

# 

**Citation:** Santa JD, Berdugo-Cely J, Cely-Pardo L, Soto-Suárez M, Mosquera T, Galeano M. CH (2018) QTL analysis reveals quantitative resistant loci for *Phytophthora infestans* and *Tecia solanivora* in tetraploid potato (*Solanum tuberosum* L.). PLoS ONE 13(7): e0199716. https://doi.org/10.1371/journal.pone.0199716

Editor: Chunxian Chen, USDA/ARS, UNITED STATES

Received: April 13, 2018

Accepted: June 12, 2018

Published: July 6, 2018

**Copyright:** © 2018 Santa et al. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

**Data Availability Statement:** All relevant data are within the paper and its Supporting Information files.

**Funding:** This study was financed by Corporación Colombiana de Investigación Agropecuaria (Corpoica), and the Colombian Ministry of Agriculture and Rural Development (MADR).The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. RESEARCH ARTICLE

# QTL analysis reveals quantitative resistant loci for *Phytophthora infestans* and *Tecia solanivora* in tetraploid potato (*Solanum tuberosum* L.)

Juan David Santa<sup>1,2</sup>, Jhon Berdugo-Cely<sup>1</sup>, Liliana Cely-Pardo<sup>1</sup>, Mauricio Soto-Suárez<sup>1</sup>, Teresa Mosquera<sup>2</sup>, Carlos H. Galeano M.<sup>3</sup>\*

 Corporación Colombiana de Investigación Agropecuaria (AGROSAVIA), C.I. Tibaitatá, Cundinamarca, Colombia, 2 Faculty of Agricultural Sciences, Universidad Nacional de Colombia, sede Bogotá, Colombia, 3 Corporación Colombiana de Investigación Agropecuaria (AGROSAVIA), C.I. Palmira, Valle del Cauca, Colombia

\* cgaleano@corpoica.org.co

## Abstract

Late blight and Guatemalan potato tuber moth caused by Phytophthora infestans and Tecia solanivora, respectively, are major phytosanitary problems on potato crops in Colombia and Ecuador. Hence, the development of resistant cultivars is an alternative for their control. However, breeding initiatives for durable resistance using molecular tools are limited due to the genome complexity and high heterozygosity in autotetraploid potatoes. To contribute to a better understanding of the genetic basis underlying the resistance to P. infestans and T. solanivora in potato, the aim of this study was to identify QTLs for resistance to P. infestans and T. solanivora using a F1 tetraploid potato segregant population for both traits. Ninetyfour individuals comprised this population. Parent genotypes and their progeny were genotyped using SOLCAP 12K potato array. Forty-five percent of the markers were polymorphic. A genetic linkage map was built with a length of 968.4 cM and 1,287 SNPs showing good distribution across the genome. Severity and incidence were evaluated in two crop cycles for two years. QTL analysis revealed six QTLs linked to P. infestans, four of these related to previous QTLs reported, and two novel QTLs (grAUDPC-3 and grAUDPC-8). Fifteen QTLs were linked to T. solanivora, being qIPC-6 and qOPA-6.1, and qIPC-10 and qIPC-10.1 stable in two different trials. This study is one of the first to identify QTLs for T. solanivora. As the population employed is a breeding population, results will contribute significantly to breeding programs to select resistant plant material, especially in countries where P. infestans and T. solanivora limit potato production.

### Introduction

Potato (*Solanum tuberosum* L.) is the third most consumed food crop worldwide after rice and wheat (FAOSTAT 2017). However, late blight caused by *Phythopthora infestans* (Mont) de Bary [1] and the Guatemalan potato tuber moth (*Tecia solanivora* (Lepidoptera: Gelechiidae)), are the main phytosanitary problems for potato in Colombia and Ecuador, generating up to



**Competing interests:** The authors have declared that no competing interests exist.

40% in annual losses, and even severe epidemics have been reported [2–4]. Moreover, these phytosanitary problems may even reach a 100% of loss in some cases under field conditions and during storage, as some potato varieties used in Colombia are susceptible to Guatemalan potato moth (GPTB) and late blight (LB) [5]. Hence, pests and diseases management requires an extremely high input of pesticides [6–8]. In this sense, it is relevant to look for resistance sources for these phytosanitary problems and especially for *T. solanivora*, for which available information is limited.

The Andigenum group in potatoes includes diploid, triploid and tetraploid individuals collected from high Andean regions [9]. Moreover, autotetraploid potatoes have tetrasomic inheritance (2n = 4x = 48), high heterozygosity (> 0.8), self-incompatibility [10] and high genetic diversity [11]. Thus, the potato genome has structural complexity that limits the analysis of quantitative trait loci (QTL) [12,13] and the potential use of marker assisted selection (MAS) [14]. Additionally, the Andigenum group is considered as an important source of resistance genes [15], with a broad genetic base that allows the induction of positive heterosis for potato breeding [16].

The Colombian germplasm bank (Banco de Germoplasma de la Nación Colombiana) maintains 675 tetraploid accessions inside the Colombian Central Collection (CCC) of potato, which is considered as one of the most diverse potato collections in the world. In 2017, the CCC was genotyped and a preliminary analysis reported single nucleotide polymorphism (SNP) associated to morphological traits [11]. However, studies to evaluate the loci involved on agronomic traits such as yield, pests and diseases resistance, abiotic tolerance, and tuber quality should be evaluated.

Authors as Ramakrishnan *et al.* [17] compiled the information generated on potato molecular breeding and reported 24 markers linked to different major resistance genes (*R* genes), identified mainly in diploid populations. Most of the *R* genes were derived from the wild potato species *Solanum demisum* Lindl., containing nucleotide-binding (NB) and leucine-rich repeat (LRR) domains, which leads to programmed cell death through hypersensitive response (HR) [18]. This monogenic resistance exerts a specific selection pressure to the pathogen, forcing the emergence and spread of new pathogen races [19]. In this sense, for resistance to LB a consensus map clustering 144 previous reported QTLs reveled 24 meta-QTLs involved on quantitative resistance [20,21].

In autotetraploid potato populations the use of SNP markers has facilitated the analysis of tetrasomic inheritance in autotetraploid species, where five different types of allelic dosage, and 13 types of expected segregation from nulliplex (AAAA) to quadruplex (BBBB) genotypes can be identified [22–23]. Advances in genotyping platforms such as the Infinium Potato Array [24,25] and the sequenced potato genome [26], have allowed a high-density genotyping on tetraploid populations. These technologies have facilitated QTL analysis to identify markers related to agronomic traits as virus resistance [27], tuber quality [28] and resistance to *P. infestans* [1,14,29]. Furthermore, the development of statistical models have allowed the incorporation of allelic dosage information, increasing the probability to detect recombination frequencies between loci for QTL mapping on autopolyploid species [22,23,30–33].

Despite these advances, limited studies related to understanding the genetic underlying potato pest resistance has been reported, and specifically the resistance to *T. solanivora* has poorly been studied and understood. Recently, as part of the project "Aprovechamiento de los recursos genéticos para la valorización de sistemas productivos sostenibles de papa" [Use of potato genetic resources for value generation in sustainable productive systems] developed by AGROSAVIA, *T. solanivora* resistance sources within the Andigenum population from the CCC of potato have been evaluated. From this study, we selected and crossed five genotypes with partial resistance, with commercial cultivars generating 34 full-sib F1 families. Among

these, the population RN  $\times$  2384 developed from the crossing between Roja Nariño as the LB resistance source, and BGVCOL 15062384 as the moth resistance source, were used in this study. According to the aforementioned, the aim of this study was to develop a linkage map and identify QTLs for resistance to *T. solanivora* and *P. infestans* in the RN x 2384 biparental population.

### Materials and methods

#### Plant material

We employed the F1 biparental population (RN  $\times$  2384) comprised by 94 full siblings resulting from a crossing between cultivar Roja Nariño (RN) and the landrace BGVCOL 15062384. Roja Nariño is a commercial cultivar with quantitative resistance to *P. infestans* and susceptible to *T. solanivora* [5], whereas BGVCOL 15062384 is a native Andean variety maintained in the CCC of potato which is susceptible to *P. infestans*, and was selected for its potential resistance against *T. solanivora* under controlled conditions, according to Cely and Barreto (unpublished data).

**Field assay and experimental design.** The segregating population was evaluated in two crop cycles during 2015 and 2016 in Tibaitatá Research Center of AGROSAVIA, located in the municipality of Mosquera in Colombia. The research center is located at 4° 68' 94" N and 74° 20' 49" W, and at 2,550 m a.s.l. Field trials included an experimental unit of 12 plants per genotype with a spacing between plants of 0.40 m and 1 m between rows. Trials were established in July 2015 under an augmented block design with six checks and six blocks, and in June 2016 under a randomized complete block design with three replicates. The LB and GPTM damage was evaluated in both years. Pests and diseases were managed with a standard chemical control until 20 days after emergence (dae) and then, applications were suspended. As a resistant and a susceptible control, the cultivars Pastusa Suprema and Diacol Capiro were used, respectively.

