

# Spatial Dispersion Pattern and Development of a Sequential Sampling Plan for The Asian Citrus Psyllid (Hemiptera: Liviidae) in Mexico



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The Asian citrus psyllid (ACP), *Diaphorina citri*, Kuwayama (Hemiptera: Liviidae),

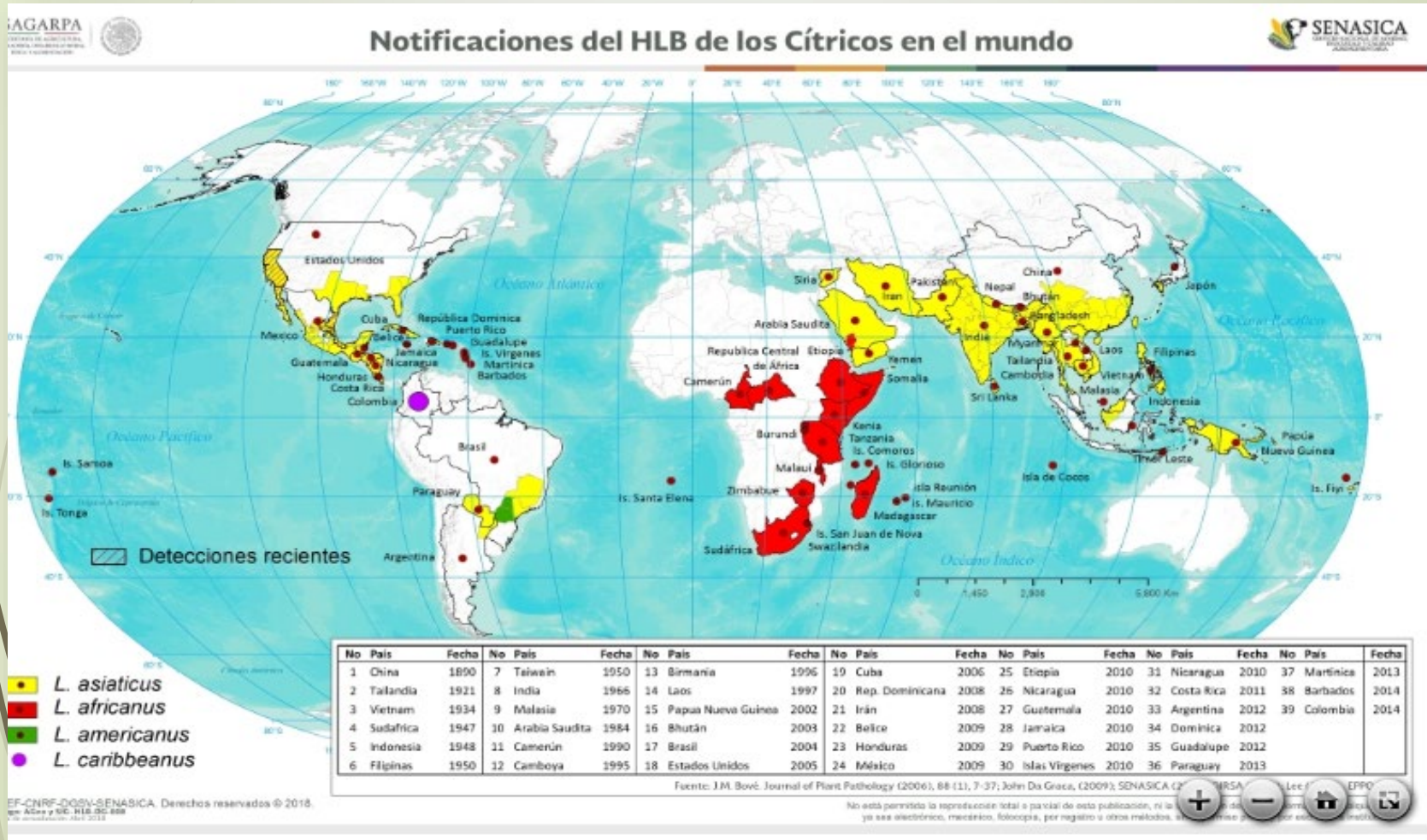
- ◆ Is the vector of *Candidatus Liberibacter* spp., an alphaproteobacterium associated with Huanglongbing
- ◆ the most devastating citrus disease in the world



