

Original Research Article

The predicted genetic architecture for number of pods per plant in cowpea in phosphorus environments.

ABSTRACT

Aims: The aim of the study was to analyze quantitative trait loci for pod number per plant in cowpea under different phosphorus environments.

Study design: On the field, the experimental design was a split-plot with two replicates. The main plots were two phosphate levels: 0 P and 30 Kg P ha⁻¹ (Triple super phosphate, TSP), while the 118 RILs and the two parents constituted the sub-plots randomized in a 12 x 10 α -lattice design. The experimental design for the pot experiment was a factorial randomized complete block design with two factors, and two replications. The factors were phosphorus levels (0 and 30 mg P per Kg soil) and genotypes.

Place and Duration of Study: The study was conducted at two sites. The first site was at the IRAD (Institut de la Recherche Agricole pour le Développement) research station, in Nkoemvone, in the HFZ of Cameroon while the second site was at Nkometou, a village in the Yaoundé neighborhoods, still within the HFZ of Cameroon.

Methodology: A RIL F11 population consisting of 118 lines derived from a cross between '58-77' and 'Yacine' using the single seed descend method was used in the study. The line '58-77' (female parent,) is a black small-seeded local cultivar from Senegal resistant to pests and diseases with many pods per plant while 'Yacine' (male parent) also from Senegal has large brown seeds but with very few pods per plant. Evaluation of cowpea RILs was done on low nitrogen plots both in the field and screen house and data collected on number of pods per plant. Analysis of Variance (ANOVA) was performed with the software SAS version 9.2 (SAS Institute Inc., Cary, NC, USA 2008). Marker genotype data for 118 RILs of the 58-77 x Yacine population were generated from the Illumina GoldenGate assay of 1,536 genome-wide SNP markers derived from EST sequences. The software WinQTL Cartographer 2.5. was used for composite interval mapping. QTL mapping was also performed using QTLnetwork 2.1 that uses a model that includes the effects of multiple QTL, epistasis, QTL-by-environment interactions and epistasis-by-environment interactions.

Results: Win Cartographer identified a total of eight QTL for Npod in all eight environments while QTLnetwork identified the following three main QTL (M-QTL) for Npod across the eight environments: qNpod2.1, qNpod5 and qNpod8. In total, three digenic epistatic interactions were detected for Npod across the eight environments. All three digenic pairs had epistasis main effects, and epistasis by environment interaction effect [aae] affects in one environment.

Conclusion: This study shows that, two QTL with epistasis effect were found to also have significant additive by environment effects. This means that the usual estimates of QTL effects could be confounded by epistatic interactions and result in biased estimation unless epistatic effect are isolated.

Keywords: [Epistasis, Number of Pods, Phosphorus, QTL, Vigna unguiculata]

11 1. INTRODUCTION

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13 Cowpea [*Vigna unguiculata* (L.) Walp] is a warm weather, drought-tolerant crop well-adapted
14 to the drier regions of the tropics, where other food legumes do not perform well. This makes
15 cowpea an important component of traditional intercropping systems, especially in the
16 complex, subsistence farming systems of the dry savannas in sub-Saharan Africa [1]. With
17 its greater tolerance to heat, drought, and low soil fertility [2] and yet close evolutionary
18 relatedness to other economically important grain legumes such as common bean
19 (*Phaseolus vulgaris*) and soybean (*Glycine max*), cowpea can serve as a model species for
20 crop adaptation to these stresses. Cowpea (*Vigna unguiculata*) is also closely related to
21 mung bean (*Vigna radiata*) and shares more distant common ancestry with common bean
22 (*Phaseolus vulgaris*), soybean (*Glycine max*), and pigeon pea (*Cajanus cajan*) [3]. Cowpea
23 germplasm is notably diverse, especially when considering tolerance to several biotic and
24 abiotic stresses; however, the genetics of these traits are not sufficiently understood in the
25 context of modern, marker-assisted, breeding.(lines 25-36 removed) In cowpea, quantitative
26 trait loci (QTL) have been detected for many traits such as seed weight and pod shattering
27 [6], thrips resistance [7], heat tolerance [8], and aphid resistance [9] but to the best of our
28 knowledge, no QTL have been reported for pod number per plant.

