vineyard variability could be profitably exploited. No doubt the growing and ripening features
352 of Ancellotta would favor such a response: Ancellotta has been demonstrated to be a quite flexible
353 genotype in terms of variation of fruit composition variables vs. increasing yield: yield vs Brix were not
354 correlated ($R^2 = 0.02$) despite yield/m ranging between 3.4 and 9.6 kg/m, and the same applied to the
355 relationship of yield/m vs total anthocyanins ($R^2 = 0.02$).

356 The batch of data gathered on Ancellotta also sheds light on the usefulness of ground truthing for a
357 vigor level defined as “high” on an NDVI mapping assessment. Expected agronomic responses to “high”
358 vigor combine with higher yield and delayed or incomplete ripening, as several previous studies have
359 shown in detail (Gatti et al. 2017, King et al. 2014, Ledderhof et al. 2017, Song et al. 2014); however, the
360 literature also reports cases where high vigor achieved the best quality. This happened, for instance, in a

361 remote sensing application to a Riesling vineyard in the Niagara Peninsula (Marciniak 2015), where vines
362 with higher NDVI during average-to-dry years had enhanced fruit maturity (higher Brix and lower TA).
363 Similarly, in the hot climate of la Rioja Region (Bonilla et al. 2015), a four-year survey on NDVI-based
364 mapping in a Tempranillo vineyard showed that berry pigmentation was consistently enhanced under HV,
365 likely as a result of better microclimate conditions for color accumulation (Mori et al. 2007). The response
366 of HV Ancellotta vines observed in our study, though, still seems different from the two reported ones.
367 While it was ascertained that NDVI based high vigor led to inferior grape composition, the same high vigor
368 was decoupled from a yield response, and the highest yield levels were found on low vigor vines. This
369 behavior was seen at both Sabbattini sites, albeit under two probably different mechanisms; in Sabbattini
370 1 the inverse relationship between NDVI based vigor level and cluster weight suggests, on a two-year
371 basis, that cluster weight was limited by lower fruit-set due to competition exerted by excessive vegetative
372 growth (May 2004) at either MV or HV. Indirect confirmation is that neither shoot fruitfulness nor berry
373 weight was affected by vigor, and calculated berry numbers/clusters varied from a maximum of 128 in LV
374 to a minimum of 93 berries/cluster in HV. At the other Sabbattini site, a different mechanism is envisaged
375 to involve a likely biannual bearing pattern. In the year 2018, which had the features of a responsive year
376 in terms of yield, bud initiation conditions were likely less favorable due to a competitive vigorous growth
377 in HV (PW at 1.42 kg/m, Figure 3), that resulted in a lower actual shoot fruitfulness the next season (Table
378 3).

379 Despite vineyard design and cultural practices not being changed as a function of cultivar, overall
380 Lambrusco Salamino response to intra-vineyard variability was mild, and differences were much less at
381 both grape and wine compositional levels. The hypothesis that can be made to explain such differential
382 behavior hints at its different agronomic traits and the role that Lambrusco Salamino is expected to play
383 in a Lambrusco wine type. Lambrusco Salamino is historically considered the “yield” builder in such a
384 context, and older Lambrusco Salamino vineyards trained to the traditional Raggi Bellussi system or the
385 more recently introduced GDC quite easily reach 40 t/ha (Intrieri and Poni 1995). In the specific context
386 of our study, Lambrusco Salamino vine balance assessed over different sites and vigor levels was quite
387 different from Ancellotta; vigor is overall lower (0.65-0.70 kg/m range), the yield is much higher (9.4-10.3
388 kg/m range), and remarkably, Ravaz index is astonishingly constant around 18 kg/kg, suggesting a sort of
389 permanent over-cropping status. Under such high crop load status, it is also probable that vines are less
390 responsive to any factor that is able to alter vigor. Lambrusco Salamino proved to be extremely insensitive

391 in terms of Brix response vs yield, showing essentially no change within the interval of 6.9 – 14.1 kg/m (R²
392 = 0.06).

393 Data need to be discussed also in terms of modifications to vineyard management that the Lambrusco
394 district could consider in light of the presented results. Due to the responsiveness of Ancellotta in terms
395 of the capacity of low vigor plots to improve either grape or wine composition without altering or even
396 slightly increasing yield, such an attitude should be exploited and managed. While the target is not to
397 exceed 1 kg/ PW/m of cordon length, a step forward would be to estimate pending pruning weight
398 through a proximal sensing approach (Millan et al. 2019) that could quickly estimate PW amounts at the
399 ground level. On a more general basis, confirming previous work done on Barbera vineyards of limited
400 size (Gatti et al. 2017), the 5m ground resolution granted by RapidEye image acquisition seems anyway
401 accurate enough to detect intra-vineyard variability, confirming what has been previously shown in
402 studies comparing acquisition platforms at varying ground resolution (Breunig et al. 2020, Matese et al.
403 2015, Pádua et al. 2020, Sozzi et al. 2020). In this study, the reliability of the RapidEye images might have
404 benefitted from the fact that at the timing that images were captured mid rows in all cases were grassed,
405 thereby minimizing the interference of mixels where soil contribution is significant.