**Evaluation of resistance to** *Phytophthora infestans.* The *P. infestans* severity-based disease progress under field conditions was scored during five observations every 15 days starting from the 30<sup>th</sup> dae for the trials in 2015 and 2016, under natural *P. infestans* infestation conditions. Percentage of the disease-infected area compared to the whole plant was estimated visually in four plants in each experimental unit [34]. The average of affected leaf area value was used to calculate the area under the disease progress curve (AUDPC):

$$AUDPC = \sum_{i=1}^{n} (\frac{Xi + 1 + Xi}{2})(ti + 1 - ti)$$
(1)

Where, *Xi* is the percentage of tissue affected at observation *i*; *ti* is observation days, and *i* is the number of observations.

**Evaluation of resistance to** *Tecia solanivora*. We evaluated the resistance to *T. solanivora* in the field during 2015 and 2016 as well as under storage conditions in 2017. For field conditions, we evaluated weekly the adult population density of *T. solanivora* using a sexual pheromone trap [35]. Pest damage incidence at harvest (IPC) was calculated as a ratio of the number of tubers with damage over the total number of tubers. For storage conditions in 2017  $(15 \pm 5^{\circ}C, 74 \pm 20\%$  relative humidity (RH)), moth incidence (IPA), moth severity (SPA) and the number of moth larvae outflow holes (OPA) were evaluated, employing in this case, entomological cages of 6.25 m<sup>2</sup> under a randomized complete block design. Infestations were carried out using 50 adult couples of Guatemalan moths released weekly for five weeks. Subsequently, IPA and OPA values were scored four weeks after the last infestation, as mentioned above. SPA was evaluated cutting the affected tuber into quarters and each quarter was visually evaluated according to the damage scale published by Arias *et al.* [36]. In addition,

means of each variable were adjusted according to differences between blocks. Phenotypic statistics data and normality test (Shapiro-Wilk, Kurtosis, Skewness) were carried out using the R software version 3.4.1 [37].

**Genotyping.** Young leaf samples of eight weeks after emergence were used for DNA extraction. DNA was extracted using the DNeasy Plant Mini kit (Qiagen, Germantown, MD, U.S.A.) according to instructions from the manufacturer. DNA quality and concentration was checked by spectrophotometry in a Nanodrop (Nanodrop Technologies, Montchanin, DE, U. S.A.), and visualized in a 1% agarose gel stained with SYBR Safe (0.5  $\mu$ m mL<sup>-1</sup>). Samples were diluted to a final concentration of 50 ng  $\mu$ L<sup>-1</sup>. Moreover, genotyping was carried out using the Infinium (Illumina®) platform with SolCAP potato 12808 SNP array (GeneSeek, San Diego, CA, U.S.A.). SNP allele fluorescence intensities obtained from Genome Studio software version 2.0 (Illumina, San Diego, CA, U.S.A.) were used to assign five possible tetraploid genotypes (AAAA, AAAB, AABB, ABBB, BBBB) in each sample using the saveMarkerModels option included in the fitTetra package [30] using the statistical R software [37].

Genetic linkage map construction. A linkage map was developed using TetraploidSNP-Map software section SNP (TPM, BIOS) [33]. SNP markers with significance values of the chisquare goodness-of-fit statistic that were lower than 0.001 for SNP simplex and 0.01 for SNP duplex and other types of segregation distortion were discarded. Furthermore, SNPs in linkage cluster analysis groups were mapped [38] and ordered according to the chromosome in the physical map (PGSC v4.03) [26]. Additionally, the linkage phase of each marker and an analysis between pairs of markers were estimated by two-point analysis (TPA). A multidimensional scaling analysis (MDS) was carried out according to the methodology reported by Preedy and Hackett [32], deleting markers placed outside the calculated curve. Then, recombination frequencies (RF) were calculated and mapped with a RF < 0.5 and transformed to relative distances in centi-Morgans (cM) using the Kosambi function [39]. Parent phase was inferred using the dosage of simplex markers of the population in each homologous chromosome. A graphical representation of the linkage map was carried out using MapChart 2.3 [40].

*Phytophthora infestans* and *Tecia solanivora* resistance QTL mapping. We adjusted the average of each variable according to the experimental design analyzed with the genotyping matrix using TetraploidSNPMap software section SNP-QTL (TPM, BIOS) [33]. A model of additive effects for each homologous chromosome was used for QTL mapping. The statistical significance of the QTL was based on 1,000 permutations with a 95% confidence interval. Furthermore, the percentage of explained variance by each QTL and coefficient of determination  $R^2$  was calculated for each variable: severity of LB in the field for each year (rAUDPC), incidence of GPTB in the field per year (IPC), incidence of GPTB under storage conditions, and number of output holes in storage (OPA).

Nonetheless, the most likely QTL position was calculated based on simple models according to the means of the phenotypic values using the Schwarz information criterion (SIC) [41]. Models tested were simplex, duplex as codominant variant, duplex as codominant factor, allele dominant duplex, double simplex as codominant variant, codominant factor double simplex, and dominant double simplex [33]. The model with the lowest SIC and a highest  $R^2$  values were selected following the methodology proposed by Hackett *et al.* [23].

#### **Results and discussion**

#### Phenotypic evaluation

Phenotypic data follow a normal distribution (Kurtosis < 1, Skewness close to 0 and Shapiro-Wilk *p*-value > 0.05), with exception of two traits: IPC in 2016 and OPA in 2017 (Table 1).



Trait*	Year	Paren	Parents**			F1 progeny							
		Roja Nariño	BGVCOL										
			15062384	Mean	SD	Min	Max	SD	SE	Var	Kurtosis	Skewness	SW p-value
rAUDPC	2015	-	-	0.16	0.04	0.08	0.26	0.037	0.003	0.0014	-0.22	0.20	0.578
rAUDPC	2016	0.11	0.60	0.43	0.12	0.16	0.72	0.118	0.012	0.0140	-0.14	-0.16	0.7215
IPC (%)	2015	-	-	27.38	17.03	0.70	73.20	17.13	1.796	239.76	-0.08	0.72	0.0008
IPC (%)	2016	20.98	2.41	5.07	4.88	0.00	33.33	4.93	0.526	24.382	11.22	2.76	7.39 x 10 <sup>-11</sup>
IPA (%)	2017	34.54	15.78	29.93	13.88	5.07	66.72	13.87	1.487	192.59	-0.68	0.38	0.05479
SPA (%)	2017	52.08	24.71	51.58	5.07	24.38	81.84	12.04	1.291	145.08	-0.45	-0.01	0.8324
OPA (holes)	2017	2.0	0.97	1.92	66.72	0.89	4.64	1.043	0.111	1.089	19.48	3.56	$6.05 \text{ X } 10^{-12}$

#### Table 1. Resistance evaluation to Phytophthora infestans and Tecia solanivora in the potato segregating tetraploid population RN × 2384.

\* Values are presented in terms of severity mean values, maximum (Max) and minimum values (Min), standard deviation (SD), standard error (SE), variance (Var), Kurtosis, Skewness and Shapiro-Wilk *p-value* (SW *p-value*). *P. infestans* relative area under the disease progress curve (rAUDPC); *T. solanivora* field incidence (IPC), *T. solanivora* incidence under storage (IPA), *T. solanivora* severity under storage (SPA); and number of outflow holes in storage (OPA). \*\* Parents were only evaluated in 2016 and 2017.

https://doi.org/10.1371/journal.pone.0199716.t001

Field condition results were directly related to rainfall. Hence, due to the low precipitation occurred in year 2015 (178 mm), the severity of *P. infestans* showed rAUDPC values from 0.08 to 0.26, with an average of 0.16. However, due to an increase in rainfall up to 425 mm occurred in the flowering stage during 2016, severity decreased ranging between 0.16 and 0.72 with an average of 0.43 (Table 1 and S1 Table). These environmental contrasting conditions were very important for the evaluation of the resistance to GPTB and LB.

Despite different weather effects occurred in each year (S1 Fig), rAUDPC and IPC traits in 2015, RAUDPC in 2016, and IPA and SPA in 2017, exhibited normal distribution showing polygenetic effects associated with LB and GPTM resistance. Specifically, in 2016 a transgressive segregation was obtained with more resistant and susceptible genotypes to *P. infestans* than their parents (Fig 1). Similarly, Costanzo *et al.* [42] found 13 genotypes with lower AUDPC values than the resistant parent BD172-1 (*Solanum stenotomum* Juz. & Bukasov) using a two-parent F1 diploid population of *Solanum phureja* Juz. et Buk × *S. stenotomum* including 230 full-sibs. In our study, high precipitation and high relative humidity occurred in 2016 comprising important factors to increase the *P. infestans* epidemic in the field. Sporangia are particularly formed in a humidity of 90% to 100%, and then water on the leaf surface allowed the production, release and dispersion of zoospores [4], while sporangia dispersion depends on wind speed [43].