29 The number of pods per plant is among the most horticulturally important traits in cowpea
30 and is inherited quantitatively based on field behaviors, and as such, dissecting the genetic
31 basis calls for adequate statistical methods that can integrate QTL with environment (QXE)
32 interaction in QTL mapping. QTL by environment interaction is an important component of
33 quantitative genetics. In the earlier studies of QTL mapping, almost all statistical methods
34 were developed in a single environment [10;11]. These methods did not consider the
35 correlation of data under different environments and thus may not extract maximum
36 information from the data. QTL network software maps QTL with additive effects and their
37 interaction with environments based on the mixed-model based composite interval mapping
38 (MCIM) method [12]. Several studies were performed to identify the QTL by environmental
39 effects in many crops by the QTL network in recent years, e.g., rice [13], corn [14], soybean
40 [15], wheat [16], and groundnut [17]. These studies indicated that QTL were greatly affected
41 by environment. Thus, it is very important to analyze QTL of pod number per plant under
42 many phosphorus (P) environments, knowing well that P, an element usually deficient in
43 most soils where cowpeas are grown in an essential requirement for cowpea growth. This
44 study makes use of markers that are accessible via community genotyping platforms and are
45 useful for modern breeding, comparative genomics, and map-based cloning.

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52 2. METHODOLOGY

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54 2.1 Plant material

55 A RIL F11 population consisting of 118 lines derived from a cross between ‘58-77’ and
56 ‘Yacine’ using the single seed descend method was used in the study. The line ‘58-77’
57 (female parent,) is a black small-seeded local cultivar from Senegal resistant to pests and
58 diseases with many pods per plant while ‘Yacine ’ (male parent) also from Senegal has large
59 brown seeds but with very few pods per plant.

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61 2.2 Field experiments

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The study was conducted at two sites. The first site was at the IRAD (Institut de la Recherche Agricole pour le Développement) Research Station, in Nkoemvone, in the HFZ of Cameroon (situated between longitude 11° 6' E and 11° 10' E, latitude 2° 53' N, and 2° 57' N, and altitude of 615 m). The average annual rainfall is 1820 mm with a bimodal distribution and mean daily temperature of 23.5° C. The soils are Ferric Acrisols characterized by a low base saturation and a low cation exchange capacity [18]. The soils for the study area are highly acidic, with pH (1:1 H₂O) 4.5 [18]. The vegetation consists of secondary humid forest. The second site, Nkometou, is a village in the Yaoundé neighborhoods, in the HFZ of Cameroon. Geographically, the study area is situated between latitude 3°51' and 3°53' N, and longitude 11°25' E and 11°27' E and has an altitude of 813 m. The climate is Equatorial with two rainy seasons corresponding to two cropping seasons: March to June and August to November. The average rainfall is 1692 mm with bimodal distribution; the mean daily temperature ranges from 19.2 to 28.6°C. The soils are also Ferric Acrisols, characterized by low base saturation and a low cation exchange capacity. The vegetation is evergreen forest, severely degraded by human activities, especially agriculture and timber exploitation [18].

Evaluation of cowpea RILs was done on low nitrogen plots. The experimental design was a split-plot with two replicates. The main plots were two phosphate levels: 0 P and 30 Kg P ha⁻¹ (Triple super phosphate, TSP), while the 118 RILs and the two parents constituted the sub-plots randomized in a 12 x 10 α -lattice design. Plots were fertilized uniformly with K (KCl) at 80 Kg ha⁻¹. Lime Ca(OH)₂ at the rate of 924kg of CaO per ha was incorporated into soil during land preparation. This dose followed the recommendations by KAMPRATH [19]. On the field, each of the 118 RILs was planted in a single row of 5m length at a spacing of 50cm between rows and 50 cm within rows. All plants were sprayed twice (before flowering and after pod setting) with the insecticide Thiodan® (endosulfuran organochlorine) at a concentration of 0.33 mg/L. The experimental area was bordered on either side by guard rows in order to minimize border effects. The field was hand weeded twice, two and four weeks after planting.

