

Article

Diverse Components of Resistance to *Fusarium verticillioides* Infection and Fumonisin Contamination in Four Maize Recombinant Inbred Families



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Received: 29 November 2018; Accepted: 22 January 2019; Published: 1 February 2019



Abstract: The fungus Fusarium verticillioides can infect maize ears, causing Fusarium ear rot (FER) and contaminating the grain with fumonisins (FUM), which are harmful to humans and animals. Breeding for resistance to FER and FUM and post-harvest sorting of grain are two strategies for reducing FUM in the food system. Kernel and cob tissues have been previously associated with differential FER and FUM. Four recombinant inbred line families from the maize nested associated mapping population were grown and inoculated with F. verticillioides across four environments, and we evaluated the kernels for external and internal infection severity as well as FUM contamination. We also employed publicly available phenotypes on innate ear morphology to explore genetic relationships between ear architecture and resistance to FER and FUM. The four families revealed wide variation in external symptomatology at the phenotypic level. Kernel bulk density under inoculation was an accurate indicator of FUM levels. Genotypes with lower kernel density-under both inoculated and uninoculated conditions-and larger cobs were more susceptible to infection and FUM contamination. Quantitative trait locus (QTL) intervals could be classified as putatively resistance-specific and putatively shared for ear and resistance traits. Both types of QTL mapped in this study had substantial overlap with previously reported loci for resistance to FER and FUM. Ear morphology may be a component of resistance to F. verticillioides infection and FUM accumulation.

Keywords: maize; mycotoxins; fumonisin; disease resistance; morphology

Key Contribution: To our knowledge, this is the first study to document the colocalization of genetic loci underlying ear morphology and resistance to *F. verticillioides* infection and fumonisin contamination. We also demonstrate the value of kernel bulk density as a low-cost proxy for fumonisin levels in maize grain.

1. Introduction

In maize (*Zea mays* L), the fungus *Fusarium verticillioides* causes Fusarium ear rot (FER) and contaminates grain with fumonisins (FUM), a family of mycotoxins produced by *Fusarium* spp. [1]. FER and FUM contamination can reduce yields and grain marketability [2]. FUM exposure has also been linked to adverse health outcomes in humans and domesticated animals [3–8]. The combination of the role of maize as a staple crop, conducive environmental conditions for *F. verticillioides* infection (FVI), and limited regulation of mycotoxins in food systems has led to high FUM exposure in the developing world [4–6,9–11].

Pre- and post-harvest management can reduce FUM levels in food systems. Agronomic practices, such as crop residue removal and soil nutrient management, have been associated with reduced risk of FUM contamination in maize [12,13]. Breeding for resistance to FVI and FUM contamination in maize varieties is a more long-term pre-harvest approach [14]. Post-harvest strategies include visual and optical grain sorting [15,16] and thermochemical treatments [17,18].

Genetic resistance to FER and FUM contamination in maize is moderately to highly heritable and quantitatively controlled, making breeding for durable resistance feasible [19–22]. Both morphological and biochemical characteristics have been shown to contribute genetic resistance. Biochemical signatures associated with differential FVI and FUM levels include lipid profiles [23] and biosynthesis of oxylipins and plant hormones, such as ethylene, abscisic acid, salicylic acid, and jasmonic acid [24,25]. The phenylpropanoid pathway, which is involved in lignin biosynthesis, has also been implicated in resistance to FVI and FUM contamination, although it is unknown whether phenylpropanoids play a passive role in resistance via pericarp hardening or whether they have an active inhibitory effect on *F. verticillioides* [24,26,27].

Cob and kernel morphological traits have been linked to differential FVI severity and FUM contamination. FVI and FUM levels have been negatively associated with kernel traits related to density and hardness [26,28–33], and kernel bulk density (also known as test weight) under *F. verticillioides* inoculation has been shown to be genetically correlated with FER and FUM [33,34]. Resistance to FUM contamination could therefore hypothetically be accomplished via indirect selection for increased kernel bulk density [35]. Cob morphology, an important component of yield [36], has also been shown to be genetically correlated with FER and FUM [33,37–39], suggesting that qualitative measures of kernel symptom severity are important components of resistance.

Understanding the variation in and the role of the maize host genetics in symptomatology of kernels under *F. verticillioides* inoculation could potentially reveal diverse modes of pathogenesis and/or host resistance. The maize nested association mapping (NAM) population, composed of 25 recombinant inbred line (RIL) families derived from 25 diverse inbred lines crossed to one recurrent inbred parent (B73), is a powerful tool for dissecting the genetic architecture of quantitatively inherited traits [40]. Here we employed quantitative, qualitative, external, and internal indicators of FVI severity as well as publicly available data on ear architecture phenotypes [41,42] to dissect the genetic mechanisms underlying FVI-specific and ear-mediated resistance to FVI and FUM accumulation in four NAM RIL families.

2. Results

2.1. Symptomatology Varies among Families

Four NAM RIL families (B73 \times CML333, B73 \times CML52, B73 \times CML69, and B73 \times NC358) were grown in an augmented incomplete block design across four environments. We inoculated the ears with toothpicks coated in *F. verticillioides* spores, a method that has previously been shown to reveal cob and kernel resistance mechanisms [33]. We evaluated the inoculated ears for external and internal indicators of disease severity. External phenotypes included FER (proportion of visibly infected kernels) and a symptom typology to account for qualitative variation in FER. Internal measures were grain FUM concentration, grain toxin load per visibly infected area (FUM:FER), and kernel bulk density (BDEN_{inoc}). As demonstrated by ANOVA, all four quantitative FVI indicators (FER, FUM, FUM:FER, BDEN_{inoc}) differed significantly among families (Table 1). On average, families that had higher BDEN_{inoc} tended to have lower FER, FUM and FUM:FER (Table 1). The B73 × CML333 family was unique in that it had high FER scores but had the least severe internal disease severity (highest BDEN_{inoc} and low FUM and FUM:FER) (Table 1).

The composition of symptom types significantly differed among families, as determined by a χ^2 test comparing the proportions of plots exhibiting asymptomatic, blush, starburst, purple, moldy, or multiple symptom types across three environments among the four RIL families ($\chi^2 = 265$, p < 0.0001). Across families, the majority of plots (57% to 75%) exhibited the starburst or purple symptom types (Figure 1). The B73 × CML333 family had the greatest proportion of plots exhibiting the blush type (22%) (Figure 1). The B73 × CML52 family had the largest proportion of asymptomatic (20%) and starburst (44%) plots (Figure 1). The proportion of purple plots was greatest in the B73 × CML69 (35%) and B73 × NC358 (40%) families (Figure 1). Approximately 9% of plots exhibited multiple symptoms in all families (Figure 1).

Table 1. Comparison of kernel bulk density (BDEN_{inoc}), Fusarium ear rot (FER), fumonisin concentration (FUM), and the ratio of FUM to FER (FUM:FER) under *Fusarium verticillioides* inoculation among four nested association mapping (NAM) recombinant inbred line (RIL) families and among the five parental inbred lines. Analyses included (1) ANOVA for BDEN_{inoc}, FER, FUM, and FUM:FER vs. family or parent, and (2) pairwise *t*-tests comparing BDEN_{inoc}, FER, FUM, and FUM:FER between families or parents. FER was evaluated across four environments, FUM and FUM:FER across three environments, and BDEN_{inoc} across two environments.

