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Presence–Absence Sampling Plans for Stink Bugs (Hemiptera: Pentatomidae) in the Midwest Region of the United States

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Abstract

Stink bugs represent an increasing risk to soybean production in the Midwest region of the United States. The current sampling protocol for stink bugs in this region is tailored for population density estimation and thus is more relevant to research purposes. A practical decision-making framework with more efficient sampling effort for management of herbivorous stink bugs is needed. Therefore, a binomial sequential sampling plan was developed for herbivorous stink bugs in the Midwest region. A total of 146 soybean fields were sampled across 11 states using sweep nets in 2016, 2017, and 2018. The binomial sequential sampling plans were developed using combinations of five tally thresholds at two proportion infested action thresholds to identify those that provided the best sampling outcomes. Final assessment of the operating characteristic curves for each plan indicated that a tally threshold of 3 stink bugs per 25 sweeps, and proportion infested action thresholds of 0.75 and 0.95 corresponding to the action thresholds of 5 and 10 stink bugs per 25 sweeps, provided the optimal balance between highest probability of correct decisions (\geq 99%) and lowest probability of incorrect decisions (\leq 1%). In addition, the average sample size for both plans (18 and 12 sets of 25 sweeps, respectively) was lower than that for the other proposed plans. The binomial sequential sampling plan can reduce the number of sample units required to achieve a management decision, which is important because it can potentially reduce risk/cost of management for stink bugs in soybean in this region.

Keywords: soybean, stink bug, binomial sampling, insect sampling, resampling software

S oybean, *Glycine max* (L.) Merr. (Fabales: Fabacea), is one of the most valuable crops globally, representing one of the largest sources of vegetable oil and animal protein feed (Pagano and Miransari 2016). The United States leads the world in soybean production and is the second in exports, comprising about 90% of the country's total oil-seed production (U.S. Department of Agriculture-Economic Research Service [USDA-ERS] 2020). The Midwest region of the United States accounts for 82% of the soybean acreage in the United States (U.S. Department of Agricultural Statistics Service [USDA-NASS] 2019). Worldwide, stink bugs (Hemiptera: Pentatomidae) are significant pests of this crop (Kogan 1976). In the Midwest region, stink bugs were historically insignificant pests (McPherson and McPherson 2000). However, in recent years, the threat posed to soybean production by stink bugs in the region is increasing (Koch et al. 2017).

The increasing risk posed by stink bugs can be attributed to a few factors (Koch et al. 2017, Pezzini et al. 2019b). First, native stink bug species abundance is increasing in agricultural crops in the Midwest region (Koch et al. 2017), perhaps due to warmer winter temperatures or the increased adoption of reduced-tillage systems (Panizzi 2015, Kistner 2017, McPherson 2018). Across the region, the predominant species of native stink bugs in soybean are the green stink bug, Chinavia hilaris (Say) (Hemiptera: Pentatomidae), brown stink bugs, Euschistus servus servus (Say) (Hemiptera: Pentatomidae) and Euschistus servus euschistoides (Vollenhoven) (Hemiptera: Pentatomidae), onespotted stink bug, Euschistus variolarius (Palisot de Beauvois) (Hemiptera: Pentatomidae), and red-shouldered stink bug, Thyanta custator accerra McAtee (Hemiptera: Pentatomidae) (Koch and Pahs 2014, Koch and Rich 2015, Pezzini et al. 2019b). Second, invasive stink bugs are spreading into this region (Tindall and Fothergill 2011, Tindall et al. 2012, Koch 2014, Koch et al. 2018). An example is the brown marmorated stink bug, Halyomorpha halys (Stal) (Hemiptera: Pentatomidae), first detected in North America in 1996 (Hoebeke and Carter 2003). Since then, H. halys has spread to 46 U.S. states and 4 Canadian provinces, including 11 states in the Midwest region (Northeastern IPM Center [NIPMC] 2020). Growers in the Mid-Atlantic region reported up to 50% yield reduction in soybean due to injuries caused by H. halys (Leskey et al. 2012).

In soybean, stink bugs prefer to feed on the reproductive plant parts such as the seeds and pods, resulting in irreversible damage that leads to impacts on seed quality, yield, and germination rates (reviewed by McPherson and McPherson [2000] and Koch et al. [2017]). This potential damage to soybean necessitates the development of practical, cost-effective sampling plans for making integrated pest management (IPM)-based control decisions (Binns et al. 2000). The time required to sample pest insects is a key bottleneck to effective monitoring in the field. Sampling for stink bugs in soybean can be done with a sweep net or drop cloth (Koch et al. 2017). Both methods are efficient, but sweeping is found to be more convenient and costeffective for several stink bug species (Todd and Herzog 1980, Sane et al. 1999, Koch et al. 2017).

Sampling plans can have different purposes, such as detection, estimation, and decision making (Moon and Wilson 2008, Pezzini et al. 2019a). Sequential sampling plans can be more efficient than fixed sample size sampling plans, allowing for more flexibility in sample size while reducing sampling effort, and retaining high levels of precision (Binns et al. 2000). Density estimation, or enumerative sequential sampling, is used to estimate pest density in the field based on a pre-established precision level, and even though it can be utilized for decision making (Hodgson et al. 2004), this approach is often used for research purposes due to high sample size requirements (Hutchison 1994, Galvan et al. 2007, Pezzini et al. 2019a). For decision making in IPM programs, binomial sequential sampling plans, which incorporate a "tally threshold," are an attractive option. The tally threshold (i.e., number of insects necessary to consider a sample unit "infested") requires only information on the presence or absence of the targeted pest above a specified level to make a decision, resulting in a more efficient, time-saving option (Jones 1994, Burkness and Hutchison 2009, Paula-Moraes et al. 2011, Araujo et al. 2020, Lindenmayer et al. 2020). In addition, binomial sequential sampling plans often facilitate a rapid decision when pest densities are much lower or higher than the economic threshold, potentially reducing sample size by up to 50% compared to fixed sample size plans (Jones 1994, Burkness and Hutchison 1997, 2009; Hodgson et al. 2004).