Similarly, the incidence of *T. solanivora* exhibited a differential pattern comparing years of assessment. In 2015, the average incidence was 73% due to low precipitation occurrence during flowering and senescence, allowing the moth to be optimally developed and increasing adult number (Fig 2). In contrast, in 2016 humidity reduced the adult moth population as well as its incidence with an average of 5.07% (Fig 3). As it was expected, the susceptible parent Roja Nariño potato showed an incidence of 20.98% and BGVCOL 15062384 showed a moderate resistance of 2.41% (Table 1). Interestingly, the population distribution during 2015 presented a biased and unimodal trend, indicating that few major genes are associated with moth resistance (Fig 3) [44]. Moreover, this contrasting response of *T. solanivora* incidence based on rainfall, relative humidity and temperature has been reported previously by Villanueva and Saldamando [45]. Additionally, in 2016 two genotypes with higher values compared to their susceptible parents were identified, and 20 genotypes showed lower degree of severity than





Fig 1. Histogram of severity of *Phythopthora infestans*. The x-axis shows the relative area under the disease progress curve (rAUDPC) and the y-axis the number of genotypes can be observed. The dash lines indicate the average trend for each year. The black and grey triangles indicate the phenotypic parent values of Roja Nariño and BGVCOL 15062384 in 2016, respectively.

https://doi.org/10.1371/journal.pone.0199716.g001

their resistant parent (negative transgressive segregation), indicating a possible genetic overdominance of some loci.

In addition, the storage trial showed a higher damage compared to field conditions, where the moderate resistant parent BGVCOL 15062384 showed less incidence (15.78%), severity (24.71%) and output holes (0.97) compared with Roja Nariño that showed an incidence of 34.54%, a severity of 52.08% and 1.6 output holes. The F1 population showed a normal distribution for incidence, severity and number of output holes (Fig 4 and Fig 5). Additionally, we found transgressive genotypes for resistance and susceptibility supporting our field results. In average, the population showed incidence of 29.93%, severity of 51.58% and 1.92 output holes (Table 1). Similar results using the same methodology were found by Cadena *et al.* [46] that reported a range of severity from 3% to 90% with an average of 45.1%, and using a severity selection threshold of 25%. In contrast to the polygenic inheritance found in the storage trial, Ortiz *et al.* [47] reported a simple inheritance resistance from the parent *Solanum sparsipilum* (Bitter) Juz. & Bukasov to potato tuber moth (*Phthorimaea operculella*), evaluating 62 full-sibling families. In this difference, it is important to define the breeding strategies used (population size, selection pressure, and selection cycles) as polygenic traits are more complicated in terms of genetic gain [48].

#### Genotyping

A total number of 12,808 SNPs from SolCAP potato array including SNPs 8,303 previously reported by Hamilton *et al.* [24], plus additional SNPs developed from candidate genes were used (Joseph Coombs, personal communication). Subsequently, 878 markers were discarded





Fig 2. Population screening of *Tecia solanivora*. Fluctuation of adult male populations of *Tecia solanivora* during the field trials for years 2015 and 2016. Evaluations were conducted weekly using a sexual pheromone trap during two crop cycles in consecutive years 2015 (continuous line) and 2016 (dotted line).

based on low allelic dosage quality. A total of 5,460 (45.8%) SNPs were polymorphic, 55 were incompatible with the parent allelic dosage, 967 showed double reduction, which in terms of tetrasomic inheritance, this is one of the biological causes generating more distortion in population segregation [49,50], and 1,954 presented 0 allele dosage for both parents (AAAA x BBBB). Finally, 1,606 (13%) markers were selected to be assigned to a chromosome; and of these, 291 markers were discarded as duplicates using a two point analysis (TPA), and 28 markers were found as outliers by multi-dimensional scaling (MDS), according to the methodology reported by Preedy and Hackett [32].

#### Linkage mapping

A total number of 1,287 markers were mapped into 12 chromosomes according to the physical map (PGSC v4.03) [26]. More than half of the markers (791 markers) segregated in the 1:1 or simplex form (AAAB × AAAA, ABBB × BBBB), and the other informative markers segregated as double simplex (AAAB × AAAA, ABBB × ABBB) and duplex (AABB × AAAA, AABB × BBBB). These specific dosage configurations allow the detection of linkages between pairs of loci and estimation of recombination frequencies [22]. In general, markers showed a uniform distribution within each chromosome with a range of 74 markers on chromosome 12, and 197 on chromosome 1, with an average of 107 markers per chromosome (Table 2).

Average density between markers across the genome was 0.77 cM with a minimum of 0.55 cM on chromosome 1 and a maximum of 1.19 cM on chromosome 12. The total map length was 968.4 cM with a mean of 82.2 cM per chromosome, a minimum length of 63.9 cM for chromosome 8 and a maximum of 108.3 cM for chromosome 1. Some intervals larger than 10





Fig 3. Incidence of *Tecia solanivora*. Histogram of incidence of number of individuals of *Tecia solanivora* under field conditions in two consecutive years (2015 and 2016). The black triangle indicates the phenotypic value of Roja Nariño and the grey one indicates the value of BGVCOL 15062384.

cM were found in the genetic map on chromosomes 5 and 7, with gaps of 10.7 cM and 15.04 cM, respectively.

Similar map length and density were reported by Hackett *et al.* [22] using a F1 population of 190 full-sibs and 1,301 SNPs, reporting a total map length of 1,087 cM with a density of 0.83 cM. Likewise, Massa *et al.* [14] showed a map length of 1,072 cM with a density of 0.54 cM using 1,972 SNPs. Recently, da Silva *et al.* [27] mapped 2,426 SNPs using 236 F1 individuals, reporting a map size of 1,052.6 cM with a density of 0.98 cM. Thus, our study showed a similar total map length and marker density compared with the results mentioned above, despite the relatively small population size (Table 2). However, when the number of progeny genotypes is around 100, the variances are highly overestimated; this can however be reduced by increasing the population size [51].

#### Phytophthora infestans QTL identification

Six QTLs were identified for resistance to *P. infestans*, more specifically, four QTLs for resistance (qrAUDPC-1, qrAUDPC-3.2, qrAUDPC-5 and qrAUDPC-8) and two for susceptibility (qrAUDPC-3.1 and qrAUDPC-4) (Table 3 and Fig 6). These QTLs were not stable from one year to the next mainly due to the climatic variability occurred in 2015 and 2016 (S1 Fig), and minor QTLs are highly affected by the environment. The percentage of explained phenotypic variance ranged from 3.93% to 7.17% with a log of the odds (LOD) score ranging from 2.86 to 3.43 on chromosomes 3 and 1, respectively, indicating that they are minor QTLs. According to the Beavis effect, this could be because the RN  $\times$  2384 population only had 94 genotypes, and this small population size may reduce the LOD score of major QTLs; on the other side, maybe it cannot detect QTLs of smaller effects reducing the number of QTLs detected [51]. Vales



Fig 4. Incidence (IPA) and severity (SPA) of *Tecia solanivora* under storage conditions. Severity (SPA) and incidence (IPA) values are shown in dark gray and lightgrey bars, respectively. The dash line indicates the SPA trend average and the dotted line indicates the IPA trend average. The black and gray symbols indicate the phenotypic value of Roja Nariño and BGVCOL 15062384. Triangles and stars indicate IPA and SPA respectively.

PLOS ONE

*et al.* [52] have studied this effect in wheat rust resistance identifying major QTLs but missing those of small effects in a relatively small population. This is an important issue especially for partial resistance to LB, where the QTLs reported showed small effects [20,53]. In contrast, QTLs related to *Globodera pallida* resistance showed a significantly higher effect [53].

Furthermore, of the QTLs related to LB resistance, four have previously been reported in the literature. Particularly, according to the synteny analysis performed by Mosquera *et al* [1], the QTL qrAUDPC-1 found at 81.5 Mb on chromosome 1 is placed 0.46 Mb from the QTL dd1b reported in tomato [54]. Additionally, the region comprised by qrAUDPC-1 shows a gene that codes for a zinc finger protein that has multiple functions in the regulation of several resistance mechanisms to biotic and abiotic factors. Particularly, zinc finger domains are present in the resistance proteins accompanied by nucleotide-binding site leucine-rich repeat (NBS-LRR) proteins [55], which have been shown to lead to programmed cell death through the hypersensitive response [18]. Additionally, the locus found is related to nodulin proteins, which shows sugar transporter domains called Sweets involved in plant susceptibility, senescence, and glucose uptake in *Arabidopsis* roots [56].

Moreover, the QTL qrAUDPC-3.1 found on chromosome 3 is collinear with the QTL GP25 reported by several authors [57–61]. This locus showed a gene related to a component of the ABC transporter membrane, which is involved in resistance to bacteria, fungi and insects [62–63]. One type of ABC transporter is the NtABCG5/NtPDR5, and its presence in the membrane is directly related to plant resistance to herbivore attack between the hornworm (*Manduca sexta* L.) and tobacco (*Nicotiana tabacum* L.) involving methyl jasmonate signaling [64].

Similarly, the QTL qrAUDPC-5 found at 4.05 Mb in chromosome 5 is closely related to QTL GP21 [57,58,65,66]. The same loci have been associated to maturity [1,14,20,67], and a





Fig 5. *Tecia solanivora* severity based on number of output holes (OPA). The x-axis shows the output holes number in each tuber, while on the y-axis shows number of individuals. The dotted line indicates the average trend. The black triangle indicates the phenotypic value of Roja Nariño and the grey one de value of BGVCOL 15062384.