Family	RILs (N/env)	BDEN _{inoc} *** (g mL ⁻¹)	FER *** (%)	FUM *** (ppm)	FUM:FER *** (ppm % ⁻¹)
$B73 \times CML333$	186	$0.737\pm0.003~\mathrm{A}$	$43.04\pm1.27~\mathrm{A}$	$24.24\pm5.32~\mathrm{B}$	$0.51\pm0.10\mathrm{C}$
$B73 \times CML52$	177	$0.720\pm0.004~\mathrm{B}$	$34.41\pm1.05~\mathrm{B}$	$11.77\pm2.39~\mathrm{B}$	$0.60\pm0.08~\mathrm{B}$
$B73 \times CML69$	186	$0.712\pm0.003~\mathrm{B}$	$40.04\pm1.23~\mathrm{A}$	$31.28\pm5.05~\mathrm{A}$	$1.00\pm0.13~\text{AB}$
$B73 \times NC358$	179	$0.683\pm0.004C$	$43.27\pm1.20~\mathrm{A}$	$32.62\pm4.21~\mathrm{A}$	$1.19\pm0.23~\mathrm{A}$
Parent	Plots (N/env)	BDEN _{inoc} *** (g mL ⁻¹)	FER *** (%)	FUM *** (ppm)	FUM:FER (ppm % ⁻¹)
B73	39	$0.650 \pm 0.005 \mathrm{C}$	$47.83\pm2.26~\mathrm{A}$	$72.93\pm14.41~\mathrm{A}$	$2.36\pm0.64~\mathrm{A}$
CML333	11	$0.770\pm0.008~\mathrm{A}$	$26.65\pm3.37~\mathrm{B}$	$7.09\pm2.82~\mathrm{B}$	$0.47\pm0.18~\mathrm{B}$
CML52	11	$0.714\pm0.020~\mathrm{B}$	$13.39\pm3.17~\mathrm{C}$	$3.18\pm0.78~\mathrm{B}$	$0.76\pm0.26~\mathrm{AB}$
CML69	11	$0.745\pm0.004~\text{AB}$	$25.42\pm5.89~\mathrm{B}$	$6.69\pm2.08~\mathrm{B}$	$0.48\pm0.20~\mathrm{AB}$
NC358	11	$0.766 \pm 0.007 \; \mathrm{A}$	$26.18\pm3.67~\mathrm{B}$	$16.14\pm7.36~\mathrm{B}$	$0.63\pm0.25~\mathrm{AB}$

N/env denotes the number of RILs evaluated in each family per environment or the number of plots for each parental line per environment. Raw means and standard errors (SE) are reported, but ANOVA and pairwise *t*-tests were conducted on Box-Cox transformed data. Groups not connected by the same letter within each column are significantly different (pairwise two-tailed *t*-tests, p < 0.05). *** p < 0.0001 for ANOVA of trait in column header vs. family.



Figure 1. Proportions of plots exhibiting distinct symptom types in four RIL families across three environments.

2.2. Relationships among External Symptomatology, Kernel Bulk Density, and Toxin Load Vary among Families

BDEN_{inoc} differed significantly among symptom types in all analyses (ANOVA, p < 0.0001) (Table 2). Pairwise *t*-tests demonstrated that greater external symptom severity was associated with more greatly reduced BDEN_{inoc} in all families (Table 2). Specifically, asymptomatic plots had the highest BDEN_{inoc}, followed by blush, starburst, purple, and moldy plots in descending order (Table 2).

Table 2. Comparison of BDEN_{inoc}, FER, FUM, and the ratio of FUM to FER (FUM:FER) under *F. verticillioides* inoculation among plots exhibiting distinct symptom types. Combined and family-specific analyses included (1) ANOVA for BDEN_{inoc}, FER, FUM, and FUM:FER vs. symptom type, and (2) pairwise *t*-tests comparing BDEN_{inoc}, FER, FUM, and FUM:FER between symptom types.