2.3 Pot experiments

Two screen house experiments were carried out at IITA Cameroon with soils collected from low N plots at Nkometou and Nkoemvone at 0– 20 cm depth. The soil was air dried, sieved through a 2mm screen and homogenized. The 118 RILs and their parents were grown. Plants were grown in 5L capacity pots containing 4.3 kg of non-sterile soil with one plant growing per pot after thinning. Amount of soil per pot was calculated based on soil bulk density. The experimental design was a factorial randomized complete block design with two factors, and two replications (two pots per RIL per replication for nodulation and yield traits, respectively). The factors were phosphorus level (0 and 30 mg P per Kg soil) and genotypes. Phosphorus and potassium were supplied as KH₂PO₄ and muriate of potash, respectively. Prior to sowing, seeds were surface sterilized with 95% ethanol for 1 min, and 3% H₂O₂ for 5 min, then rinsed with sterile water [20]. Three seeds of each genotype were sown in each pot and thinned to one plant per pot one week after emergence. Before sowing, P and K nutrients were applied as mentioned above. One milliliter of a combination of micronutrients per kg soil was also applied [20]. Pots were watered and maintained at field capacity. Soil rhizobial population was estimated using the Most Probable Number (MPN) method [21; 20]. The soil rhizobia population was found to be high (>103 rhizobium bacteria per g soil) which made artificial inoculation unnecessary for the soils [22; 23].

2.4 Linkage Analysis and QTL mapping

114 Analysis of Variance (ANOVA) was performed with the software SAS version 9.2 (SAS
115 Institute Inc., Cary, NC, USA 2008). Factors in the ANOVA model were cowpea lines and
116 blocks. Normality was tested per environment. The means of parents were compared using
117 a student t test. A 5% false-positive value was chosen as a significant criterion. Marker
118 genotype data for 118 RILs of the 58-77 x Yacine population were obtained from LUCAS

119 et al. [5] and generated from the Illumina GoldenGate assay of 1,536 genome-wide SNP
120 markers derived from EST sequences [4]. The Illumina GoldenGate Assay with the
121 BeadStation 500G (<http://www.illumina.com>) was used to genotype 1,536 SNPs using the
122 USLP 1.0 array. The Illumina GenomeStudio software (Illumina, Inc., San Diego, CA, USA)
123 was used to call SNP alleles. Additional SNPs that were excluded in USLP 1.0 markers were
124 genotyped with a KASP (K-Bioscience, Hoddesdon Herts, UK), and these SNPs were
125 analyzed by a LightCycler 480 (Roche Applied Science, Indianapolis, IN, USA) based on
126 endpoint genotyping. Linkage maps were constructed with the software QTL IciMapping 3.1
127 (<http://www.isbreeding.net>) using the Kosambi function, and alignment with the cowpea
128 consensus genetic map [5] available at HarvEST:Cowpea (<http://harvest-web.org/>).

129 The software WinQTL Cartographer 2.5. was used for composite interval mapping [CIM,
130 24]. For CIM, the stepwise selection was used for background marker selection as co-factors
131 in the model. An alpha value of 0.05 was used to avoid model over-fitting. A 1,000-repetition
132 permutation [25] was performed to find the genomewide critical likelihood ratio test (LRT)
133 value according to trait and year at an overall a value of 0.05. A window size of 1 cM was
134 applied to control background marker effects and produce a precise LOD profile.

135 QTL mapping was also performed using QTLnetwork 2.1 [26] that uses a model that
136 includes the effects of multiple QTL, epistasis, QTL-by-environment interactions and
137 epistasis-by-environment interactions. The map distances were estimated based on the
138 Kosambi function. This mapping strategy is based on marker interval selection, detection of
139 marker interval interactions and genome scans, to evaluate putative locations of multiple
140 QTL and their interactions. An F-statistics was used for hypothesis tests. In each of the
141 mapping procedures, permutation testing was exploited to control for genome-wide false
142 positive rate, and model selection was used to reduce ghost peaks in F-statistic profile. The
143 thresholds of the QTL (LOD scores) were obtained at $p = 0.05$ by 1,000 random
144 permutations of the trait values. Parameters of the full-QTL model were estimated using a
145 Bayesian method via Gibbs sampling. The different stages in QTL mapping using the the
146 QTLnetwork software involved mapping main QTL by one dimensional (1D) genome scan
147 and epistasis by two-dimensional (2D) genome scan.

