

ARTICLE

# Determinants of the adoption of fungus-resistant grapevines: Evidence from Switzerland

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## Abstract

The adoption of fungus-resistant grapevines may be a key strategy for substantially reducing fungicide use in pesticide-intensive viticulture. In a representative survey conducted among 436 grapevine growers in Switzerland, we elicited growers' expected share of land devoted to fungus-resistant varieties in ten years. More specifically, using regression analyses, we explore the main predictors behind the stated adoption intentions. We find that one-third of new plantings in the next decade will be fungus-resistant varieties. As a result, the expected share of land devoted to fungus-resistant varieties in ten years is 27.4% (compared to 10.2% in 2022), thus increasing by 169%. Farmer- and farm characteristics explain most of the adoption dynamics, especially growers' beneficial health perceptions about fungus-resistant varieties, which correlate positively with their expected land share devoted to these varieties. Moreover, non-organic grapevine growers are particularly likely to increase their land devoted to these varieties. These findings have important implications for agricultural policy and industry in Europe and elsewhere, facilitating the expected plantation increase using a policy mix tailored to farmer- and farm-level characteristics.

**Keywords:** expectation; pesticide; supply-response; viticulture; wine

**JEL classifications:** D84; Q01; Q12; Q18

## 1. Introduction

Wine grapes are one of the most economically relevant crops in many European countries in terms of gross production value (FAO, 2022).<sup>1</sup> Viticulture also ranks among the most pesticide-intensive agricultural sectors (Montaigne, Coelho, and Khefifi, 2016; Pertot et al., 2017), negatively affecting human health and the environment (e.g., Baldi et al., 2006; Komárek et al., 2010). Thus, pesticide use and risk reductions are at the top of agricultural policy agendas. For instance, the European Union's Farm-to-Fork strategy mandates a reduction in the overall use and risk of chemical and hazardous pesticides by 50% by 2030 (Schebesta and Candel, 2020).

<sup>1</sup>Wine grape production in Europe represents more than 50% of global viticultural land (OIV, 2022).

The production of wine grapes could thus play a key entry point in reducing pesticide use risks. The vast majority of pesticides used in vineyards are fungicides sprayed against fungal pathogens (Pertot et al., 2017; de Baan, 2020). For example, on average, 12–15 treatments are required per season (peaking at 25–30 treatments in severe conditions) (Pertot et al., 2017). As a result, grapevine is the most pesticide-intensive crop in European agriculture, with fungicide applications in vineyards representing 26% and 27% of total pesticide use in the European Union and Switzerland (Muthmann and Nadin, 2007; de Baan, 2020). Moreover, fungal pest pressure is expected to increase substantially in the future in European viticulture due to changing environmental conditions (Salinari et al., 2006; Bregaglio, Donatelli, and Confalonieri, 2013).

The biggest leverage to reduce fungicide use is switching to fungus-resistant varieties that allow fungicide use to be reduced massively (by around 80%) without depleting yield or quality of production (Poni et al., 2017; Viret et al., 2019). However, the use of these varieties still remains globally limited (Finger, Zachmann, and McCallum, 2023). Integrating new varieties is a long-term process, as grapevine re-planting only takes place every 25–35 years (Carbone, Quici, and Pica, 2019). Thus, growers' intentions for the future use of fungus-resistant varieties are very relevant for policy and industry. However, to what extent grapevine growers intend to switch to fungus-resistant varieties and what differences across farms explain these intentions remain unknown.

In this paper, we investigate grapevine growers' expected future use of fungus-resistant varieties and the main predictors behind these future developments. We test and quantify the relevance of a large list of farmer- and farm characteristics as well as regional factors that may influence growers' expected change in land devoted to fungus-resistant varieties in ten years compared to current land under cultivation. Using a supply response framework that examines predictors of 436 grapevine growers in Switzerland regarding their intentions of planting fungus-resistant varieties, we especially account for barriers and determinants relevant for future adoption.

Previous research highlighted the problem of global pesticide pollution from agricultural activities (e.g., Stehle and Schulz, 2015; Tang et al., 2021). Moreover, studies have documented societal demand and political pressures to reduce pesticide use in European agriculture (e.g., Möhring et al., 2020; Finger, 2021). This societal and political push to reduce pesticide risk was also documented for viticulture specifically (e.g., Montaigne, Coelho, and Khefifi, 2016; Schäufole and Hamm, 2017). Research on fungus-resistant varieties has mainly focused on consumer demand and concludes that there is generally acceptance among consumers for wines made from fungus-resistant varieties (e.g., Van Der Meer et al., 2010; Espinoza et al., 2018; Nesselhauf, Fleuchaus, and Theuvsen, 2019; Borrello, Cembalo, and Vecchio, 2021; Vecchio et al., 2022). While the demand for specific wines can change rapidly, supply responses by producers typically lag behind (Cuellar, Karnowsky, and Acosta, 2009; Consoli et al., 2021). Thus, growers' decisions are also of key relevance.

Yet, only two studies investigate the adoption decision from the producer side. Finger, Zachmann, and McCallum (2023) study the currently observed early-stage adoption of fungus-resistant varieties, focusing on the relevance of the supply chain. They find that the closer the producer is to the final consumer of wine, the more likely the producer is to grow fungus-resistant varieties. Zachmann, McCallum,

and Finger (2023a) study whether nudging grapevine growers with personalized information about their use of environmentally toxic fungicides induces changes in planting intentions of fungus-resistant varieties. The low level of knowledge that exists about the adoption decisions of these varieties and especially on future adoption intentions by producers increasingly represents the bottleneck in the transition toward more sustainable viticulture and especially pesticide use reductions, which is particularly pressing since viticultural supply is a slow-moving process (Masson *et al.*, 2021).

We contribute to this knowledge gap by shedding light on grapevine growers' intentions about the future adoption dynamics of fungus-resistant varieties. Moreover, we investigate the importance of explanatory groups of factors such as farmer- and farm characteristics, growers' perceptions, preferences, and personality traits, as well as regional characteristics, for the expected change in land devoted to these varieties. Specifically, we investigate from a large list of potential determinants, thus considering the "big picture", which factors drive the adoption dynamics. We focus on the expected change between the share of land devoted to fungus-resistant varieties in ten years and the current plantation share. Given the difficulty in forecasting into the distant future, a ten-year horizon is reasonable to account for the typical 25–35 year cycle of vineyard replanting as well as accounting for bounded human prediction capabilities (e.g., Simon, 1990). Importantly, we use the expected value from a triangular distribution around the elicited share in ten years and, as such, account for uncertainties inherent in the long-term expectations (Hardaker *et al.*, 2015).

Our results suggest that Swiss grapevine growers expect to substantially increase their share of land devoted to fungus-resistant varieties within the next ten years. Specifically, we find that about one-third of new plantings in the next decade will be fungus-resistant. As a result, the expected farm level share (unweighted average) of land devoted to fungus-resistant varieties in ten years is 27.4% (compared to 10.2% in 2022), thus increasing by 169%. We show that farmer- and farm characteristics explain most of the variability in the change of land devoted to fungus-resistant varieties in ten years and today. Especially farms with a higher replantation rate in the next ten years (e.g., those with older grapevines) expect to increase their share of land devoted to fungus-resistant varieties. Moreover, grapevine growers who perceive fungus-resistant varieties to be superior for human health of the farmers and communities surrounding farms compared to traditional varieties indicate that they should increase their land share. Furthermore, non-organic grapevine growers indicate a substantial increase in their share of land devoted to fungus-resistant varieties, contrary to organic grapevine growers, who are mainly early adopters. Given the expected substantial increase in land devoted to fungus-resistant varieties, agricultural policy can facilitate the transition by ensuring the availability of required information and resources. This land expansion leads, *ceteris paribus*, to a massive reduction in pesticide treatments in Swiss vineyards.

In the remainder of this paper, we present background on viticulture and pesticide use, including the role of fungus-resistant varieties and our case study in [Section II](#). Then, we present the conceptual framework, empirical strategy, and data used in [Section III](#). [Section IV](#) follows with the results and their discussion. Finally, [Section V](#) concludes and provides policy implications.

## II. Background

### A. Viticulture and pesticides

The production of wine grapes is of great economic importance in several countries (Appendix A). For example, in Chile, France, Spain, and Switzerland, grapes account for the largest share of gross production value among all crops, with a share between 17.3% and 39.9% (FAO, 2022). *Vitis vinifera* (European) varieties are the most important species for winemaking, accounting for about 94% of land under grapevines globally (Bavaresco, 2019). However, due to their high susceptibility to fungal infestations, fungicides are intensively sprayed on *Vitis vinifera* varieties (Bavaresco, 2019). Viticulture ranks thus also among the most pesticide-intensive crops globally (Maggi et al., 2019; Masson et al., 2021; Tang et al., 2021). In Switzerland, vineyards are responsible for 58% of all fungicide treatments and 27% of total pesticides in Swiss agriculture at large (de Baan, 2020).