Family	Symptom Type	BDEN _{inoc} (g mL ⁻¹)	FER (%)	FUM (ppm)	FUM:FER (ppm % ⁻¹)
Combined	Asym.	$0.693 \pm 0.003 \text{ A}$	$19.58\pm0.44~\mathrm{E}$	$10.79\pm1.69~\mathrm{A}$	$0.96\pm0.009~\mathrm{A}$
	Blush	$0.682\pm0.005~\mathrm{A}$	$56.59\pm1.88\mathrm{C}$	$15.51\pm6.64~\mathrm{C}$	$0.73\pm0.017~\mathrm{C}$
	Starburst	$0.656 \pm 0.003 \; \rm B$	$65.54\pm0.75~\mathrm{B}$	$18.40\pm1.90~\mathrm{B}$	$0.75\pm0.008~\mathrm{C}$
	Purple	$0.641\pm0.003~\mathrm{C}$	$50.51\pm0.82\mathrm{D}$	$38.39\pm4.75~\text{BC}$	$0.78\pm0.009~\mathrm{B}$
	Moldy	$0.576 \pm 0.013 ~\rm{D}$	$76.14\pm2.64~\mathrm{A}$	$97.66\pm38.54~\mathrm{A}$	$0.79\pm0.038~\text{BC}$
	ANOVA p	< 0.0001 ***	< 0.0001 ***	0.0002 **	< 0.0001 ***
B73 ×	Asym.	$0.713\pm0.007~\mathrm{A}$	$19.73\pm1.36~\mathrm{C}$	$4.58\pm0.92~\text{AB}$	$0.91\pm0.02~\mathrm{A}$
CML333	Blush	$0.691\pm0.005~\mathrm{B}$	$58.68\pm2.20~\mathrm{B}$	$14.35\pm5.01~\text{AB}$	$0.74\pm0.02~\mathrm{B}$
	Starburst	$0.685\pm0.006~\mathrm{B}$	$70.49\pm1.49~\mathrm{A}$	$13.80\pm3.12~\mathrm{A}$	$0.73\pm0.02~\mathrm{B}$
	Purple	$0.658 \pm 0.006 \text{ C}$	$54.04\pm1.79~\mathrm{B}$	$31.19\pm10.31~\mathrm{B}$	$0.71\pm0.02~\mathrm{B}$
	Moldy	$0.601 \pm 0.021 \text{ D}$	$77.95 \pm 3.77 \text{ A}$	$85.22\pm53.51~\mathrm{AB}$	$0.73\pm0.07~\mathrm{B}$
	ANOVA p	< 0.0001 ***	< 0.0001 ***	0.0427*	0.0001 **
B73 ×	Asym.	$0.688\pm0.005~\mathrm{A}$	$18.09\pm0.68~\text{D}$	$6.17\pm0.70~\mathrm{A}$	$0.94\pm0.01~\mathrm{A}$
CML52	Blush	$0.606\pm0.020~\mathrm{B}$	$46.78\pm7.61~\text{BC}$	$8.75\pm8.17~\mathrm{AB}$	$0.70\pm0.07~\mathrm{BC}$
	Starburst	$0.660\pm0.004~\mathrm{B}$	$59.81 \pm 1.32~\mathrm{B}$	$10.46\pm2.16~\text{AB}$	$0.74\pm0.01~\mathrm{C}$
	Purple	$0.655\pm0.008~\mathrm{B}$	$41.05\pm1.57~\mathrm{C}$	$21.21\pm7.81~\mathrm{B}$	$0.78\pm0.02~\mathrm{B}$
	Moldy	$0.503\pm0.039~\mathrm{C}$	$84.19\pm5.38~\mathrm{A}$	$32.09\pm24.56~\text{AB}$	$0.66\pm0.08~\text{BC}$
	ANOVA p	< 0.0001 ***	< 0.0001 ***	0.113	< 0.0001***
B73 \times	Asym.	$0.693\pm0.004~\mathrm{A}$	$21.47\pm0.79~\mathrm{C}$	$14.70\pm4.11~\mathrm{AB}$	$0.99\pm0.01~\mathrm{A}$
CML69	Blush	$0.659\pm0.016~\mathrm{AB}$	$46.36\pm6.61~\mathrm{B}$	$39.96\pm25.15~\text{BC}$	$0.78\pm0.07~\mathrm{BC}$
	Starburst	$0.657\pm0.005~\mathrm{B}$	$67.74\pm1.40~\mathrm{A}$	$21.59\pm4.09~\mathrm{C}$	$0.75\pm0.02\mathrm{C}$
	Purple	$0.644\pm0.006~\mathrm{B}$	$54.22\pm1.63~\mathrm{B}$	$42.20\pm8.61~\mathrm{C}$	$0.78\pm0.02~\mathrm{BC}$
	Moldy	$0.588 \pm 0.021 \text{ C}$	$72.49\pm5.74~\mathrm{A}$	$179.86 \pm 116.91 ~\rm A$	$0.88\pm0.07~\mathrm{AB}$
	ANOVA <i>p</i>	<0.0001 ***	< 0.0001 ***	0.015*	<0.0001 ***
B73 \times	Asym.	$0.692\pm0.006~A$	$20.88\pm0.85~\text{D}$	$21.91\pm7.24~\text{A}$	$0.97\pm0.02~\mathrm{A}$
NC358	Blush	$0.654\pm0.016~\text{AB}$	$56.06\pm4.60~\text{BC}$	$4.93\pm1.84~\mathrm{B}$	$0.67\pm0.05~\mathrm{D}$
	Starburst	$0.617\pm0.006~\mathrm{B}$	$66.45\pm1.68~\mathrm{A}$	$29.82\pm5.56~\mathrm{A}$	$0.77\pm0.02~\text{CD}$
	Purple	$0.623\pm0.006~\mathrm{B}$	$51.19\pm1.40\mathrm{C}$	$53.31\pm10.22~\mathrm{A}$	$0.82\pm0.02~\mathrm{B}$
	Moldy	$0.562 \pm 0.029 \text{ C}$	$68.74\pm7.55~\mathrm{AB}$	$60.22\pm31.84~\mathrm{A}$	$0.89\pm0.08~\text{ABC}$
	ANOVA p	< 0.0001 ***	< 0.0001 ***	0.0502	<0.0001 ***

ANOVA and pairwise *t*-tests were conducted on Box-Cox transformed data. Box-Cox-transformed means and standard errors (\pm) are reported. Groups not connected by the same letter within each column/family are significantly different (pairwise two-tailed *t*-tests, *p* < 0.05). ANOVA significance is denoted as * 0.05 > *p* ≥ 0.01; ** 0.01 > *p* ≥ 0.0001; *** *p* < 0.0001.

FER and FUM:FER differed significantly among symptom types in all analyses, but pairwise differences between symptom types varied by family (Table 2). Similarly, symptom types differed significantly with respect to FUM in the combined-family, B73 \times CML333, and B73 \times CML69 analyses, but symptom severity was not clearly linked to FUM contamination (Table 2). Unexpectedly, asymptomatic plots had the highest or second-highest FUM contamination across all families (Table 2). This phenomenon may be the result of the symptom type scoring method, which was conducted with the kernels still attached to the cob and thus kernels may have had symptoms present below the visible area.

2.3. Fusarium Ear Rot Severity, Fumonisin Contamination, and Kernel Bulk Density are Correlated

We assessed correlations among indicators of FVI severity and FUM contamination at the levels of plot phenotype and genotype means (after controlling for genetic and field effects). Across all families, FUM and FER were (1) positively phenotypically and/or genotype-means correlated with each other and (2) negatively phenotypically and genotype-means correlated with BDEN_{inoc} (Table 3). These correlations are consistent with those previously reported [33,35,43,44]. FUM tended to be more strongly correlated with BDEN_{inoc} than with FER across families (Table 3), suggesting that internal infection severity (as reflected by BDEN_{inoc}) may be a better indicator of FUM contamination that external symptom severity (FER).

Table 3. Phenotypic and genotype-mean correlations among $\text{BDEN}_{\text{inoc}}$, FER, FUM, and the ratio	of
FUM to FER (FUM:FER) under F. verticillioides inoculation within four NAM RIL families. Phenotyp	oic
correlations (rp) among plot-level phenotypes are in the upper diagonals. Correlations amon	ng
genotype-means (r_G) after controlling for genetic and field effects are in the lower diagonals.	

B73 × CML333 Family							
r _P /r _G	BDEN inoc	FER	FUM	FUM:FER			
BDENinoc		-0.46 ***	-0.25 ***	-0.15 *			
FER	-0.53 ***		0.17 **	-0.18 **			
FUM	-0.31 **	0.28 ***		0.94 ***			
FUM:FER	0.02	-0.33 ***	0.80 ***				
	В	73 imes CML52 famil	ly				
r _P /r _G	BDEN inoc	FER	FUM	FUM:FER			
BDEN inoc		-0.47 ***	-0.12 *	0.12 *			
FER	-0.48 ***		0.08 ^{ms}	-0.36 ***			
FUM	-0.18 *	0.20 *		0.90 ***			
FUM:FER	0.15 *	-0.46 ***	0.75 ***				
B73 × CML69 family							
r _P /r _G	BDEN _{inoc}	FER	FUM	FUM:FER			
BDEN inoc		-0.55 ***	-0.30 ***	0.02			
FER	-0.53 ***		-0.01	-0.33 ***			
FUM	-0.27 **	0.21 **		0.95 ***			
FUM:FER	0.06	-0.39 ***	0.81 ***				
B73 × NC358 family							
r _P /r _G	BDEN _{inoc}	FER	FUM	FUM:FER			
BDENinoc		-0.59 ***	-0.19 **	0.11 ^{ms}			
FER	-0.58 ***		0.21 ***	-0.14 **			
FUM	-0.25 **	0.12		0.94 ***			
FUM:FER	0.15 ^{ms}	-0.46 ***	0.79 ***				

Pearson correlation coefficients are reported in each cell, and significance is denoted as ^{ms} $0.1 > p \ge 0.05$ (marginally significant); * $0.05 > p \ge 0.01$; ** $0.01 > p \ge 0.0001$; *** p < 0.0001.