# Year of incidence and presence of HLB in the world

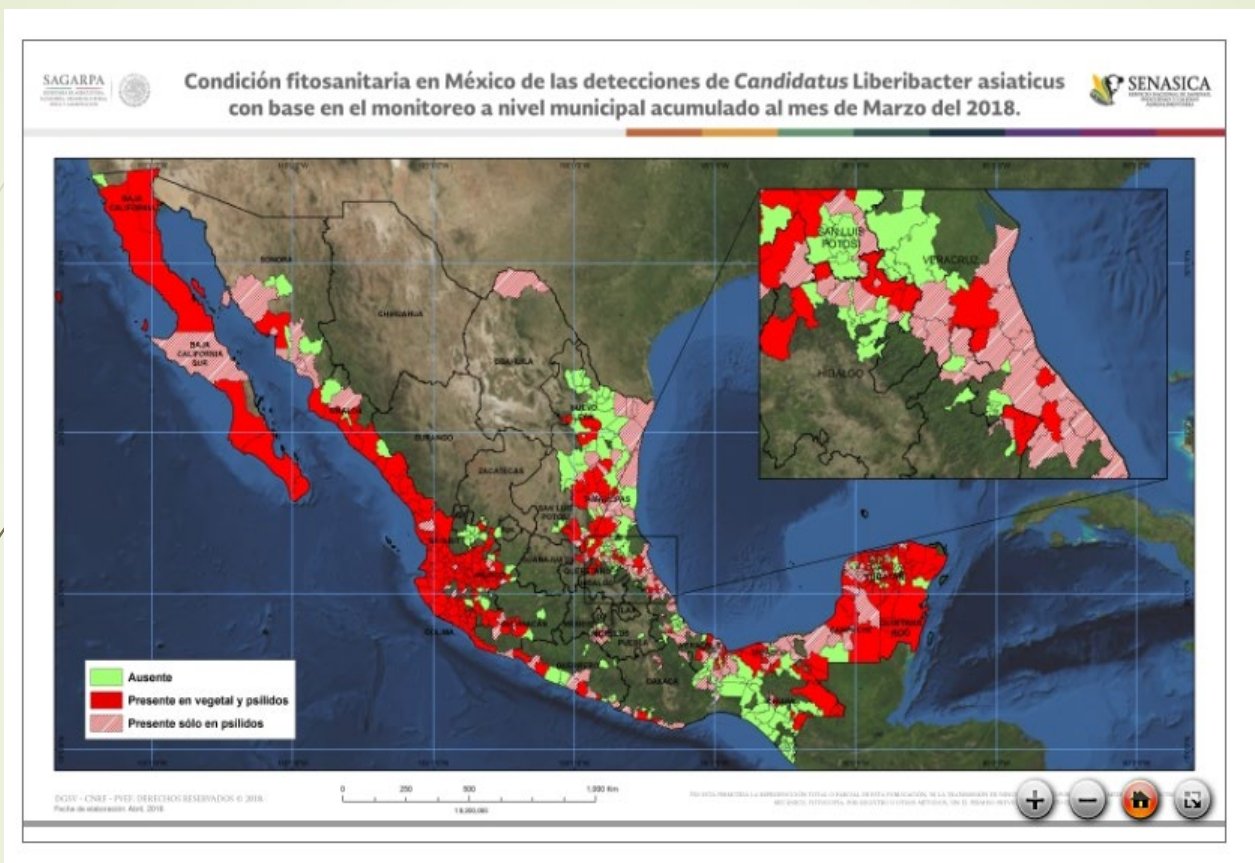
The first outbreaks were recorded in 1890 in China

HLB disease is present in 39 countries around the world



# Status of the HLB in Mexico

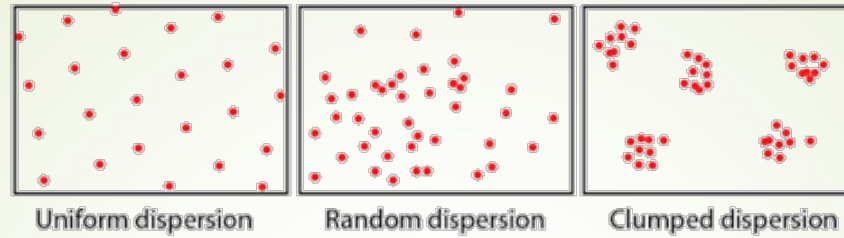
## Dissemination of HLB in Mexico – March 2018



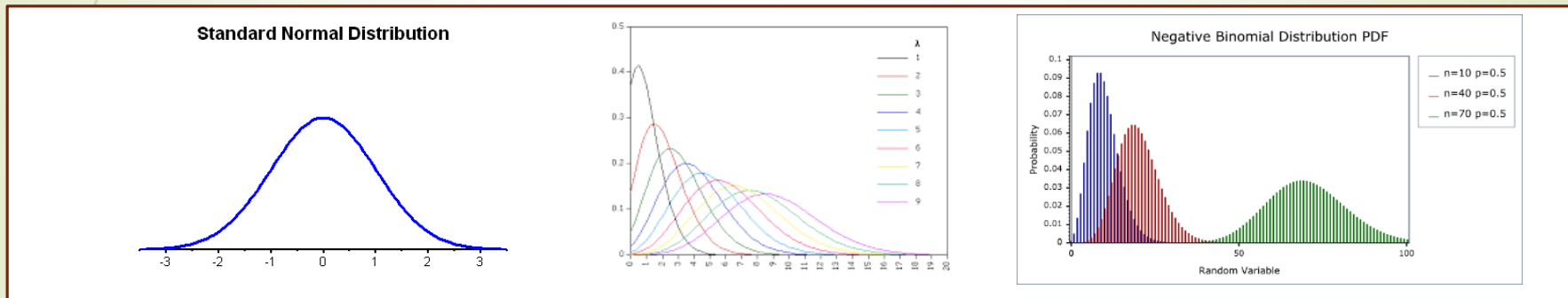
The pathogen was found in the Mexican citriculture during 2009, where it has affected to date 15% of the citrus area and the vector is present in all the citrus areas