There have been no binomial sequential sampling plans developed for stink bugs in the Midwest region. Given the practicality and

efficiency of binomial sequential sampling plans, and the need to aid growers with decision making for improved IPM of these pests, the objective of this study was to develop and validate the performance of several binomial sequential sampling plans. The sampling plans we evaluated included the composite action thresholds (all herbivorous stink bug species combined) currently used in the Midwest region i.e., 5 stink bugs per 25 sweeps for soybean grown for seed and 10 stink bugs per 25 sweeps for soybean grown for grain (Kogan 1976, Koch et al. 2017). We also proposed several different tally thresholds that can be used in the field for characterizing a sample unit as infested. Finally, the sampling plan combinations were developed and validated using resampling software (Naranjo and Hutchison 1997), which included estimates of the probability of making correct decisions (i.e., treat or not-treat). Results of this study provide a decision-making framework for IPM implementation to be used for herbivorous stink bugs in soybean, which is an advancement from the work by Pezzini et al. (2019a) to develop a sequential sampling plan for density estimation.

Materials and Methods

Insect Data

Stink bug nymphs and adults were sampled from 146 soybean fields across 11 states in the Midwest region during 2016, 2017, and 2018 (Table 1). For the data collected in 2016 and 2017, sampling protocols (i.e., field sites and data collection) are described in Pezzini et al. (2019a), where an enumerative sequential sampling plan was developed. Briefly, sampling occurred in eight states (63 fields) in 2016 and nine states (62 fields) in 2017 (Table 1). In each state, one to four sites were selected with 13–368 km between sites, and at each site, one to four fields were sampled. In 2018, 21 fields were sampled in eight states (Table 1). In each state, two separate fields were sampled, except for Michigan which had seven fields. Within each state, fields were 0.92–116 km apart. In general, fields were sampled every week from R1 to R8 soybean growth stages (i.e., beginning bloom to full maturity, respectively) (Fehr and Caviness 1977).

State	2016	2017	2018
Illinois	0	0	2
Indiana	8	8	2
Kansas	8	7	0
Michigan	0	8	7
Minnesota	12	8	2
Missouri	8	4	0
Nebraska	7	8	2
North Dakota	8	8	2
Ohio	8	8	2
South Dakota	4	3	0
Wisconsin	0	0	2
Total	63	62	21

Table 1. Number of fields sampled for herbivorous stink bugs in soybean across the participating states in the Midwest region of the United States for 2016, 2017, and 2018

Adapted from Pezzini et al. (2019a).

Sampling was done using sweep nets (39-cm net diameter). A sample unit was a set of 25 sweeps (i.e., sample unit size of 25 sweeps). Sweeps were performed using vertical pendulum-style swings of the net through two adjacent rows of soybean as the sampler walked between the rows, resulting in the sweep net passing only once through the same plants in the field; one full pendulum-style swing counted as one sweep (Kogan and Pitre 1980). In 2016 and 2017, 12-50 sample units were collected from randomly selected locations at the field edge (i.e., < 10 m into the field) and in the field interior (i.e., > 10 m into the field) (Pezzini et al. 2019a,b). In 2018, 15 sample units were collected from the interior of each field (i.e., > 10 m into the field) on a given date. For all years, at least 10 m separated sample units in each field. The contents of each set of sweeps was transferred into plastic zipper-locking bags (20.3 \times 25.4 cm) and brought to the laboratory for later processing. The contents of the bags were sorted to retain only stink bug nymphs and adults and sent to the University of Minnesota for identification. Nymphs and adults were identified to genus, species, and subspecies using DeCoursey and Esselbaugh (1962), Evans (1985), McPherson and McPherson (2000), Rider (2012), and Paiero et al. (2013). For the purpose of this research, only the herbivorous stink bugs were quantified.

Binomial Sequential Sampling Plans

A total of 885 data sets (i.e., each data set was a group of sample units collected on a given date from a given field) were collected over all years. However, data sets with a mean density of zero (i.e., without any stink bugs; 178 data sets) were excluded from the analysis. The binomial sequential sampling plans were developed and validated from 707 data sets using Resampling for Validation of Sampling Plans (RVSP) software v. 2.0 (Excel add-in) developed by Naranjo and Hutchison (1997). Steps to develop the binomial sequential sampling plans followed methodologies used by Burkness et al. (1999), Hodgson et al. (2004), Galvan et al. (2007), and Lindenmayer et al. (2020). Several parameters are needed to create the stop-lines for the Wald's sequential probability ratio test (Wald 1947); 1) tally threshold, 2) proportion infested action threshold (based on proportion of infested sample units), 3) upper and lower boundaries around the proportion infested action threshold, and 4) type I and II error rates (Jones 1994). The type I error (α) is defined as the probability of making a decision to treat when proportion of infested sample units is below the proportion infested action threshold and type II error (β) is defined as the probability of making a decision to not treat when proportion of infested sample units is above the proportion infested action threshold. The lower and upper boundaries were set at 0.03 (above or below the proportion infested action threshold), and type I and II errors were set at 0.10 (Binns 1994, Burkness and Hutchison 2009, Paula-Moraes et al. 2011, Araujo et al. 2020). For all the tally threshold and proportion infested action threshold combinations, the parameters were kept constant. For each proportion infested action threshold and tally threshold combination, the stop-lines were calculated using Wald's plan (Wald 1947). The 707 data sets were iteratively resampled using 500 resampling bouts (with replacement) until a decision to treat or not to treat was made. The software simulations provided the average proportion of infested sample units, the operating characteristic (OC) function, and the average sample number (ASN). The OC corresponds to the probability of not taking action against an insect population relative to the observed proportion of infested sample units (Onsager 1976), and ASN represents the average sample size required for making a decision.