2.4. Innate Ear Morphology is a Component of Resistance to FVI and FUM Contamination

Previous studies have reported associations between FVI severity and FUM contamination with characteristics of the cob and kernel tissues, such as cob morphology and kernel density-related traits [28,32–34,45–47]. Given the symptomatological variation present in the four RIL families, we sought to test the extent to which innate (uninoculated) ear architecture played a role in resistance to FVI using publicly available data on cob density (CobDen), diameter (CobDiam), length (CobLen), mass (CobMass), and volume (CobVol) as well as uninoculated kernel bulk density (BDEN_{uninoc}).

Supporting the hypothesis that maize lines with greater innate kernel bulk density (BDEN_{uninoc}) in turn have greater bulk density under *F. verticillioides* inoculation (BDEN_{inoc}), we found that BDEN_{uninoc} and BDEN_{inoc} were positively correlated in all families (Table S1). BDEN_{uninoc} was negatively

correlated with FER in the B73 × CML52 and B73 × CML69 families and positively correlated with FUM:FER in the B73 × CML333 and B73 × CML52 families (Table S1). BDEN_{uninoc} was less strongly correlated with FER and FUM:FER than was BDEN_{inoc} (Tables 3 and 4). Unlike the correlations found between FUM and BDEN_{inoc}, FUM was not significantly (p > 0.05) correlated with BDEN_{uninoc} in any family (Table S1).

Table 4. Genotypic and field effect variance proportions, significance of days to silking (DTS), and broad-sense heritability of genotype-means (H) for BDEN_{inoc}, FER, FUM, the ratio of FUM to FER (FUM:FER), and the absence/presence of five symptom types (asymptomatic, blush, starburst, purple, moldy) under *F. verticillioides* inoculation within four NAM RIL families. Mixed linear models were fit with genotype, environment (env), genotype*environment (G*E), block[environment] (B[E]) as random effects and DTS as a fixed effect.

Family	Trait	Random Effects (Variance Proportions)					Fixed Effect (<i>p-</i> Value)	н
			Env.	G*E	B[E]	Error	DTS	-
	BDEN _{inoc}	0.64	0.01	0.04	0	0.31	0.1	0.79
	FER	0.42	0.01	0.12	0	0.45	0.9	0.75
	FUM	0.02	0.61	0.16	0	0.21	0.3	0.12
P72 ×	FUM:FER	0.03	0.58	0.10	0	0.29	0.6	0.17
D/3 ×	Asymptomatic	0.05	0.07	0.17	0.02	0.69	0.2	0.15
CIVIL555	Blush	0.18	0.13	0.30	0.01	0.38	0.004 **	0.44
	Starburst	0.12	0.18	0.17	0.01	0.53	0.9	0.33
	Purple	0.04	0.25	0.12	0.03	0.56	0.5	0.16
	Moldy	0.17	0.03	0.80	0	0.001	0.3	0.40
	BDEN _{inoc}	0.33	0.003	0	0.04	0.62	0.002 **	0.52
	FER	0.30	0.20	0.06	0.03	0.41	0.03 *	0.72
	FUM	0.03	0.46	0.01	0.04	0.46	0.1	0.17
B73 ×	FUM:FER	0.02	0.48	0	0.01	0.48	0.3	0.12
CMI 52	Asymptomatic	0.06	0.27	0.17	0.03	0.48	0.8	0.21
CIVILOZ	Blush	0	0.01	0	0	0.99	0.04 *	0
	Starburst	0.11	0.28	0.18	0.02	0.42	0.6	0.35
	Purple	0.03	0.30	0.20	0.01	0.46	0.4	0.13
	Moldy	0.31	0.01	0.68	0	1×10^{-5}	0.8	0.58
	BDEN _{inoc}	0.46	0.03	0.32	0.02	0.18	0.04 *	0.65
	FER	0.22	0.14	0.18	0.03	0.43	0.8	0.59
	FUM	0.02	0.70	0.13	0.01	0.14	0.1	0.15
B73 ×	FUM:FER	0.02	0.70	0.07	0.02	0.19	0.3	0.21
CMI 69	Asymptomatic	0.09	0.13	0.16	0	0.62	0.2	0.25
CIVILO	Blush	0.06	0.04	0.01	0	0.88	0.05	0.18
	Starburst	0.08	0.24	0.15	0.003	0.53	0.005 **	0.27
	Purple	0.07	0.26	0.21	0.01	0.46	0.03 *	0.24
	Moldy	0.17	0.03	0.80	0	8×10^{-5}	0.009 **	0.39
	BDEN _{inoc}	0.23	0.08	0.56	0.02	0.12	0.07	0.40
D72 V	FER	0.27	0.22	0.06	0.04	0.40	0.003 **	0.70
	FUM	0.01	0.73	0.04	0	0.22	0.7	0.14
	FUM:FER	0.03	0.65	0.06	0	0.27	0.7	0.19
D7.5 X NC358	Asymptomatic	0.05	0.04	0	0.05	0.86	0.08	0.15
110330	Blush	0.11	0.02	0.87	0	0.001	0.9	0.28
	Starburst	0.06	0.20	0.03	0.01	0.70	0.003 **	0.21
	Purple	0.07	0.25	0	0.01	0.67	0.03 *	0.24
	Moldy	0.13	0.01	0.85	0	0.002	0.4	0.32

Fixed effect *p*-value significance is denoted as: * $0.05 > p \ge 0.01$; ** $0.01 > p \ge 0.0001$.

Although the statistical significance of correlations between cob size traits and $BDEN_{inoc}$ or $BDEN_{uninoc}$ varied among families, the directionality of these correlations was generally conserved across families (Table S1). Both $BDEN_{inoc}$ and $BDEN_{uninoc}$ tended to be negatively correlated with

CobDiam, CobMass, and CobVol (Table S1). Relationships between cob morphology and FER, FUM, and FUM:FER varied from family to family. In general, lines with larger cobs had greater FER severity, as demonstrated by positive correlations between FER and CobDiam or CobVol across families (Table S1). FER was negatively correlated with CobDen in the B73 × CML52 family and positively correlated with CobMass in the B73 × NC358 family (Table S1). FUM:FER correlations with cob size and/or density in the B73 × CML52 and B73 × NC358 families revealed that lines with larger, less dense cobs had reduced FUM:FER (Table S1). We expected to find similar relationships between FUM and cob morphology, but instead found that FUM was only marginally positively correlated with CobMass in the B73 × CML52 family. This may have been due to the low genetic variation for FUM in this study. Similar to previous studies [33,36], cob size traits (CobDiam, CobLen, CobVol) were significantly (p < 0.05) or marginally significantly (p < 0.1) positively correlated with cobMass and significantly or marginally significantly negatively correlated with cob size traits (Table S1).