# In Integrated Pest Management, it is essential to know:

*What is the dispersion pattern of the insect ?*



*Empirical distribution to which the presence of the pest is adjusted*

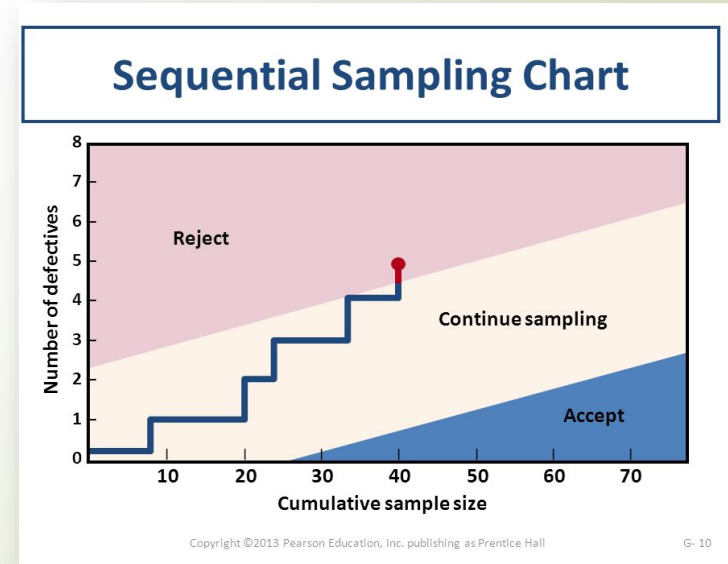
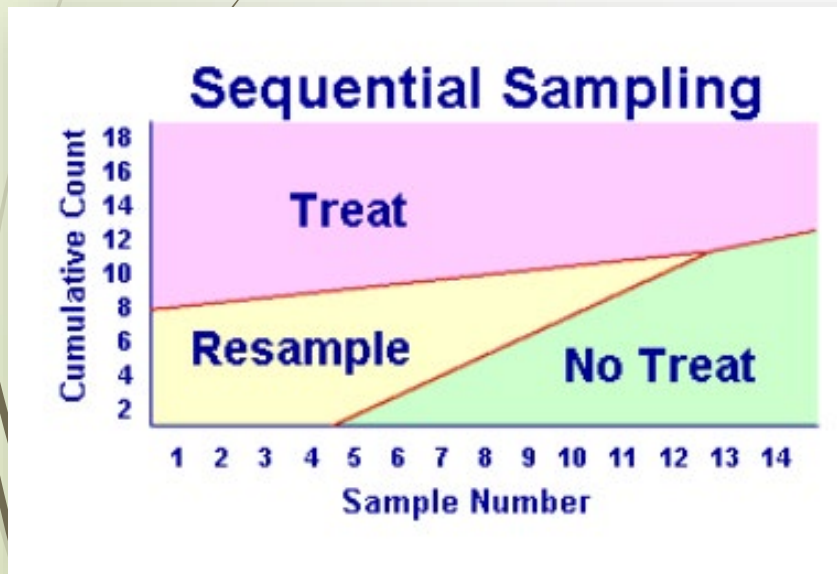


*What is the right time to apply some control techniques?*



# Sequential Sampling (SS)

- Minimizes the sample size, (Wald 1940, Krebs, 1999) and reduce the inspection and monitoring costs
- In citrus, there are few examples of sequential sampling (eg. Trumble et al., 1995).
- Tsai et al. (2000) established the bases for the development of the sequential sampling design for the control of the Asian Citrus Psyllid (ACP)



# Database and Species of Study

2015-2016



Crop	State	Area Sown (ha)	Percent of the national total	Number of Traps	Total records
Orange ( <i>Citrus sinensis</i> )	Veracruz	168,635	52.3%	5,227	261,350
Persian lime ( <i>Citrus latifolia</i> Tanaka )	Veracruz	44,934	54.1%	2,274	113,700
Mexican lime ( <i>Citrus aurantifolia</i> )	Colima	18,996	23.4%	2,784	139,200
<b>National total</b>		<b>555,833</b>		<b>86,337</b>	<b>3,264,715</b>

$Y_i$  = The study variable was psyllids captured by trap by week

# Basic Statistics and Dispersion of the Number of Captured Psyllids per Trap In a Week, for different States and Citrus Species In Mexico (2015-2016).

STATE / SPECIES	N	MEAN	STANDARD DEVIATION	STANDARD ERROR	CONFIDENCE INTERVAL (95%)	
					LOWER	UPPER
<b>COLIMA STATE</b>						
Mexican Lime	103,516	1.20319	4.47275	0.0139	1.175	1.232
<b>VERACRUZ STATE</b>						
Orange	265232	0.22288	1.32166	0.00257	0.218	0.22791
Persian Lime	116220	0.37145	2.36001	0.00692	0.35954	0.38519
<b>TOTAL</b>	<b>3,264,660</b>	<b>0.26657</b>	<b>1.89891</b>	<b>0.00105</b>	<b>0.2645</b>	<b>0.26878</b>





# Evaluation of Dispersion Indices based in Variance and Mean

Parametro	Formula	Nacional	Naranja	Limon Persa	Limón Mexicano
<b>n (tamaño de muestra)</b>	<b>n</b>	3264660	265232	116220	103516
<b>m (media)</b>	$\bar{X} = \frac{\sum_{i=1}^n x_i}{n}$	0.2666	0.2228	0.3714	1.2031
<b>S2 (varianza)</b>	$S^2 = \frac{\sum_{i=1}^n (x_i - \bar{X})^2}{n-1}$	3.6058	1.7467	5.5690	20.0055
<b>Indice de Dispersión (ID)</b>	$ID = \frac{s^2}{\bar{x}}$	13.5251	7.8398	14.9946	16.6283
<b>Indice de aglomeracion(IA)</b>	$ICS = \frac{s^2}{\bar{x}} - 1 = ID - 1$	12.5251	6.8398	13.9946	15.6283
<b>Indice de Green (IG)</b>	$GI = \frac{\frac{s^2}{\bar{x}} - 1}{n-1} = \frac{ICS}{n-1}$	3.8366E-06	2.5788E-05	1.2042E-04	1.5098E-04
<b>Indice de Frecuencia de Clusters (IFC)</b>	$ICF = \frac{\frac{\bar{x}}{s^2} - 1}{\frac{\bar{x}}{s^2} - 1} = \frac{\bar{x}}{ICS}$	0.0213	0.0326	0.0265	0.0770
<b>Indice de Aglomeración Medio (IAM)</b>	$IMC = \frac{\bar{x}}{s^2} + \frac{s^2}{\bar{x}} - 1 = \bar{x} + ICS$	12.7917	7.0626	14.3660	16.8314
<b>Index of Patchiness (IP)</b>	$IP = \frac{\frac{\bar{x}}{s^2} - 1}{\frac{\bar{x}}{s^2}} = \frac{IMC}{\bar{x}} = 1 + \frac{1}{ICF}$	47.9810	31.6991	38.6807	13.9900
<b>Indice de Morisita (I<sub>M</sub>)</b>	$I_M = \frac{n \sum x(x-1)}{n\bar{x}(n\bar{x}-1)} = \frac{n\bar{x}IP}{(n\bar{x}-1)}$	47.9810	31.6997	38.6816	13.9901
<i>Factor k calculado por momentos</i>		0.0213	0.0325	0.0265	0.0769
<i>Factor k calculado por maxima verosimilitud</i>		0.0730	0.0738	0.1223	0.1558