StCDF1 gene (PGSC0003DMG400018408), which is a maturity gene in potato plants, has been found in this region. The QTL qrAUDPC-4 was related to susceptibility and was located at position 65.9 Mb with a syntenic relation to the QTL TG345 reported by Brouwer *et al.* [54] in tomato. In addition, individuals with this allele from the susceptible parent in locus c1\_16191, have on average a higher disease severity (0.071 rAUDPC). This mapped locus is related to the kinase protein receptor of the cytoplasmic membrane CLAVATA 1, which has extracellular domain leucine-rich repeats (LRRs), and a functional domain of kinases rich in serine-

Table 2. Summary of the genetic map of the potato population RN × 2384.

Chromosome	Mapped markers	Length map (cM)	Interval density (cM)	Long Interval (cM)
1	197	108.3	0.55	7.31
2	95	70.2	0.74	7.18
3	108	88.08	0.82	6.08
4	131	82.88	0.63	7.03
5	90	70.96	0.79	10.7
6	113	76.15	0.67	5.40
7	91	91.09	1.00	15.04
8	88	63.9	0.73	4.30
9	102	83.9	0.82	7.34
10	99	96.51	0.97	9.87
11	99	66.74	0.67	4.26
12	74	87.74	1.19	9.40
Total	1,287	986.4		

https://doi.org/10.1371/journal.pone.0199716.t002

QTL	Chr	Year	Marker	Position cM	Position Mb <sup>a</sup>	LOD	LOD 90% <sup>b</sup>	$R^2$	Gene function
qrAUDPC-3	3	2015	c2_229	68	57.97	2.9	2.73	3.9	Auxin response factor 2
qrAUDPC-8	8	2015	c2_16993	58	54.8	3.5	2.56	5.2	BHLH transcription factor JAF13
qrAUDPC-5	5	2016	c2_11822	7	4.05	2.9	2.48	4.2	E3 ubiquitin ligase PUB14
qrAUDPC-4	4	2016	c1_16191	67	65.9	2.5	2.47	5.4	Receptor protein kinase CLAVATA1
qrAUDPC-3.1	3	2016	c2_17559	40	44.14	3.1	2.64	5.6	ABC-type Co2+ transport system
qrAUDPC-1	1	2016	c2_9878	98	81.5	3.4	3.08	7.2	Unknown function

Table 3. QTLs for resistance to Phytophthora infestans found in the RN × 2384 population.

<sup>a</sup> Location on the physical map (Mb) according to PGSC v4.03. LOD score.

<sup>b</sup> LOD score at a threshold calculated at 90% with 1,000 permutations; Chr: chromosome.

https://doi.org/10.1371/journal.pone.0199716.t003

threonine, which acts in signal transduction [68]. This type of domain has been shown to have the function of recognizing pathogens by signaling cascades, and the subsequent activation of defense mechanisms in plants [69-70].

On the other hand, qrAUDPC-3 and qrAUDPC-8 have not been reported previously. The first one was located in the 57.97 Mb position and individuals with this allele from the susceptible parent in locus c2\_229 has an average higher disease severity (0.015 rAUDPC). Moreover, this locus involved a transcription factor Arf2 related to leaf senescence, mediated by oxidative stress in *Arabidopsis* [71], and is related to the signaling of the gibberellin and brassinosteroid pathways in the plant-pathogen interaction [72,73], Specifically, wheat plants with this silenced gene showed a moderate but significant reduction in the severity of wheat blight (FHB) symptoms caused by *Fusarium culmorun* [74], mainly due to auxin signaling that helps colonization in a plant-pathogen interaction [75–77]. The QTL qrAUDPC-8 was located at the 54.8 Mb position and individuals with this allele of the susceptible parent at locus c2\_16993 have on average a lower disease severity (-0.018 rAUDPC). This marker is related to a gene that codes for a transcription factor helix-loop-helix (bHLH) JAF13 involved in flavonoid biosynthesis in *Petunia x hybrida* [78].

These results should be validated in other environments and with another genetic background to corroborate the QTL effect on resistance due to non-additive effects and environmental interaction, as these play an important role for quantitative resistance response to *P. infestans* [79]. It is also important to note that QTL-associated genes identified in this study (Table 3) are known to be important for plant defense and disease resistance (i.e. auxin-mediated defensive mechanisms, defense-related transcription factors, protein degradation, cell signaling and ABC-associated transport).

#### Tecia solanivora QTL identification

The QTLs associated with resistance or susceptibility to *T. solanivora* found in this study are so far, the first reported in the literature. These QTLs are different from those identified for *P. infestans* in this evaluation. A total of fifteen QTLs for *Tecia solanivora* were identified, five QTLs for the field phenotypic trial (IPC), including three QTLs in 2015 and two in 2016. Under storage conditions, ten QTLs were identified including four related to moth incidence (IPA), three for moth severity (SPA) and three for moth output holes (OPC) (Table 4 and Fig 6). In summary, seven QTLs were found related to resistance, and eight to susceptibility. Interestingly, despite the precipitation difference occurred between years (S1 Fig) some QTLs were stable such as qIPC-6 in 2015 and qOPA 6.1 in 2017, and qIPC-10 in 2015 and qIPC10.1 in 2016.









QTL	Chr	Year	Marker	Position (cM)	Position (Mb)	LOD score	LOD Threshold 90%	R <sup>2</sup>	Gene function
qIPC-2	2	2015	c1_7874	67	46.19	2.83	2.79	4.8	Granule-bound starch synthase 2
qIPC-6	6	2015	c2_33892	56	49.67	2.77	2.59	3.7	Cytochrome c1-1. heme protein
qIPC-10	10	2015	c1_13416	86	55.89	2.38	2.35	3.9	Transcription initiation factor IIB-2
qIPC-7	7	2016	c2_52110	29	9.12	4.15	2.55	11.4	Auxin response factor
qIPC-10.1	10	2016	c2_48107	82	58.4	2.77	2.36	5.7	F-box family protein
qIPA-4	4	2017	c1_11211	58	62.25	2.86	2.77	3.8	Regulator of Vps4 activity in the MVB pathway
qIPA-2.1	2	2017	c2_32381	51	22.39	4.49	2.99	12.9	Conserved gene of unknown function
qIPA-9	9	2017	c2_43437.	40	47.65	2.91	2.81	4.8	Cyclin-dependent protein kinase
qIPA-12	12	2017	c1_16443	41	10.04	3.55	2.67	8.3	Enhancer of ag-4 1
qSPA-3	3	2017	c2_20177	54	48.94	3.68	2.64	8.6	AGO1-2
qSPA-4.1	4	2017	c2_21934	10	4.60	2.63	2.73	5.2	CD2 antigen cytoplasmic tail-binding protein 2
qOPA-7.1	7	2017	c2_10461	54	32.40	3.61	2.47	10.3	Vacuolar protein sorting protein
qOPA-6.1	6	2017	c2_31144	57	48.87	2.46	2.17	4.8	Unknown function
qOPA-12.1	12	2017	c1_3172	45	29.22	2.33	2.24	4.3	Cleavage stimulation factor 50 kDa subunit

Table 4. QTLs identified for resistance to Tecia solanivora in the RN x 2384 population.

Chromosome (Chr); evaluation year (Year); Marker position (Position Mb) on the physical map according to PGSC v4.03; LOD score at a threshold calculated at 90% with 1,000 permutations (LOD Threshold 90%); % of explained variance ( $R^2$ ).

https://doi.org/10.1371/journal.pone.0199716.t004

Among the four QTLs found for resistance in the field (qIPC-10, qIPC-6, qIPC-7 and qIPC-2), the QTL qIPC-2 at 67 cM in chromosome 2 contributed in the additive effect to the quantitative resistance with an incidence percentage of -13.05%. This means that within this population, individuals with the resistant potato allele at locus c1\_7874 had on average a lower pest incidence. On the same chromosome at 52 cM the susceptibility QTL qIPA-2.1 was observed where the highest LOD score (12.99) and the highest explained variance (4.49%) were found. The same locus (PGSC0003DMB00000085) was found by Manrique-Carpintero *et al.* [80] using association mapping, identifying a gene related to Leptin type II, a type of hormone related to the steroidal glycoalkaloid synthesis pathway(SGAs). This compound has been found in high concentrations in *Solanum chacoense* Bitter, which is known as a resistance source to the Colorado potato beetle (*Leptinotarsa decemlineata*) [81].

Two QTLs were found on chromosome 7. The first QTL is qIPC-7 at 29 cM with an additive effect on the incidence of -4.49%, and this locus is related to a gene that codes for an auxin response factor Arf19, which functions as a repressor or transcriptional activator of 3-indoleacetic acid [82]. Furthermore, Xu *et al.* [83] have shown that this family of auxin response factors plays an important role in signaling abiotic stress events and plant development in tea plants (*Camellia sinensis* (L.) Kuntze). The second QTL found on chromosome 7 has an additive effect of -1.05 outflow holes. This locus is related to a subunit of the multiprotein proteasome complex RPN1, which has endoprotease activity, and has been found in *Arabidopsis* plants, where the accumulation of RPN1 is positively affected by salicylic acid (SA). This in turn relates to the basal immunity response to various pathogens, but when this subunit mutates, the SA level decreases facilitating the infection of the powdery mildew caused by *Golovinomyces cichoracearum* [84].

