



# Sample Size Estimation for BMP Verification

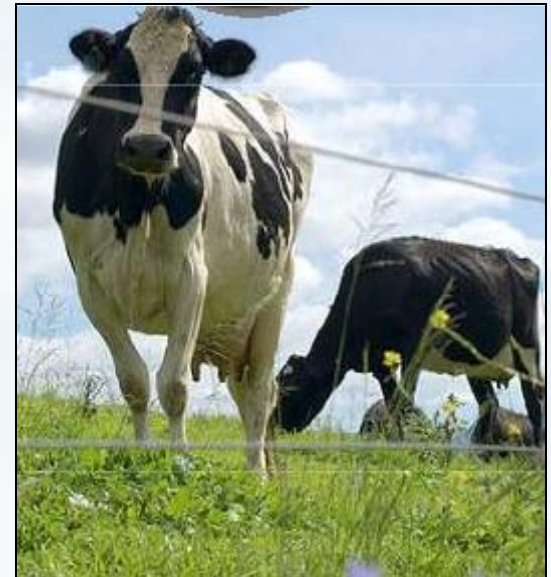
August 14, 2014



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# Sample Size Estimation

- ▶ Objective/Management Goal
  - Document the percentage of BMPs that are still in place and functioning properly
  - Inform Bay model simulation updates
- ▶ Target Populations
  - BMP implemented through state cost-share program
  - BMP implemented through CAFO permits
  - BMP implemented voluntarily without cost-share
  - Resource improvement practice

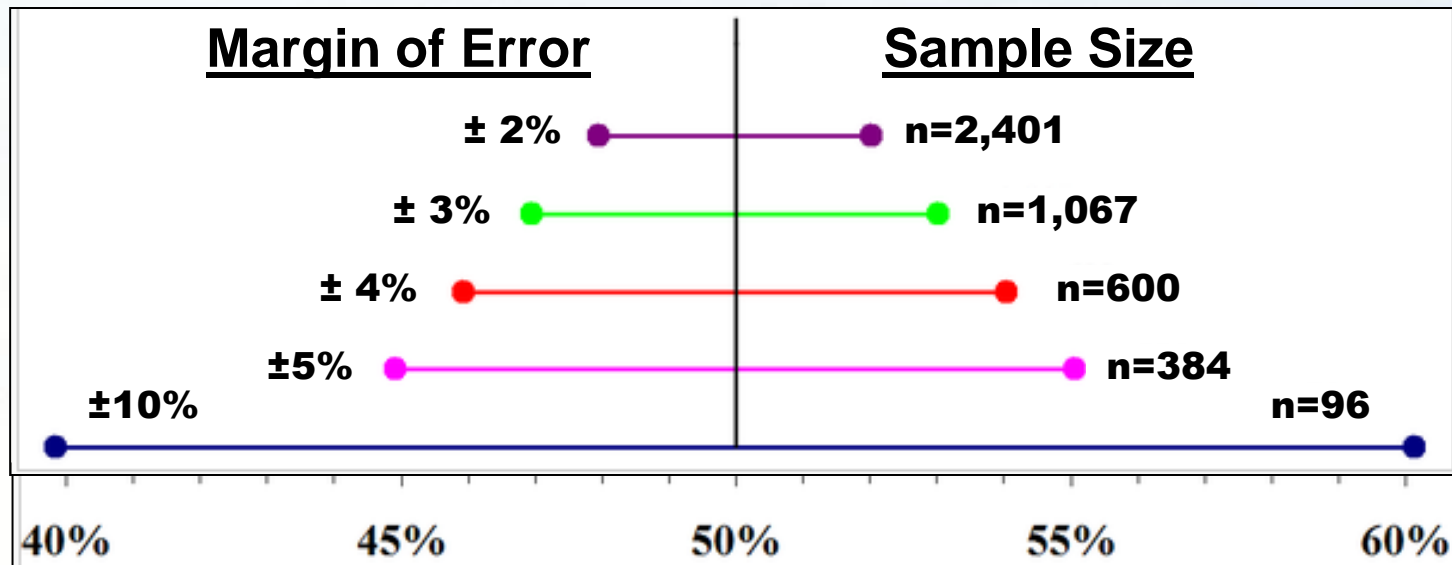
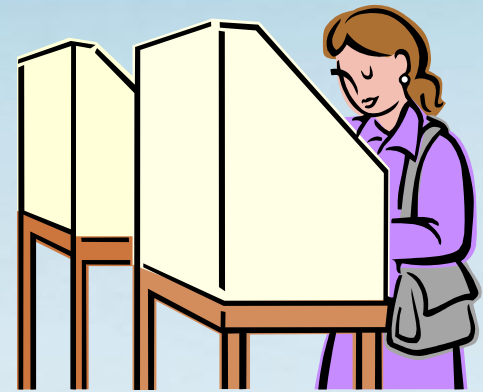


# Binomial Distribution

## ► Binomial Distribution

- Are the BMPs still there?
  - Yes/No
- Are the BMPs still functioning properly?
  - Yes/No

## ► Sample Size—just like political polls



Source: [http://en.wikipedia.org/wiki/Margin\\_of\\_error#Calculations\\_assuming\\_random\\_sampling](http://en.wikipedia.org/wiki/Margin_of_error#Calculations_assuming_random_sampling)