Accordinging of the rules of decisión of each Index the result is that the spatial patern of dispersion is agregated

## Taylor's Power Law

Taylor and collaborators proposed the so-called Taylor's model, that assume that spatial variance ( $V$ ) is proportional to a fractional power of the mean population density ( $M$ ), that is [1]

$$V = \alpha M^{\beta}$$

which can be represented by log-log plots as

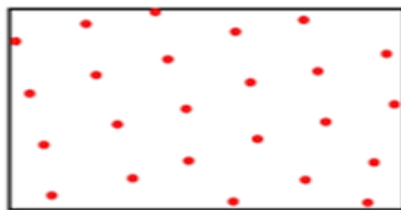
$$\log V = \log \alpha + \beta \log M$$

where  $\alpha$  is a proportionality parameter and  $\beta$  was regarded as an index of aggregation, which takes a characteristic value for each species

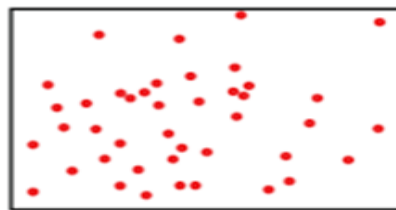
$\beta < 1$

$\beta = 1$

$\beta > 1$



Uniform dispersion

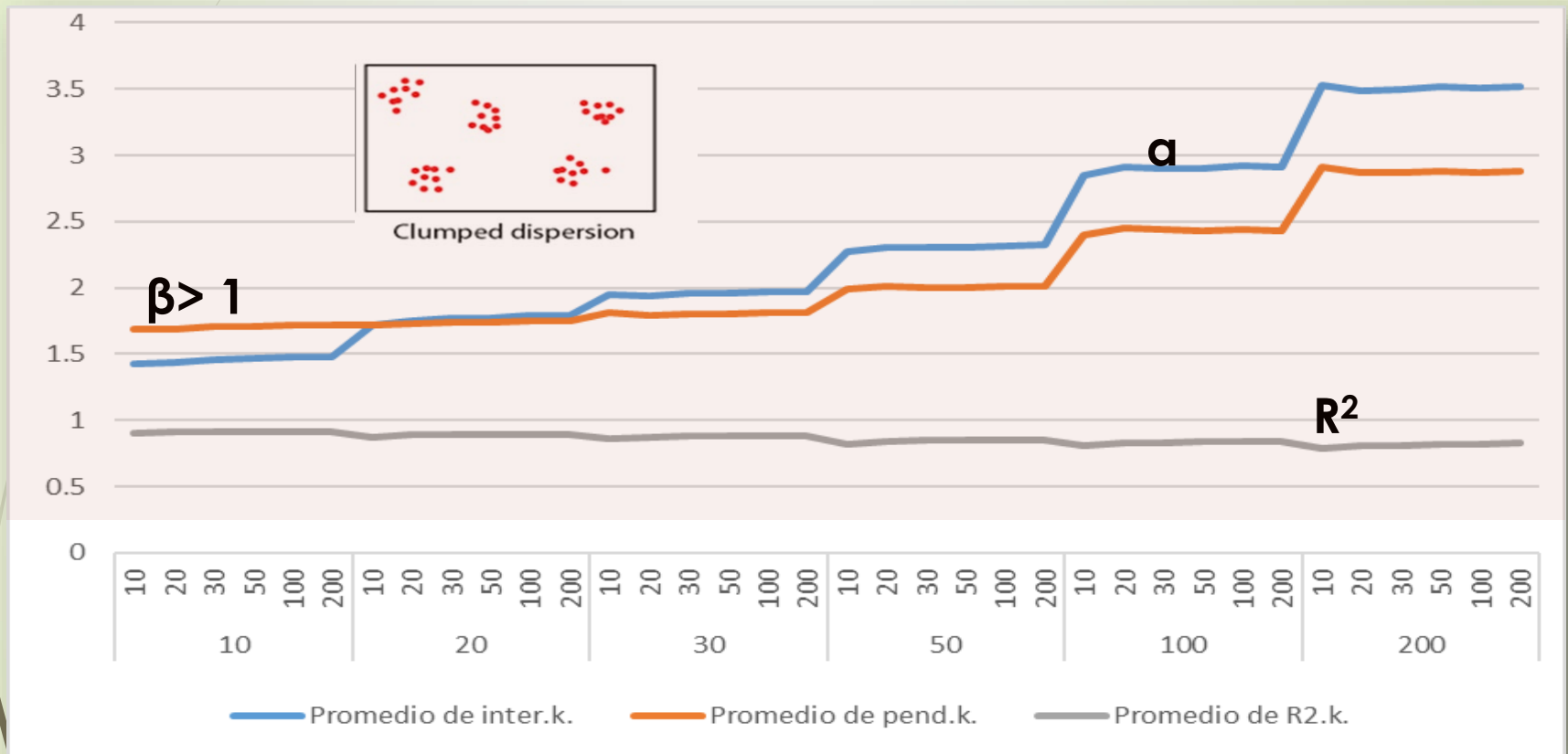


Random dispersion



Clumped dispersion

Resampling 1,000 times and testing different groups and sample sizes, the conclusion is that: the spatial dispersion of *diaphorina citri* is aggregated.