Viticulture is thus a key sector to reduce pesticides. This applies to all production systems, including organic production.<sup>2</sup> This is particularly relevant because copper-based plant-protection products, which are widely used, especially in organic viticulture, have been shown to be harmful to the environment (Komárek et al., 2010; Mackie, Müller, and Kandeler, 2012).<sup>3</sup> Copper usage has therefore been increasingly restricted by European agricultural authorities over the last years, with the aim of a total phasing out in the near future (European Commission, 2009; Bundesrat, 2017).

### B. Fungus-resistant varieties

The single most effective strategy to reduce pesticide use in viticulture, including copper-based products, is the plantation of fungus-resistant varieties. Numerous studies across Europe report fungicide use reductions from using fungus-resistant varieties on average by around 80% (Appendix B). Fungus-resistant varieties result from cross-breeding *Vitis vinifera* species and wild grapes such as *Vitis labrusca* or *Vitis rupestris* (Asian or American grapevines) that have been exposed to fungal pressure and thus developed natural defense mechanisms. Private and public breeding initiatives have attempted to insert resistance genes from American or Asian varieties into European varieties to shift toward a disease prevention approach for crop protection (Villano and Aversano, 2020). While first-generation hybrids have not proven successful for their wine quality, due to advancements in breeding methods, current fungus-resistant varieties carry both resistance genes and a high degree of *Vitis vinifera* genes, resulting in varieties that are well-accepted by consumers (e.g., Van Der Meer et al., 2010; Pedneault and Provost, 2016; Vecchio et al., 2022).

While many wine regions globally feature beneficial climatic conditions for fungal disease development (e.g., Thind et al., 2004), the adoption of fungus-resistant varieties remains low. For example, the land share devoted to fungus-resistant varieties

<sup>2</sup>We define organic producers as those who grow wine grapes using organic or bio-dynamic methods. Conventional are all non-organic producers.

<sup>3</sup>Vineyards account for the highest copper concentrations in European topsoils (Ballabio, C., Panos, P., Lugato, E., Huang J.-H., Orgiazzi, A., Jones, A., Fernández-Ugalde, O., Borrelli, P., and Montanarella, L. (2018). Copper distribution in European topsoils: An assessment based on LUCAS soil survey. *Science of The Total Environment*, 636, 282–298).

ranges between 1% and 3% in countries like Switzerland, Austria, Germany, and France (Finger, Zachmann, and McCallum, 2023).<sup>4</sup>

Fungus-resistant varieties offer major benefits to grapevine growers (Pertot *et al.*, 2017; Villano and Aversano, 2020). For example, economic benefits from reduced fungicide applications (e.g., less product costs, labor, fuel, etc.) and environmental advantages due to enhanced biodiversity resulting from fewer adverse effects on flora and fauna from spraying.<sup>5</sup> Soil becomes less compact due to fewer spraying cycles, and less accumulation of pesticide metabolites occurs, particularly from copper-based products. Growers may also reduce the risk of losses from diseases due to increased resistance of the varieties to pathogens. Disadvantages of fungus-resistant varieties mainly stem from uncertainties relating to long-term resistance, agronomy, vinification, and marketing (Montaigne, Coelho, and Khefifi, 2016; Pedneault and Provost, 2016; Pertot *et al.*, 2017).

### C. Switzerland: The ideal case study

In Switzerland, the share of land under fungus-resistant varieties from total land under wine grapes remains low; it was 2.8% in 2021 (Bundesamt für Landwirtschaft (BLW) 2022).<sup>6</sup> The adoption intensity, however, differs across the six different Swiss wine regions (see Figure 1). Adoption rates are higher in the Deutschschweiz (German-speaking part of Switzerland), Geneva, and the Trois Lacs (Three Lakes) region, and lower in Ticino, Valais, and Vaud (Finger, Zachmann, and McCallum, 2023).

Switzerland is subject to a temperate and humid climate, with varying degrees, and thus there is high fungal pressure across the country, which will likely increase due to changing climates (Salinari *et al.*, 2006; Bregaglio, Donatelli, and Confalonieri, 2013). Switzerland has a competitive wine market in which a major supermarket, in cooperation with large wineries, has recently begun labeling their wines as low in pesticides (Finger, 2021). Moreover, agricultural policy as well as society envision sharp pesticide risk reductions in the near future, making Switzerland the ideal case study to investigate the adoption dynamics of fungus-resistant varieties (Finger, 2021).

## III. Materials and methods

### A. Conceptual model

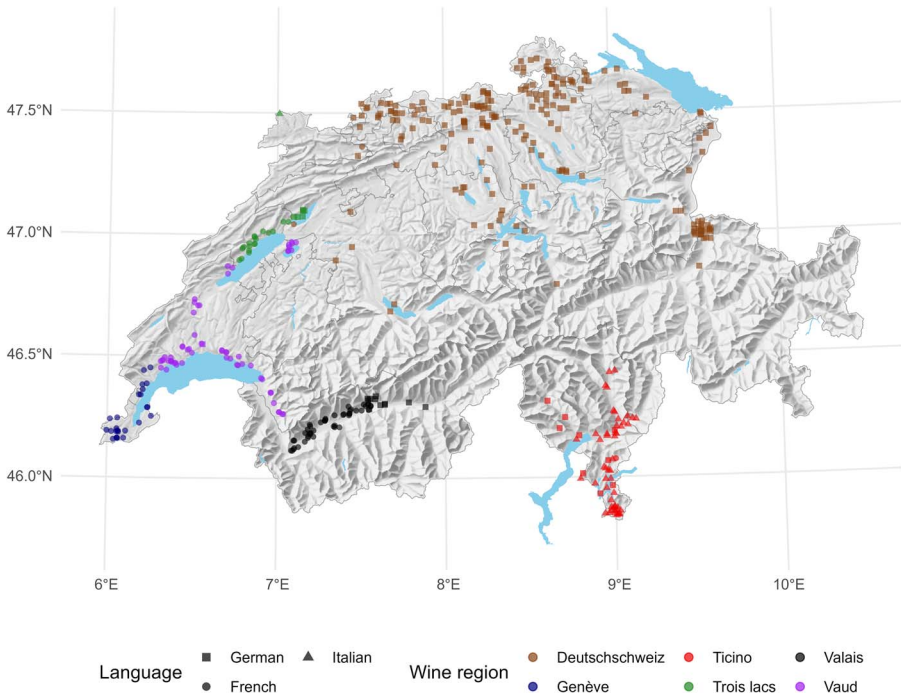
Plantation decisions for perennial crops like wine grapes are characterized by taking longer between initial planting and first harvest, which is followed by an extended period of regular output at an eventually declining rate (French and Matthews, 1971). Modeling perennial crops must thus take long-term time and risk aspects into account.<sup>7</sup>

<sup>4</sup>These are calculated as total land under fungus-resistant varieties divided by total land under wine grapes.

<sup>5</sup>For instance, Fuller, Alston, and Sambucci (2014) estimate cost savings due to using fungus-resistant grapevines of \$48 million per year in California.

<sup>6</sup>The uptake of fungus-resistant varieties is also low in other countries (e.g., Finger, Zachmann, and McCallum, 2023).

<sup>7</sup>Our conceptual framework is inspired by French and Matthews (1971) and is adapted to grapevine growing. We extend their framework by considering utility (instead of profit) maximization (e.g., Weersink and



**Figure 1.** Sample overview (N = 436) by wine region (N = 6) and language (N = 3).

*Notes:* Every scatter represents a farm that is randomly positioned within the municipality to maintain the farms' anonymity. The survey was conducted in all six wine-growing regions in Switzerland. Participants could choose their preferred language (German, Italian, or French). Therefore, the sample also contains languages not fitting to the region, for example, Italian responses in the German-speaking part of Switzerland and vice versa.

We assume grapevine growers adjust acreage for fungus-resistant varieties by considering changes in (expected) utility over time (now and in the future) and across variety types (traditional and fungus-resistant varieties).<sup>8</sup> Grapevine planting does not necessarily happen from one year to another, expected future utility from fungus-resistant varieties is thus conditional on the desired long-term land share the grower wishes to devote to these varieties. The change in the share of land devoted to fungus-resistant varieties that is the desired minus the current (or last period) land share is thus given by comparing (discounted) utility differences of the alternatives over time (Fernandez-Cornejo, 1998). Expected utility is a function of expected prices and costs, which define profits, and other features of fungus-resistant varieties that reward (dis)utility to the grower. Expected utility differentials and thus decisions across farms are driven by farmer- and farm characteristics, regional factors, as well as the perceptions, preferences, and personality traits of grapevine growers.

Fulton, 2020) as well as a farm-level (instead of an aggregative) perspective. To our knowledge, only a few studies look at supply responses in grapevines (e.g., Consoli et al., 2021).

<sup>8</sup>Refer to online Supplementary Material A for a detailed description of the modeling.