406 **Conclusions**

407 NDVI based vigor mapping conducted, for two seasons, in three sites encompassing two cultivars
408 (Ancellotta and Lambrusco Salamino) and different pruning systems showed higher responsiveness by the
409 highly colored Ancellotta than the Lambrusco Salamino, marked by very high yield/m and Ravaz index
410 levels. The behavior observed in the “low vigor” Ancellotta plots allows foreseeing a vast improvement in
411 vineyard efficiency, as enhanced grape and wine composition was achieved without any significant change
412 in yield, which rather manifested an increasing trend. Ancellotta is currently grown across an area of about
413 4,100 ha and producers are many, quite small in size, mostly delivering their grapes to large cooperative
414 wineries. This seems an ideal condition for running a large-scale mid-resolution satellite image acquisition
415 and then quickly confirming, through proximal sensing aimed at providing an almost real-time estimation
416 of pruning weight, areas where urgent correction of unbalanced vigor is needed.

417 Conversely, Lambrusco Salamino, despite being grown in nearby parcels and trained to the same
418 training system, did not show significant vine performance differences across different NDVI based vigor

419 levels, proving that ground truthing remains a necessary procedure to assess convenience for intra-
420 vineyard variability exploitation or correction.

421

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Table 1 Main vineyards features of each farm with specification of soil management (SM), irrigation system (if present) and day of harvest for each season (2018 and 2019).

Farm	Vineyard code	Grape variety	Training system	In-the row and between row vine spacing (m)	Mid-row SM	Within-row SM	Irrigation system	Geographic coordinates	Area (ha)	Day of harvest (2018)	Day of harvest (2019)
Sabbattini	ASAB1	Ancellotta	Sylvoz	1.60 x 3.00	native grass	herbicides	not present	44°47'34.91" N 10° 48' 2.19" E	0.7	14.09	24.09
	ASAB2	Ancellotta	Sylvoz	1.60 x 2.50	native grass	herbicides	not present	44° 47' 35.07" N 10° 47' 21.21" E	0.4	13.09	24.09
	LSSAB	Lambrusco Salamino	Sylvoz	1.60 x 3.00	native grass	herbicides	not present	44° 47' 35.85" N 10° 48' 2.19" E	0.9	13.09	27.09
Pignagnoli	APIGN	Ancellotta	Spur-pruned cordon	1.25 x 3.00	native grass	herbicides + tillage	not present	44° 50' 22.09" N 10° 46' 21.05" E	1.2	06.09	13.09
	LSPIGN	Lambrusco Salamino	Spur-pruned cordon	1.25 x 3.00	native grass	herbicides + tillage	not present	44° 50' 22.09" N 10° 46' 21.05" E	1.3	14.09	25.09
Robuschi	AROB	Ancellotta	Casarsa	1.50 x 2.85	native grass with tillage in autumn	herbicides	sub-irrigation	44° 48' 31.36" N 10° 48' 0.26" E	1.1	14.09	-
	LSROB	Lambrusco Salamino	Casarsa	1.50 x 2.85	native grass with tillage in autumn	herbicides	sub-irrigation	44° 48' 30.83" N 10° 44' 9.71" E	1.0	25.09	-

Table 2 Pruning weight (PW), yield components, shoot fruitfulness and yield-to-pruning weight ratio (Ravaz index as kg/kg) measured in 2018-2019 seasons on twelve vines of Ancellotta in the three identified vigor classes (HV = high; MV = medium and LV = low) at Pignagnoli, Robuschi and Sabbattini vineyards.

		Pignagnoli (APIGN)								Robuschi (AROB)							
		PW (kg/m)	Nodes (n/m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoot)	Ravaz index (kg/kg)	PW (kg/m)	Nodes (n/m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoot)	Ravaz index (kg/kg)
Vigor (V)	LV	0.70	13	5.18	28	179	1.51	1.9	9.0	0.73	40	9.58	92	107	1.53	2.6	13.8
	MV	0.80	12	5.19	26	191	1.55	1.9	7.9	0.63	43	8.65	83	104	1.57	2.5	14.6
	HV	0.79	14	4.68	27	170	1.45	1.9	6.5	0.77	39	7.82	84	94	1.53	2.6	10.6
Year (Y)	2018	0.92	13	3.49	23	154	1.45	1.7	4.1	0.70	41	8.58	85	101	1.55	2.6	13.1
	2019	0.61	13	6.55	32	206	1.56	2.2	11.6	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
	V	ns	ns	ns	ns	ns	ns	ns	ns	*	ns	ns	ns	ns	ns	ns	ns
	Y	***	ns	***	***	***	**	***	***	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
	V x Y	ns	ns	ns	ns	ns	ns	ns	ns	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
		Sabbattini 1 (ASAB1)								Sabbattini 2 (ASAB2)							
		PW (kg/m)	Nodes (n/m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoot)	Ravaz index (kg/kg)	PW (kg/m)	Nodes (n/m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoot)	Ravaz index (kg/kg)
Vigor (V)	LV	1.24b	28b	9.50	54	183 a	1.43b	2.4	8.4a	0.94	29	5.64a	46a	119	1.49a	2.4	6.4a
	MV	1.51a	29b	8.81	57	160 b	1.55a	2.3	6.0b	0.98	27	4.99a	44a	110	1.46a	2.5	5.2b
	HV	1.59a	33a	8.05	58	139 c	1.50ab	2.4	5.5b	1.15	29	3.38b	31b	111	1.38b	1.8	3.1c
Year (Y)	2018	1.54	26	11.40	77	148	1.59	3.5	7.8	1.13	24	6.47	53	129	1.52	3.2	6.6
	2019	1.35	34	6.17	36	173	1.40	1.3	5.4	0.92	32	2.87	29	98	1.36	1.3	3.3
	V	*	*	ns	ns	*	*	ns	***	ns	ns	***	**	ns	**	*	***
	Y	ns	***	***	***	***	***	***	**	**	***	***	***	***	ns	***	***
	V x Y	ns	ns	ns	ns	ns	ns	ns	ns	*	ns	ns	ns	ns	ns	ns	ns

In case of significance of F test, mean separation within columns and year factor was performed using the Student-Newman Keuls (SNK) test or t-test, respectively: * p < 0.05; ** p < 0.01; ***: p < 0.001; ns: not significant.