In all the cases the  $\beta > 1$

## Goodness of fit of the psyllids' population using Chi Square algorithm developed in R

An example is developed below: for which a sample size and a crop of interest are determined.

**Example:** Mexican lemon, Colima state and sample size = 200

**First resampling:**

```
> sampling
[1] 0 1 8 0 0 6 2 0 0 0 0 1 0 0 0 2 1 0 0 0 0 1 0 0 0
[26] 4 0 1 0 0 3 0 0 6 1 1 0 0 0 0 0 0 0 0 0 0 0 0 1 1
[51] 1 1 1 0 0 0 3 0 0 0 0 4 0 0 0 0 0 0 2 3 0 0 0 0 0
[76] 0 0 0 0 0 0 0 0 0 0 0 0 0 4 0 0 0 2 0 0 1 0 0 1 0
[101] 6 0 2 3 0 0 1 0 0 0 0 1 4 0 1 0 0 0 0 2 0 0 1 0 0
[126] 0 0 0 0 0 1 0 3 0 0 6 0 0 0 2 0 0 0 4 0 0 0 0 0 0
[151] 0 0 0 0 0 3 13 4 0 0 0 0 0 2 1 0 0 1 0 5 0 2 1 0 0
[176] 8 3 1 0 0 0 0 0 0 0 0 0 0 5 3 0 1 0 0 0 34 0 0 12 4
>
```

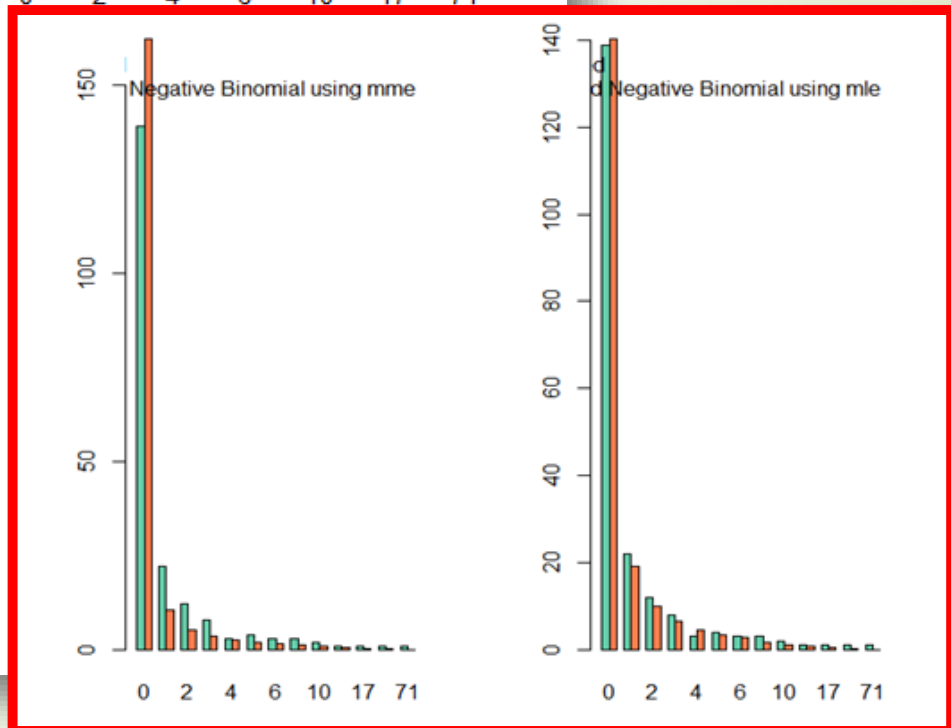
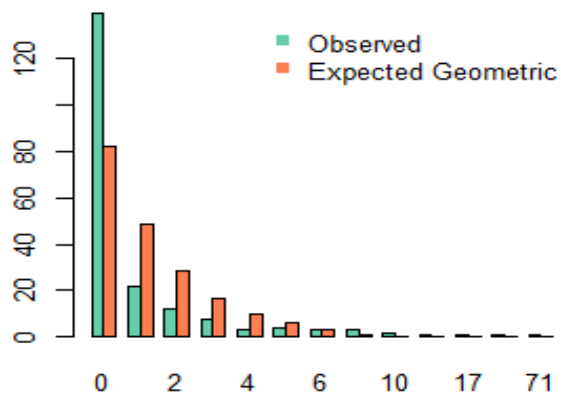
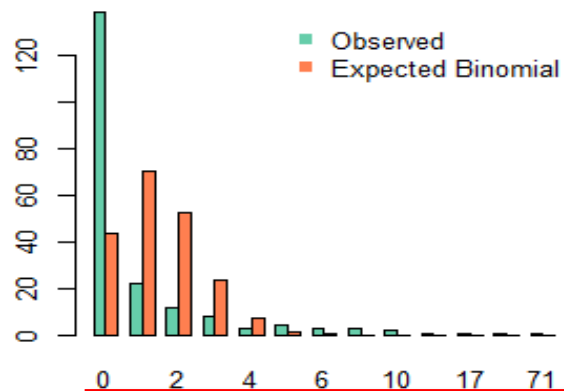
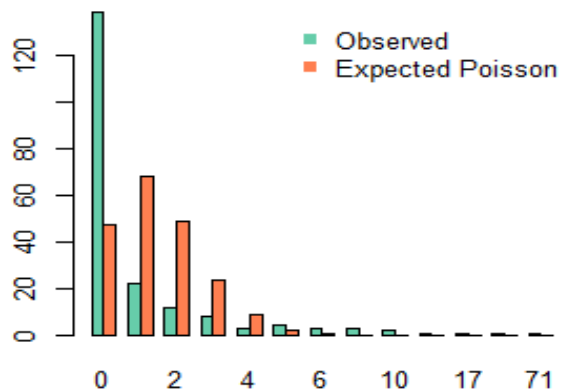
## Testing the Estimated Frequencies for different Empirical Distributions