Farmer- and farm characteristics such as the degree of specialization, the size of the farm, structural factors such as the share of old grapevines, the production system, marketing channels, and labeling, as well as grapevine growers' education and (self-assessed) knowledge about fungus-resistant varieties, may all determine profits and costs, including switching and adjustment costs (Gardebroek and Oude Lansink, 2004). Grapevine growers' risk preferences are crucial to explaining economic decisions, and especially time preferences are relevant to comparing long-term utility levels across time (Falk *et al.*, 2018; Iyer *et al.*, 2020). Moreover, grapevine growers' perceptions of fungus-resistant varieties, such as environmental and health benefits or marketing difficulties, as well as the perceived willingness to pay from consumers, may reward (dis)utility to grapevine growers (Piñeiro *et al.*, 2020; Weersink and Fulton, 2020; Finger and Möhring, 2022). Additionally, personality traits such as growers' ambition, locus of control, and self-efficacy may matter for the adoption of preventive measures against pests (Knapp, Wuepper, and Finger, 2021). Last, regional factors such as pest pressure or tradition may explain utility differentials across varieties and time.

### B. Econometric strategy

Empirically, expected utility differentials remain unobserved; thus, we estimate the following linear model with ordinary least squares (OLS), including farmer- and farm characteristics, grapevine growers' perceptions, preferences, and personality traits, as well as regional factors as explanatory variables:

$$\begin{aligned} \Delta \text{Share of land under FRG}_i &= \alpha + \gamma \text{Farmer - and farm characteristics}_i \\ &+ \delta \text{Regional factors}_i + \theta \text{Perceptions and preferences}_i + \rho \text{Personality Traits}_i + \varepsilon_i, \end{aligned} \quad (1)$$

$\Delta \text{Share of land under FRG}_i$  is the difference in the expected share of land devoted to fungus-resistant varieties in ten years and the current share.<sup>9</sup> We calculate the expected share as the mean from a triangular distribution following Hardaker *et al.* (2015).<sup>10</sup> As such, we capture uncertainties inherent in the long-term prediction;  $\varepsilon_i$  is the error term that we cluster at the wine region level, which are important decision-making units in viticulture, using a wild bootstrap approach due to the small number of clusters (Wooldridge, 2003).

To assess the sensitivity and mechanisms of our results, we conduct several further analyses. First, since our model contains many explanatory variables and thus potentially suffers from multicollinearity, we test for correlated variables using variance inflation factors. Thereafter, we re-run Model 1 using sub-groups of the explanatory variables. Moreover, we run Model 1 using LASSO regression, allowing us to identify insignificant or unimportant variables from the large list of explanatory factors (Tibshirani, 1996). Second, we regress Model 1 separately for the current and expected

<sup>9</sup>The use of stated intentions is common in the literature and, in the majority of cases, reveals true ex-post behavior (e.g., Sok *et al.*, 2021).

<sup>10</sup>We calculate the expected share as the mean value from the minimum, most likely, and maximum shares growers foresee to have planted in ten years, as in Hardaker *et al.* (2015).

adoption shares. As such, we aim to describe current adopters as well as expected future adopters, independent of each other. Third, since the expected share is a projection into the future and, as such, subject to uncertainty, we investigate the variance of the expected land share distribution under fungus-resistant varieties in ten years. This provides insight into the (un)certainty around the predictions across growers in our sample.

### C. Data

We use representative survey data from 436 grapevine growers in Switzerland (see Zachmann, McCallum, and Finger, 2023b). Figure 1 reports the scope of the data collection, which was done in the three main official Swiss languages and includes responses from grapevine growers in all wine regions. Data collection focused specifically on barriers and determinants that influence the adoption of fungus-resistant varieties, including detailed farmer- and farm characteristics, perceptions, preferences, as well as personality traits of the grapevine growers.

In the survey, grapevine growers were asked which varieties they grow and how much land they allocate to each variety, allowing for the calculation of the current share of land devoted to fungus-resistant varieties. Grapevine growers were also asked what share of land they would allocate to fungus-resistant varieties in ten years using a triangular distribution where they state the most likely, minimum, and maximum shares (Hardaker et al., 2015). An important aspect is the expected replantation rate; thus, what share of their land growers intend to replant within the next ten years was elicited. We drop 75 (17.2%) grapevine growers from the sample that report no replanting of their vineyard in the next ten years. For those farms, the structural composition of the vineyards will not change and is thus not the focus of our analysis.

Refer to Table 1 for a description of the included variables in our model and to Zachmann, McCallum, and Finger (2023b) for detailed information on data collection. Table 1 also reports the coding of the variables and the expected effects.<sup>11</sup>

## IV. Results

### A. Descriptive results

At the time of the survey in 2022, 40.1% of the grapevine growers in the sample had at least one fungus-resistant variety cultivated. This is an increase of around 100% compared to 2016–2018 (Finger, Zachmann, and McCallum, 2023). However, the unweighted average of the farm-level shares of land that are devoted to fungus-resistant varieties is still low, at 10.2%. This represents an increase of 42% from 7.2% in 2016–2018.<sup>12</sup> The expected farm-level share of land devoted to fungus-resistant varieties in ten years, as stated by survey participants, is 27.4%, thus increasing by 169%.

<sup>11</sup>Refer to online Supplementary Material B for the derivation of the expected effects and sources.

<sup>12</sup>Note that here we report the average of the individual shares of land devoted to fungus-resistant varieties, while 2.8% is the total land under fungus-resistant varieties in relation to the total land under grapevines.



**Table 1.** Description of variables

	Variable name	Description	Coding	Expected effect
<b>Farmer- and farm characteristics</b>	Labor	Standardized labor requirements for vineyard	Standardized labor units (numeric)	+
	Age	Age (in years)	Years (integer)	+/0/-
	Female	The gender of the grapevine grower	Female: 1/Male: 0 (binary)	+/0/-
	Farm size	The size of the farm (in are)	Are (numeric)	+
	Farming specialization	Majority of income is from farming (>51%)	Yes: 1/No: 0 (binary)	+
	Viticulture specialization	Majority of income is from viticulture (>51%)		+
	Geographical denomination label	Farmer produces and markets their wine under AOC/DOC geographical denomination		+
	Organic label	Farmer sells wine under organic label		+/0/-
	Bio-dynamic label	Farmer sells wine under bio-dynamic label		+/0/-
	Integrated production label	Farmer sells wine under integrated production label		+
	Direct marketing	Farmer is specialized in direct marketing (share of sales that go directly to consumers is larger than 50%)		+/0/-
	Further education	Farmer has further education in plant protection		+/0/-
	Knowledge about fungus-resistant grapevines	Self-assessed knowledge about fungus-resistant grapevines (FRG)	0 (= nothing) to 5 (= very knowledgeable) (integer)	+/0/-
	Replantation rate	Replantation rate in next ten years	% (numeric)	+
	Farm successor	Does the farmer have a successor for the farm?	Yes or rather yes: 1/else: 0 (binary)	+/0/-
<b>Regional characteristics</b>	Peronospora viticola infection risk	Average peronospora viticola infection risk index between 2012 and 2021 from the nearest weather station	1: no infection risk; 2: medium infection risk; 3: high infection risk (numeric)	+

(Continued)

Table 1. (Continued.)

	Variable name	Description	Coding	Expected effect
	Oidium infection risk	Average oidium infection risk index between 2012 and 2021 from the nearest weather station	0 (no infection risk) to 100% (high infection risk) (numeric)	+
	Wine region	Dummy variable identifying wine regions (Deutschschweiz, Valais, Ticino, Vaud, Geneva, and the Three Lakes Region)	Factor	+/0/-
<b>Farmer perceptions</b>	Fungal damage	Fungal Infections have the biggest negative impact on the grapevine yield (i.e., quality and quantity)	Yes: 1/No: 0 (binary)	+
	Banned copper	Whether the farmer thinks copper will be a banned substance in Swiss viticulture in ten years		+
	FRG have a positive impact on the human health of farmers and communities surrounding farms	FRG have a positive impact on the human health of farmers and communities surrounding farms	How strongly does the farmer agree or disagree with the following statements on the left:	+
	FRG varieties are better for the environment	FRG varieties are better for the environment	strongly disagree (1), disagree (2), neutral (3), agree (4), strongly agree (5) (integer)	+
	FRG wine use will increase in the future	FRG wine use will increase in the future		+
	Wine from FRG is difficult to market	Wine from FRG is difficult to market		0/-
	Consumers are willing to pay less for wine from FRG	Consumers are willing to pay less for wine from FRG		0/-
	Wine from FRG is of lower quality than traditional varieties	Wine from FRG is of lower quality than traditional varieties		0/-
<b>Farmer preferences</b>	Time preferences	How willing is the farmer to give up income that is beneficial for them today to benefit more from that in the future	0 (= not willing) to 10 (= very willing) (integer)	+

(Continued)

**Table 1.** (Continued.)

	Variable name	Description	Coding	Expected effect
	Production risk preferences	Is the farmer willing to take risks or tries to mitigate risks in production		-
	Market risk preferences	Is the farmer willing to take risks or tries to mitigate risks with respect to market and prices		+
	Plant protection risk preference	Is the farmer willing to take risks or tries to mitigate risks with respect to plant protection		-
<b>Farmer personality traits</b>	Self-efficacy	I am confident that I can accomplish my production goals at the end of the harvest	strongly disagree (1), disagree (2), neutral (3), agree (4), strongly agree (5) (integer)	+
	Locus of control	How successful my grape/wine production is, depends mostly on my skills as a farmer		+
	Ambition	I usually set myself quite ambitious production goals		+ / 0 / -

Notes: The focus here is on technology adoption, since improved varieties such as fungus-resistant grapevines are considered new technologies in the literature (e.g., Doss, 2006; Shiferaw *et al.*, 2014). For the expected effect, + refers to an expected increase, - to a decrease, and 0 stands for no change in the expected change of the share of land devoted to fungus-resistant varieties. Refer to online Supplementary Material B for the derivation of the expected effects and sources.