The QTLs qIPC-10 and qIPC-10.1 placed at 55.89 Mb and 58.4 Mb identified during 2015 and 2016, respectively, showed a stable QTL region. The genotypes with this allele from the resistant parent has an incidence damage percentage of -6.53% and -8.94%, respectively. The first locus is related to the transcription factor TFIID, which provides the recognition of the

promoter and has a catalytic function for the synthesis of mRNA in eukaryotic organisms [85]. Another gene reported in this region codes for the enzyme glucosyltransferase, which catalyzes the glucose residues transfer for polysaccharide synthesis, and is related to the synthesis route of abscisic acid (ABA). In addition, in mutant *Arabidopsis* plants a relationship of this gene with tolerance to water stress [86] was demonstrated. Likewise, QTL qIPC-10.1 is related to a type of F-box protein, which contributes to resistance to phytopathogenic bacteria; this protein is involved in the regulation of hormones such as ABA, which is the central mediator of signaling responses to different stresses and plant defense by other phytohormones [87].

Similarly, two susceptibility QTLs were found on chromosome 6. The QTL qIPC-6 for field incidence was located at the same position as qOPA-6.1 that was found under storage conditions. This locus is 1.8 Mb from superscaffold PGSC0003DMB000000578 (cytochrome P450 71D7) found by Manrique-Carpintero *et al.* [80], related to putative SGAs genes, specifically  $\alpha$ -solanine and  $\alpha$ -chaconine in the resistance to the Colorado potato beatle (*L. decemlineata*). These genes were found with catalytic characteristics like *GAME7* and *GAME8* genes in tomato, involved in the transformation of cholesterol to tomatidenol in  $\alpha$ -tomatine synthesis [88].

In addition, in the evaluation under storage conditions, two QTL related to susceptibility were found in the same position in a range of 37 to 47 cM of chromosome 12 (qIPA-12 and qIPA-12.1). The qSPA-3 explains 8.63% of the variance and is related to the Argonaute gene AGO1, where its mutant allele is related to susceptibility to the cucurbit mosaic virus (CMV) in *Arabidopsis* [89]. Furthermore, this family of genes are related to the transcriptional silencing pathways of genes through RNA interference (RNAi) in insects, showing death or non-viability in the silkworm *Bombyx mori* via ingestion [90]; however, it has been proposed as an alternative for integrated pest management [91](16). The marker found in qSPA-1 is related to the gene glutaredoxin ATGRXS13 involved in the infection of *Botrytis cinerea* in *Arabidopsis*, regulating jasmonic acid expression [92].

Finally, QTLs qIPA-4 and qSPA-4.1 located at position 58 and 10 cM, respectively, were found on chromosome 4. The QTL qIPA-4 shows an additive effect on resistance of -6.76% incidence, while qSPA-4.1 presents an effect of -8.94% on severity. QTL qSPA-4.1 (c2\_21934, chr04: 4606550) is colocalized with the resistance QTL PCN\_res for *Globodera pallida*, which was reported between markers c1\_16358 (chr04: 3240076) and c2\_21847 (chr04: 5030164), with a LOD score of 16.6 and an explained variance of 29.8% [22,93].

Nonetheless, polygenic resistance to *T. solanivora* involves antibiosis and/or antixenosis mechanisms, reducing the rate of pest growth [94]. This resistance is based on molecule signaling associated with metabolic pathways of basal plant defense as primary metabolites (citric acid, cysteine and aromatic amino acids) and secondary ones such as jasmonic acid, salicylic acid, abscisic acid, ethylene, cytokinins and glycoalkaloids [95–98]. Interestingly, QTLs qIPA2.1, qIPC-6, and qOPA-6.1 reported here are involved on some on these pathways. However, these substances are toxic to humans within a maximum threshold of 200 mg per fresh weight consumed, according to studies with commercial cultivars [99].

Additionally, the attack of *T. solanivora* activates systemic defense mechanisms in the plant, increasing the transcription of the gene Lipoxygenase 3 (*Lox 3*) in leaves. This contributes to the synthesis of signaling molecules associated with plant defense in jasmonic acid and ethylene routes; hydroxycinnamoyl-CoA quinate hydroxycinnamoyl transferase (HQT) and 3-hydroxy-3-methylglutaryl CoA reductase I (HMGR1) genes are involved in the biosynthesis of chlorogenic acid and SGAs, respectively [100,101]. Putative genes involved in these SGAs were found related to QTLs qIPA2.1, qIPC-6, and qOPA-6.1. On the other hand, further phenotyping efforts should be focused on volatile compounds. For instance, 6-methyl-5hepten-2-one (sulcatone) found in tubers has been reported to reduce the attraction to *T. solanivora*, while others such as methyl phenylacetate (MPA) emitted by flowers and in tubers increases the attraction of *T. solanivora* adults [102], allowing an effective oviposition in plant roots [103](18). In addition, the attack of lepidopteran insects such as *Spodoptera exigua* and *Spo-doptera frugiperda* do not have a systemic resistance effect against the attack of *T. solanivora* [101]. Consequently, it is extremely likely that the results in this study are based on genetic effects inherited from the parent that carries the resistance, instead of a systemic resistance acquired by the attack of another insect. However, further studies must be carried out to validate these results and to understand the biochemical and metabolic pathways involved on the genetic response to pest resistance. Additionally, the resistance and susceptibility of the QTLs found in this study will be an important information to look at for function and gene pathway validation using silencing or knock-out approaches such as virus induced gene silencing (VIGS) in resistance QTLs [104], and genome editing using the CRISPR/Cas9 system in susceptible QTLs [105,106].

#### Conclusions

This study used the linkage mapping approach to identify QTLs for resistance to *P. infestans* and *T. solanivora*. QTLs linked to *P. infestans* were identified and mapped, four of them very close to QTLs reported previously; meanwhile fifteen QTLs for *T. solanivora* were identified for the first time. These results are a valuable tool for development of cultivars with partial resistance to *P. infestans* and *T. solanivora*. However, these QTLs are going to be validated in different environments and genetic backgrounds, in order to be routinely used on marker-assisted selection in a potato-breeding program in Colombia.

#### **Supporting information**

**S1 Table.** Phenotypic values of the F1 progeny. (XLSX)

S1 Fig. Weekly and total precipitation ocurred in two crop cycles during 2015 and 2016.(A) Weekly precipitation. (B) Total precipitation.(TIF)

### Acknowledgments

The authors are grateful to the Colombian Germplasm Bank for providing the necessary accessions used in this study from the Colombian Core Collection of Potato (CCCP), as well as to the group of Entomology, Phytopathology and Plant breeding of AGROSAVIA for characterizing the quantitative resistance to Guatemalan moth and Late blight in the CCCP. Many thanks also to Roxana Yockteng and Johana Carolina Soto for their advice and suggestions throughout this study. The authors also want to thank Christine Hackett and Bram Boskamp for allowing us to use the beta version of the TPM Software, and Norma Manrique for her valuable advice in tetraploid mapping. In addition, we wish to thank the editor and reviewers for their accurate and helpful inputs and suggestions. This study was financed by Corporación Colombiana de Investigación Agropecuaria (AGROSAVIA), and Ministerio de Agricultura y Desarrollo Rural (MADR) of Colombia.

### **Author Contributions**

**Conceptualization:** Juan David Santa, Teresa Mosquera, Carlos H. Galeano M. **Formal analysis:** Juan David Santa, Jhon Berdugo-Cely, Carlos H. Galeano M.

Funding acquisition: Liliana Cely-Pardo, Mauricio Soto-Suárez.

Investigation: Juan David Santa, Carlos H. Galeano M.

Methodology: Juan David Santa, Mauricio Soto-Suárez, Carlos H. Galeano M.

Resources: Liliana Cely-Pardo.

Software: Jhon Berdugo-Cely.

Supervision: Teresa Mosquera.

Writing – original draft: Juan David Santa, Carlos H. Galeano M.

Writing – review & editing: Juan David Santa, Jhon Berdugo-Cely, Liliana Cely-Pardo, Mauricio Soto-Suárez, Teresa Mosquera, Carlos H. Galeano M.