Table 3 Grape composition and total soluble solids (TSS), titratable acidity (TA), pH, tartaric and malic acid concentration, total anthocyanins and phenols concentration, measured at 2018-2019 harvests on twelve vines of Ancellotta in each of the three identified vigor classes (HV = high; MV = medium and LV = low) at Pignagnoli, Robuschi and Sabbattini vineyards. T/M = tartrate-to-malate concentration ratio.

		Pignagnoli (APIGN)								Robuschi (AROB)							
		TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)	TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)
Vigor (V)	LV	21.19a	8.02b	3.34	9.08	3.65c	2.92a	2.32	3.27a	21.41a	6.21b	3.38a	8.54b	2.66b	3.21a	2.62a	3.68a
	MV	20.43b	7.94b	3.38	8.66	4.38b	2.37b	2.09	2.90b	19.71b	6.87a	3.40b	9.67a	3.54a	2.78b	2.11b	3.17b
	HV	19.74b	9.46a	3.36	8.15	6.14a	1.85c	2.02	2.78b	19.98b	7.13a	3.30b	8.45b	3.71a	2.34b	2.56a	3.25b
Year (Y)	2018	22.26	6.61	3.47	9.16	2.83	3.37	3.06	4.22	20.18	6.81	3.31	9.01	3.41	2.73	2.27	3.32
	2019	18.65	10.33	3.25	8.10	6.62	1.38	1.23	1.74	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
	V	**	***	ns	ns	***	***	ns	**	*	*	*	*	*	***	*	*
	Y	***	***	***	***	***	***	***	***	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
	V x Y	ns	**	***	ns	***	ns	ns	ns	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
		Sabbattini 1 (ASAB1)								Sabbattini 2 (ASAB2)							
		TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)	TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)
Vigor (V)	LV	20.33	7.00c	3.42a	7.70	3.20b	3.43a	2.37	3.61a	20.76a	7.40c	3.40	7.95	2.86c	3.06a	2.94a	4.15ab
	MV	20.27	7.70b	3.43a	8.23	3.60b	2.71b	2.32	3.60a	20.76a	8.94b	3.40	8.54	3.95b	2.40b	2.56a	4.36a
	HV	19.68	8.75a	3.37b	8.80	4.22a	2.46b	2.07	3.17b	19.31b	10.42a	3.44	7.97	5.46a	1.64c	2.16b	3.69b
Year (Y)	2018	21.19	6.40	3.48	8.20	2.21	3.94	2.51	3.47	20.98	7.34	3.45	9.67	3.72	3.08	2.60	4.07
	2019	19.00	9.23	3.33	8.96	5.14	1.80	2.00	3.45	19.57	10.21	3.47	6.63	4.46	1.65	2.21	4.07
	V	ns	***	*	ns	***	***	ns	*	***	***	ns	ns	*	***	*	*
	Y	***	***	***	*	***	***	***	ns	***	***	***	***	***	***	**	ns
	V x Y	ns	ns	ns	ns	ns	ns	ns	ns	ns	**	ns	ns	ns	ns	ns	ns

In case of significance of F test, mean separation within columns and year factor was performed using the Student-Newman Keuls (SNK) test or t-test, respectively. * p < 0.05; **: p < 0.01; ***: p < 0.001; ns: not significant.

Table 4 Grape composition as total soluble solids (TSS), titratable acidity (TA), pH, tartaric and malic acid concentration, total anthocyanins and phenols concentration, measured at 2018-2019 harvests on twelve vines of Lambrusco Salamino in each of the three identified vigor classes (HV = high; MV = medium and LV = low) at Pignagnoli, Robuschi and Sabbattini vineyards.

		Pignagnoli (LSPIGN)							
		TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)
Vigor	LV	18.23	10.54b	3.19a	9.64	6.10b	1.71a	1.30b	4.30
	MV	18.65	10.92b	3.17a	10.39	7.03ab	1.61a	1.34b	4.17
	HV	19.07	11.94a	3.13b	9.83	7.61a	1.34b	1.65a	4.55
Year	2018	19.66	9.03	3.26	10.32	5.79	188	1.44	4.50
	2019	17.63	13.24	3.06	9.59	8.04	1.22	1.41	4.18
	V	ns	*	*	ns	*	**	**	ns
	Y	***	***	***	ns	***	***	ns	ns
	V x Y	ns	ns	ns	ns	ns	ns	ns	ns
		Robuschi (LSROB)							
		TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)
Vigor	LV	19.44	9.98	3.01	9.17	5.58	1.67	1.22	3.44
	MV	18.60	10.19	3.04	8.79	5.98	1.50	1.04	3.21
	HV	18.36	10.13	3.00	9.70	6.00	1.64	1.08	3.29
Year	2018	18.78	10.09	3.01	9.32	5.85	1.62	1.12	3.32
	2019	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
	V	ns	ns	ns	ns	ns	ns	ns	ns
	Y	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
	V x Y	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
		Sabbattini (LSSAB)							
		TSS (Brix)	TA (g/L)	pH	Tartrate (g/L)	Malate (g/L)	T/M ratio	Anth. (g/kg)	Phenols (g/kg)
Vigor	LV	18.30a	12.73	3.06	10.42	9.04	1.29a	1.32	3.57
	MV	18.14a	13.68	3.08	10.54	9.66	1.14ab	1.32	3.60
	HV	17.42b	13.35	3.06	10.59	10.29	1.08b	1.28	3.49
Year	2018	18.65	10.88	3.08	10.21	7.41	1.41	1.31	3.31
	2019	17.26	15.62	3.06	10.83	11.92	0.94	1.31	3.79
	V	*	ns	ns	ns	ns	**	ns	ns
	Y	***	***	ns	ns	***	***	ns	**
	V x Y	ns	ns	ns	ns	ns	ns	ns	ns

In case of significance of F test, mean separation within columns and year factor was performed using the Student-Newman Keuls (SNK) test.:* p < 0.05; **: p < 0.01; ***: p < 0.001; ns: not significant.