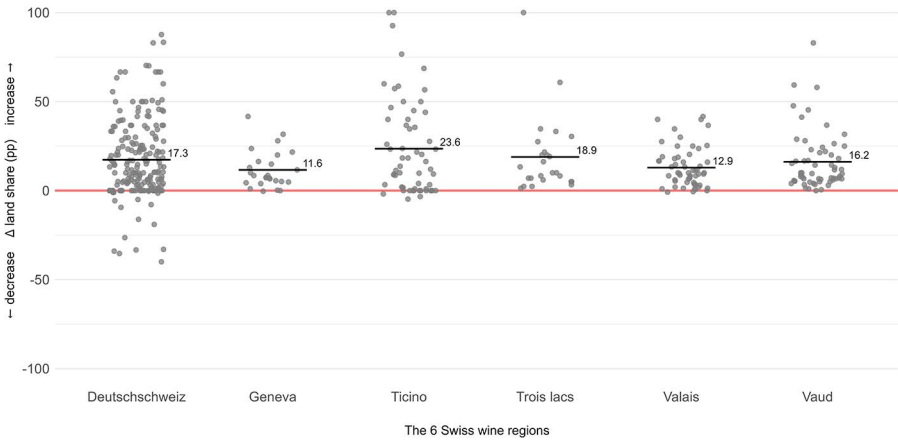
Figure 2 shows the change in percentage points (pp) between the expected share of land devoted to fungus-resistant varieties in ten years and the current shares per farm and wine region. Although a few grapevine growers in the German-speaking part of Switzerland and Ticino report a decrease in their land devoted to fungus-resistant varieties ( $N = 22$  out of 436), the large majority expects an increase in the plantation intensity of fungus-resistant varieties. The change is largest in Ticino (on average 24pp), the Trois Lacs region (19pp), and the German-speaking part of Switzerland (17pp), and lower in Vaud (16pp), Valais (13pp), and Geneva (12pp).<sup>13</sup>

## B. Regression results

Figure 3 reports coefficient estimates and 99%/95% confidence intervals from Model 1. Coefficient estimates are vertically ordered from farmer- and farm characteristics to perceptions, personality traits, preferences, and regional characteristics.

Figure 3 shows that the expected replantation rate has a large positive effect on the expected future change of fungus-resistant varieties. A 1pp increase in the replantation

<sup>13</sup>We show in Appendix H the relationship between the current land under fungus-resistant varieties as well as the future expected land and its change with local pest pressure. Farms that are subject to higher pest pressure from both *Oidium* and *Peronospora* devote more land to fungus-resistant varieties and are expected to devote more land to these varieties in ten years.



**Figure 2.** Change in expected land share devoted to fungus-resistant varieties per farm and region (percentage points).

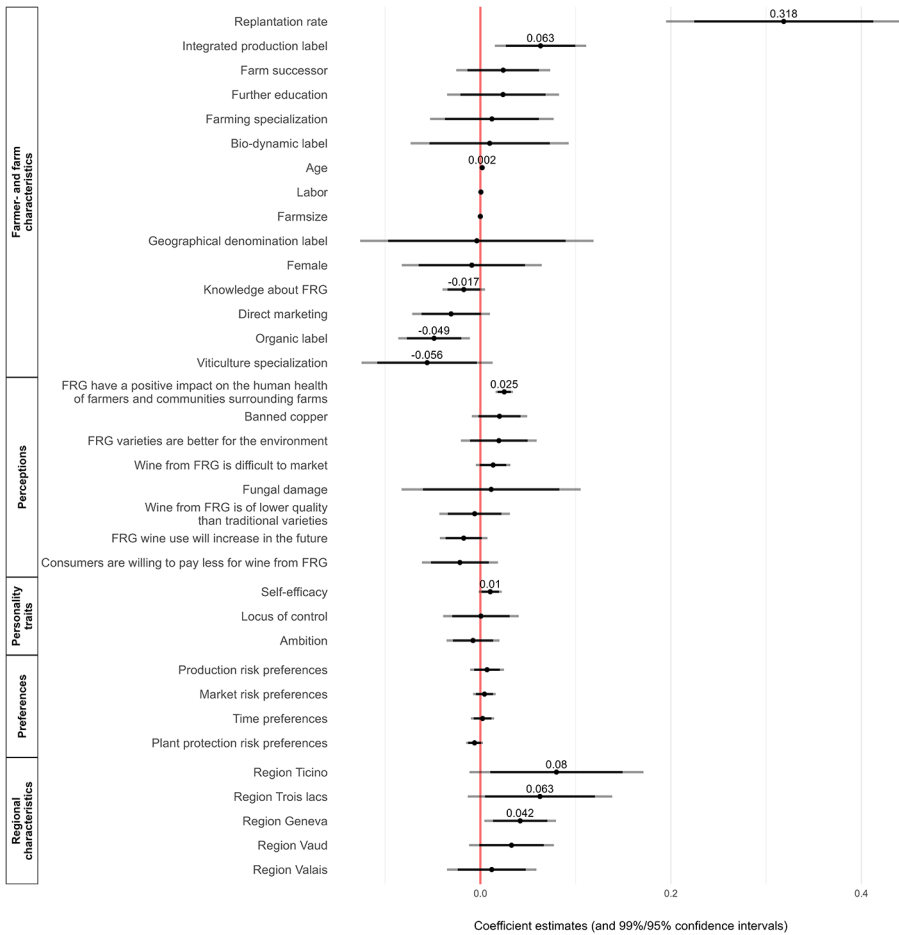
Notes: Every dot represents a farm. The horizontal black lines and corresponding numbers represent mean values per wine region.

rate is associated with a 0.32pp increase in the land devoted to fungus-resistant varieties.<sup>14</sup> Moreover, grapevine growers who produce under integrated production expect to increase their share under fungus-resistant varieties by 6.3pp compared to the baseline (i.e., conventional grapevine growers excluding integrated production).<sup>15</sup> Contrary to this, organic producers expect to decrease their share under fungus-resistant varieties by 4.9pp compared to the baseline. Generally, we find that conventional grapevine growers (i.e., non-organic growers) expect to increase their land devoted to fungus-resistant grapevine varieties more compared to organic producers (Appendix F). Furthermore, we find that grapevine growers who perceive fungus-resistant varieties to be advantageous for human health of farmers and communities surrounding farms (compared to traditional varieties) indicate that they should increase their share. More specifically, a grapevine grower with the strongest agreement that fungus-resistant varieties have a positive impact on human health indicates increasing the land under fungus-resistant varieties by 10pp more compared to a grapevine grower with the strongest disagreement (5 vs. 1 on the Likert scale).

Overall, we find that farm- and farmer characteristics and, as such, structural factors explain most of the change between the future expected share of land devoted to fungus-resistant varieties and the current share, as shown in Figure 4. The figure reports the adjusted R-squared, that is, coefficients of determination of models only including the variables of each group.

<sup>14</sup>Note that the effect sizes discussed in this section are based on correlational analysis hence do not imply causation.

<sup>15</sup>The baseline is grapevine growers who produce under the Proof of Ecological Performance Record (“Ökologischer Leistungsnachweis ÖLN”), which is the minimal regulation to be eligible to receive direct payments, and 97% produce under this standard or under no specific production system (i.e., are not eligible for direct payments).



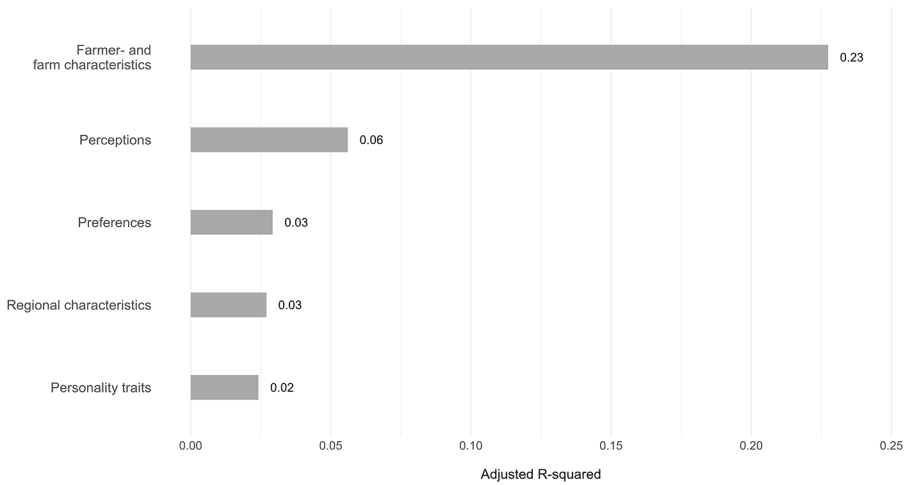
**Figure 3.** Coefficient plots and 99%/95% confidence intervals from Model 1.