Psyllids	Frequency	round.RF..5.	Poisson	Binomia	Geometric	Neg_Bin*	Neg_Bin**
0	139	0.695	47.38555	43.47286	81.96721	162.18515	140.22914
1	22	0.110	68.23519	70.39896	48.37409	10.45169	19.12210
2	12	0.060	49.12934	52.61653	28.54865	5.32875	9.95942
3	8	0.040	23.58208	24.03246	16.84838	3.50798	6.46357
4	3	0.015	8.48955	7.48416	9.94331	2.56976	4.60896
5	4	0.020	2.44499	1.67811	5.86818	1.99693	3.46371
6	3	0.015	0.58680	0.27872	3.46319	1.61108	2.69181
8	3	0.015	0.02173	0.00324	1.20621	1.12573	1.73264
10	2	0.010	0.00050	0.00001	0.42011	0.83492	1.17678
13	1	0.005	0.00000	0.00000	0.08635	0.57024	0.69976
17	1	0.005	0.00000	0.00000	0.01048	0.36994	0.37470
23	1	0.005	0.00000	0.00000	0.00044	0.21214	0.15973
71	1	0.005	0.00000	0.00000	0.00000	0.00824	0.00052

Neg\_Bin\* = Negative binomial estimating for the moments method.

Neg\_Bin\*\* = Negative binomial estimating for Maximum Likelihood.

# Observed Vs Expected frequency observation for different distributions



## Chi-square and other statistic for testing different distributions

	Poisson	Binomial	Geometric	Negative Binomial (mme)	Negative Binomial (mle)
sum of residuals	0.1243	0.0350	3.2634	9.2275	9.3172
Chi-square Statistic	112.5171	123.0327	44.1295	14.3522	3.2322
p-value	0.0000	0.0000	0.0000	0.2788	0.9937
MSE	939.0411	1032.6554	335.5326	57.5986	1.8276

We resampling 1000 times for different samples sizes (10,20,200,500,1000) and the results were identical, so we concluded that the psyllids population follows a negative binomial distribution with an alpha close to 95 %.

The maximum likelihood method presents a better fit than the moment method.

# Sequential Sampling – Wald - Okland

The screenshot shows an Excel spreadsheet titled "Copia de NBD Model Sequential Sampling-USDA-Krebs-Badii\_VU\_GDP2.xlsx". The spreadsheet is organized into several sections:

- Datos (Inputs):**
  - $kpo$ : 0.0600
  - $kp1$ : 0.2000
  - $k\text{ común}$ : 0.0780
  - $\alpha$ : 0.0500
  - $\beta$ : 0.0500
  - $A$ : 19.0000
  - $B$ : 0.0526
- Economic Umbral:**
  - Mean
  - $k\text{ value from NB}$
- Calculo de Parametros:**

Ho	Valores	H1	Valores
$Kpo$	0.0600	$Kp1$	0.2000
$Kpoqo$	0.1062	$Kp1q1$	0.7128
$qo$	1.7692	$q1$	3.5641
$po$	0.7692	$p1$	2.5641
$(p1 * q0) / q1$	1.6547		
$q1 / q0$	2.0145		
$q0 / q1$	0.4964		
Slope	0.1085		
$h0 =$	-5.8467		
$h1 =$	5.8467		
- Calculo de lineas de aceptación rechazo:**

0	5.8467	-5.8467	0
10	6.9315	-4.7620	0
20	8.0162	-3.6772	0
30	9.1010	-2.5925	0.701423
40	10.1857	-1.5077	2.6908746
50	11.2705	-0.4230	2.6908746
60	12.3552	0.6618	4.307278
70	13.4400	1.7465	7.1759816
80	14.5247	2.8313	8.4094263
90	15.6095	3.9160	9.3573008
100	16.6942	5.0008	10.414306
110	17.7790	6.0855	11.649518
120	18.8637	7.1703	11.649518
130	19.9485	8.2550	14.406451
140	21.0332	9.3398	16.433584
150	22.1180	10.4246	16.433584
160	23.2027	11.5093	16.433584
170	24.2875	12.5941	16.433584
180	25.3722	13.6788	19.38785
190	26.4570	14.7636	21.495935
200	27.5417	15.8483	23.871328
- Table with columns h, p, L(p), E(n):**

h	p	L(p)	E(n)
infin	0	1.00	53.90
1	0.77	0.95	108.55
0.5	1.03	0.81	130.90
0.0001	1.39	0.50	131.82
-0.5	1.88	0.19	95.29
-1	2.56	0.05	57.49
-1.5	3.51	0.01	34.58
-2	4.82	0.00	21.75
-3	9.21	0.00	9.59

$p$ : indicates the average density,  $po$  the minimum value observed to avoid the insect control,