2.5. Genetic and Environmental Variation on Disease Severity Differ among Families

We assessed genetic and environmental effects on indicators of FVI severity within and among families. Across all families, broad-sense heritability of genotype-means (H) was greater for BDEN_{inoc} (0.4–0.79) and FER (0.59–0.75) than for FUM (0.12–0.17), FUM:FER (0.12–0.21), or symptom type traits (0–0.44) (Table 4, Figure 2). The variance explained by genotype, environment and the interaction between genotype and environment (G*E) varied widely by trait and family (Table 4). Of the nine FVI traits, the moldy symptom type was most affected by G*E (68% to 85% variance in all families) (Table 4). In general, G*E explained less than 20% of the variance in all other traits across families (Table 4). Traits related to fumonisin contamination (FUM and FUM:FER) had lower genetic variance (1% to 3%) and higher variance explained by environment (46% to 73%) than the other traits across all families (Table 4). In contrast, BDEN_{inoc} and FER had the highest genetic variance (BDEN_{inoc} (0.3% to 84%) and the moldy symptom type (1% to 3%) (Table 4). The H for FUM found in our experiment was much lower than those previously reported (0.43–0.86) [43,44]. Resistance to mycotoxigenic fungi and kernel composition are influenced by environmental conditions and management practices [13,19,36,37,48–51], which may explain the large environmental and G*E effects here.



Figure 2. (**A**) Box-plots comparing H, number of associated quantitative trait loci (QTL), and variance explained by QTL models (model R^2) among BDEN_{inoc}, FER, FUM, and the ratio of FUM to FER (FUM:FER) under *F. verticillioides* inoculation, and kernel bulk density (BDEN_{uninoc}) and cob density, diameter, length, mass, and volume under uninoculated conditions. (**B**) Pearson correlations among H, number of associated QTL, and QTL model R^2 for the previously described *F. verticillioides* infection (FVI) and ear traits (p < 0.0001 for all three pairwise correlations).

2.6. Genetic Architecture Differs between Ear Morphological and Resistance Traits

In total, stepwise regression selected 271 quantitative trait loci (QTL) associated with the nine FVI traits and the six ear traits in the single and joint family models from the total set of 7386 markers (Table S2). Sixty-six QTL were selected in the joint family models, and 57, 41, 59, and 48 QTL were mapped in the B73 × CML333, B73 × CML52, B73 × CML69, and B73 × NC358 families, respectively (Table S2). Traits that had greater H also had a greater number of associated QTL and greater variance explained by their respective QTL models (model R^2) (Figure 2). Cob morphological traits tended to have a greater number of associated QTL (28–37 QTL each) and QTL model R^2 (model R^2 = 0.31–0.63) than BDEN_{uninoc} and FVI traits (3–15 QTL, R^2 = 0.06–0.32), with the exception of BDEN_{inoc} (20 QTL, model R^2 = 0.28–0.39), FER (26 QTL, R^2 = 0.18–0.45), and the blush symptom type (10 QTL, model R^2 = 0.29–0.30) (Figure 2).

2.7. Most QTL for Resistance to F. verticillioides are Trait-Specific

Within families, the majority of QTL were specific to one trait (161/271 QTL) (Table S3). A total of 110 QTL overlapped with QTL for at least one other trait within families at 44 distinct regions ("colocalized QTL") (Table S3). Twenty-one colocalized QTL were associated with multiple ear traits but not associated with any FVI trait (Table S3). Ten colocalized QTL were associated with multiple FVI traits but no ear traits ("FVI-specific colocalized QTL"), with three each from the B73 × CML69 and B73 × CML333 families, two from the B73 × NC358 family, and one each from the B73 × CML52 and joint family analyses (Table 5). Thirteen colocalized QTL were associated with both FVI and ear traits ("FVI-ear colocalized QTL"), with five from the joint analysis, three from the B73 × CML52 family, three from the B73 × CML333 family, and one each from the B73 × CML69 and B73 × NC358 family, three from the B73 × CML52 family, three from the B73 × CML333 family, and one each from the B73 × NC358 families (Table 5).

Table 5. Physical positions (AGPv2) and marker effects of colocalized QTL. Marker effects were nested within family in the joint family stepwise regression model. As such, each colocalized QTL from the joint family analysis has four marker effects from the four non-B73 alleles (CML333, CML52, CML69, NC358) vs. the B73 allele. Colocalized QTL from the single-family analyses have one marker effect each (non-B73 parent allele vs. B73 allele).

Analysis	Chr.	Position (bp)	Associated Traits	Marker Effect on Trait (Non-B73 vs. B73 Allele)
Joint family	1	17,256,105– 25,068,060	BDEN _{inoc} Blush CobLen	$\begin{array}{l} +0.003_{CML333}; +0.013_{CML52}; +0.019_{CML69}; -0.001_{NC358} \\ +0.054_{CML333}; +0.002_{CML52}; -0.001_{CML69}; +0.007_{NC358} \\ -4.874_{CML333}; -3.899_{CML52}; -5.097_{CML69}; -13.611_{NC358} \end{array}$
	2	20,081,914– 50,634,516	Blush CobDiam CobLen CobMass CobVol Moldy Starburst	$\begin{array}{l} +0.073_{\rm CML333}; +0.001_{\rm CML52}; +0.012_{\rm CML69}; +0.005_{\rm NC358} \\ +0.531_{\rm CML333}; +0.380_{\rm CML52}; +0.510_{\rm CML69}; +0.907_{\rm NC358} \\ +3.033_{\rm CML333}; +6.651_{\rm CML52}; +3.954_{\rm CML69}; +9.236_{\rm NC358} \\ +1.197_{\rm CML333}; +0.655_{\rm CML52}; +1.605_{\rm CML69}; +1.843_{\rm NC358} \\ +5.456_{\rm CML333}; +3.441_{\rm CML52}; +4.325_{\rm CML69}; +8.825_{\rm NC358} \\ -0.026_{\rm CML333}; -0.013_{\rm CML52}; -0.021_{\rm CML69}; -0.006_{\rm NC358} \\ -0.001_{\rm CML333}; +0.023_{\rm CML52}; +0.044_{\rm CML69}; +0.047_{\rm NC358} \end{array}$
	2	193,400,572– 196,813,641	BDEN _{inoc} CobMass	$\begin{array}{l} +0.025_{CML333}; +0.003_{CML52}; +0.010_{CML69}; +0.002_{NC358} \\ -1.545_{CML333}; +0.418_{CML52}; -1.314_{CML69}; +0.220_{NC358} \end{array}$
	5	205,258,663– 208,297,027	BDEN _{inoc} Blush CobLen FER	$\begin{array}{l} +0.009_{\rm CML333;} & -0.016_{\rm CML52;} & -0.002_{\rm CML69;} & -0.016_{\rm NC358} \\ -0.088_{\rm CML333;} & -0.001_{\rm CML52;} & -0.006_{\rm CML69;} & -0.017_{\rm NC358} \\ -0.868_{\rm CML333;} & -2.017_{\rm CML52;} & -7.233_{\rm CML69;} & -2.325_{\rm NC358} \\ -0.606_{\rm CML333;} & +5.843_{\rm CML52;} & -1.058_{\rm CML69;} & +8.576_{\rm NC358} \end{array}$
	6	130,721,405– 133,795,910	Asym FER	+ 0.002_{CML333} ; + 0.027_{CML52} ; + 0.015_{CML69} ; + 0.007_{NC358} - 4.192_{CML333} ; - 6.906_{CML52} ; - 6.253_{CML69} ; - 4.148_{NC358}
	10	79,389,587– 116,043,385	CobDen Starburst	$\begin{array}{l} +0.005_{CML333}; +0.012_{CML52}; +0.0003_{CML69}; +0.007_{NC358} \\ -0.031_{CML333}; -0.037_{CML52}; -0.029_{CML69}; -0.048_{NC358} \end{array}$