Table 5 Composition of experimental wines derived from grapes harvested in high vigor (HV) and low vigor (LV) plots at LSSAB and ASAB2 in 2018-2019 seasons. Within row, year and vigor level, significance of paired comparison was assessed by t-test at $P \leq 0.04$ (n=3).

Parameters	Ancellotta				Lambrusco Salamino			
	2018		2019		2018		2019	
	LV	HV	LV	HV	LV	HV	LV	HV
Total alcohol (vol%)	12.36a	11.14b	10.84a	9.30b	10.42a	9.70b	9.11	8.53
Total sugars (g/L)	1.33	1.40	2.71	2.77	1.35a	1.10b	1.65	1.58
Total dry extract (g/L)	33.10	34.55	32.47	31.25	29.75	27.25	31.40	32.45
pH	3.94b	4.09a	3.86b	4.01a	3.60	3.64	3.37b	3.44a
Total acidity (g/L)	4.48a	3.91b	5.38a	4.20b	6.34	6.80	9.41	9.80
Volatile acidity (g/L)	0.42)	0.46	0.23b	0.54a	0.25	0.24	0.19	0.24
Tartaric acid (g/L)	1.31b	1.58a	1.43b	1.70a	1.77	1.62	1.90a	1.56b
Malic acid (g/L)	0.38b	0.55a	1.26a	0.54b	2.23b	3.32a	5.69b	6.70°
Lactic acid (g/L)	3.83	4.11	4.33	3.92	<0.2	<0.2	0.10	0.19
Citric acid (g/L)	0.42a	<0.1b	0.22a	0.08b	0.59	0.65	0.68	0.74
Phenols (mg/L)	4457a	3584b	3150a	2642b	3647a	3359b	1998a	1753b
Anthocyanins (mg/L)	705a	556b	664a	531b	323a	263b	330	312
OD 420 nm	7.00a	5.05b	4.92a	3.01b	3.26a	2.59b	2.12	1.73
OD 520 nm	10.58a	6.54b	8.45a	4.19b	5.39a	4.01b)	4.64	3.39
Intensity	17.58a	11.59b	13.37a	7.20b)	8.64a	6.60b	6.75	5.12
Tonality	0.67	0.77	0.59	0.72	0.61	0.65	0.46	0.51

Supplemental Table 1 Main physico-chemical soil features of vineyards in high and low vigor areas of each farm. Numbers in brackets are the code of soil sample as reported in Figures 1 and 2 and the corresponding vigor level.

		Ancellotta			Lambrusco Salamino		
		APIGN (13 - LV)	AROB (3-HV)	ASAB2 (17 - MV)	LSPIGN (12 - HV)	LSROB (4 - LV)	LSSAB (7 - HV)
Sand	%	16	19	43	20	12	42
Silt	%	44	39	30	54	42	35
Clay	%	40	42	27	26	46	23
Texture		silty clay loam	clay	loam	silty loam	silty clay	loam
pH		7.90	7.7	7.90	7.80	7.6	7.8
Electrical conductivity	mS/cm	0.24	0.30	0.24	0.26	0.34	0.23
Total carbonate	%	15.80	10.60	15.10	16.40	12.00	17.00
Active carbonate	%	9.80	8.30	5.80	9.50	8.80	4.80
Organic matter	%	2.94	3.76	2.87	2.94	4.59	2.68
Total nitrogen	%	0.15	0.20	0.15	0.16	0.23	0.14
Phosphorus (ass)	mg/L	65	19.00	20	44	32	32
Iron (ass.)	mg/L	16.20	21.00	7.00	18.20	19.20	22.2
Manganese (ass.)	mg/L	13.80	11.40	7.8	13.60	13.40	6.40
Copper (ass.)	mg/L	32.20	35.80	60.60	50.20	63.20	52.80
Zinc	mg/L	3.20	4.40	6.00	4.40	9.6	7.00
Calcium	mg/L	3950	4300	3050	3850	4300	3350
Magnesium	mg/L	320	420	200	340	560	176
Potassium	mg/L	420	420	360	440	640	320
Sodium	mg/L	82	54	66	72	56	48
C.E.C./100 g	meq	23.85	26.30	18.13	23.52	28.05	19.25
Calcium	%	82.80	81.70	84.10	81.90	76.70	87.00
Magnesium	%	11.20	13.30	9.20	12.00	16.60	7.60
Potassium	%	4.50	4.10	5.10	4.80	5.80	4.30
Sodium	%	1.50	0.90	1.60	1.30	0.90	1.10
B.C.S.R.	%	100	100	100	100	100	100

Supplemental Table 2 Main features of most representative soil profiles for high vigor (HV) vs low vigor (LV) levels and grapevine cultivar. Soil profiles are described following the methodologies used by the Regional Soil Agency (Tarocco 2002).