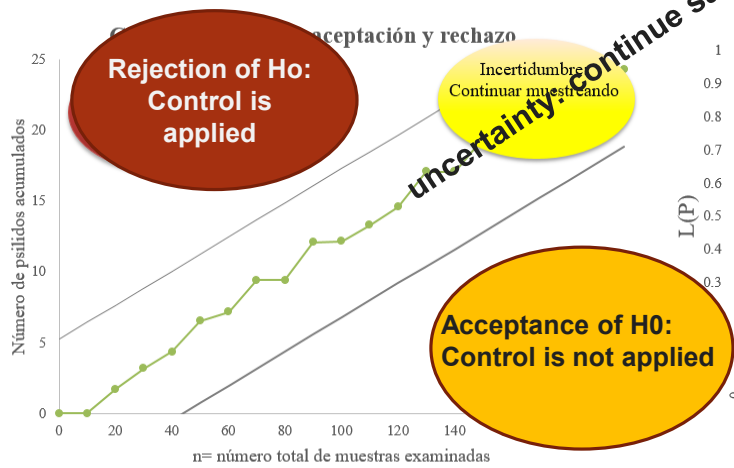
$q$ : standard deviation and,  $k$ -value from the negative binomial obtained by maximum likelihood

For  $\alpha$  and  $\beta$  it is suggested to assign values of 0.05.



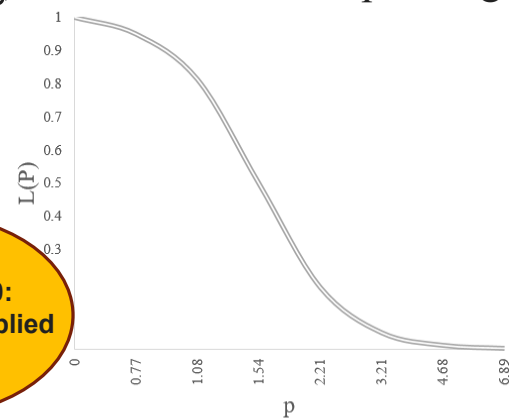
	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
19		0.0001	1.54	0.50	89.96									150	23.2897	12.7993	19.4092505		
20		-0.5	2.21	0.19	62.80									160	24.4927	14.0022	21.161463		
21		-1	3.21	0.05	36.40									170	25.6956	15.2052	21.2530385		
22		-1.5	4.68	0.01	20.91									180	26.8986	16.4082	22.0048236		
23		-2	6.89	0.00	12.50									190	28.1016	17.6111	22.0048236		
24		-3	15.26	0.00	4.90									200	29.3045	18.8141	24.2629773		

### ACCEPTANCE AND REJECTION LINES

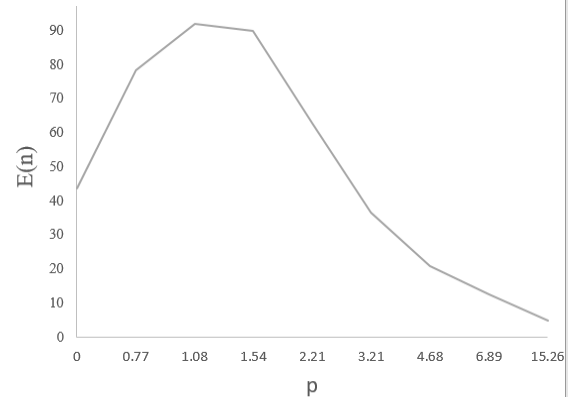


uncertainty: continue sampling

Characteristic operating curve



Average sampling curve



Copia de NBD Model Sequential Sampling-USDA-Krebs-Badii\_VU\_GDP2 - Excel

Inicio Insertar Diseño de página Fórmulas Datos Revisar Vista Desarrollador LASERFICHE Power Pivot ¿Qué desea hacer?

DIAZ PADILLA GABRIEL Compartir

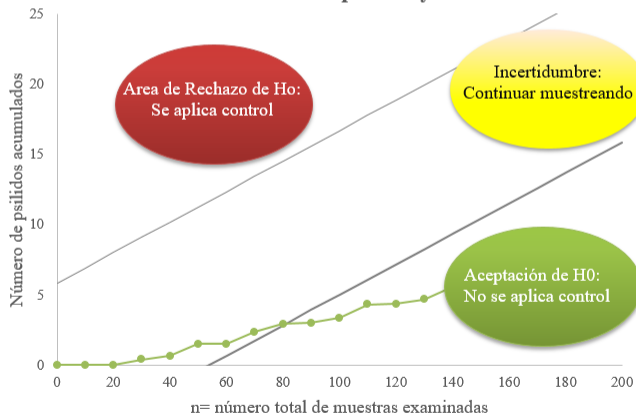
Cortar Copiar Pegar Copiar formato Portapapeles Fuente Alineación Número Formato condicional Dar formato como tabla Estilos

Normal Bueno Incorrecto Neutral Cálculo Celda de co... Celda vincul... Entrada Notas Salida

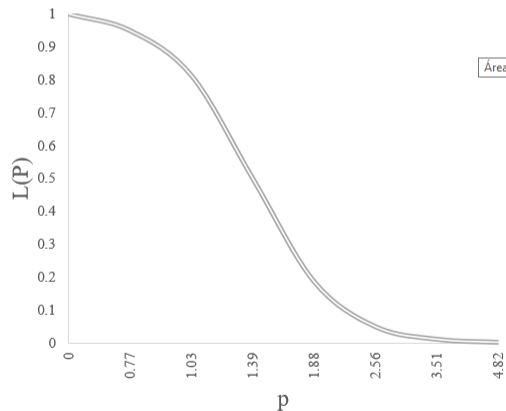
Autosuma Rellenar Borrar Ordenar y filtrar Buscar y seleccionar

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
20		-0.5	1.88	0.19	95.29									160	23.2027	11.5093	6.71577247		
21		-1	2.56	0.05	57.49									170	24.2875	12.5941	6.90292687		
22		-1.5	3.51	0.01	34.58									180	25.3722	13.6788	7.15590739		
23		-2	4.82	0.00	21.75									190	26.4570	14.7636	7.49050563		
24		-3	9.21	0.00	9.59									200	27.5417	15.8483	7.49050563		