We evaluated multiple combinations of tally threshold and action threshold to identify those that provided the best sampling outcomes. Two mean densities were used to develop the proportion infested action threshold (i.e., action thresholds in terms of proportion of infested sample units). These densities, which are the recommended action thresholds for stink bugs in soybean in the Midwest region, are 5 stink bugs per 25 sweeps for soybean grown for seed and 10 stink bugs per 25 sweeps for soybean grown for grain (Kogan 1976, Koch et al. 2017). In addition, we independently evaluated five tally thresholds (i.e., 1, 2, 3, 4, and 5 stink bugs per 25 sweeps), meaning that for a sample unit (i.e., set of 25 sweeps) to be considered infested, at least

one, two, three, four, or five stink bugs must be present, respectively. For each tally threshold, the relationship between the mean density and proportion of infested sample units based on that tally threshold was used to calculate proportion infested action threshold for the densities of 5 and 10 stink bugs per 25 sweeps.

For decision-making purposes, the efficiency and precision of a sampling plan are what best characterize its appropriateness (Galvan et al. 2007). The OC function determines precision and ASN function determines efficiency (Binns and Nyrop 1992). Therefore, to validate the sampling plans' precision, OC functions were plotted against the observed proportion of infested sample units for each tally threshold and proportion infested action threshold combination. In addition, the efficiency of the sampling plans was validated by plotting the ASN functions against the observed proportion of infested sample units for each tally threshold and proportion infested action threshold combination. Models for the relationships between mean density and proportion of infested sample units, OC, and ASN were fitted using the software, TableCurve 2D (Systat Software, Inc., San Jose, CA). The predicted lines for the relationship between mean density and proportion of infested sample units and OC functions were fitted using a logistic dose-response function:

$$[y = a/(1 + (x/b)^{c})],$$

where *a*, *b*, and *c* are parameters to be estimated, and *x* is mean density of stink bugs. These parameter estimates are presented in Supplementary Tables S1 and S2.

The ASN functions were fitted using a Pearson VII function:

$$\left[y = a + b/(1 + 4 \times ((x - c)/d)^2 (2^{(1/e)-1}))^e \right],$$

where, *a*, *b*, *c*, *d*, and *e* are parameters to be estimated, and *x* is the mean density of stink bugs. These parameter estimates are presented in Supplementary Table S3.

To aid in the validation process, a decision probability matrix was used to evaluate the accuracy of the sampling plans, similar to the approach used by Calvin et al. (1986), Burkness et al. (1999), Hodgson et al. (2004), Galvan et al. (2007), Burkness and Hutchison (2009), and Paula-Moraes et al. (2011). The results obtained from the OC curves, jointly with the observed and average proportion infested, were used in the decision probability matrix to calculate the probability of making a correct decision (i.e., treating when population exceeds the threshold or not treating when the population is below the threshold), by comparing the observed proportion infested (i.e., average proportion of infested sample units calculated from actual field data) to the average proportion infested (i.e., average proportion of infested sample units generated from the 500 resampling bouts in the software simulation) at each action threshold. The decision probability matrix contains four cells, including correct decisions to treat (cell A) and not treat (cell D), and incorrect decisions to not treat (cell B) and to treat (cell C). A decision to correctly treat (A) or not treat (D) is made when the observed and average proportion infested both exceeded or did not exceed, respectively, the proportion infested action threshold. A decision to incorrectly not treat (B) is made when the observed proportion infested exceeded the proportion infested action threshold and the average proportion infested did not exceed the proportion infested action threshold. Conversely, a decision to incorrectly treat (C) is made when the observed proportion infested did not exceed the proportion infested action threshold and the average proportion infested exceeded the proportion infested action threshold. In the probability matrix, the decision for each data set evaluated is determined by the density and must be correct or incorrect (i.e., A + B or C + D must equal 1) (Burkness et al. 1999, Hodgson et al. 2004, Galvan et al. 2007). The probability of making correct decisions to treat or not to treat was summed across all data sets at each tally threshold and proportion infested action threshold combination with

$$1 = \sum p_i (A_i + D_i) + \sum p_i (B_i + C_i) ,$$

where p_i is the proportion of *n* data sets represented by data set *i*, and *A*, *D*, *B*, and *C* were described above.

The correct and incorrect decisions were totaled for each combination of tally threshold and proportion infested action threshold. The best sampling plan was then selected based on the greatest probability of making correct decisions while minimizing the probability of incorrect decisions, and on the balance among OC, ASN, and actual α and β error values. Based on this, graphs with decision stop-lines for the best combinations of tally threshold and proportion infested action threshold were developed (Wald 1947). The proportion of infested sample units can be calculated and compared with the decision stop-lines. From this, a management decision can be achieved if the proportion is in the "treat" or "do not treat" area of the graphs. If the value is in the "continue sampling" area, additional sample units will be required before a management decision to treat or not treat is determined when the lower stop-line intercepts the x-axis.