Vigor class	Cultivar	Drilling code	Soil horizons ^a	Depth of horizon layers (cm)	Humidity ^b	Main color ^c	Oxygen availability			
HV	Ancellotta	1	Ap1	0-40	1	2.5 YR 5/2	Moderate			
			Ap2	40-70	2	2.5 YR 5/2				
			Bk1	70-110	2	2.5 YR 5/3				
			Bk2	110-120	2	2.5 YR 5/3				
		16	Ap1	0-40	1	2.5YR 4/3	Good			
			Ap2	40-85	1	2.5YR 4/3				
			Bw	85-110	2	2.5YR 5/4				
			Bk	110-120	2	2.5YR 5/3				
	Lambrusco Salamino	6	Ap	0-50	2	2.5 YR 5/2	Moderate			
			Bw	50-95	2	2.5 YR 5/2				
			Bk	95-120	2	2.5 YR 5/2				
			Ap1	0-40	1	2.5YR 4/3				
	12	Ap2	40-85	2	2.5YR 4/3	Moderate				
		Bw	85-110	2	2.5YR 5/3					
		Bg	110-120	3	2.5YR 5/2					
		Ap1	0-40	1	2.5YR 4/3					
LV	Ancellotta	13	Ap2	40-75	2	2.5YR 4/3	Moderate			
			Bk1	75-110	2	2.5YR 5/3				
			Bk2	110-120	1	2.5YR 5/3				
			Ap	0-40	1	2.5YR 4/3				
		18	Bk	40-70	1	2.5YR 4/4	Good			
			Ap	0-40	1	2.5YR 5/3				
			Lambrusco Salamino	9	Bw1	40-90		1	2.5YR 5/4	Good
					Bw2	90-120		1	2.5YR 5/4	
	11	Ap	0-50	1	2.5YR 4/3	Moderate				
		Bw	50-105	2	2.5YR 4/3					
			Bl	105-110	2	2.5YR 5/4				

^aSoil horizons are described according to Word Reference Base (WRB) international standard for soil classification (Soil Survey Staff 2014); ^b 1= dry; 2= slightly humid; 3=humid; 4=strongly humid; 5=wet (no free water); 6=wet (free water) (Tarocco 2002); ^c colors classified according to Munsell Color System (Munsell 1915).

Supplemental Table 3 Pruning weight (PW), yield components, shoot fruitfulness and yield-to-pruning weight ratio (Ravaz index as kg/kg) measured in 2018-2019 seasons on twelve vines of Lambusco Salamino in each of the three identified vigor classes (HV = high; MV = medium and LV = low) at Pignagnoli, Robuschi and Sabbattini vineyards.

		Pignagnoli (LSPIGN)							
		PW (kg/m)	Nodes (n/m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoot)	Ravaz index (kg/kg)
Vigor (V)	LV	0.53	14a	6.91	31	237	1.69	2.3b	15.3
	MV	0.66	10b	7.25	34	226	1.68	2.8ab	14.0
	HV	0.62	9b	6.97	34	220	1.68	3.0a	12.4
Year (Y)	2018	0.75	8	8.34	25	275	1.76	2.6	9.5
	2019	0.46	14	9.27	41	180	1.60	2.7	18.3
V		ns	***	ns	ns	ns	ns	*	ns
Y		**	***	*	***	***	***	ns	***
V x Y		ns	***	ns	ns	ns	ns	ns	ns
		Robuschi (LSROB)							
		PW (kg/m)	Nodes (n/m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoots)	Ravaz index (kg/kg)
Vigor (V)	LV	0.46	46	13.18	111	120	1.63	2.9	30.6
	MV	0.39	45	14.13	117	123	1.54	3.4	37.5
	HV	0.46	45	13.32	118	113	1.57	3.2	30.2
Year (Y)	2018	0.44	45	13.45	116	118	1.58	3.13	32.0
	2019	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
V		ns	ns	ns	ns	ns	ns	ns	ns
Y		N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
V x Y		N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
		Sabbattini (LSSAB)							

		PW (kg/m)	Nodes (n ^o /m)	Yield (kg/m)	Clusters (n/m)	Cluster weight (g)	Berry weight (g)	Fruitfulness (clusters/shoots)	Ravaz index (kg/kg)
Vig or (V)	LV	1.04	26	8.17	50	173	1.63	2.4	9.6
	MV	1.08	27	9.40	56	173	1.60	2.5	9.6
	HV	1.07	28	8.79	57	157	1.61	2.4	10.2
Y ear (2018	0.88	24	13.45	83	162	1.66	3.7	16.1
	2019	1.24	30	4.12	26	174	1.57	1.1	3.5
	V	ns	ns	ns	ns	ns	ns	ns	ns
	Y	***	**	***	***	ns	*	***	***
	V x Y	ns	ns	ns	ns	ns	ns	ns	ns

In case of significance of F test, mean separation within columns and year factor was performed using the Student-Newman Keuls (SNK) test or t-test, respectively: * p < 0.05; **: p < 0.01; ***: p < 0.001; ns: not significant.