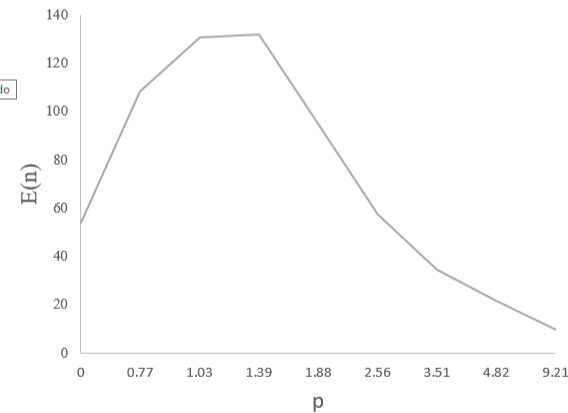
**Cálculo de líneas de aceptación y rechazo**



**Curva Operativa Característica**



**Curva número de muestreo promedio**



Psilidos por trampa

SPRT-NBD-Krebs SPRT-NBD-Krebs (2) SPRT-NBD-Krebs (3) Okland\_Wall Hoja2 Hoja1 SPRT-NBD-Binns-Nyrop Stop line-Green-Nyrop

124%

09:41 a. m. 05/10/2018

Copia de NBD Model Sequential Sampling-USDA-Krebs-Badil\_VU\_GDP2 - Excel

Inicio Insertar Diseño de página Fórmulas Datos Revisar Vista Desarrollador LASERFICHE Power Pivot ¿Qué desea hacer?

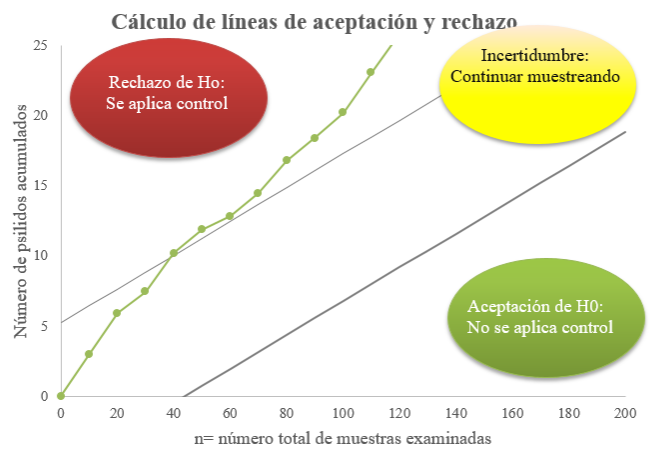
DIAZ PADILLA GABRIEL Compartir

Cortar Copiar Pegar Copiar formato Portapapeles Fuente Alineación Número Formato condicional Dar formato como tabla Estilos Celdas

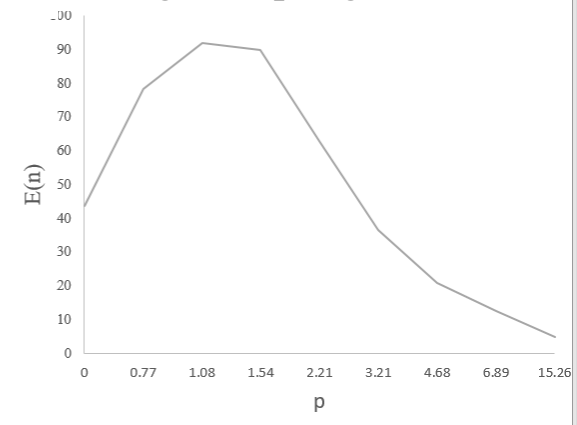
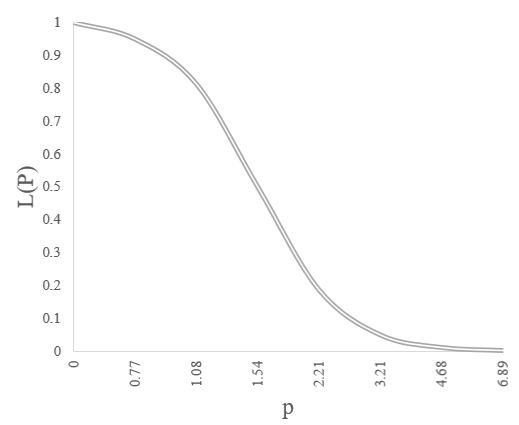
Normal Bueno Incorrecto Neutral Cálculo Celda de co... Celda vincul... Entrada Notas Salida

Autosuma Rellenar Borrar Ordenar y filtrar Buscar y seleccionar Modificar

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
19		0.0001	1.54	0.50	89.96									150	23.2897	12.7993	32.5349281		
20		-0.5	2.21	0.19	62.80									160	24.4927	14.0022	32.5349281		
21		-1	3.21	0.05	36.40									170	25.6956	15.2052	35.4081801		
22		-1.5	4.68	0.01	20.91									180	26.8986	16.4082	37.2273159		
23		-2	6.89	0.00	12.50									190	28.1016	17.6111	41.1259123		
24		-3	15.26	0.00	4.90									200	29.3045	18.8141	41.1259123		



## Characteristic operating curve Average sampling curve



## CONCLUSIONS

- ◆ It was found that the Asian citrus psyllid in Mexico presents an aggregate dispersion.
- ◆ The empirical distribution of the Asian Citrus Psyllid (ACP) is the negative binomial.
- ◆ For its management and control, a strategy based on sequential sampling is proposed, which will help to define in an accurate way the opportune moment to apply some pest control measures, this *could bring a decrease in crop losses, control costs and reduce the environmental impact.*

非常感謝你

*Muchas Gracias*