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153 **3. RESULTS AND DISCUSSION**

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155 **3.1 RESULTS**

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157 **3.1.1 Trait performance of the parents and population**

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159 The phenotypic behavior for number of pods per plant (Npod) for the RIL population and its
160 parents under the eight environments are described in Table 1 for the pot experiments and
161 Table 2 for the field experiments. The parent 58-77 had higher means than Yacine in both
162 experiments. The means were different under different environments and transgressive
163 segregants were observed across all eight environments with some RILs higher than the

164 better parent, 58-77, or lower than the poor parent, Yacine. The Npod of the RIL population
 165 under study segregated continuously as indicated by the absolute skew and kurt values
 166 (Tables 1 and 2).
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171 **Table 1: Phenotypic values of number of pods per plant among parents and RIL**
 172 **population per environment in pot experiments.**
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ENV	Trait	Parents		RIL population						
		58-77	Yacine	Mean	Max	Min	Stdev	C V(%)	Skew	Kurt
PHP1	Npod	14±4.24	4.5±0.71	7.89	20.00	2.50	2.64	33.41	1.22	4.09
PLP1	Npod	7.5±2.12	2±0.00	2.81	6.50	1.00	1.34	47.71	0.90	0.72
PHP2	Npod	7.5±3.54	3±1.41	9.05	24.00	3.00	3.70	40.89	1.25	2.74
PLP2	Npod	4.5±2.12	1.5±0.71	3.97	11.00	1.00	1.84	46.42	1.41	2.69

174 ENV = Environment; PHP1 = Nkometou high p, PLP1 = Nkometou low P , PHP2 = Nkoemvone high P and PLP2 =
 175 Nkoemvone low p in pot experiments. Stdev = standard deviation and CV is coefficient of variation. The means of the parents
 176 are given ± stdev.
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192 **Table 2: Phenotypic values of number of pods per plant among parents and RIL**
 193 **population per environment in field experiments.**
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ENV	Trait	Parents		RIL population						
		58-77	yacine	mean	max	min	Stdev	cv (%)	skew	Kurt
FHP1	Npod	61.5±4.95	28.5±2.12	37.11	71.00	22.50	10.63	28.66	1.57	2.58
FLP1	Npod	5.1±0.42	1.2±0.85	3.47	10.50	1.00	1.66	47.96	1.30	3.28

FHP2	Npod	74.55±7.67	39.7±4.38	62.15	177.50	29.00	32.07	51.61	1.58	2.53
FLP2	Npod	6.15±1.06	1.8±0.85	8.30	29.50	1.00	5.57	67.10	1.28	2.07

ENV = Environment; FHP1 = Nkometou high p, FLP1 = Nkometou low P , FHP2 = Nkoemvone high P and FLP2 = Nkoemvone low p in field experiments. Stdev = standard deviation and CV is coefficient of variation. The means of the parents are given ± stdev.

3.1.2 Analysis of QTL and QTL by Environment (QE) interactions of number of pods per plant

Win Cartographer identified a total of eight QTL for Npod (Table 3) in all eight environments. A “Constitutive” QTL, qNpod 6.2 (Table 3) was identified in low phosphorus conditions both in the screen house and on the field by Win Cartographer but this QTL was not detected by QTLnet work software after isolating the effect of epistasis. QTLnetwork identified the following three main QTL (M-QTL) for Npod across the eight environments (Figure 1) qNpod2.1, qNpod5 and qNpod8. The positions of these QTL (Table 4) are indicated by the distance between the QTL and the first marker of the relevant linkage group. The interval refers to the flanking markers of the QTL while the range is the support interval of QTL position.

Table 3: Number of pods (Npod) per plant QTL with main effects identified by Win Cartographer in eight environments.