Notes: The figure shows coefficient plots from Model 1. Standard errors are clustered at the wine region level using a wild bootstrap approach (Wooldridge, 2003). Significant estimates at the 5% level are highlighted with the shown estimate. 99% (95%) confidence intervals are shown in black (grey). We drop the *Oidium* and *Peronospora viticola* infection risk indices from the regression because they correlate with the wine region dummies. N = 348 (13 observations are dropped due to missing values). Appendix C reports the complete regression output.

### C. Robustness checks

Our results remain robust to several tests and further analyses.

First, variance inflation factors confirm that there is little concern for multicollinearity among the variables (Appendix D). However, grapevine growers’ time preferences and risk preferences play a role when separately included into Model 1 (together with uncorrelated control variables). Specifically, growers who are more willing to give up something today to benefit more from it in the future and are more willing to take risks in the marketing and production domain indicated an increase in the share of land devoted to fungus-resistant varieties. Moreover, a LASSO regression shows that



**Figure 4.** Relevance of groups on the adoption dynamics of fungus-resistant varieties.

*Notes:* The figure shows adjusted R-squared statistics from Model 1 when regressing only variables in the respective groups (e.g., farmer- and farm characteristics, perceptions, etc.) on the expected change of the land share devoted to fungus-resistant varieties. Refer to [Appendix C](#) for details, also on the number of included observations.

the main variables under discussion are also selected with this mechanical approach, yielding similar levels and directions of the effects.

Second, regressions on the current and expected plantation intensities reveal patterns that are in line with existing studies ([Appendix E](#)). For instance, current adopters cultivate their grapes mainly with organic methods and market their wines directly to consumers (e.g., Finger, Zachmann, and McCallum, 2023). Additionally, grapevine growers with high self-assessed knowledge regarding fungus-resistant varieties use more of these varieties, as well as those who perceive that fungus-resistant varieties are better for the environment compared to traditional varieties. Contrarily, growers who perceive fungus-resistant varieties to be better for the health of farmers and surrounding communities currently have less land devoted to these varieties.

Third, we indicate that grapevine growers are certain about the projection of their expected land share under fungus-resistant varieties in ten years ([Appendix G](#)).

#### D. Discussion

Our results show that over the next ten years, approximately 4,876 ha of land in Switzerland will be newly planted with grapevines, with 1,560 ha devoted to fungus-resistant varieties.<sup>16</sup> The expected share of land devoted to fungus-resistant varieties in ten years' time is 27.4%. *Ceteris paribus*, this means that the number of pesticide treatments in vineyards will be reduced massively, at least by around 32,000 treatments per year (see online Supplementary Material C). This implies major economic savings at

<sup>16</sup>This is assuming a constant yearly stock of land under grapevines of 14,629 ha and an annual re-plantation rate of 3.3%.

the farm level as well as reduced impacts on the environment. Moreover, it aligns with recent societal demand and policy goals to reduce pesticide use (Finger, 2021).

Furthermore, our results suggest that current (early adopters) are mainly farms producing under organic standards. However, we also find that important future adopters will be conventional, that is, non-organic growers. This is in line with existing literature suggesting that fungus-resistant varieties are one important instrument in integrated pest management but not a stand-alone solution (e.g., Pertot *et al.*, 2017). Moreover, a large supermarket chain, which is a major player in the Swiss wine market, and an organization of integrated producers in Switzerland recently established a sustainable wine label with a focus on reducing pesticide use. Using fungus-resistant varieties is one of the strategies growers can use to achieve these reductions and produce under the new label. Such industry collaborations and the corresponding price markups for growers may be crucial for the adoption dynamics of fungus-resistant varieties.

## V. Conclusions and policy implications

Fungus-resistant grapevines offer a unique opportunity to reduce pesticide use in agriculture and thus meet pesticide risk reduction targets. Using a sample of 436 Swiss grapevine growers, we investigate future adoption dynamics of fungus-resistant varieties and how these are influenced by a wide range of factors. Our results suggest that grapevine growers in Switzerland expect to devote a large share of their new plantings over the next decade to these varieties. Specifically, we find that one-third of new plantings in the next decade will be fungus-resistant varieties. As a result, the expected share of land devoted to fungus-resistant varieties in ten years is 27.4% (compared to 10.2% in 2022), thus increasing by 169%. Farmer- and farm characteristics explain most of the variability in the future expected adoption dynamics, followed by growers' perceptions, preferences, regional characteristics, and personality traits.

Our results have important public and industry policy conclusions. Fungus-resistant varieties will become more relevant in the near future. Grapevine growers see a large growth in land devoted to fungus-resistant varieties, which would have massive implications for pesticide use in Swiss agriculture. Policy shall pick up this opportunity and support this process further, tailoring a mix of policy instruments to farmer- and farm characteristics.

First, in competitive wine markets, niche products like low-pesticide wine may be attractive to grapevine growers looking to differentiate (Masset and Weisskopf, 2019). Labeling low-/no pesticide wine could thus encourage the adoption of fungus-resistant varieties.

Second, partnerships between grapevine growers (associations) and industry organizations like retailers and cooperatives could reach more growers and consumers and help reduce the risks and costs for grapevine growers in adopting fungus-resistant varieties, thus helping to timely and thoroughly reduce pesticide use and risks across the sector (e.g., Möhring and Finger, 2022).

Third, since our results predict a substantial increase in the land devoted to fungus-resistant varieties, agricultural policy can help facilitate the exchange of experience between grapevine growers regarding fungus-resistant varieties as well as ensuring the

availability of sufficient planting material. Given the currently low intensity of cultivation and the associated low level of experience with these varieties (e.g., regarding pesticide treatments, agronomy, vinification, availability, and marketing), sharing knowledge, and conducting demonstration plots, trials, and evaluations on local farms or at research stations may help increase self-efficacy about fungus-resistant varieties that positively influences future adoption in our sample. Our results give support for specific targeting of action toward some producers that are less likely to adopt fungus-resistant varieties and/or regions where adoption is needed (e.g., due to pollution problems).

Varietal adaptations are lengthy processes, so it is important to focus on long-term expectations. However, this presents a challenge because it relies on hypothetical predictions rather than actual planting decisions. However, the use of intentions is common in the literature since it is one of the few options for expectation elicitation and, in most cases, reflects actual ex-post behavior.

Future research could study the determinants of the adoption dynamics of grapevine growers in different contexts and use novel methods. Specifically, investigating causal mechanisms relevant for the adoption of fungus-resistant varieties is of great value for understanding factors influencing grapevine growers' decision-making toward low-pesticide practices.

**Supplementary material.** The supplementary material for this article can be found at <https://doi.org/10.1017/jwe.2023.36>

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## Appendix

### A. Economic relevance of wine grape production

Figure A1 shows the share of gross production values from grapes from total non-animal production averaged between 2010 and 2020. Countries with no data available are shown in white. The red-highlighted areas identify regions in the 25th and 55th parallel in both the northern and southern hemispheres where most wine production takes place. The figure illustrates that for countries where wine grapes are grown, they are highly economically relevant, accounting for shares of gross production values from total non-animal production between 20 and 30%.

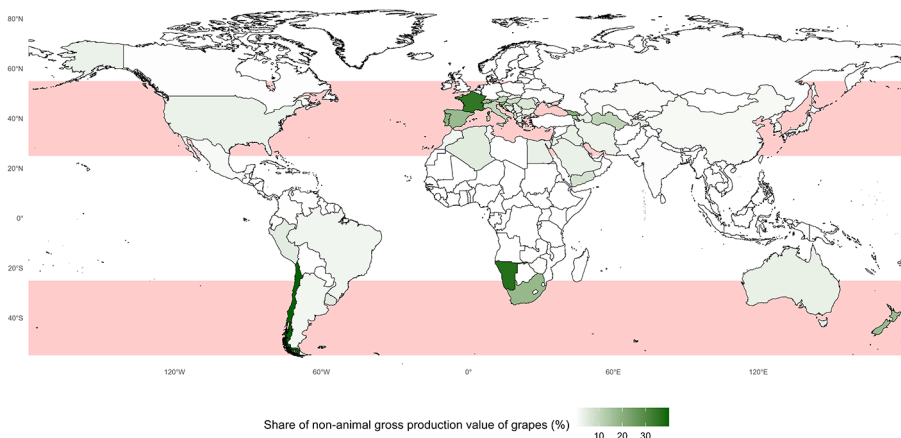


Figure A1. Global economic relevance of wine grape production.

**Table B1.** Literature review on reduction potentials of fungus-resistant varieties

Fungicide reduction	Country	Publication	Remarks
47–80%	Germany	Reiff et al. (2021)	Stronger reductions under organic than under conventional management
75–100%	Switzerland	Viret et al. (2019)	
60–90%	Six countries including France	Rousseau et al. (2013)	
>80%	Spain	Casanova-Gascón et al. (2019)	Real field experiment under growing conditions over three successive years (2016–2018)
80–84%	France	Guimier et al. (2019)	Fourteen plots around the country in 2017 Treatment Frequency Index was 84% (80%) lower for fungicides (pesticides) compared to national reference.
83.4%	Italy	Poni et al. (2017)	Next to fungicide reductions, the study also reports benefits in terms of physiological and cropping response of fungi-resistant variety compared to susceptible clone.