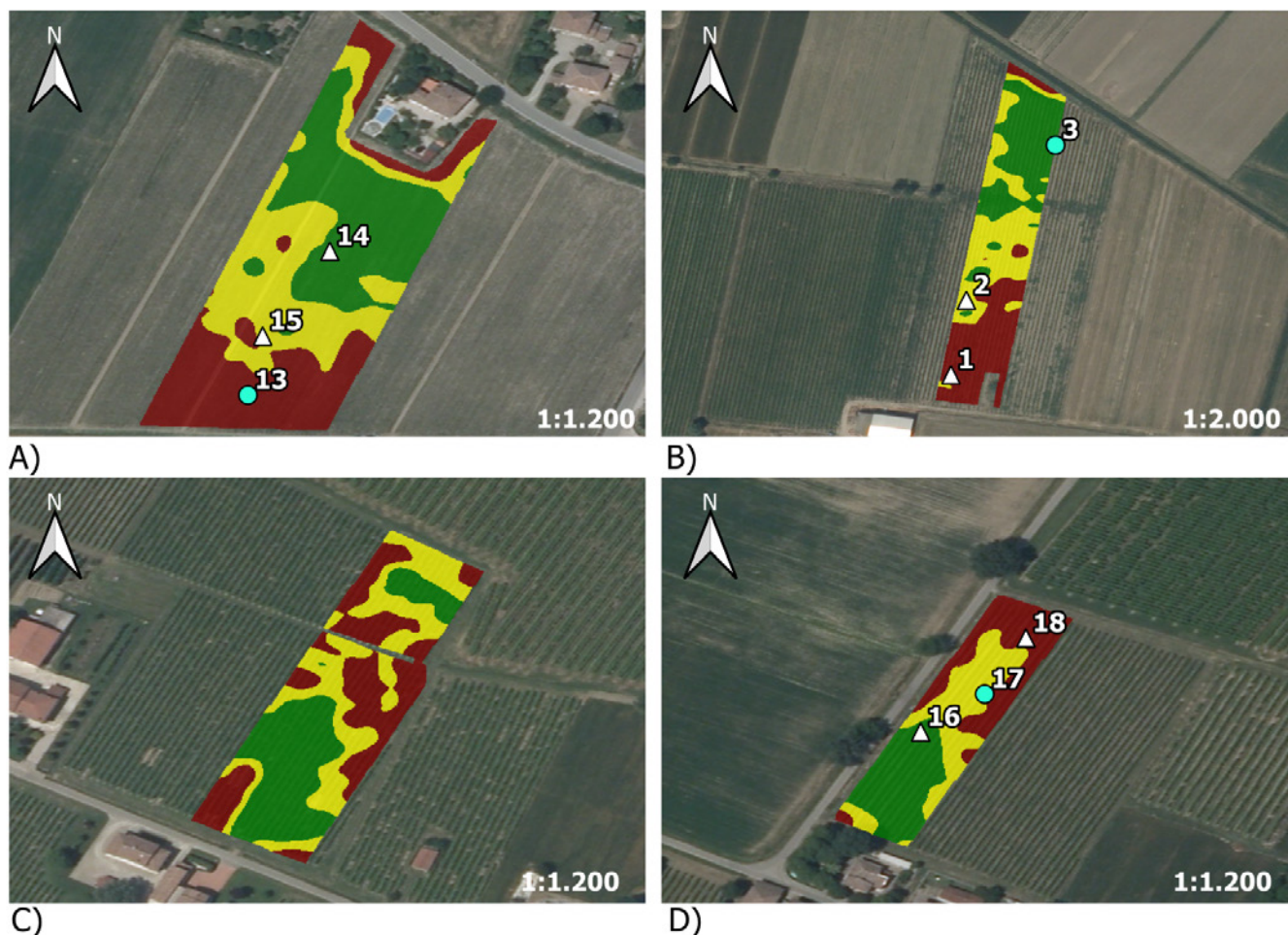


Figure 1 Maps of normalized difference vegetation index (NDVI) derived from the multispectral images taken on 9 August 2018 by the RapidEye constellation in Ancellotta vineyards (A) PIGN, (B) ROB, (C) SAB1, and (D) SAB2. Colors indicate different vigor levels: green corresponds to high vigor (HV), yellow corresponds to medium vigor (MV), and red is for low vigor (LV). Absolute values (min/max) of NDVI for each class are: (A) LV: 0.215/ 0.239; MV: 0.239/0.263; HV: 0.263/0.286; (B) LV: 0.221/0.238; MV: 0.238/0.255; HV: 0.255/0.272; (C) LV: 0.239/0.251; MV: 0.251/0.263; HV: 0.263/0.276; (D) LV: 0.261/0.281; MV: 0.281/0.301; HV: 0.301/0.322. The white triangles (Δ) on the maps indicate the spots where only deep soil drilling was carried out, whereas light blue dots (\bullet) indicate the areas where both deep soil drilling and composite soil sampling were done. Soil samples were not taken in SAB1 (C).