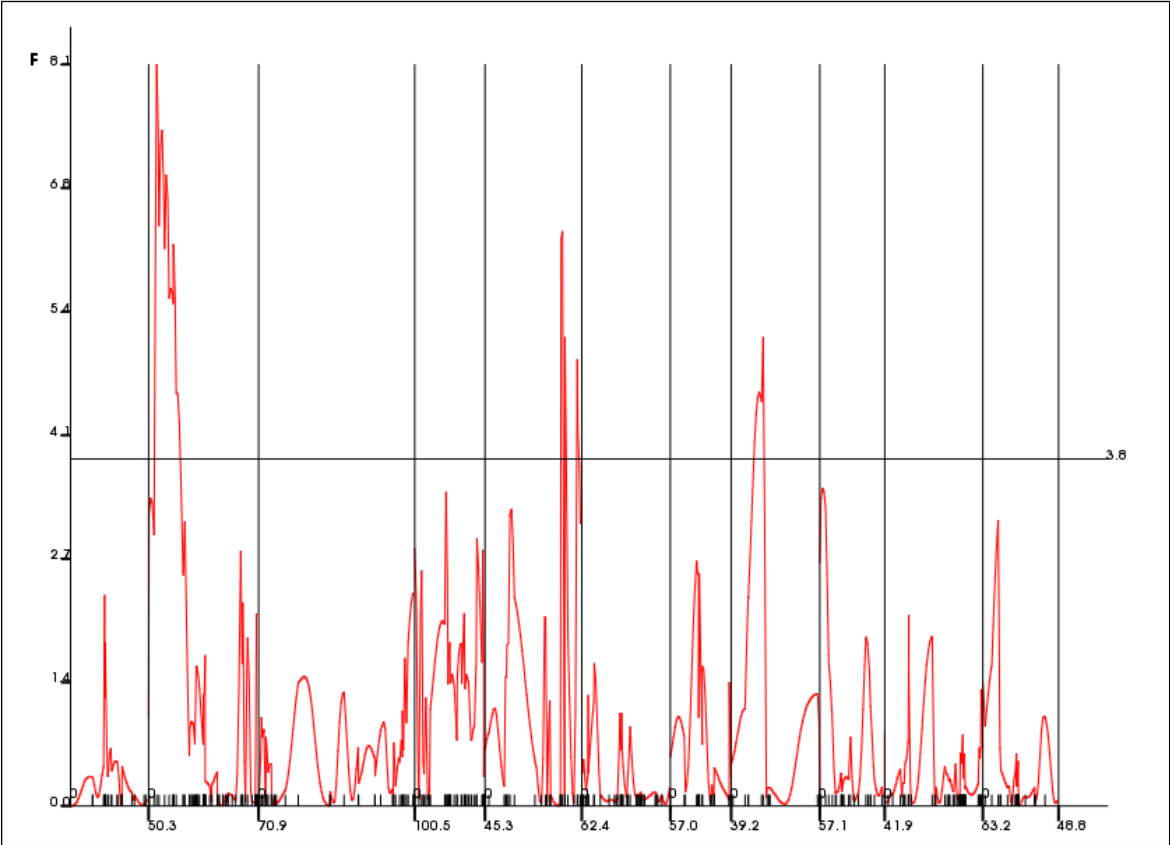
Trait	ENV	QTL	LG	Marker	Lod score	additive	R ²
Npod (08QTL, 8 EVNs)	FHP1	qNpod3.1	3	1_0139	5.05	12.64	0.4
	PLP1	qNpod1.1	1	1_0972	2.67	1.31	0.4
	PHP2	qNpod1.1	1	1_0972	4.23	2.18	0.4
	FLP2	qNpod10.1	10	1_1098	3.21	4.61	0.4
	FLP2	qNpod10.2	10	1_0416	3.97	4.75	0.4
	PLP2	qNpod5.1	5	1_0032	4.33	2.18	0.4
	FLP2	qNpod6.2*	6	1_0326	2.86	4.54	0.3
	PLP2	qNpod6.2*	6	1_0326	2.63	2.02	0.4

*Represent a constitutive QTL detected in more than one Environment. LG = linkage group. ENV = Environment; FHP1 = Nkometou high p, FLP2 = Nkoemvone low p in field experiments. PLP1 = Nkometou low P, PHP2 = Nkoemvone high P and

223 PLP2 = Nkoemvone low p in pot experiments. The QTL are named beginning with “q” standing for QTL, followed by trait
224 name and the linkage group number. In cases where there are more than one QTL on a linkage group for the same trait, the
225 serial number is added after the linkage group number separated by a dot.

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Figure 1: F-statistic plots from one dimensional genome scan for QTL with individual effects for number of pods per plant . Three peaks exceed the threshold F-value (3.7) calculated by permutation tests on LG 2, 5 and 8, respectively.

Table 4: Positions of Main QTL (M-QTL) identified by QTLnetwork in eight environments for Npod in cowpea

Trait	QTL	LG	interval	Position cM	R ² (%) range of
					QTL
Npod	<i>qNpod2.1</i>	2	1_1067-1_0113	5.2	4.5-6.2

qNpod5	5	1_0032-1_0945	49.9	48.5-50.9
<i>qNpod8</i>	8	1_0762-1_1123	23.8	19.3-24.9

QTL with both detectable additive and epistasis effects are presented in bold italic form. .LG= linkage group.