Results

Across all states and years, 9,433 specimens from 17 species of adults and six genera of nymphs of herbivorous stink bugs were collected from soybean fields (Table 2). The mean number of herbivorous stink bugs per 25 sweeps ranged from 0.02 to 15.58 for the 707 data sets with at least one stink bug (i.e., each data set was a group of sample units collected on a given data from a given field). Proportion infested action thresholds were calculated for each tally threshold based on the relationship between mean density and proportion of infested sample units for the densities of 5 and 10 stink bugs per 25 sweeps (Fig. 1). For the mean density of five stink bugs per 25 sweeps and tally thresholds of 1, 2, 3, 4, and 5 stink bugs per 25 sweeps, the calculated proportion infested action threshold values were 0.95, 0.86, 0.75, 0.62, and 0.49, respectively. For the mean density of 10 stink

Species	Total number of individuals	Relative abundance (%)
Adults		
Banasa dimidiata	1	0.03
Chinavia hilaris	916	31.10
Coenus delius	3	0.10
Cosmopepla lintneriana	9	0.31
Euschistus servus servus	105	3.57
Euschistus servus euschistoides	69	2.34
Euschistus servus hybrid	36	1.22
Euschistus tristigmus luridus	44	1.49
Euschistus tristigmus tristigmus	20	0.68
Euschistus variolarius	1,539	52.26
Halyomorpha halys	94	3.19
Holcostethus limbolarius	4	0.14
Mormidea lugens	1	0.03
Oebalus pugnax	8	0.27
Thyanta calceata	6	0.20
Thyanta custator accerra	89	3.02
Trichopepla semivittata	1	0.03
Nymphs		
Chinavia hilaris	1,438	22.16
Chlorochroa spp.	2	0.03
Euschistus spp.	4,853	74.80
Halyomorpha halys	141	2.17
Oebalus pugnax	31	0.48
<i>Thyanta</i> spp.	23	0.35

Table 2. Relative abundance of stink bug nymphs and adults collected from soybean from 2016 to 2018 in the Midwest region of the United States.

bugs per 25 sweeps and tally thresholds of 3, 4, and 5 stink bugs per 25 sweeps, the calculated proportion infested action threshold values were 0.95, 0.94, and 0.88, respectively. Proportion infested action threshold values that correspond to the mean density of 10 stink bugs per 25 sweeps for the tally thresholds of 1 and 2 stink bugs per 25 sweeps were not included in the OC and ASN calculations because their associated upper boundaries (i.e., 0.03 above the proportion infested action threshold) would exceed 1.

The OC function curves for each proportion infested action threshold associated with the respective tally thresholds showed varying levels of precision among sampling plans. For a mean density threshold of 5 stink bugs per 25 sweeps, the OC for tally thresholds of 1, 2, 3, 4, and 5 stink bugs per 25 sweeps were 0.36, 0.36, 0.51, 0.46, and

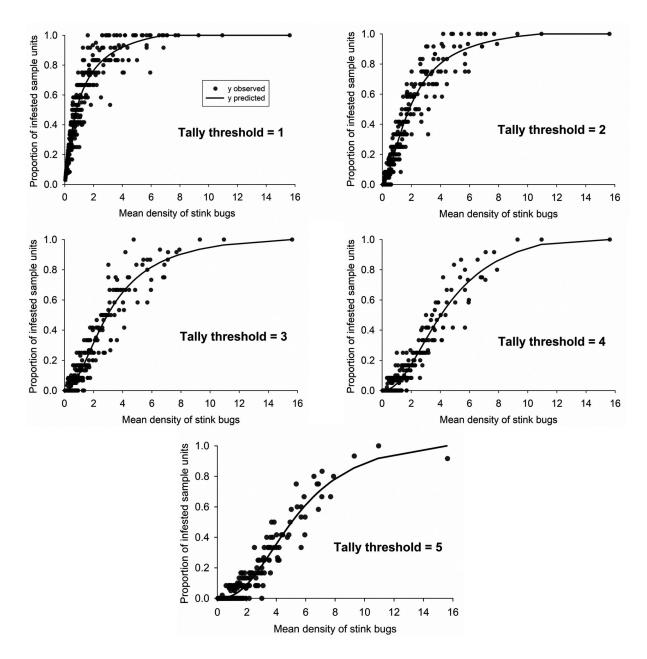


Fig. 1. Relationship between the proportion of infested sample units (i.e., sets of 25 sweeps) and mean density of herbivorous stink bugs (i.e., bugs per 25 sweeps) for tally thresholds of \geq 1, 2, 3, 4, or 5 stink bugs per sample unit.

0.42 respectively (Fig. 2A, C, E, G, and I). Ideally, when $\alpha = \beta$, the OC should be equal to 0.5 at the proportion infested action threshold (i.e., 50% chance of treating or not treating) (Naranjo and Hutchison 1997, Binns et al. 2000). For all the sampling plans, except for tally threshold of 3 stink bugs per 25 sweeps, the OC values at the