#### References

- Mosquera T, Alvarez MF, Jimenez-Gomez JM, Muktar MS, Paulo MJ, Steinemann S, et al. Targeted and untargeted approaches unravel novel candidate genes and diagnostic SNPs for quantitative resistance of the potato (*Solanum tuberosum* L.) to *Phytophthora infestans* causing the late blight disease. PLoS One. 2016; 11(6).
- 2. PNRT, INIAP. Potato/Project FORTIPAPA, 1997. Annual Report. Quito, Ecuador; 1997.
- 3. Fedepapa. Technical Reports. 1998.
- Fry WE, Birch PRJ, Judelson HS, Grünwald NJ, Danies G, Everts KL, et al. Five Reasons to Consider *Phytophthora infestans* a Reemerging Pathogen. Phytopathology [Internet]. 2015; 105(7):966–81. <u>https://doi.org/10.1094/PHYTO-01-15-0005-FI PMID: 25760519</u>
- 5. Ñústez C. Variedades colombianas de papa. Universidad Nacional de Colombia. Bogotá, Colombia: Universidad Nacional de Colombia; 2011.
- 6. Benavides M. Protección sanitaria del cultivo de la papa para programas de manejo integrado de plagas. Papas Colomb. 2000; 2:62–4.
- 7. Data sheets on quarantine pests: Tecia solanivora. Vol. 35, EPPO Bulletin. 2005. p. 399-401.
- Fry WE. *Phytophthora infestans*: New Tools (and Old Ones) Lead to New Understanding and Precision Management. Annu Rev Phytopathol. 2016; 54(1):529–47.
- Spooner DM. Species delimitations in plants: Lessons learned from potato taxonomy by a practicing taxonomist. Vol. 54, Journal of Systematics and Evolution. 2016. p. 191–203.
- Gebhardt C. The historical role of species from the Solanaceae plant family in genetic research. Vol. 129, Theoretical and Applied Genetics. 2016. p. 2281–94. <u>https://doi.org/10.1007/s00122-016-2804-1</u> PMID: 27744490
- Berdugo-Cely J, Valbuena RI, Sánchez-Betancourt E, Barrero LS, Yockteng R. Genetic diversity and association mapping in the colombian central collection of *Solanum tuberosum* L. Andigenum group using SNPs markers. PLoS One. 2017; 12(3).
- Hackett CA, Bradshaw JE, Meyer RC, McNicol JW, Milbourne D, Waugh R. Linkage analysis in tetraploid species: A simulation study. Genet Res. 1998; 71(2):143–54.
- **13.** Luo ZW, Hackett CA, Bradshaw JE, McNicol JW, Milbourne D. Predicting parental genotypes and gene segregation for tetrasomic inheritance. Theor Appl Genet. 2000; 100(7):1067–73.
- Massa AN, Manrique-Carpintero NC, Coombs JJ, Zarka DG, Boone AE, Kirk WW, et al. Genetic Linkage Mapping of Economically Important Traits in Cultivated Tetraploid Potato (*Solanum tuberosum* L.). G3 Genes|Genetics. 2015; 5(11):2357–64. https://doi.org/10.1534/g3.115.019646
  PMID: 26374597
- **15.** Rodríguez LE. Origen Y Evolución De La Papa Cultivada. Una Revisión. Agron Colomb. 2010; 28 (1):9–17.
- Sukhotu T, Hosaka K. Origin and evolution of Andigena potatoes revealed by chloroplast and nuclear DNA markers. Genome. 2006; 49(6):636–47. https://doi.org/10.1139/g06-014 PMID: 16936843
- 17. Ramakrishnan AP, Ritland CE, Blas Sevillano RH, Riseman A. Review of Potato Molecular Markers to Enhance Trait Selection. Am J Potato Res. 2015; 92(4):455–72.
- Jupe F, Pritchard L, Etherington GJ, MacKenzie K, Cock PJA, Wright F, et al. Identification and localization of the NB-LRR gene family within the potato genome. BMC Genomics. 2012; 13(1).

- Tan MYA, Hutten RCB, Visser RGF, van Eck HJ. The effect of pyramiding *Phytophthora infestans* resistance genes RPi-mcd1 and RPi-ber in potato. Theor Appl Genet. 2010; 121(1):117–25. <a href="https://doi.org/10.1007/s00122-010-1295-8">https://doi.org/10.1007/s00122-010-1295-8</a> PMID: 20204320
- 20. Danan S, Veyrieras JB, Lefebvre V. Construction of a potato consensus map and QTL meta-analysis offer new insights into the genetic architecture of late blight resistance and plant maturity traits. BMC Plant Biol. 2011; 11.
- 21. Bradeen J, Kole C. Genetics, genomics and breeding of potato. CRC Press; 2017.
- 22. Hackett CA, McLean K, Bryan GJ. Linkage Analysis and QTL Mapping Using SNP Dosage Data in a Tetraploid Potato Mapping Population. PLoS One. 2013; 8(5).
- Hackett CA, Bradshaw JE, Bryan GJ. QTL mapping in autotetraploids using SNP dosage information. Theor Appl Genet. 2014; 127(9):1885–904. https://doi.org/10.1007/s00122-014-2347-2 PMID: 24981609
- Hamilton JP, Hansey CN, Whitty BR, Stoffel K, Massa AN, Van Deynze A, et al. Single nucleotide polymorphism discovery in elite north American potato germplasm. BMC Genomics. 2011; 12.
- Vos PG, Uitdewilligen JGAML, Voorrips RE, Visser RGF, van Eck HJ. Development and analysis of a 20K SNP array for potato (*Solanum tuberosum*): an insight into the breeding history. Theor Appl Genet. 2015; 128(12):2387–401. <u>https://doi.org/10.1007/s00122-015-2593-y</u> PMID: <u>26263902</u>
- 26. Sharma SK, Bolser D, de Boer J, Sønderkær M, Amoros W, Carboni MF, et al. Construction of Reference Chromosome-Scale Pseudomolecules for Potato: Integrating the Potato Genome with Genetic and Physical Maps. G3;58; Genes|Genomes|Genetics. 2013; 3(11):2031–47. https://doi.org/10.1534/g3.113.007153 PMID: 24062527
- da Silva W, Ingram J, Hackett CA, Coombs JJ, Douches D, Bryan G, et al. Mapping Loci That Control Tuber and Foliar Symptoms Caused by PVY in Autotetraploid Potato (*Solanum tuberosum* L.). G3;58; Genes|Genomes|Genetics. 2017; g3.300264.2017.
- **28.** Schönhals EM, Ding J, Ritter E, Paulo MJ, Cara N, Tacke E, et al. Physical mapping of QTL for tuber yield, starch content and starch yield in tetraploid potato (*Solanum tuberosum* L.) by means of genome wide genotyping by sequencing and the 8.3 K SolCAP SNP array. BMC Genomics. 2017; 18(1).
- 29. Simko I. Comparative analysis of quantitative trait loci for foliage resistance to *Phytophthora infestans* in tuber-bearing Solanum species. Am J Potato Res. 2002; 79(2):125–32.
- Voorrips RE, Gort G, Vosman B. Genotype calling in tetraploid species from bi-allelic marker data using mixture models. BMC Bioinformatics. 2011; 12.
- **31.** Bourke PM, Voorrips RE, Visser RGF, Maliepaard C. The double reduction landscape in tetraploid potato as revealed by a high- density linkage map. Genetics. 2015; 115(181008):181008.
- Preedy KF, Hackett CA. A rapid marker ordering approach for high-density genetic linkage maps in experimental autotetraploid populations using multidimensional scaling. Theor Appl Genet. 2016; 129 (11):2117–32. https://doi.org/10.1007/s00122-016-2761-8 PMID: 27502200
- Hackett C, Boskamp B, Vogogias A, Preedy K, Milne I. TetraploidSNPMap: Software for linkage analysis and QTL mapping in autotetraploid populations using SNP dosage data. J Hered. 2017; 108 (4):438–442.
- 34. Forbes G, Pérez W, Andrade-Piedra J. Procedimiento para evaluación estándar y manejo de datos de clones avanzados de papa. Módulo 3: Evaluación de la resistencia en genotipos de papa a *Phy-tophthora infestans* bajo condiciones de campo. Guía para Colaboradores Internacionales. Lima, Perú; 2014.
- **35.** Bosa CF, Prado AMC, Fukumoto T, Bengtsson M, Witzgall P. Pheromone-mediated communication disruption in Guatemalan potato moth, *Tecia solanivora*. Entomol Exp Appl. 2005; 114(2):137–42.
- 36. Arias R. Manejo integrado de plagas: El caso de la polilla gigante de la papa Tecia solanivora (Povolny) (Lepidoptera: Gelechidae) en Antioquia. In: Seminario Experiencias y Avances en el Manejo de la Polilla Guatemalteca de la Papa Sociedad Colombiana de Entomología Comité Regional Cundinamarca. Bogotá, Colombia; 1997.
- R Development Core Team R. R: A Language and Environment for Statistical Computing [Internet]. Vol. 1, R Foundation for Statistical Computing. 2011. 409 p. Available from: <a href="http://www.r-project.org">http://www.r-project.org</a>
- 38. Müllner D. fastcluster: Fast Hierarchical, Agglomerative. J Stat Softw. 2013; 53(9):1–18.
- **39.** Kosambi DD. The estimation of map distances from recombination values. Ann Eugen. 1943; 12 (1):172–5.
- Voorrips RE. MapChart: Software for the Graphical Presentation of Linkage Maps and QTLs. J Hered. 2002; 93(1):77–8. PMID: 12011185
- 41. Schwarz G. Estimating the Dimension of a Model. Ann Stat. 1978; 6(2):461-4.