## B. Reduction potential of fungus-resistant varieties

Table B1 shows a literature review of the reduction potential of fungus-resistant varieties across Europe. Thus, the reduction potential of fungus-resistant varieties is substantial (at around 80%) in different contexts (e.g., countries, climates, etc.).

## C. Regression results full table

Table C1 reports full regression results from Model 1. Column (1) includes only farmer- and farm characteristics, Column (2) regional factors, Column (3) perceptions, Column (4) preferences, Column (5) personality traits, and finally, Column (6) all variables jointly (this is the base for Figure 3).

## D. Correlations between variables

Since our model includes many variables that may be correlated with each other, biasing both the magnitude and precision of the estimated effects, we conduct tests for potential multi-collinearity among the variables included in our main model. We start with a correlation matrix (see Figure D1).

Figure D1 shows correlations between all variable pairs. We use as a threshold for correlations among variables the top 95th percentile of the significant correlation distribution (e.g.,  $|\rho| > 0.4705$ ). As a result, we find correlated blocks of variables in the domains of preferences, perceptions, and regional characteristics (see Table D1).

Next, we calculate variance inflation factors (VIF) from Model 1, including all predicting variables (except for region Deutschschweiz due to perfect collinearity). We use 5 as a critical factor to determine whether multicollinearity is present (e.g., Akinwande, Dikko, and Samson, 2015). Figure D2 reports that no variable has a variance inflation factor that is larger than 5. However, the same variable blocks as shown in Table D1 depict large variance inflation factors.

Therefore, we include perceptions and preferences separately into Model 1 to see if sign and significance change due to correlations. Table D2 reports that we do not observe any changes to the sign of the respective coefficients; however, we estimate some of the preferences and perceptions with greater precision (at the 99%/95% confidence level). Specifically, grapevine growers who perceive fungus-resistant varieties to be better for human health of farmers and communities surrounding farms, or who perceive them to be better for the environment, indicate that they should increase their land under these varieties. Moreover, we find

Table C.1. Full regression output from Model 1

OLS results						
	(1)	(2)	(3)	(4)	(5)	(6)
	Change in share of land devoted to fungus-resistant varieties (%)					
Labor	0.0004 (0.0003)					0.001 (0.0003)
Age	0.002 (0.001)					0.002*** (0.001)
Female	-0.009 (0.028)					-0.009 (0.029)
Farm size	-0.00001*** (0.0001)					-0.00000*** (0.0001)
Farming specialization	-0.0002 (0.027)					0.012 (0.025)
Viticulture specialization	-0.050** (0.022)					-0.056** (0.027)
Geographical denomination label	0.003 (0.043)					-0.004 (0.048)
Organic label	-0.030 (0.017)					-0.049*** (0.015)
Bio-dynamic label	0.011 (0.031)					0.010 (0.032)
Integrated production label	0.056*** (0.021)					0.063*** (0.019)
Direct marketing	-0.015 (0.016)					-0.031 (0.016)
Further education	0.035 (0.023)					0.024 (0.023)
Knowledge about FRG	-0.002 (0.006)					-0.017** (0.009)
Farm successor	0.035 (0.027)					0.024 (0.019)
Replantation rate	0.353*** (0.057)					0.319*** (0.048)
Fungal damage			0.026 (0.031)			0.011 (0.037)
FRG have a positive impact on the human health of farmers and communities surrounding farms			0.016** (0.008)			0.025*** (0.004)

(Continued)

Table C1. (Continued.)

OLS results						
	(1)	(2)	(3)	(4)	(5)	(6)
	Change in share of land devoted to fungus-resistant varieties (%)					
FRG varieties are better for the environment			0.012 (0.009)			0.019 (0.015)
FRG wine use will increase in the future			0.007 (0.014)			-0.017 (0.010)
Wine from FRG is difficult to market			0.014** (0.007)			0.013** (0.007)
Consumers are willing to pay less for wine from FRG			-0.022 (0.018)			-0.021 (0.015)
Wine from FRG is of lower quality than traditional varieties			-0.016 (0.013)			-0.006 (0.014)
Banned copper			0.020** (0.010)			0.020 (0.011)
Time preferences				0.0005 (0.004)		0.002 (0.005)
Production risk preferences				0.009 (0.010)		0.007 (0.007)
Market risk preferences				0.003 (0.008)		0.004 (0.005)
Plant protection risk preferences				-0.006** (0.003)		-0.006 (0.003)
Self-efficacy					-0.012 (0.013)	0.010** (0.005)
Locus of control					-0.0001 (0.013)	0.001 (0.015)
Ambition					-0.011 (0.015)	-0.008 (0.011)
Wine region Geneva	0.017 (0.024)	-0.057** (0.025)	-0.027 (0.018)	-0.048** (0.023)	-0.057** (0.024)	0.042*** (0.015)
Wine region Ticino	0.072 (0.039)	0.080*** (0.030)	0.098*** (0.030)	0.087*** (0.031)	0.074** (0.034)	0.080** (0.035)

(Continued)

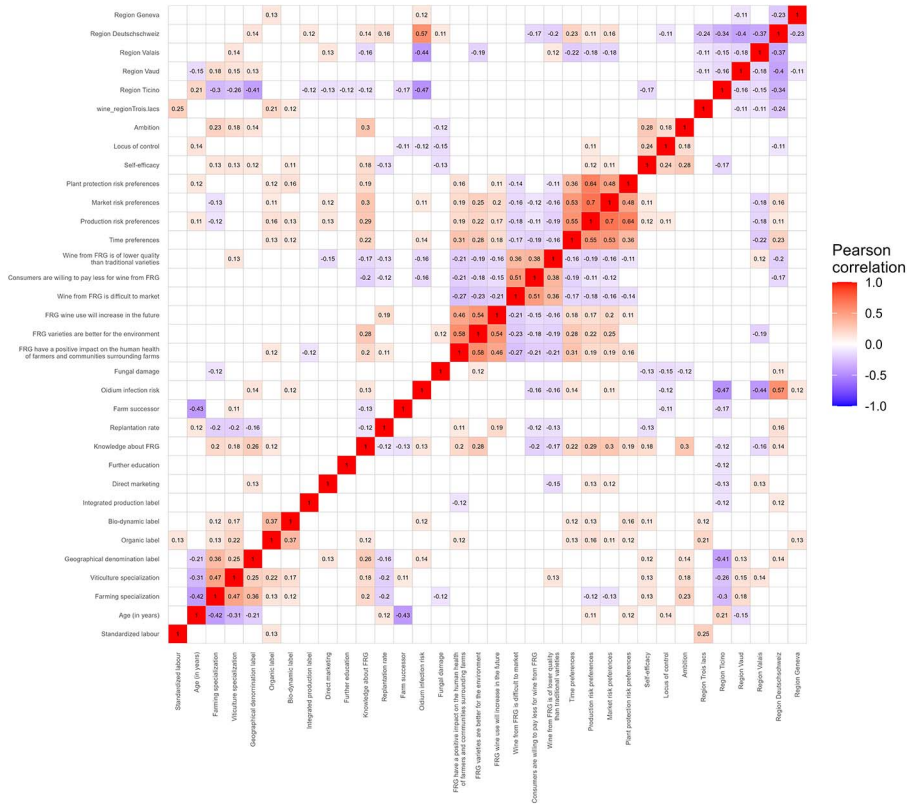
Table C1. (Continued.)

		OLS results					
		Change in share of land devoted to fungus-resistant varieties (%)					
	(1)	(2)	(3)	(4)	(5)	(6)	
Wine region Trois Lacs	0.065 (0.043)	0.007 (0.040)	0.015 (0.028)	0.008 (0.031)	0.004 (0.041)	0.063** (0.029)	
Wine region Valais	-0.021 (0.018)	-0.064*** (0.017)	-0.034 (0.027)	-0.048*** (0.017)	-0.062*** (0.018)	0.012 (0.018)	
Wine region Vaud	0.014 (0.017)	-0.028*** (0.010)	-0.009 (0.007)	-0.019** (0.009)	-0.028*** (0.007)	0.033 (0.017)	
Constant	0.001 (0.056)	0.191*** (0.011)	0.090 (0.131)	0.159*** (0.028)	0.276*** (0.027)	-0.070 (0.068)	
Wine region dummies	Yes	Yes	Yes	Yes	Yes	Yes	
N	349	361	361	361	360	348	
R <sup>2</sup>	0.272	0.041	0.090	0.054	0.046	0.322	
Adjusted R <sup>2</sup>	0.227	0.027	0.056	0.029	0.024	0.246	

\*\*\*Significant at the 1 percent level.

\*\*Significant at the 5 percent level.

Notes: Clustered and wild bootstrapped standard errors in the wine region are shown in parentheses.