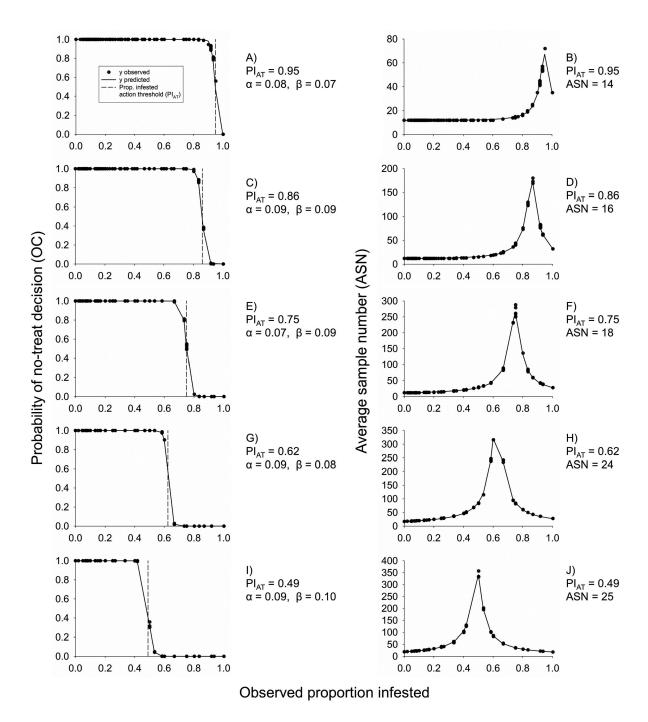


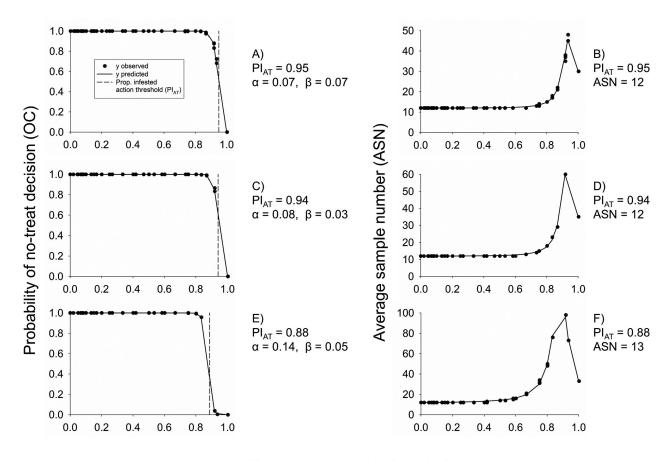
Fig. 2. OC and ASN functions for binomial sequential sampling plans for action thresholds based on the proportion of infested sample units that correspond to a mean density of five stink bugs per 25 sweeps. The OC (panels A, C, E, G, and I) and ASN (panels B, D, F, H, and J) functions were plotted against the observed proportion infested obtained from resampling software. Panels A and B correspond to tally threshold of 1; C and D correspond to tally threshold of 2; E and F correspond to tally threshold of 3; G and H correspond to tally threshold of 4; I and J correspond to tally threshold of 5. Proportion infested action thresholds (PI_{AT}) and actual α and β error values are shown, based on preset values of $\alpha = \beta = 0.10$ (see Table 3).

proportion infested action threshold were less than 0.5, suggesting the sampling plans were conservative, that is, treating at the proportion infested action threshold was more likely to occur. For the tally threshold of 3 stink bugs per 25 sweeps, the sampling plan was slightly liberal (OC = 0.51), that is, not treating at the proportion infested action threshold was more likely to occur. For the mean density threshold of 10 stink bugs per 25 sweeps, the OC for tally thresholds of 3, 4, and 5 stink bugs per 25 sweeps were 0.39, 0.32, and 0.36 respectively (Fig. 3A, C, and E). Because the OC values at the proportion infested action threshold were less than 0.5, these sampling plans can be considered conservative.

Resampling analysis resulted in eight summary outputs that were used to develop the treatment decision probability matrix to determine the best possible combination of tally threshold and proportion infested action threshold (Table 3). All simulations had high probabilities (i.e., 0.994-0.999) of correct decisions (A + D) and low probabilities (i.e., 0–0.005) of incorrect decisions (B + C) (Table 3). The ASN required to reach a decision ranged from 15 to 25 and 12 to 13 sample units for the different combinations of tally thresholds and proportion infested action thresholds that corresponded to the mean densities of 5 and 10 stink bugs per 25 sweeps, respectively (Table 3). The maximum ASN required to reach a decision is near or at the proportion infested action threshold. The maximum ASN ranged from 67 to 357 (Fig. 2B, D, F, H, and J) and 49 to 88 (Fig. 3B, D, and F) sample units for the different combinations of tally thresholds and proportion infested action thresholds that corresponded to a mean density of 5 and 10 stink bugs per 25 sweeps, respectively.

Based on a pre-established criteria to select the optimum combinations of tally thresholds and proportion infested action thresholds (i.e., correct treat + not treat > incorrect treat + not treat decisions; and incorrect treat > incorrect not treat decisions; balance between actual α and β values, and ASN), a tally threshold of 3 stink bugs per 25 sweeps was selected as the optimal tally threshold to be used for field implementation of the binomial sequential sampling plans that represented the action thresholds of 5 and 10 stink bugs per 25 sweeps. The use of one tally threshold for all field situations facilitates the development and execution of binomial sampling plans for herbivorous stink bugs. This tally threshold represents the best suitable balance

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Observed proportion infested

Fig. 3. OC and ASN functions for binomial sequential sampling plans for action thresholds based on the proportion of infested sample units that correspond to a mean density of 10 stink bugs per 25 sweeps. The OC (panels A, C, and E) and ASN (panels B, D, and F) functions were plotted against the observed proportion infested obtained from resampling software. Panels A and B correspond to tally threshold of 3; C and D correspond to tally threshold of 4; E and F correspond to tally threshold of 5. Proportion infested action thresholds (PI_{AT}) and actual α and β error values are shown, based on preset values of $\alpha = \beta = 0.10$ (see Table 3).

among the highest probability of correct (i.e., $A + D \ge 99\%$) and lowest probability of incorrect (i.e., $B + C \le 1\%$) decisions, while minimizing actual α (i.e., for proportion infested action threshold of 0.75 and 0.95, $\alpha = 0.07$) and β (i.e., for proportion infested action threshold of 0.75 and 0.95, $\beta = 0.09$ and 0.07, respectively) error rates and ASN (i.e., for proportion infested action threshold of 0.75 and 0.95, ASN = 18 and 12, respectively) compared to the other tally thresholds examined.

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Table 3. Decision matrix summary for the probability of correct and incorrect decisions, in relation to tally thresholds and action thresholds for a binomial sequential sampling plan for herbivorous stink bugs in the Midwest region of the United States.