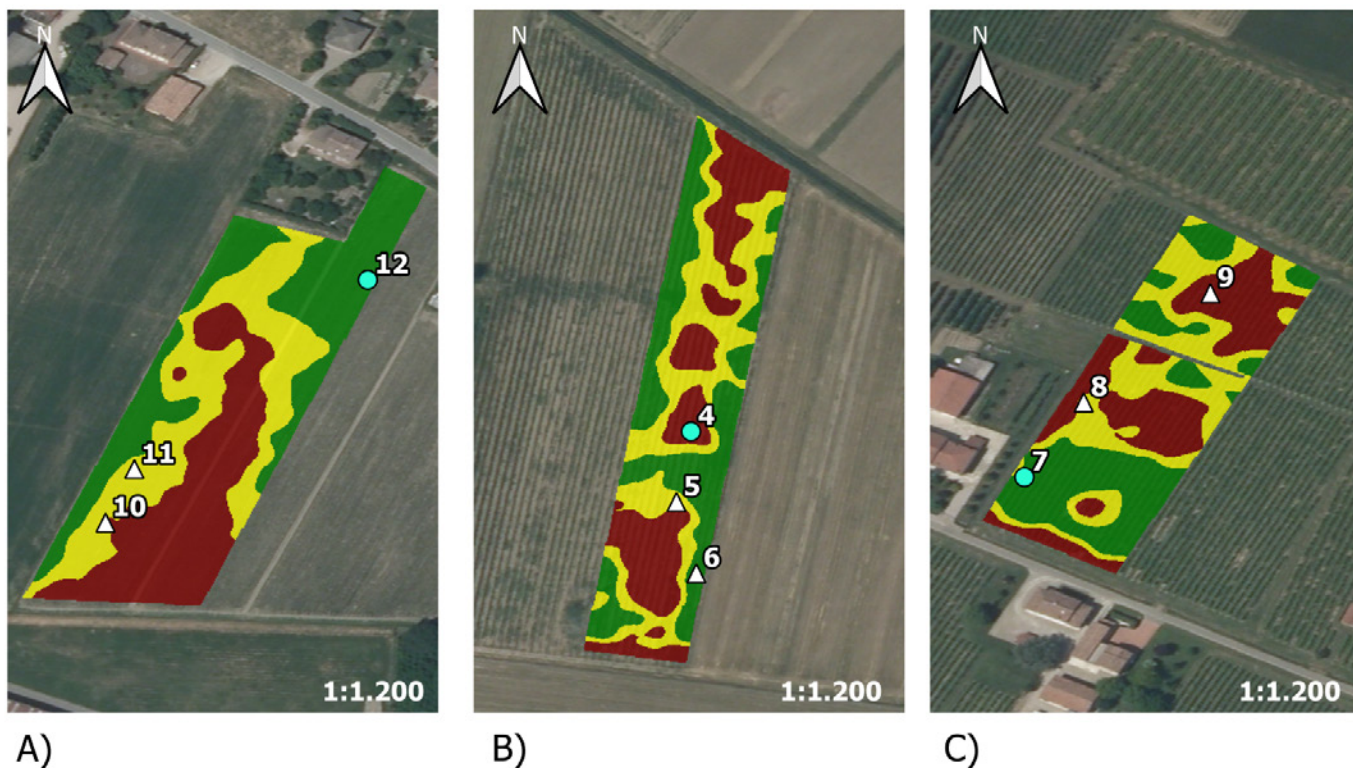


Figure 2 Maps of normalized difference vegetation index (NDVI) derived from the multispectral images taken on 9 August 2018 by the RapidEye constellation in Lambrusco Salamino (LS) vineyards (A) PIGN, (B) ROB, (C) SAB1, and (D) SAB2. Colors indicate different vigor levels: green corresponds to high vigor (HV), yellow corresponds to medium vigor (MV), and red is for low vigor (LV). Absolute values (min/max) of NDVI for each class area (A) LV: 0.160/0.188; MV: 0.188/0.216; HV: 0.216/0.244; (B) LV: 0.215/0.225; MV: 0.225/0.235; HV: 0.235/0.246; (C) LV: 0.226/0.238; MV: 0.238/0.249; HV: 0.249/0.261. The white triangles (Δ) on the maps indicate the spots where only deep soil drilling was done, whereas light blue dots (\bullet) indicate the areas where both deep soil drilling and composite soil sampling were carried out.