**Figure D1.** Correlation matrix of all variables.  
 Note: The figure shows significant Pearson correlation coefficients at the 95% confidence level only.

that grapevine growers who are more willing to give up something today in order to benefit more from it in the future (i.e., time preferences) indicate an increase in land share under fungus-resistant varieties. When separately included in Model 1, production and marketing risk preferences also play a role. Specifically, grapevine growers who are more willing to take risks in the production and marketing domain indicate that they will increase their share of fungus-resistant varieties in the next decade.

Here we show output from LASSO regression using cross-validation to identify  $\lambda_{\min}(MSE)$ , which minimizes mean-square error. Table D3 shows the selected variables and their coefficients; it shows that the main variables under discussion are also selected with LASSO, as well as yielding similar levels and signs of the effects.

**E. Regression results for current and expected uptake intensities**

Figure E1 shows the barriers and determinants of the current and expected uptake intensities of fungus-resistant varieties. Both models use the full sample (N = 436).

Figure E1 confirms that the replantation rate has a big impact on expected plantation intensity in ten years, but not on current plantation intensity. Moreover, organic grapevine growers have currently adopted fungus-resistant varieties more intensively, in contrast to grapevine growers under integrated production.

Figure E2 shows that farm- and farmer characteristics (29%) as well as perceptions (27%) explain the largest share of the variation in the current uptake intensity as measured by the adjusted R-squared, similar



**Table D1.** Correlated variables

Domain	Variable 1	Variable 2	Pearson correlation
Preferences	Production risk preferences	Market risk preferences	0.70
	Plant protection risk preferences	Production risk preferences	0.64
	Time preferences	Production risk preferences	0.55
	Market risk preferences	Time preferences	0.53
	Plant protection risk preferences	Market risk preferences	0.48
Perceptions	FRG have a positive impact on the human health of farmers and communities surrounding farms	FRG varieties are better for the environment	0.58
	FRG varieties are better for the environment	FRG wine use will increase in the future	0.54
	Wine from FRG is difficult to market	Consumers are willing to pay less for wine from FRG	0.51
Regional characteristics	Oidium infection risk	Region Deutschschweiz	0.57

to the variability in expected land shares to fungus-resistant varieties in ten years with 39% of farm- and farmer characteristics and 29% of perceptions.

## F. Current and expected share per production system and group

**Table F1** shows that grapevine growers across all production systems are expected to increase their land devoted to fungus-resistant varieties on average, however, to varying degrees. For instance, grapevine growers under integrated production expect to increase their land from currently 5% to 25%. Similarly, grapevine growers farming under proof of ecological performance expect to increase their land from 12% to 28%. The change in land share devoted to fungus-resistant varieties is lower for organic and bio-dynamic producers that currently adopt more intensively, at 17% and 15%, respectively. Moreover, we see that grapevine growers who do not produce under a specific production system (and thus are not eligible for direct payments) expect to increase their share substantially (by 29pp), although subject to large uncertainty (mean variance of 103).

Thus, at the production group level, organic grapevine growers currently have 16% of their land devoted to fungus-resistant varieties, while for conventional growers this share is at 9.6%. In ten years, organic growers expect to have 27%, while conventional growers expect to have 31% of their land under fungus-resistant varieties.

## G. Uncertainty in the expected land share in ten years

We show the relationship between the change in the expected land share under fungus-resistant varieties (ten years and today) and the variance of the triangular distribution around the expected land share under fungus-resistant varieties. The variance is calculated as in Hardaker *et al.* (2015). **Figure G1** shows that there is no clear relationship between the change in the expected land share and the uncertainty inherent in the long-term prediction.

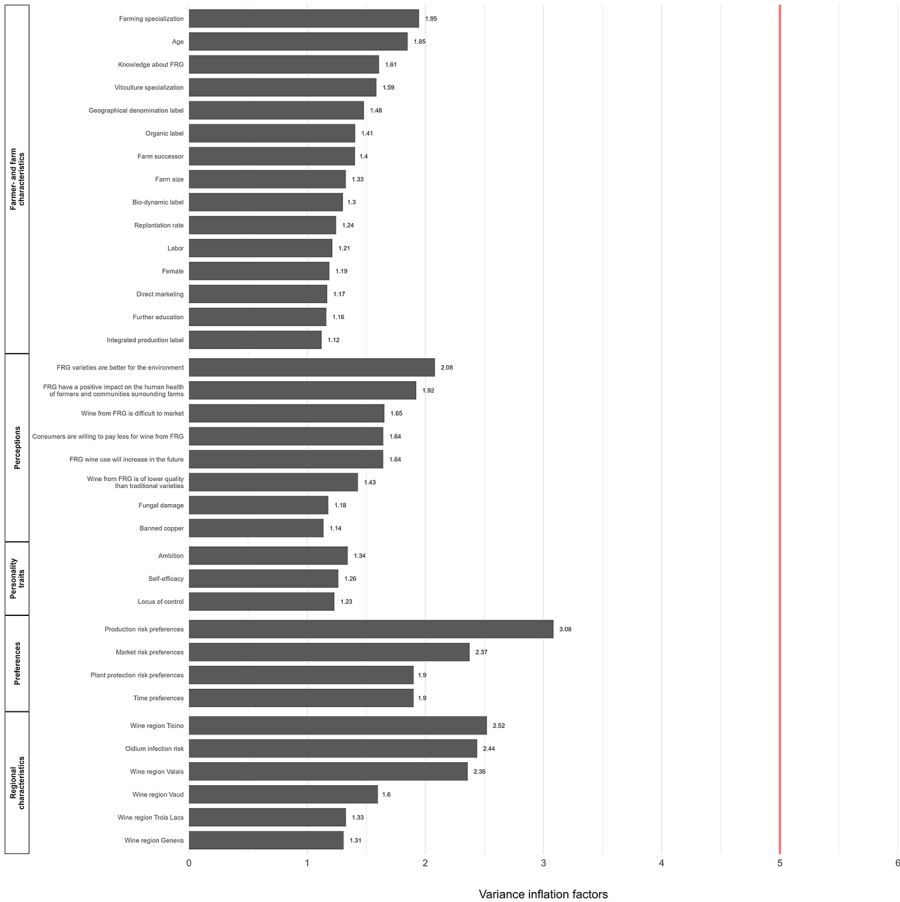


Figure D2. Variance inflation factors.

Moreover, Figure G2 shows that the vast majority of grapevine growers in our sample report a small variance (e.g., a standard deviation below 10 in the projected land share under fungus-resistant varieties in ten years).

### H. Pest pressure and uptake of fungus-resistant varieties

Table H1 shows regression results for the current share of land under fungus-resistant varieties, the expected share under fungus-resistant varieties in ten years, and the change in the land share devoted to fungus-resistant varieties between the expected and the current share. However, here we dropped the regional dummies and included the *Oidium* and *Peronospora* infection risk index averages between 2012 and 2021 from the nearest weather station as proxies for local pest pressure. Note that the scales of the two indices are different. While the *Peronospora* infection risk index is measured as 1 = no infection risk, 2 = medium infection risk, and 3 = high infection risk, the *Oidium* index is continuous from 0 = no infection risk to 100% = high infection risk.

The results show that farms that are in regions where both *Oidium* and *Peronospora* infection risks are higher, currently have more land under fungus-resistant varieties and expect to devote more to these varieties in ten years. However, for the change in the land share, we find mixed results.

Table D2. Separate inclusion of preferences and perceptions

		OLS results											
		Change in share of land devoted to fungus-resistant varieties (%)											
		(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)
Fungal damage		0.022 (0.035)											
FRG have a positive impact on the human health of farmers and communities surrounding farms			0.034*** (0.008)										
FRG varieties are better for the environment				0.031** (0.015)									
FRG wine use will increase in the future					0.011 (0.016)								
Wine from FRG is difficult to market						-0.008 (0.007)							
Consumers are willing to pay less for wine from FRG							-0.023 (0.014)						
Wine from FRG is of lower quality than traditional varieties								-0.014 (0.012)					
Banned copper									0.011 (0.014)				
Time preferences										0.009*** (0.003)			
Production risk preferences											0.008*** (0.001)		

(Continued)

Table D2. (Continued.)

OLS results												
Change in share of land devoted to fungus-resistant varieties (%)												
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)
Market risk preferences											0.008***	(0.001)
Plant protection risk preferences												0.0003 (0.002)
Constant	-0.036 (0.047)	-0.113** (0.055)	-0.100 (0.065)	-0.053 (0.082)	0.020 (0.041)	0.060 (0.055)	0.033 (0.092)	-0.012 (0.059)	-0.047 (0.064)	-0.004 (0.055)	-0.025 (0.054)	-0.011 (0.058)
Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
N	348	348	348	348	348	348	348	348	348	348	348	348
Adjusted R <sup>2</sup>	0.222	0.242	0.237	0.221	0.221	0.231	0.226	0.220	0.231	0.228	0.228	0.219

\*\*\*Significant at the 1 percent level  
 \*\*Significant at the 5 percent level.  
 Notes: Clustered and wild bootstrapped standard errors at the wine region are shown in parentheses.