				Correct decisions		Incorrect decisions				
AT ^a	Pl_{AT}^{b}	α ^c	β ^c	\mathcal{A}^{d}	D^e	$A + D^f$	B ^g	C ^h	$B + C^i$	ASN
Tally th	reshold =	: 1								
5	0.95	0.083	0.078	0.048	0.948	0.996	0.000	0.003	0.003	14.55
Tally th	reshold =	: 2								
5	0.86	0.098	0.097	0.036	0.960	0.997	0.001	0.001	0.002	16.47
Tally th	reshold =	: 3								
5	0.75	0.077	0.095	0.029	0.965	0.994	0.004	0.000	0.005	18.47
10	0.95	0.077	0.075	0.005	0.993	0.998	0.000	0.001	0.001	12.40
Tally th	reshold =	: 4								
5	0.62	0.096	0.082	0.028	0.971	0.999	0.000	0.000	0.000	23.87
10	0.94	0.083	0.032	0.004	0.995	0.999	0.000	0.000	0.000	12.34
Tally threshold = 5										
5	0.49	0.093	0.105	0.028	0.970	0.998	0.001	0.000	0.001	24.52
10	0.88	0.144	0.057	0.004	0.995	0.999	0.000	0.000	0.000	12.59

Results are based on the observed and average proportion infested outcomes, and OC results from the resampling validations using independent data sets from 11 states, 2016–2018.

^a Mean stink bug density per 25 sweeps that are the current action thresholds (AT) for stink bugs (i.e., soybean grown for seed = 5 stink bugs per 25 sweeps; soybean grown for grain = 10 stink bugs per 25 sweeps).

^b Proportion infested action threshold (PI_{AT}), based on the proportion of infested sample units and mean relationship curves (Fig. 1).

^c Type I error (α) is defined as the probability of making a treatment decision when proportion infested (PI) is below the AT. Type II error (β) is defined as the probability of making a no-treat decision when PI is above the AT. Actual error values were estimated from the fitted curves in Figs. 2 and 3.

^{*d*}A, probability of making a correct treat decision.

^eD, probability of making a correct no-treat decision.

 $^{f}A + D$, total probability of making a correct treat or no-treat decision.

^g B, probability of making an incorrect no-treat decision.

^{*h*}C, probability of making an incorrect treat decision.

 $^{\prime}B + C$, total probability of making an incorrect treat or no-treat decision.

Based on the above results, graphs with decision stop-lines for the tally threshold of 3 stink bugs per 25 sweeps and proportion infested action threshold of 0.75 (i.e., corresponding to an action threshold of 5 stink bugs per 25 sweeps) and 0.95 (i.e., corresponding to an action threshold of 10 stink bugs per 25 sweeps) were developed (Fig. 4A and B). When the proportion infested action threshold is 0.75 (i.e., 75% of

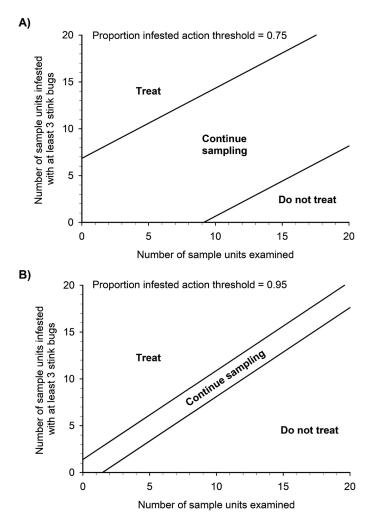


Fig. 4. Decision stop-lines for the binomial sequential sampling plans for herbivorous stink bugs in the Midwest region of the United States, where sample unit size = 25 sweeps, $\alpha = \beta = 0.10$, and tally threshold = 3 (three or more stink bugs per sample unit to be considered infested). Panel A represents the proportion infested action threshold of 0.75, which corresponds to a mean density action threshold of 5 stink bugs per 25 sweeps (upper line is y = 6.84 + 0.75x and lower line is y = -6.84 + 0.75x). Panel B represents the proportion infested action threshold of 0.95, which corresponds to a mean density action threshold of 0.95, which corresponds to a mean density action threshold of 10 stink bugs per 25 sweeps (upper line is y = -1.39 + 0.95x). For implementation, we recommend a minimum of four sample units to make a decision. If a decision cannot be made after collecting 20 sample units, return to the field and sample again in 10–14 d.

infested sample units), a minimum of nine sample units must be sampled to make a decision (Fig. 4A). When the proportion infested action threshold is 0.95 (i.e., 95% of infested sample units), a minimum of two sample units must be sampled to make a decision (Fig. 4B).

Discussion

In this study, we developed and validated eight binomial sequential sampling plans based on five tally thresholds and two proportion infested action thresholds, using RVSP software based on Wald's sequential probability ratio test (Naranjo and Hutchison 1997) for herbivorous stink bugs in the Midwest region. The goal of this study was to identify the sampling plan combination that provided the most efficient decision-making outcome. Unlike enumerative sequential sampling plans, which are typically evaluated based on the precision level (Southwood 1978), binomial sequential sampling plans are evaluated based on Monte Carlo simulations (e.g., theoretical distribution) or by bootstrap simulations, examining the OC and ASN functions (Jones 1994, Naranjo and Hutchison 1997). The binomial sequential sampling plans in this study were evaluated using bootstrap simulations. This approach is usually more robust and more predictive than the Monte Carlo method (Fowler and Lynch 1987, Hutchison et al. 1988, Nyrop and Binns 1990), because actual field data are used to develop OC functions (Hutchison 1994, Naranjo and Hutchison 1997). The OC obtained from the resampling software was used with a decision probability matrix to select the optimal tally threshold and proportion infested action threshold (Burkness et al. 1999, Hodgson et al. 2004, Galvan et al. 2007).