Analysis	Chr.	Position (bp)	Associated Traits	Marker Effect on Trait (Non-B73 vs. B73 Allele)
B73 × CML333	1	19,128,807– 24,311,471	Blush CobLen	+0.052 _{CML333} -5.937 _{CML333}
	1	47,813,030– 57,347,172	FER FUM	+6.660 _{CML333} +0.162 _{CML333}
	2	21,767,606– 35,311,519	BDEN _{inoc} Blush	+0.020 _{CML333} +0.065 _{CML333}
	7	4,823,956– 6,178,479	CobLen CobVol Starburst	+6.465 _{CML333} +15.265 _{CML333} +0.046 _{CML333}
	7	14,152,199– 23,748,237	FER FUM:FER	+4.985 _{CML333} -0.009 _{CML333}
	8	130,983,626– 151,773,181	BDEN _{inoc} CobDen CobDiam Starburst	+0.015 _{CML333} +0.010 _{CML333} -1.587 _{CML333} +0.040 _{CML333}
B73 × CML52	5	83,007,601– 140,575,190	BDEN _{inoc} BDEN _{uninoc}	+0.018 _{CML52} +0.009 _{CML52}
	6	129,994,297– 140,630,780	Asym CobDiam	+0.027 _{CML52} -0.744 _{CML52}
	6	154,530,689– 156,104,230	FER FUM:FER	-7.612 _{CML52} +0.010 _{CML52}
	8	132,405,651– 146,365,593	BDEN _{uninoc} CobVol FER	$+0.010_{CML52}$ -6.924 _{CML52} -5.718 _{CML52}
B73 × CML69	2	49,846,838– 87,089,680	CobMass Moldy Starburst	+2.016 _{CML69} -0.023 _{CML69} +0.048 _{CML69}
	4	17,330,826– 21,710,411	BDEN _{inoc} FER	-0.018 _{CML69} +6.347 _{CML69}
	4	167,066,431– 170,804,182	Purple Starburst	+0.034 _{CML69} -0.050 _{CML69}
	7	138,072,861– 142,429,440	Asym FER	+0.020 _{CML69} -7.435 _{CML69}
B73 × NC358	2	144,159,847– 160,579,525	Purple Starburst	-0.031_{NC358} +0.046_{NC358}
	3	6,427,177– 8,563,589	BDEN _{inoc} Starburst	+0.021 _{NC358} -0.054 _{NC358}
	10	16,505,881– 77,678,052	Asym CobDen	+0.018 _{NC358} +0.009 _{NC358}

Table 5. Cont.

2.8. Allele Effects at FVI-Specific Loci Reflect Trait Relationships

The directionality of allele effects on quantitative FVI traits (e.g., FER, FUM) that shared QTL with each other and/or with BDEN_{uninoc} generally matched the phenotypic correlation between the corresponding traits. For example, FER was negatively correlated with both BDEN_{inoc} and BDEN_{uninoc} in the B73 × CML52 and B73 × CML69 families (Tables 3 and 5), and allele effects on FER were opposite to allele effects on BDEN_{inoc} and BDEN_{uninoc} at three colocalized QTL in the B73 × CML52, B73 × CML69, and joint family analyses (Table 5). Similarly, FER was positively correlated with FUM and negatively correlated with FUM:FER across all families (Tables 3 and 5), and the allele effect on FER was in the same direction as the allele effect on FUM at a colocalized QTL in the B73 × CML333 family and in the opposite direction as the allele effect on FUM:FER at colocalized QTL in the B73 × CML333 and B73 × CML52 families (Table 5).

QTL colocalized for multiple symptom type traits generally had opposite allele effects on mild (e.g., blush, starburst) vs. severe (e.g., purple, moldy) symptom types (Table 5), indicating that

related mechanisms may underlie the manifestation of similar symptomatologies (blush/starburst or purple/moldy). For example, allele effects on starburst were in the same direction as those on blush and opposite to allele effects on moldy and purple at colocalized QTL (Table 5). Similarly, asymptomatic lines by definition have low FER, and allele effects on FER were opposite to asymptomatic allele effects at their two colocalized QTL (Table 5).

2.9. Characteristics of Loci Underlying Specific and Ear-Mediated Resistance to F. verticillioides

We sought to characterize and compare FVI-specific and FVI-ear QTL. First, we tested whether the two classes of resistance loci differed with respect to marker effect size, controlling for trait, family, and QTL length effects. We found that trait and family were significantly (p < 0.0001) and marginally significantly (p < 0.1) associated with absolute marker effect size, respectively. As the trait scale for FER and CobVol was larger than the other FVI and ear traits, these two traits in turn had larger absolute marker effects. Compared to the other families, the B73 × NC358 family had greater marker effect sizes and the joint family models had smaller marker effect sizes. We then investigated whether FVI-specific and FVI-ear loci tended to be found in pericentromeric regions, which have lower recombination rates than non-centromeric regions of the genome [52]. The FVI-specific (10/62 QTL) and FVI-ear (4/13 QTL) groups did not significantly differ with respect to the proportion of QTL located in pericentromeric bins ($\chi^2 = 1.5$, p = 0.2). Several other studies have mapped loci for resistance to *F. verticillioides*, and we identified which of our FVI-specific and FVI-ear QTL colocalized with previously described FVI loci [19,49,53–59]. A significantly greater proportion of our FVI-specific QTL (46/62 QTL) overlapped published FVI loci than did our FVI-ear QTL (6/13) ($\chi^2 = 4.0$, p = 0.04).

3. Discussion

Here we dissect the diversity of genetic resistance to FVI and FUM accumulation in four maize RIL families. We further establish the importance of BDEN_{inoc} as a useful proxy for FUM [33,34], especially given the poor heritability of FUM contamination in maize grain. In addition, we demonstrate that some loci underlying resistance FVI and FUM severity may have trade-offs for agronomically important kernel and cob traits.

At the phenotypic, genetic, and locus levels, BDEN_{inoc} was negatively associated with external symptom severity and FUM contamination. These results strengthen the arguments that BDEN_{inoc} could be used as a predictor of FUM contamination [28,32–34] and that selection for increased BDEN_{inoc} could indirectly increase resistance to FUM [35], even under conditions resulting in low heritability for FUM. The relatively low heritability for FUM in our experiment may have been due to the inoculation method (insertion of spore-coated toothpick into the developing ear), which has been shown to be less effective for screening genetic sources of resistance to FUM contamination [33,60]. However, toothpick inoculation, which has been shown to be effective at screening ear-mediated resistance mechanisms [33], allowed us to study the role of the cob in resistance to FVI and FUM. We identified 23 novel QTL associated with resistance to FVI, seven of which may be mediated by kernel and cob architecture.