3.1.3 Epistatic QTL and QE interactions of number of pods per plant

Digenic epistatic interactions with epistatic main effect [aa] and /or epistasis by environment interaction effect [aae] were detected for the number of pods per plant in cowpea. Two M-QTL (qNpod2.1 and qNpod8) with both [ae] effects, but without [a] effects (Table 5) were involved in digenic interactions (Table 6), same as qNpod2.2, qNpod2.3 and qNpod2.4 which had no detectable [ae] and/or [a] effects. In total, three digenic epistatic interactions were detected for Npod across the eight environments (Table 6). All three digenic pairs had [aa] main effects (Table 7), and epistasis by environment interaction effect [aae] affects in one environment. The QTL qNpod2.1 was involved in two digenic interactions on different LGs, LG 2 and LG 8 (Figure 2).

Table 5: Additive and /or additive x environment interaction effects of M-QTL across eight environments

Gene effect and environment	qNpod2.1	qNpod5	qNpod8
[a]	-0.734	0.617	-0.596
ae FHP1	0.122	-0.845	0.673
ae FLP1	0.654	-0.448	0.245
ae PHP1	0.576	-0.424	0.184
aePLP1	0.478	-0.454	0.242
aeFHP2	-2.992**	4.704**	-1.721*
aeFLP2	0.091	-0.691	-0.114
aePHP2	0.538	-1.017	0.243
aePLP2	0.561	-0.776	0.242

[a], ae represent additive main effect and additive x environment interaction effect, respectively. Environments are defined as follows: FHP1 = Nkometou high P, FLP1 = Nkometou low P, FHP2 = Nkoemvone high P and FLP2 = Nkoemvone low P in field experiments. PHP1 = Nkometou high P, PLP1 = Nkometou low P, PHP2 = Nkoemvone high P and PLP2 = Nkoemvone low P in pot experiments. * and **represent the significance level of p=.05 and .01 respectively. Npod = number of pods per plant.

Table 6: Positions of epistatic QTL (E-QTL) identified by QTLNETWORK for Npod across eight environments.

Trait	QTL_i	interval_i	position_i	QTL_j	interval_j	position_j
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Npod	<i>qNpod2.1</i>	1_1067-1_0113	5.2	<i>Npod8</i>	1_0762-1_1123	23.8
	qNpod2.1	1_1067-1_0113	5.2	Npod2.4	1_0709-1_0513	63.8
	qNpod2.2	1_0062-1_0687	35.2	Npod2.3	1_0115-1_0885	59.4



QTL with both detectable additive and epistasis effects are presented in bold italic form. QTL_i and QTL_j are the two QTL involved in epistatic interaction. Interval_i = the flanking markers of QTL_i, LG= linkage group, interval_j = the flanking markers of QTL_j,

Table 7: Additive x additive and /or additive x additive x environment interaction effects of E-QTL for number of pods across eight environments.

Gene effect and environment	qNpod2.1 (QTL_i) qNpod8 (QTL_j)	qNpod2.1 (QTL_i) qNpod2.4 (QTL_j)	qNpod2.2 (QTL_i) qNpod2.3 (QTL_j)
[aa]	1.224**	1.570**	1.061**
aae FHP1	0.439	-0.48	-0.396
aae FLP1	-0.841	-1.728	-0.603
aae PHP1	-0.66	-1.473	-0.759
aaePLP1	-0.887	-1.618	-0.901
aaeFHP2	4.887**	9.676**	4.187**
aaeFLP2	-0.648	-1.022	0.195
aaePHP2	-1.322	-1.659	-0.828
aaePLP2	-1.071	-1.673	-0.876

[aa], [aae] represent epistatic main effect and epistasis x environment interaction effect, respectively. Environments are defined as follows: FHP1 = Nkometou high P, FLP1 = Nkometou low P, FHP2 = Nkoemvone high P and FLP2 = Nkoemvone low P in field experiments. PHP1 = Nkometou high P, PLP1 = Nkometou low P, PHP2 = Nkoemvone high P and PLP2 = Nkoemvone low P in pot experiments. * and **represent the significance level of p=.05 and .01 respectively.

Legend for figure 2

-  QTL with both additive [a] and additive by environment [ae] effects
-  Blue dashed lines linking QTL means the epistasis interaction has both main [aa] and epistasis x environment interaction effect [aae]