All sampling plans delivered highly accurate classifications (i.e., the probability of making a correct treat or no-treat decision was always > 99%). For tally thresholds \leq 3 stink bugs per 25 sweeps, and action thresholds corresponding to a mean density of five stink bugs per 25 sweeps, the ASN was \leq 18 sample units. As the tally threshold increased (i.e., 4 and 5 stink bugs per 25 sweeps), the ASN increased by approximately 28%. For tally thresholds of 3, 4, and 5 stink bugs per 25 sweeps and action thresholds corresponding to a mean density of 10 stink bugs per 25 sweeps, the ASN was near the minimum sample size of 12 sample units. A tally threshold of 3 stink bugs per 25 sweeps was selected as the optimal tally threshold to be used in the field, because this tally threshold presented the proper balance among OC, ASN, actual α and β , and high probability of correct decisions compared to other proposed tally thresholds. Although all sampling plans delivered highly accurate decisions, a tally threshold of 3

stink bugs also provided the smallest actual α and β error values over all the sampling plans. The α and β error values are considered variables of the data and the resampling analysis (Naranjo and Hutchison 1997, Subramanyam et al. 1997, Paula-Moraes et al. 2011). The actual α and β values were lower than the values originally input in RVSP (0.10) and represent a reduced probability of committing type I (implementing control measures when they are not necessary) and type II (not implementing control measures when they are necessary) errors. This is essential in today's soybean production where profit margins are narrow and making such errors would result in either unnecessary insecticide applications, which increase financial costs and environmental contamination, or missing necessary insecticide applications, which could result in significant yield loses that reduce financial gains. Of these, the latter error is potentially more serious for producers, and any sampling method with a high type II error rate will be unacceptable.

Stink bugs have aggregated spatial patterns in multiple crops (Espino et al. 2008, Reay-Jones et al. 2009, Babu and Reisig 2018, Fernandes et al. 2019, Pezzini et al. 2019a). With highly aggregated species, generally higher sample sizes are needed with enumerative sequential sampling plans designed to estimate insect density in the field (Jones 1994, Reay-Jones et al. 2009). Because binomial sequential sampling plans only classify the pest as either present or absent based on a tally threshold rather than a full count, this approach can greatly reduce sampling costs for highly aggregated pests (McGraw and Koppenhofer 2009). Overall, the ASN of our proposed sampling plans with a tally threshold equal to 3 stink bugs per 25 sweeps was 18 and 12 sample units for proportion infested action threshold of 0.75 and 0.95, respectively, which are reasonable numbers for use in field-based decision making. Recommended sample sizes for stink bug sampling in soybean vary across the United States, ranging from two to 12 sample units with variable sample unit sizes (see Table 1 in Pezzini et al. [2019a]). Based on the ASN estimates for our proposed binomial sequential sampling plans, a soybean field could be sampled in approximately 42 and 28 min for ASN of 18 and 12 sample units, respectively. These time estimates were based on our recorded times of 1.22 min for walking between sample units and collecting a sample unit (unpublished data), and an additional 1.12 min for counting

the stink bugs in a sample unit in the field, i.e., 50% of the time required to count stink bugs in two sets of 25 sweeps in cotton (Reay-Jones et al. 2009). A reasonable next step in this effort is implementing this approach across the region and determining whether these time estimates are representative.

Pezzini et al. (2019a) proposed an enumerative sequential sampling plan, with a desired precision of 0.25, for herbivorous stink bugs in the Midwest region and found that an ASN of 40–42 sample units were needed. Our findings represent a significant reduction in sample size requirements when compared to an enumerative sequential sampling plan while retaining high levels of accuracy, efficiency, and improved practicality. Similarly, Hodgson et al. (2004) found that a binomial sequential sampling plan developed for the soybean aphid, *Aphis glycines* Matsumura (Hemiptera: Aphididae), improved efficiency in IPM decision making with an ASN of 11 plants compared to an ASN of 38 plants for a desired precision level of 0.25 for an enumerative sequential sampling plan.

As with most binomial sequential sampling plans, the greatest ASN for decision making occur near the action thresholds (Jones 1994, Naranjo and Hutchison 1997, Paula-Moraes et al. 2011). In a binomial sequential sampling plan, the density of the insect population impacts the number of sample units collected (Paula- Moraes et al. 2011). When stink bug densities are low or high, the binomial sequential sampling plans proposed here will provide the greatest savings in sampling since a no-treat or treat decision will be reached quickly.

For binomial sequential sampling, the point where the lower stopline intercepts the x-axis can indicate the minimum number of sample units required to reach a decision to treat or not treat (Subramanyam et al. 1997, Burkness and Hutchison 2009); however, in practice, we recommend that at least four sample units be collected prior to making a decision (Espino et al. 2008, Reay-Jones et al. 2009). Furthermore, because this is a sequential sampling plan, the proportion of infested sample units can potentially indicate that it is necessary to 'continue sampling' indefinitely. One of the main advantages of a binomial sequential sampling plan is that it is practical (i.e., a decision could be made after each sample unit), minimizing the effort and

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time of the scout. Therefore, based on our analysis, we recommend a limit of 20 sample units to arrive at a decision. If 20 sample units have been collected, and no decision has been reached, the field should be resampled in 10–14 d.

Binomial sequential sampling plans have been developed for beatcloth sampling for stink bugs in soybean in Brazil (Souza et al. 2014, Fernandes et al. 2019). To our knowledge, this is the first proposed binomial sequential sampling plan for herbivorous stink bugs in soybean in the Midwest region. In Brazil and the United States, which are worldwide leaders in soybean production, IPM can be challenging, where the grower is confronted with the need for a guicker and easier pest sampling methodology that may reduce prophylactic insecticide applications that occur when scouting is too tedious and time intensive (Bueno et al. 2020). Results of this research found that the binomial sequential sampling plans can improve efficiency by reducing the number of sample units required to reach a management decision for the region. In addition, the sampling plan parameters used in this study can easily be adjusted to accommodate other action thresholds and allowable error rates suitable for a specific geographic region. However, continued efforts should be made to evaluate the costs and benefits of the proposed binomial sequential sampling plans across the Midwest region (e.g., Hodgson et al. 2007).