**Table D3.** LASSO regression output

Variable name	Coefficient
Labor	0.03
Age	0.07
Farming specialization	-0.0002
Viticulture specialization	-0.13
Geographical denomination label	-0.02
Organic label	-0.04
Integrated production label	0.05
Direct marketing	-0.04
Further education	0.018
Knowledge about fungus-resistant grapevines	-0.05
Replantation rate	0.334
Fungal damage	0.011
FRG have a positive impact on the human health of farmers and communities surrounding farms	0.06
FRG varieties are better for the environment	0.06
Consumers are willing to pay less for wine from FRG	-0.05
Time preferences	0.01
Production risk preferences	0.03
Market risk preferences	0.01
Ambition	-0.006

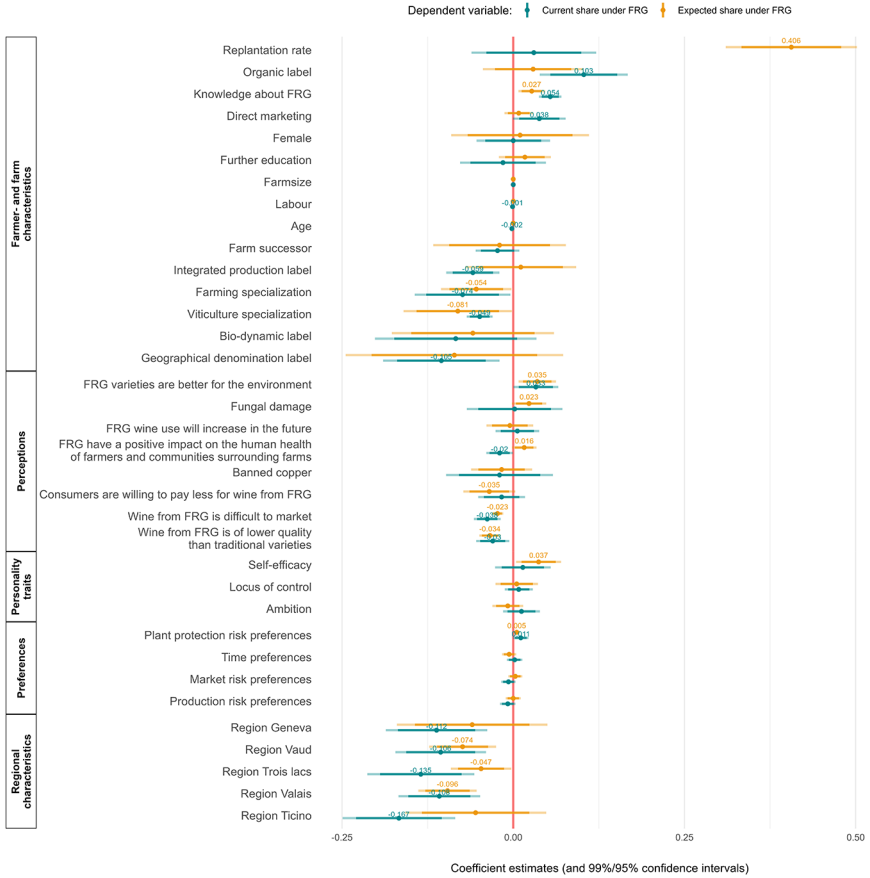


Figure E1. Regression results for current and expected uptake intensities (%).

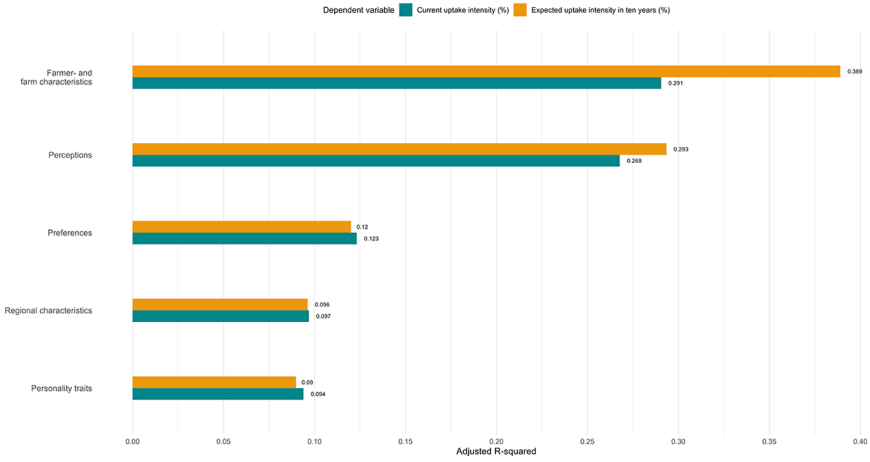


Figure E2. Adjusted R-squared for current and expected uptake intensities.

Table F1. Current and expected share per production system

Production group	Production system	Current share under fungus-resistant varieties (%)	Expected share under fungus-resistant varieties in ten years (%/variance)	Change between expected and current share (percentage points)	N
Organic	Bio-dynamic	15	25/54	10	32
	Organic	17	29/44	12	85
Conventional	Proof of ecological performance	12	28/45	16	96
	Integrated production	5	25/47	20	195
	Miscellaneous	12	42/103	29	28

Note: Miscellaneous refers to grapevine growers who have not or indicated a different production system compared to the four mentioned (e.g., hobby growers, traditional production, etc.).

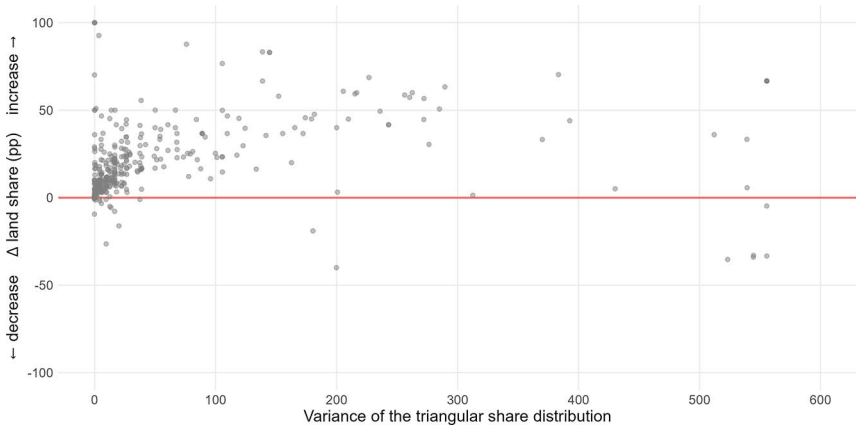


Figure G1. Change in the expected land share and uncertainty.

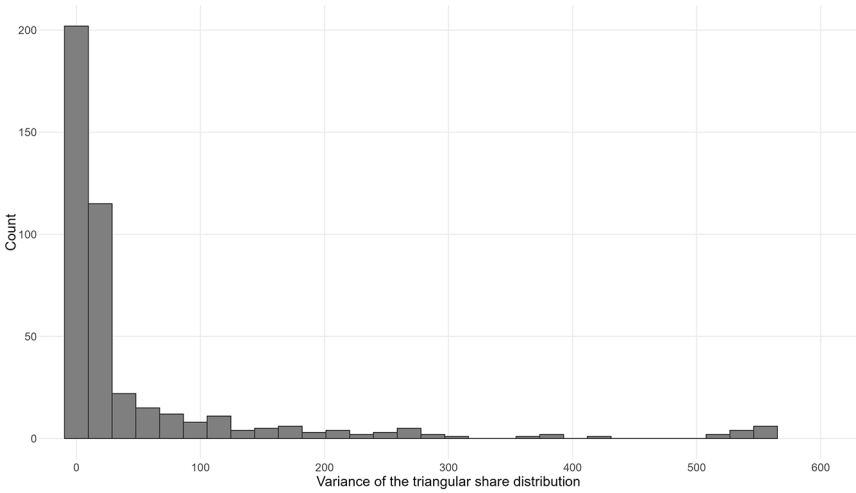


Figure G2. Frequency distribution of the variance around the expected share.



Table H1. Fungal pest pressure and the uptake of fungus-resistant varieties

	OLS results					
	(1)	(2)	(3)	(4)	(5)	(6)
	Current share of land devoted to fungus-resistant varieties (%)	Expected share of land devoted to fungus-resistant varieties in ten years (%)	Change of the share of land devoted to fungus-resistant varieties (%)	Current share of land devoted to fungus-resistant varieties (%)	Expected share of land devoted to fungus-resistant varieties in ten years (%)	Change of the share of land devoted to fungus-resistant varieties (%)
Oidium risk index	0.022*** (0.004)	0.020*** (0.004)	-0.003 (0.005)			
Peronospora Viticola risk index				0.283*** (0.004)	0.182*** (0.004)	-0.101*** (0.004)
Wine region dummies	No	No	No	No	No	No
Controls	Yes	Yes	Yes	Yes	Yes	Yes
N	348	348	348	348	348	348
R <sup>2</sup>	0.404	0.547	0.309	0.397	0.536	0.312
Adjusted R <sup>2</sup>	0.346	0.502	0.241	0.338	0.490	0.245

\*\*\*Significant at the 1 percent level.

Note: Clustered standard errors are shown in parentheses.