● QTL with no additive $[a]$ effect

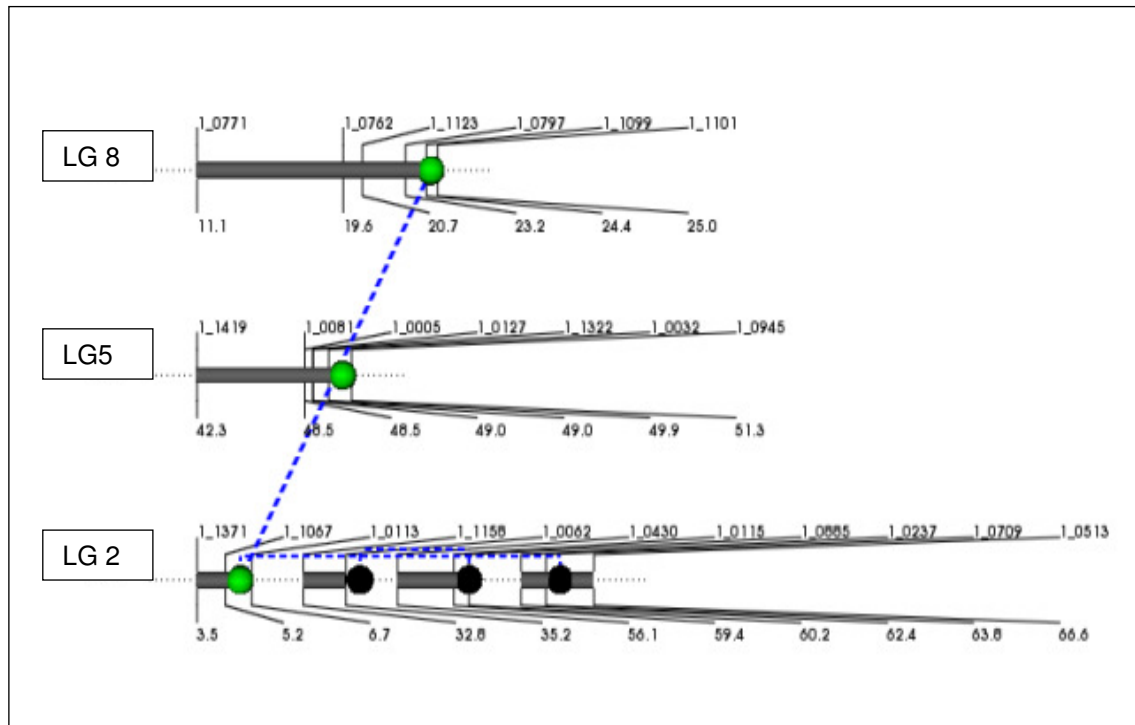


Figure 2: The predicted genetic architecture for number of pods per plant in cowpea. The figure was identified by QTLNetwork v2.0. It shows additive and epistatic QTL for number of pods per plant in cowpea. The interaction loci between epistatic QTL are shown by dashed lines.

3.2 DISCUSSION

The genetic architecture of number of pods per plant in cowpea can be determined through QTL identified under different environments. The use of different P environments not only greatly facilitated the detection of QTL, but also allowed the identification of QTL by environment interactions. Win Cartographer identified a total of eight QTL for Npod in all eight environments while QTLnetwork identified only three main QTL (M-QTL) for Npod across the eight environments: qNpod2.1, qNpod5 and qNpod8.

Both epistatic interaction effects and QTL by environment interactions effects were found to be very important genetic factors in this study. To infer epistasis between QTL, interaction effects between molecular markers were widely assayed by two-way analysis of variance [27]. But his method usually cannot give unbiased estimation for QTL parameters. The possibility of QTL by environment interactions was also indicated simply by comparing results from different environments [28] as was identified by Win Cartographer in this study. A "Constitutive" QTL, qNpod 6.2 was identified in low phosphorus conditions both in the screen house and on the field by Win Cartographer but this QTL was not detected by QTLnet work

365 software after isolating the effect of epistasis. The results of this study indicated comparing
366 QTL from different environments to identify QTL by environment interactions leads to biased
367 results. Quantitative trait loci (QTL) mapping has often been used to test for epistasis. But,
368 numerous problems hinder estimation of QTL main effects, and these problems are
369 exacerbated for QTL-by-QTL epistasis.