- 42. Costanzo S, Christ BJ, Haynes KG. Late blight resistance in a diploid full-sib potato family. Plant Breed. 2004; 123(4):377–81.
- Arora R, Sharma S, Singh B. Late blight disease of potato and its management. Potato J. 2014; 41:16–40.
- 44. Broman K, Sen S. Non-normal phenotypes. In: A Guide to QTL Mapping with R/qtl. New York: Springer New York; 2009. p. 135–51.
- 45. Villanueva D, Saldamando C. *Tecia solanivora*, Povolny (Lepidoptera: Gelechiidae): una revisión sobre su origen, dispersión y estrategias de control biológico. Ing y Cienc. 2013; 9(18).
- Cadena M, Naranjo A, Ñustez C. Evaluating the response of 60 Solanum phureja (Juz. et Buk.) genotypes to attacks by the Guatemalan moth (*Tecia solanivora* Povolny). Agron Colomb. 2005; 23 (1):112–6.
- Ortiz R, Iwanaga M, Raman K V., Palacios M. Breeding for resistance to potato tuber moth, *Phthorimaea operculella* (Zeller), in diploid potatoes. Euphytica. 1990; 50(2):119–25.
- Falconer DS, Mackay TFC, Frankham R, Falconer DS, Mackay TFC, Frankham R. Introduction to quantitative genetics (4th edn). Trends Genet. 1996; 12(7):280.
- Luo ZW, Zhang RM, Kearsey MJ. Theoretical basis for genetic linkage analysis in autotetraploid species. Proc Natl Acad Sci. 2004; 101(18):7040–5. <u>https://doi.org/10.1073/pnas.0304482101</u> PMID: 15100415
- Xu F, Lyu Y, Tong C, Wu W, Zhu X, Yin D, et al. A statistical model for QTL mapping in polysomic autotetraploids underlying double reduction. Brief Bioinform. 2013; 15(6):1044–56. <u>https://doi.org/10.1093/</u> bib/bbt073 PMID: 24177379
- 51. Xu S. Theoretical Basis of the Beavis Effect. Genetics. 2003; 165(4):2259–68. PMID: 14704201
- Vales MI, Schön CC, Capettini F, Chen XM, Corey AE, Mather DE, et al. Effect of population size on the estimation of QTL: A test using resistance to barley stripe rust. Theor Appl Genet. 2005; 111 (7):1260–70. https://doi.org/10.1007/s00122-005-0043-y PMID: 16179997
- Gebhardt C, Valkonen JPT. Organization of Genes Controlling Disease Resistance in the Potato Genome. Annu Rev Phytopathol. 2001; 39:79–102. <u>https://doi.org/10.1146/annurev.phyto.39.1.79</u> PMID: <u>11701860</u>
- Brouwer DJ, Jones ES, St Clair D a. QTL analysis of quantitative resistance to *Phytophthora infestans* (late blight) in tomato and comparisons with potato. Genome. 2004; 47(3):475–92. https://doi.org/10. 1139/g04-001 PMID: 15190365
- 55. Gupta SK, Rai AK, Kanwar SS, Sharma TR. Comparative analysis of zinc finger proteins involved in plant disease resistance. PLoS One. 2012; 7(8).
- Chen LQ, Hou BH, Lalonde S, Takanaga H, Hartung ML, Qu XQ, et al. Sugar transporters for intercellular exchange and nutrition of pathogens. Nature. 2010; 468(7323):527–32. <u>https://doi.org/10.1038/</u> nature09606 PMID: 21107422
- Leonards-Schippers C, Gieffers W, Schafer-Pregl R, Ritter E, Knapp SJ, Salamini F, et al. Quantitative resistance to *Phytophthora infestans* in potato: A case study for QTL mapping in an allogamous plant species. Genetics. 1994; 137(1):67–77. PMID: 7914505
- Collins A, Milbourne D, Ramsay L, Meyer R, Chatot-Balandras C, Oberhagemann P, et al. QTL for field resistance to late blight in potato are strongly correlated with maturity and vigour. Mol Breed. 1999; 5(5):387–98.
- Oberhagemann P, Chatot-Balandras C, Schäfer-Pregl R, Wegener D, Palomino C, Salamini F, et al. A genetic analysis of quantitative resistance to late blight in potato: Towards marker-assisted selection. Mol Breed. 1999; 5(5):399–415.
- Bormann CA, Rickert AM, Ruiz RAC, Paal J, Lübeck J, Strahwald J, et al. Tagging quantitative trait loci for maturity-corrected late blight resistance in tetraploid potato with PCR-based candidate gene markers. Mol Plant Microbe Interact. 2004; 17(10):1126–38. <u>https://doi.org/10.1094/MPMI.2004.17</u>. 10.1126 PMID: 15497405
- Śliwka J, Jakuczun H, Lebecka R, Marczewski W, Gebhardt C, Zimnoch-Guzowska E. Tagging QTLs for late blight resistance and plant maturity from diploid wild relatives in a cultivated potato (*Solanum tuberosum*) background. Theor Appl Genet. 2007; 115(1):101–12. https://doi.org/10.1007/s00122-007-0546-9 PMID: 17468842
- 62. Kretzschmar T, Burla B, Lee Y, Martinoia E, Nagy R. Functions of ABC transporters in plants. Essays Biochem. 2011; 50:145–60. https://doi.org/10.1042/bse0500145 PMID: 21967056
- Hwang JU, Song WY, Hong D, Ko D, Yamaoka Y, Jang S, et al. Plant ABC Transporters Enable Many Unique Aspects of a Terrestrial Plant's Lifestyle. Mol Plant. 2016; 9(3):338–55. https://doi.org/10. 1016/j.molp.2016.02.003 PMID: 26902186

- 64. Bienert MD, Siegmund SEG, Drozak A, Trombik T, Bultreys A, Baldwin IT, et al. A pleiotropic drug resistance transporter in *Nicotiana tabacum* is involved in defense against the herbivore *Manduca sexta*. Plant J. 2012; 72(5):745–57. https://doi.org/10.1111/j.1365-313X.2012.05108.x PMID: 22804955
- 65. Ballvora A, Ercolano MR, Weiß J, Meksem K, Bormann CA, Oberhagemann P, et al. The R1 gene for potato resistance to late blight (*Phytophthora infestans*) belongs to the leucine zipper/NBS/LRR class of plant resistance genes. Plant J. 2002; 30(3):361–71. PMID: 12000683
- 66. Visker MHPW Keizer LCP, Van Eck HJ, Jacobsen E, Colon LT, Struik PC. Can the QTL for late blight resistance on potato chromosome 5 be attributed to foliage maturity type?. Theor Appl Genet. 2003; 106(2):317–25. https://doi.org/10.1007/s00122-002-1021-2 PMID: 12582858
- Kloosterman B, Abelenda JA, Gomez MDMC, Oortwijn M, De Boer JM, Kowitwanich K, et al. Naturally occurring allele diversity allows potato cultivation in northern latitudes. Nature. 2013; 495(7440):246– 50. https://doi.org/10.1038/nature11912 PMID: 23467094
- DeYoung BJ, Clark SE. Signaling through the CLAVATA1 receptor complex. Vol. 46, Plant Molecular Biology. 2001. p. 505–13. PMID: <u>11516143</u>
- Goff KE, Ramonell KM. The role and regulation of receptor-like kinases in plant defense. Gene Regul Syst Biol. 2007; 1: 167–75.
- Afzal AJ, Wood AJ, Lightfoot DA. Plant Receptor-Like Serine Threonine Kinases: Roles in Signaling and Plant Defense. Mol Plant-Microbe Interact. 2008; 21(5):507–17. https://doi.org/10.1094/MPMI-21-5-0507 PMID: 18393610
- Lim PO, Lee IC, Kim J, Kim HJ, Ryu JS, Woo HR, et al. Auxin response factor 2 (ARF2) plays a major role in regulating auxin-mediated leaf longevity. J Exp Bot. 2010; 61(5):1419–30. https://doi.org/10. 1093/jxb/erg010 PMID: 20164142
- 72. Vert G, Walcher CL, Chory J, Nemhauser JL. Integration of auxin and brassinosteroid pathways by Auxin Response Factor 2. Proc Natl Acad Sci. 2008; 105(28):9829–34. https://doi.org/10.1073/pnas. 0803996105 PMID: 18599455
- 73. Richter R, Behringer C, Zourelidou M, Schwechheimer C. Convergence of auxin and gibberellin signaling on the regulation of the GATA transcription factors GNC and GNL in *Arabidopsis thaliana*. Proc Natl Acad Sci U S A. 2013; 110(32):13192–7. <u>https://doi.org/10.1073/pnas.1304250110</u> PMID: 23878229
- 74. Chen W, Kastner C, Nowara D, Oliveira-Garcia E, Rutten T, Zhao Y, et al. Host-induced silencing of *Fusarium culmorum* genes protects wheat from infection. J Exp Bot. 2016; 67(17):4979–91. https:// doi.org/10.1093/jxb/erw263 PMID: 27540093
- Llorente F, Muskett P, Sánchez-Vallet A, López G, Ramos B, Sánchez-Rodríguez C, et al. Repression of the auxin response pathway increases Arabidopsis susceptibility to necrotrophic fungi. Mol Plant. 2008; 1(3):496–509. https://doi.org/10.1093/mp/ssn025 PMID: 19825556
- 76. Fu J, Liu H, Li Y, Yu H, Li X, Xiao J, et al. Manipulating Broad-Spectrum Disease Resistance by Suppressing Pathogen-Induced Auxin Accumulation in Rice. PLANT Physiol. 2011; 155(1):589–602. https://doi.org/10.1104/pp.110.163774 PMID: 21071600
- Cui F, Wu S, Sun W, Coaker G, Kunkel B, He P, et al. The Pseudomonas syringae Type III Effector AvrRpt2 Promotes Pathogen Virulence via Stimulating Arabidopsis Auxin/Indole Acetic Acid Protein Turnover. PLANT Physiol. 2013; 162(2):1018–29. <u>https://doi.org/10.1104/pp.113.219659</u> PMID: 23632856
- 78. Quattrocchio F, Verweij W, Kroon A, Spelt C, Mol J, Koes R. PH4 of Petunia is an R2R3 MYB protein that activates vacuolar acidification through interactions with basic-helix-loop-helix transcription factors of the anthocyanin pathway. Plant Cell. 2006; 18(5):1274–91. <u>https://doi.org/10.1105/tpc.105.034041</u> PMID: 16603655
- Birhman RK, Singh BP. Path-coefficient analyses and genetic parameters of the components of field resistance of potatoes to late blight. Ann Appl Biol. 1995; 127(2):353–62.
- Manrique-Carpintero NC, Tokuhisa JG, Ginzberg I, Veilleux RE. Allelic variation in genes contributing to glycoalkaloid biosynthesis in a diploid interspecific population of potato. Theor Appl Genet. 2014; 127(2):391–405. https://doi.org/10.1007/s00122-013-2226-2 PMID: 24190104
- Sinden SL, Sanford LL, Osman SF. Glycoalkaloids and resistance to the Colorado potato beetle in Solanum chacoense Bitter. Am Potato J. 1980; 57(7):331–43.
- Okushima Y, Overvoorde PJ, Arima K, Alonso JM, Chan A, Chang C, et al. Functional Genomic Analysis of the AUXIN RESPONSE FACTOR Gene Family Members in Arabidopsis thaliana: Unique and Overlapping Functions of ARF7 and ARF19. Plant Cell. 2005; 17(2):444–63. <a href="https://doi.org/10.1105/tpc.104.028316">https://doi.org/10.1105/tpc.104.028316</a> PMID: 15659631