Although no FUM or FUM:FER QTL colocalized with ear QTL in this study, we did find that lines with larger, less dense cobs had greater FER and lower BDEN_{inoc} at the QTL and trait correlation levels. In addition, both FER and BDEN_{inoc} were phenotypically and genetically correlated with FUM here and in previous studies [33,34] and we found substantial overlap between our ear QTL and previously described loci for resistance to FUM [19,49,53–59], suggesting that there may indeed be a genetic link between cob morphology and FUM but that the low heritability for FUM in our experiment may have limited our ability to detect this inferred relationship.

As cob morphology and kernel density are important components of grain yield [36] and quality [61], respectively, increased susceptibility to FVI and FUM contamination may be a by-product of the breeding process. We are currently conducting follow-up experiments with near isogenic lines (NILs) to dissect possible pleiotropy between ear architecture and resistance to FVI and FUM.

We also recommend that kernel bulk density under *F. verticillioides* infection be more thoroughly evaluated as a proxy for FUM contamination in maize grain. The wide variation in internal vs. external symptomatology, inter-trait correlations, and QTL colocalizations in this study implies that distinct modes of resistance exist within tropical germplasm, which can be leveraged for resistance breeding.

4. Materials and Methods

4.1. Field Design and Inoculation

Four RIL families (B73 × CML333, B73 × CML52, B73 × CML69, B73 × NC358) from the maize NAM population [40] and the five inbred parents (B73, CML333, CML52, CML69, NC358) were grown at the Central Crops Research Station in Clayton, NC in four year-environments from 2012 to 2015. Each NAM family is composed of 200 RILs. The four non-B73 parents originate from breeding programs in Mexico and North Carolina—regions that are prone to mycotoxin contamination [5,62]—and have previously demonstrated greater resistance to FER than B73 [20,21]. We used an augmented incomplete block design, in which each family was grown separately with 20-plot blocks. RIL plots were replicated once per year-environment and randomized within family, and the two parental lines of each family were randomized in each 20-plot block. All RILs from the B73 × CML52 and B73 × NC358 families were grown in four year-environments from 2012 to 2015. For the B73 × CML333 and B73 × CML69 families, all RILs from these two families were grown in three year-environments from 2013 to 2015 and 40 randomly selected RILs from each of these two families were grown in 2012. We measured days to silking (DTS) in each plot as described by Buckler et al. [63]. One toothpick coated with spores from local toxigenic *F. verticillioides* isolates was inserted into the middle of each developing primary ear approximately 10 days after silking, and the toothpick remained in the ear until harvest [21].

4.2. Disease Phenotyping

Primary ears were harvested from each plot at maturity, dried, and then visually evaluated for FER. FER was scored based on the percentage of the kernels presenting symptoms on a 1% to 100% scale with 5% increments [19]. The average FER score of all the ears in each plot was then calculated.

We used a symptom typology to account for the qualitative variation in external FER symptoms, in which each ear was assigned a symptom type: "asymptomatic," "blush," "starburst," "purple," or "moldy" (photographic examples in Morales et al. [33]). Asymptomatic ears had no or very limited visible external symptoms [33,38,39]. The blush type was characterized by pink discoloration localized on the kernel crowns [33]. Starburst ears had whitish streaks radiating from the kernel silk scar and/or pedicel [33,38,64,65]. The kernels of purple type ears were visibly degraded and had severe purplish discoloration [33]. Moldy ears had severely degraded kernels with matted fungal growth [33,37,38]. Each plot was assigned a main symptom type based on the most frequent symptom type of the ears in the plot. Plots with less than 10% average FER were considered asymptomatic. Plots with equal representation of more than one symptom type were categorized as "multiple."

After scoring FER and symptom typology, ears were then shelled and bulked per plot. From each plot, a random 250-mL volume of kernels was weighed, and kernel bulk density ($BDEN_{inoc}$) was calculated as the weight of the kernels divided by 250 mL. After weighing, the kernels were returned to the bulked plot.

All of the kernels in each bulked plot were ground into a fine powder with a Waring 7010 two-speed laboratory blender (Waring Commercial, Inc., Torrington, CT, USA). A 10-g subsample from each ground bulk was put in a 25 mL centrifuge tube. To extract fumonisins, 20 mL of 90% methanol was added to each 25 mL tube, resulting in a two-fold dilution factor at this step. The tubes were then shaken with a Lab-Line Environ Orbitol Shaker (Lab-Line Instruments, Inc., Melrose Park, IL, USA) at 150 rpm for approximately five minutes. The samples settled for 15 min, after which 0.5 mL of supernatant from each sample was transferred to a 15 mL centrifuge tube. To dilute the supernatant to a final 40-fold dilution, 9.5 mL of distilled water was added to each 15 mL tube.

Fumonisin contamination (FUM) was quantified with FUM-specific enzyme-linked immunosorbent assay (ELISA) kits (Helica Biosystems, Inc., Santa Ana, CA, USA). Absorbance at 450 nm of the ELISA plates was read using a BioTek μ QuantTM microplate spectrophotometer (BioTek Instruments, Inc., Winooski, VT, USA) paired with Gen5TM software (BioTek Instruments, Inc., Winooski, VT, USA). Samples that had FUM levels predicted to be above the highest standard provided by the ELISA kits, 6 μ g g⁻¹ (ppm), were serially diluted until their predicted FUM levels were within the standard curve. To approximate samples that had non-detectable FUM levels (<0.1 ppm), uniform random values between 0 and 0.1 ppm were assigned to these samples [66]. The ratio of FUM to FER (FUM:FER) was calculated as FUM/(FER+1).

4.3. Mixed Models and Heritability Estimation

For mixed model analysis, we treated each of the five symptom types as absence/presence traits. Each plot was assigned as having the absence (0) or presence (1) of each symptom type. For example, if a plot exhibited the blush symptom type, it was assigned 1 for blush and 0 for asymptomatic, starburst, purple, and moldy. As the raw BDEN_{inoc}, FER, FUM, and FUM:FER data were not normally distributed, they were Box-Cox transformed using JMP[®] software (SAS Institute Inc., Cary, NC, USA, 1989–2007) for further analysis.

We used JMP[®]software (SAS Institute Inc., Cary, NC, USA, 1989–2007) to fit mixed linear models for the five symptom type absence/presence traits and the four quantitative traits (Box-Cox-transformed BDEN_{inoc}, FER, FUM, and FUM:FER). Within and among families, mixed models were fit for each of the nine FVI traits as a separate response variable with environment, block[environment], genotype, and genotype*environment as random effects and DTS as a fixed covariate. Variance components from each model were extracted and used to calculate broad-sense heritability (H) as

$$\frac{\sigma_G^2}{\sigma_G^2 + \frac{\sigma_{GE}^2}{e_h} + \frac{\sigma_{\varepsilon}^2}{p_h}}$$

where σ_G^2 , σ_{GE}^2 , and σ_{ϵ}^2 are the genotype, genotype*environment, and error variances, respectively, and e_h and p_h are defined as

$$e_h = \frac{n}{\sum_{i=1}^n \frac{1}{e_i}},$$
$$p_h = \frac{n}{\sum_{i=1}^n \frac{1}{p_i}},$$

where *n* is the number of genotypes and e_i and p_i are the number of environments and plots for the *i*th genotype, respectively [67].