370 Many agronomically important traits in cowpea display a continuous phenotypic distribution.
371 These quantitatively inherited traits are typically influenced by several loci and the
372 environment, and are difficult to breed using conventional methods reliant on phenotypic
373 assessments. The progress in cowpea genomics in recent years has provided an
374 opportunity to unravel the genetic basis of important horticultural traits in this crop as well as
375 other subspecies like asparagus bean (*Vigna unguiculata* ssp *sesquipedalis*). The recent
376 cowpea consensus genetic map which includes more than 1,000 loci from as many as
377 thirteen different RIL populations [4;5] was constructed based on bead-assay SNP
378 genotyping. Among the 13 mapping populations, one is derived from yacine-5877 cross
379 used in this study. Associations between genotype and phenotype can expedite
380 development of improved varieties containing favorable alleles for several traits through
381 streamlined approaches to breeding. In this study, QTLnetwork program allowed the
382 detection of QTL with epistasis and QE interactions and estimated their effects in multi-
383 environments. QTLnetwork has also been used in other studies for similar purposes [29; 30].
384 The dissection of epistasis from other genetic components of variation is in no doubt helpful
385 in obtaining reliable estimates of QTL effects. This can be seen in the difference in main QTL
386 identified by Win Cartograper compared with QTLnetwork that estimates epistatic effects. In
387 addition, considering epistasis in QTL analysis enhances the understanding of the
388 inheritance of the traits under consideration. This study shows that, two QTL with epistasis
389 effect were found to also have significant additive by environment effects. This means that
390 the usual estimates of QTL effects could be confounded by epistatic interactions and result
391 in biased estimation unless epistatic effects are isolated.

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393 Three other loci qNpod2.2, qNpod2.3 and qNpod2.4 involved in epistasis did not have
394 any significant single effects of their own. These epistatic QTL have not been reported
395 before as focus has always been on QTL with main effects. Epistatic interactions can occur
396 between loci that have no significant main effects. WADE [31] suggested caution when
397 considering the importance of significant main effects, stating, "the existence of a statistical
398 main effect is not an indication that a gene has any effect independent of its genetic
399 background". HOLLAND et al. [32] detected several QTL for heading date and plant height in
400 oat that were involved in epistatic interactions. They also found epistasis among loci that
401 were not individually significant for trait effects and concluded that all pairs of loci should be
402 tested for epistatic interactions, not merely the significant ones. LECOMTE et al. [33] also
403 reported variability among fruit traits in tomato that were attributed to epistatic interactions
404 between QTL and the genetic backgrounds.

405 The successful detection of significant epistasis effects resulting from QTL without additive
406 and additive by environment main effects indicates that, many loci even without significantly
407 affecting the trait on their own could still affect the trait in combination with other loci. Such
408 loci may play the part of modifying agents which tend to activate other loci or modify the
409 action of other loci [34]. At a specific environment, the total effect of a QTL includes all the
410 genetic main effects and QE interaction effects.

411 Two M-QTL, qNpod2.1 and qNpod8 were also found to have both epistasis and QE effects,
412 implying that major gene or QTL could also interact with other genes under different
413 environments. PRIOUL et al. [35] reported that environmental or stress-specific gene
414 regulation affects the detection rates and approximate genomic locations of QTL.

415 From the signs of the additive effects, it shows that two QTL (with positive additive effects)
416 are from the less performant parent, Yacine. This suggests that alleles for improving these
417 traits may be dispersed within the two parents. So pyramiding of all alleles increasing these
418 traits from the two parents will produce segregants higher than the better parent.

419 Pyramiding of all these minor QTL for the improvement of Npod in cowpea may not be
420 possible through marker-assisted backcrossing (MABC), since MABC involves the transfer
421 of limited number of QTL from one genetic background to another [36]. Therefore, to
422 improve this trait, alternative and more efficient approaches (genome wide marker
423 approaches) like MARS (marker-assisted recurrent selection) and GWS (genome wide
424 selection), which allows selection for several QTL with small effects [37] will have to be used
425 in cowpea.

426 **4. CONCLUSION**

427
428 The QTLnetwork program analyzed QTL with epistasis and QTL by environment interactions
429 and estimated their effects in multi-environments. These interactions could not be detected
430 by win Cartographer. This study shows that, two QTL with epistasis effect were found to also
431 have significant additive by environment effects. This means that the usual estimates of QTL
432 effects could be confounded by epistatic interactions and result in biased estimation unless
433 epistatic effect are isolated. Since two main QTL were also found to have both epistasis and
434 QTL by environment effects it may be concluded that major gene or QTL could also interact
435 with other genes under different environments.
436

437 **COMPETING INTERESTS**

438
439
440 No competing interest.

441
442
443 All authors read and approved the final manuscript

444 **CONSENT (WHERE EVER APPLICABLE)**

445
446
447 Not applicable

448 **ETHICAL APPROVAL (WHERE EVER APPLICABLE)**

449
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451 Not applicable

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