- Xu Y-X, Mao J, Chen W, Qian T-T, Liu S-C, Hao W-J, et al. Identification and expression profiling of the auxin response factors (ARFs) in the tea plant (*Camellia sinensis* (L.) O. Kuntze) under various abiotic stresses. Plant Physiol Biochem PPB / Société Fr Physiol végétale. 2016; 98: 46–56.
- Yao C, Wu Y, Nie H, Tang D. RPN1a, a 26S proteasome subunit, is required for innate immunity in Arabidopsis. Plant J. 2012; 71(6):1015–28. https://doi.org/10.1111/j.1365-313X.2012.05048.x PMID: 22577987
- Pan S, Czarnecka-Verner E, Gurley WB. Role of the TATA binding protein-transcription factor IIB interaction in supporting basal and activated transcription in plant cells. Plant Cell. 2000; 12(1):125– 36. PMID: 10634912
- Liu Z, Yan J-P, Li D-K, Luo Q, Yan Q, Liu Z-B, et al. UDP-Glucosyltransferase71C5, a Major Glucosyltransferase, Mediates Abscisic Acid Homeostasis in Arabidopsis. Plant Physiol. 2015; 167(4):1659– 70. https://doi.org/10.1104/pp.15.00053 PMID: 25713337
- Piisilä M, Keceli MA, Brader G, Jakobson L, Jöesaar I, Sipari N, et al. The F-box protein MAX2 contributes to resistance to bacterial phytopathogens in *Arabidopsis thaliana*. BMC Plant Biol. 2015;15(1). https://doi.org/10.1186/s12870-014-0394-0
- Itkin M, Heinig U, Tzfadia O, Bhide AJ, Shinde B, Cardenas PD, et al. Biosynthesis of antinutritional alkaloids in solanaceous crops is mediated by clustered genes. Science (80). 2013; 341(6142):175–9. https://doi.org/10.1126/science.1240230 PMID: 23788733
- Morel J-B, Godon C, Mourrain P, Béclin C, Boutet S, Feuerbach F, et al. Fertile hypomorphic ARGO-NAUTE (ago1) mutants impaired in post-transcriptional gene silencing and virus resistance. Plant Cell. 2002; 14(3):629–39. https://doi.org/10.1105/tpc.010358 PMID: 11910010
- Kolliopoulou A, Swevers L. Recent progress in RNAi research in Lepidoptera: Intracellular machinery, antiviral immune response and prospects for insect pest control. Curr Opin Insect Sci. 2014; 6:28–34.
- Rodríguez T, Figueira A. Management of insect pest by RNAi—A new tool for crop protection. In: Biochemistry, Genetics and Molecular Biology "RNA Interference." 2016.
- 92. La Camera S, L'Haridon F, Astier J, Zander M, Abou-Mansour E, Page G, et al. The glutaredoxin ATGRXS13 is required to facilitate *Botrytis cinerea* infection of Arabidopsis thaliana plants. Plant J. 2011; 68(3):507–19. https://doi.org/10.1111/j.1365-313X.2011.04706.x PMID: 21756272
- Bryan G J., McLean K, Pande B, Purvis A, Hackett C A., Bradshaw J E., et al. Genetical dissection of H3-mediated polygenic PCN resistance in a heterozygous autotetraploid potato population. Mol Breed. 2004; 14(2):105–16.
- Torres F. Biología y manejo integrado de la polilla centroamericana de la papa *Tecia solanivora* (Polvoný) en Venezuela. Convenio FONAIAP-UNET. 1998.
- **95.** Fowden M, Jennings P. Mejoramiento de plantas resistentes a insectos. Mexico D.F: Editorial Limusa; 1984.
- Poveda K, Gómez Jiménez MI, Halitschke R, Kessler A. Overcompensating plants: Their expression of resistance traits and effects on herbivore preference and performance. Entomol Exp Appl. 2012; 143(3):245–53.
- 97. Erb M, Flors V, Karlen D, De Lange E, Planchamp C, D'Alessandro M, et al. Signal signature of aboveground-induced resistance upon belowground herbivory in maize. Plant J. 2009; 59(2):292–302. https://doi.org/10.1111/j.1365-313X.2009.03868.x PMID: 19392694
- **98.** Strauss SY, Watson W, Allen MT. Predictors of male and female tolerance to insect herbivory in *Raphanus raphanistrum*. Ecology. 2003; 84(8):2074–82.
- 99. Valkonen JPT, Keskitalo M, Vasara T, Pietilä L. Potato glycoalkaloids: A burden or a blessing? CRC Crit Rev Plant Sci. 1996; 15(1):1–20.
- Yogendra KN, Pushpa D, Mosa KA, Kushalappa AC, Murphy A, Mosquera T. Quantitative resistance in potato leaves to late blight associated with induced hydroxycinnamic acid amides. Funct Integr Genomics. 2014; 14(2):285–98. https://doi.org/10.1007/s10142-013-0358-8 PMID: 24408130
- 101. Kumar P, Ortiz EV, Garrido E, Poveda K, Jander G. Potato tuber herbivory increases resistance to aboveground lepidopteran herbivores. Oecologia. 2016; 182(1):177–87. <u>https://doi.org/10.1007/</u> s00442-016-3633-2 PMID: 27147449
- Bosa CF, Clavijo A, Karlsson MF, Cotes AM, Witzgall P. Respuesta de *Tecia solanivora* (Lepidoptera: Gelechiidae) a compuestos volátiles de papa, Solanum tuberosum. Rev Colomb Entomol. 2011; 37 (1):1–7.
- 103. Karlsson MF, Proffit M, Birgersson G. Host-plant location by the Guatemalan potato moth *Tecia solani-vora* is assisted by floral volatiles. Chemoecology. 2017; 27(5):187–98. <u>https://doi.org/10.1007/s00049-017-0244-2</u> PMID: 28943720

- 104. Brigneti G, Martín-Hernández AM, Jin H, Chen J, Baulcombe DC, Baker B, et al. Virus-induced gene silencing in Solanum species. Plant J. 2004; 39(2):264–72. https://doi.org/10.1111/j.1365-313X.2004. 02122.x PMID: 15225290
- **105.** Butler NM, Atkins PA, Voytas DF, Douches DS. Generation and inheritance of targeted mutations in potato (*Solanum tuberosum* L.) Using the CRISPR/Cas System. PLoS One. 2015; 10(12).
- 106. Wang S, Zhang S, Wang W, Xiong X, Meng F, Cui X. Efficient targeted mutagenesis in potato by the CRISPR/Cas9 system. Plant Cell Reports. 2015; 34(9):1473–6. https://doi.org/10.1007/s00299-015-1816-7 PMID: 26082432