We also sought to assess associations between FVI and kernel bulk density (BDEN_{uninoc}) and cob morphology under non-inoculated conditions. Total kernel volume, cob diameter (CobDiam), cob length (CobLen), cob mass (CobMass), and ear mass had been previously measured in the NAM in five location-environments in 2006 (Aurora, NY, USA; Clayton, NC, USA; Homestead, FL, USA; Ponce, Puerto Rico; Urbana, IL, USA) [41,42], and these publicly accessible data for our four NAM families were provided by Panzea [42]. BDEN_{uninoc} was calculated as (ear mass—CobMass)/total kernel volume. Assuming cob shape to be cylindrical, cob volume (CobVol) was calculated as π^* CobLen*(CobDiam/2)². Cob density (CobDen) was calculated as CobMass/CobVol. To estimate genotype means for BDEN_{uninoc}, CobDen, CobMass, and CobVol, we fit mixed linear models within and among families for these four ear traits with genotype and environment as random effects and DTS as a fixed effect using JMP[®]software (SAS Institute Inc., Cary, NC, USA, 1989–2007). Broad-sense heritability (H) was calculated as

$$\mathbf{H} = \frac{\sigma_G^2}{\sigma_G^2 + \frac{\sigma_\varepsilon^2}{e}},$$

where *e* is the number of environments and σ_G^2 and σ_{ϵ}^2 are the genotype and error variances, respectively. Genotype means and broad-sense heritability for CobDiam and CobLen were accessed from Brown et al. [41].

4.4. Trait Correlation Analyses

Pairwise Pearson correlations among plot phenotypes and among trait best linear unbiased predictors (BLUPs) for quantitatively measured traits (BDEN_{inoc}, BDEN_{uninoc}, FER, FUM, FUM:FER) were calculated within families using JMP[®] software (SAS Institute Inc., Cary, NC, USA 1989–2007). Both plot-level (phenotypic) and BLUP (genetic) correlations were assessed among the FVI traits. Genetic correlations among BLUPs for BDEN_{uninoc} and FVI traits were also calculated.

4.5. Comparison of Disease Severity among Families

We tested differences in FVI severity among families using JMP[®] software (SAS Institute Inc., Cary, NC, USA, 1989–2007). We used analysis of variance (ANOVA) to test the effect of family on BDEN_{inoc}, FER, FUM, and FUM:FER, and pairwise two-tailed *t*-tests to asses differences in these four traits between families. A likelihood ratio χ^2 test was used to compare the composition of symptom types among families.

4.6. QTL Mapping, Colocalization, and Allele Effects

The NAM population had been analyzed with genotyping-by-sequencing (GBS) technology [68]. A subset of 7386 GBS markers with 0.2 cM resolution had been selected by Olukolu et al. [69]. We extracted the 7386 GBS markers for the B73 × CML333, B73 × CML52, B73 × CML69, and B73 × NC358 NAM families and used them for stepwise regression.

Stepwise regression models were fit in TASSEL version 5.2.37 [70] to identify markers associated with BDEN_{inoc}, BDEN_{uninoc}, FER, FUM, FUM:FER, and the five symptom types (asymptomatic, blush, starburst, purple, moldy). For the single-family models, a marker significance threshold of 0.001 was used [71]. For the joint-family models, marker effects were nested within family and the significance threshold was set to 0.0001 [71]. QTL were defined by the confidence intervals (CIs) of markers selected by stepwise regression [70]. Within each family, QTL were considered colocalized if their CIs overlapped.

In addition to identifying colocalized QTL, we also sought to investigate allele effect relationships at specific colocalized QTL. We extracted allele effect estimates from the TASSEL stepwise regression model outputs [70] and then compared allele effects on traits that had colocalized QTL.

4.7. Characterization of Resistance QTL

We classified the QTL mapped in our study as (1) FVI-specific if the trait-specific or colocalized QTL was only associated with FVI trait(s) or (2) FVI-ear colocalized if the QTL was associated with both ear and FVI trait(s). With JMP[®] software, we fit a linear model including absolute marker effect as the response and trait, family, resistance locus type, and QTL confidence interval size as fixed effects. We determined in which genetic bin(s) each resistance QTL was located using bin physical position (AGPv2) information from MaizeGDB [72], and if the QTL overlapped the bin containing the centromere on the respective chromosome, the QTL was classified as pericentromeric. We then compared the proportion of pericentromeric QTL between the two classes of resistance loci. We amassed loci associated with resistance to *F. verticillioides* from nine publications [19,49,53–59] and determined which of our QTL overlapped with said previously described loci.

Supplementary Materials: The following are available online at http://www.mdpi.com/2072-6651/11/2/86/s1, Table S1: Genotype-means correlations among kernel bulk density (BDEN_{inoc}), Fusarium ear rot (FER), fumonisin concentration (FUM), and the ratio of FUM to FER (FUM:FER) under *F. verticillioides* inoculation, and kernel bulk density (BDENuninoc) and cob density (CobDen), diameter (CobDiame), length (CobLen), mass (CobMass), and volume (CobVol) under uninoculated conditions within four maize RIL families.; Table S2: Summary of family-specific and joint family stepwise regression models and QTL for kernel bulk density (BDEN_{inoc}), Fusarium ear rot (FER), fumonisin concentration (FUM), and the ratio of FUM to FER (FUM:FER) under *F. verticillioides* inoculation, and kernel bulk density (BDEN_{uninoc}) and cob density (CobDen), diameter (CobDiam), length (CobLen), mass (CobMass), and volume (CobVol) under uninoculated conditions; Table S3: Physical positions (AGPv2) and associated traits of colocalized and trait-specific QTL from family-specific and joint family analyses.

Author Contributions: Conceptualization, L.M. and R.J.N.; Methodology, L.M., C.T.Z., P.J.B.-K., J.B.H. and R.J.N.; Formal Analysis, L.M.; Investigation, L.M., C.T.Z., D.E.M.M. and M.M.A.; Resources, P.J.B.-K., J.B.H. and R.J.N.; Data Curation, L.M.; Writing-Original Draft Preparation, L.M.; Writing-Review & Editing, L.M., P.J.B.-K., J.B.H. and R.J.N.; Visualization, L.M.; Supervision, R.J.N.; Funding Acquisition, P.J.B.-K., J.B.H. and R.J.N.

Funding: This research was funded by National Science Foundation Plant Genome Research Program grant number 1127076 and McKnight Foundation project number 80267.

Acknowledgments: The authors wish to thank Jason Brewer and Judith Kolkman for technical support and Nicolas Morales for data management.

Conflicts of Interest: The authors declare no conflict of interest.

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