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Supplementary Data Supplementary Tables S1 – S3 follow the References.

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Supplemental Table S1. Parameter estimates from a logistic dose-response function used to fit the relationship between the proportion of infested sample units as a function of the mean density of stink bugs per 25 sweeps

$\mathrm{T}\mathrm{T}^{a}$	Pa	rameter estimates ± SEI	\mathbb{R}^2	F 2, 704	Р	
	a	b	С			
1	1.12 ± 0.02	0.99 ± 0.05	-1.07 ± 0.02	0.93	5103.06	< 0.001
2	1.06 ± 0.02	1.99 ± 0.07	-1.60 ± 0.04	0.94	5564.02	< 0.001
3	1.05 ± 0.03	3.10 ± 0.11	$\textbf{-1.92} \pm 0.05$	0.93	4909.61	< 0.001
4	1.11 ± 0.03	4.43 ± 0.15	$\textbf{-2.12}\pm0.06$	0.94	5565.71	< 0.001
5	1.08 ± 0.03	5.37 ± 0.17	-2.42 ± 0.07	0.93	5054.42	< 0.001

^{*a*} This relationship for the data sets at a given tally threshold (TT) was used to transform the mean density action thresholds to proportion infested action thresholds.

^b Equation type is a logistic dose response of the form: $y = a/(1 + (x/b)^{c})$.

Supplemental Table S2. Parameter estimates from a logistic-dose response formula used to fit the operating characteristic (OC) curves as a function of the observed proportion of infested sample units obtained from resampling software (RVSP), using field data for each tally threshold (TT) and proportion infested action threshold (PI_{AT}) combination.

PIAT	TT	Par	rameter estimates ± SEM	\mathbb{R}^2	F 2, 704	Р	
	-	а	b	С			
0.95^{b}	1	0.99 ± 0.00	0.94 ± 0.00	77.11 ± 0.72	0.99	381832.70	< 0.001
0.86^{b}	2	0.99 ± 0.00	0.85 ± 0.00	63.82 ± 0.19	0.99	3693079.00	< 0.001
0.75^{b}	3	0.99 ± 0.00	0.75 ± 0.00	59.18 ± 0.43	0.99	2011823.00	< 0.001
0.95 ^c	3	0.99 ± 0.00	0.94 ± 0.00	67.36 ± 0.74	0.99	226607.00	< 0.001
0.62^{b}	4	1.00 ± 0.00	0.62 ± 0.00	58.20 ± 0.14	0.99	32948592.00	< 0.001
0.94 ^{<i>c</i>}	4	0.99 ± 0.00	0.93 ± 0.00	91.17 ± 3.17	0.99	1507724.00	< 0.001
0.49^{b}	5	0.99 ± 0.00	0.48 ± 0.00	35.99 ± 0.38	0.99	3685510.00	< 0.001
0.88 ^c	5	0.99 ± 0.00	0.87 ± 0.00	67.26 ± 0.13	0.99	10948715.00	< 0.001

^{*a*} Equation type is a logistic dose response of the form: $y = a/(1 + (x/b)^c)$.

^b This PI_{AT} corresponds to the action threshold of 5 stink bugs per 25 sweeps.

^c This PI_{AT} corresponds to the action threshold of 10 stink bugs per 25 sweeps.

Supplemental Table S3. Parameter estimates from a Pearson VII formula used to fit the average sample number (ASN) curves as a function of the observed proportion of infested sample units obtained from resampling software (RVSP) using field data for each tally threshold (TT) and proportion infested action threshold (PI_{AT}) combination

PIAT	TT		Paramet	\mathbb{R}^2	F 4, 702	Р			
		а	b	С	d	e			
0.95^{b}	1	11.50 ± 0.03	55.91 ± 0.38	0.95 ± 0.00	0.08 ± 0.00	0.80 ± 0.01	0.99	48038.66	< 0.001
0.86^{b}	2	9.93 ± 0.07	164.84 ± 0.49	0.86 ± 0.00	0.09 ± 0.00	0.72 ± 0.00	0.99	80739.14	< 0.001
0.75^{b}	3	5.95 ± 0.24	258.74 ± 0.63	0.74 ± 0.00	0.09 ± 0.00	0.61 ± 0.00	0.99	71954.19	< 0.001
0.95 ^c	3	11.93 ± 0.00	37.26 ± 0.24	0.94 ± 0.00	0.09 ± 0.00	1.22 ± 0.02	0.99	37155.50	< 0.001
0.62^{b}	4	4.88 ± 0.16	411.61 ± 2.62	0.62 ± 0.00	0.09 ± 0.00	0.59 ± 0.00	0.99	295217.50	< 0.001
0.94 ^c	4	11.91 ± 0.00	57.66 ± 0.23	0.93 ± 0.00	0.09 ± 0.00	1.20 ± 0.01	0.99	131581.80	< 0.001
0.49^{b}	5	2.72 ± 0.31	357.05 ± 0.95	0.49 ± 0.00	0.09 ± 0.00	0.55 ± 0.00	0.99	163170.50	< 0.001
0.88 ^c	5	11.32 ± 0.03	116.60 ± 1.30	0.88 ± 0.00	0.11 ± 0.00	0.93 ± 0.01	0.99	53160.65	< 0.001

^{*a*} Equation type is Pearson VII of the form: $y = a + b/(1 + 4 \times ((x - c)/d)^2 (2^{(1/e)^{-1}}))^e$.

^b This PI_{AT} corresponds to the action threshold of 5 stink bugs per 25 sweeps.

^c This PI_{AT} corresponds to the action threshold of 10 stink bugs per 25 sweeps.