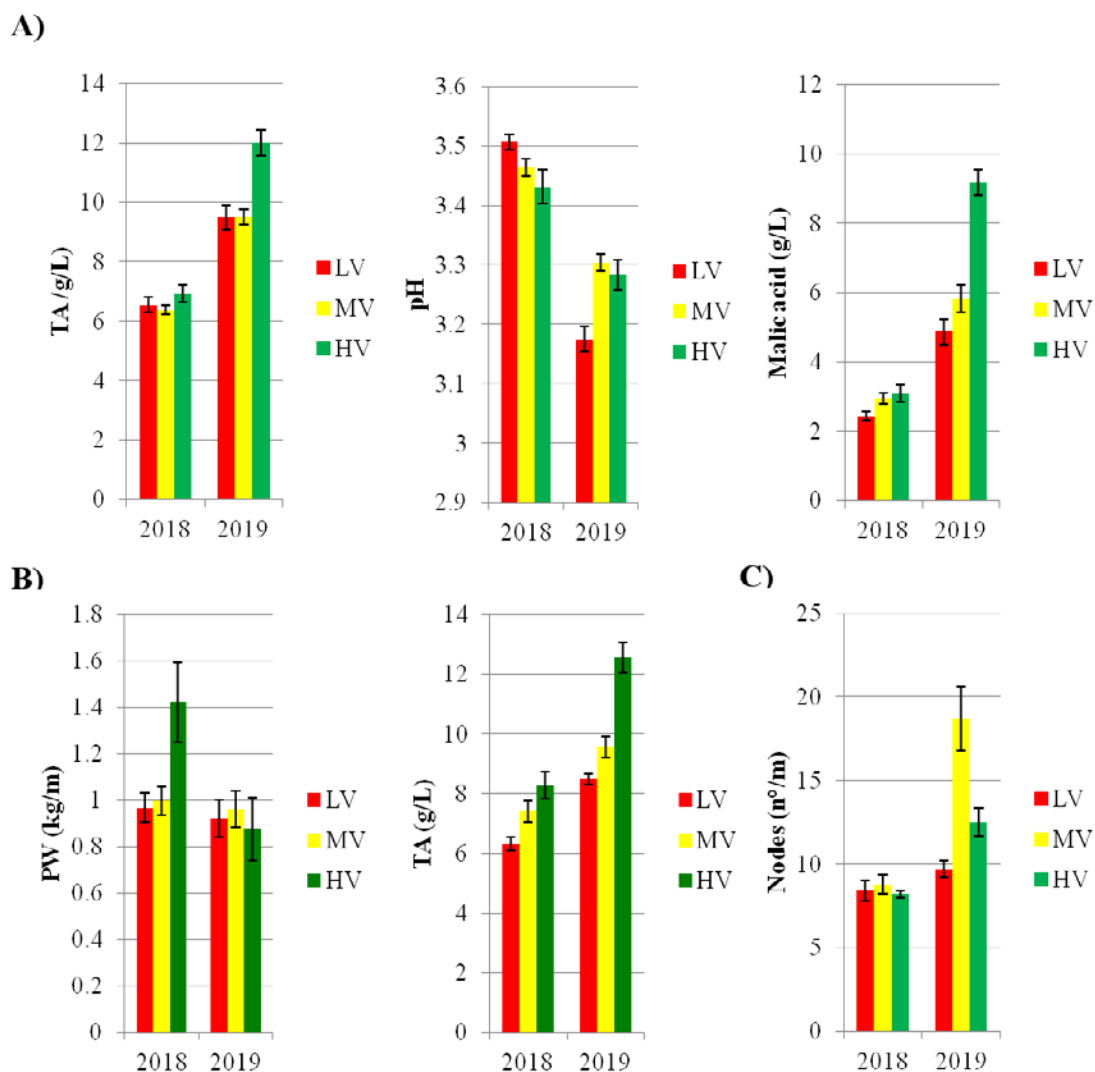
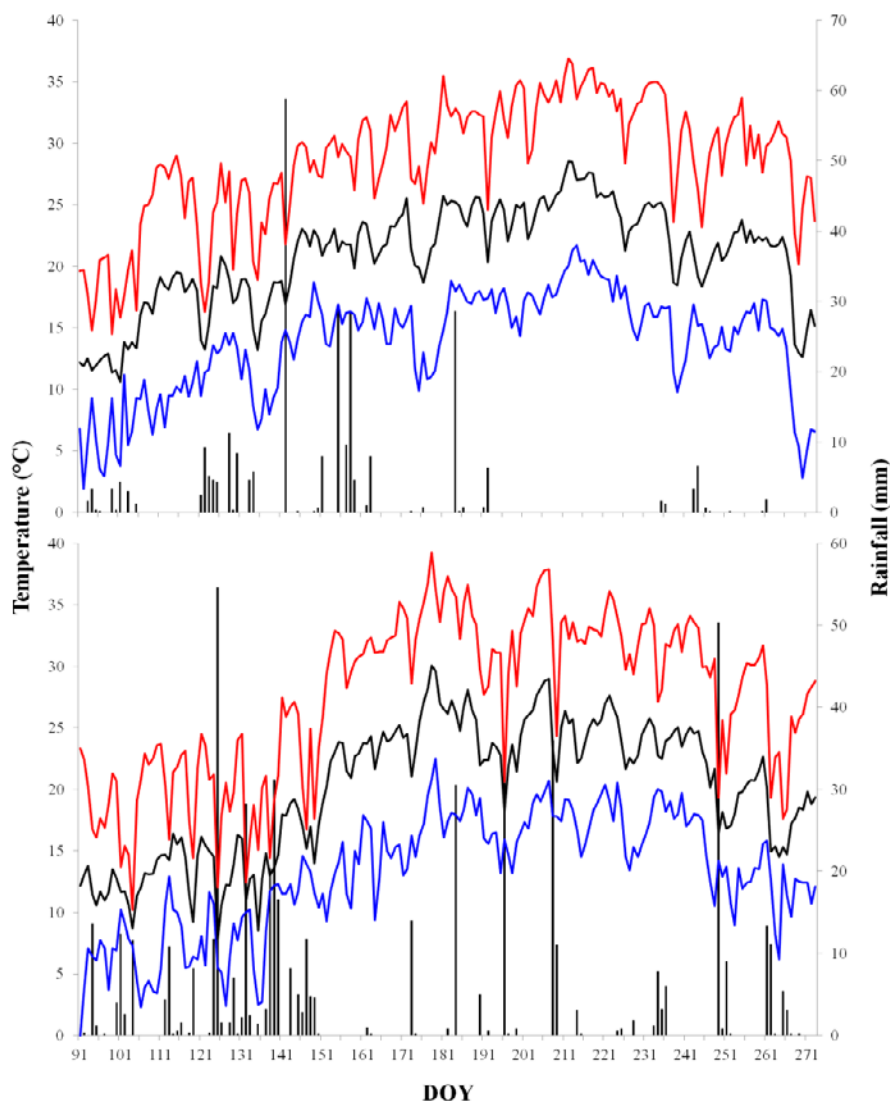


Figure 3 Partitioning of interactive vigor x year (V x Y) effects found at Pignagnoli for TA, pH, and malic acid of Ancellotta (A); at Sabbattini for PW and TA of Ancellotta (B); and at Pignagnoli for nodes/m in the "Lambrusco Salamino" vineyard (C). Histograms represent means (n = 12) of each treatment combination ± standard error for each vigor class (HV = high vigor, MV = medium vigor, and LV = low vigor).



Supplemental Figure 1 Weather trends recorded at Correggio (Reggio Emilia) a nearby weather station to the experimental logged to the Emilia Romagna weather monitoring network) in 2018 (top panel) and 2019 (bottom panel) from April to September (DOY = Day of Year from 01/04 to 30/09). Data are daily maximum temperature (red line), daily mean temperature (black line), daily minimum temperature (blue line) and daily rainfall (black bars). In the considered period cumulated Growing Degree Days (GDD) were 19828 and 1836 in 2018 and 2019 , respectively , whereas while cumulated rainfall (mm) was 277 in 2018 and 542 in 2019.