# Some Common Terms

- ▶ **N**: total number of population units in sample population
  - County XYZ wrote **246** nutrient management plans (**N=246**)
- ▶ **n**: number of samples
  - County XYZ randomly inspected/reviewed the implementation of **30** nutrient management plans (**n=30**)
- ▶ **n/N**: Sampling level
  - i.e., **30/246** = 0.12 or **12%**
- ▶ **p**: proportion of “yes” responses
  - County XYZ found that **26** of the nutrient management plans continue to be implemented as expected (**26/30**= 0.867 or **86.7%**)
- ▶ Confidence level: certainty that **p** is within a certain range
  - e.g., **90%** confidence level (significance level,  $\alpha = 0.10$ )
- ▶ **d**: allowable error (margin of error)
  - 86.7% **±9.6%** (87%  $\pm 10\%$ ) with 90% confidence
  - Upper and lower 90% confidence interval is 77-97%

# Binomial Distribution

## Standard Sample Size Equation

$$n_o = \frac{\left(Z_{1-\alpha/2}\right)^2 pq}{d^2}$$

## Political Poll Example

$$96 = \frac{(1.96)^2 (0.5)(0.5)}{(0.10)^2}$$

## Finite Population Correction

$$n = \frac{n_o}{(1 + \varphi)}$$

$N$  ➤ total number of population units in sample population

$n_o$  = preliminary estimate of sample size (sample size for large  $N$ )

$Z_{1-\alpha/2}$  = value corresponding to cumulative area of  $1-\alpha/2$  using the normal distribution

$p$  = proportion of “yes” responses

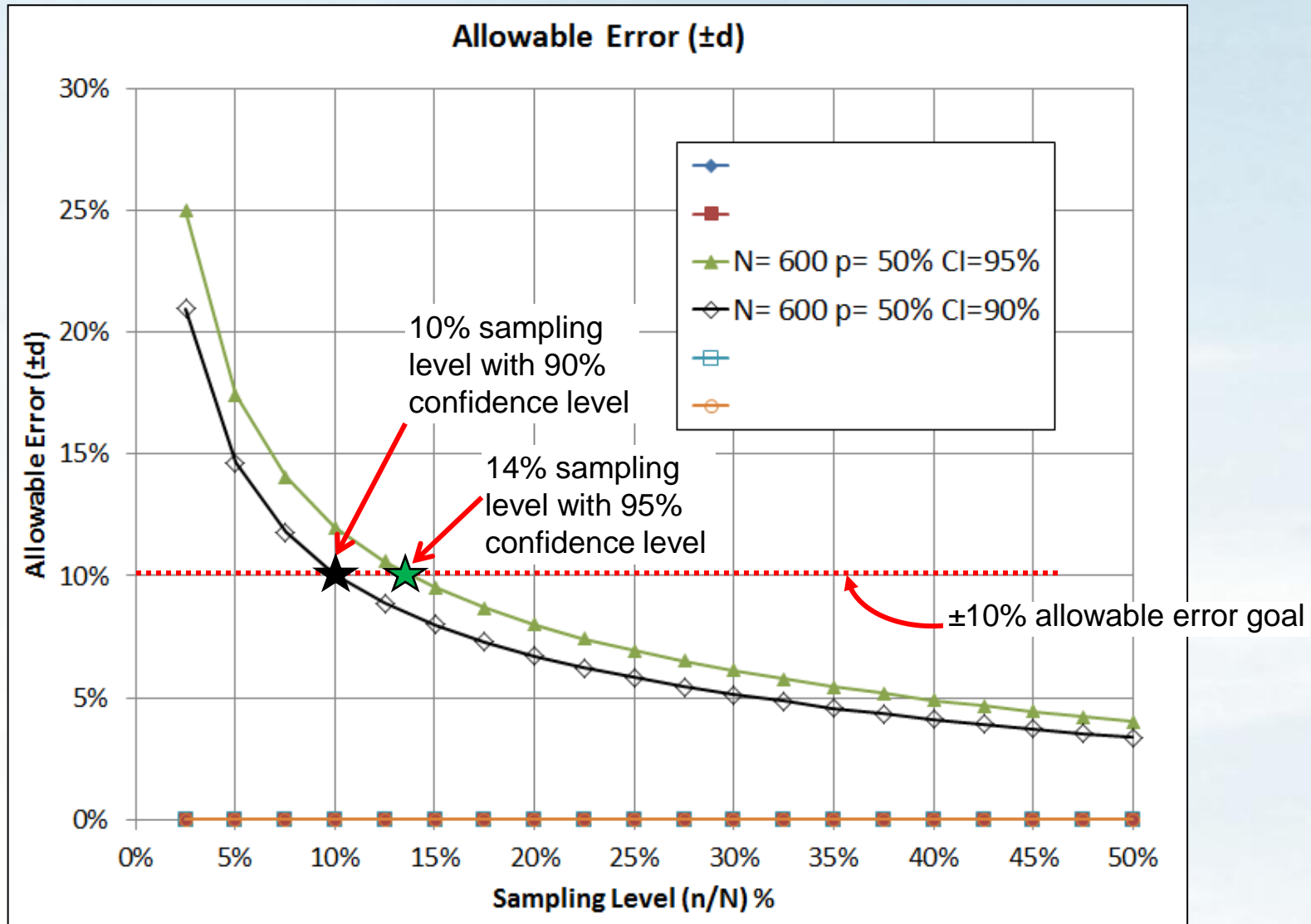
$q$  = proportion of “no” responses (i.e.,  $1-p$ )

$d$  = allowable error (margin of error)

$\varphi$  =  $n_o/N$  unless otherwise stated

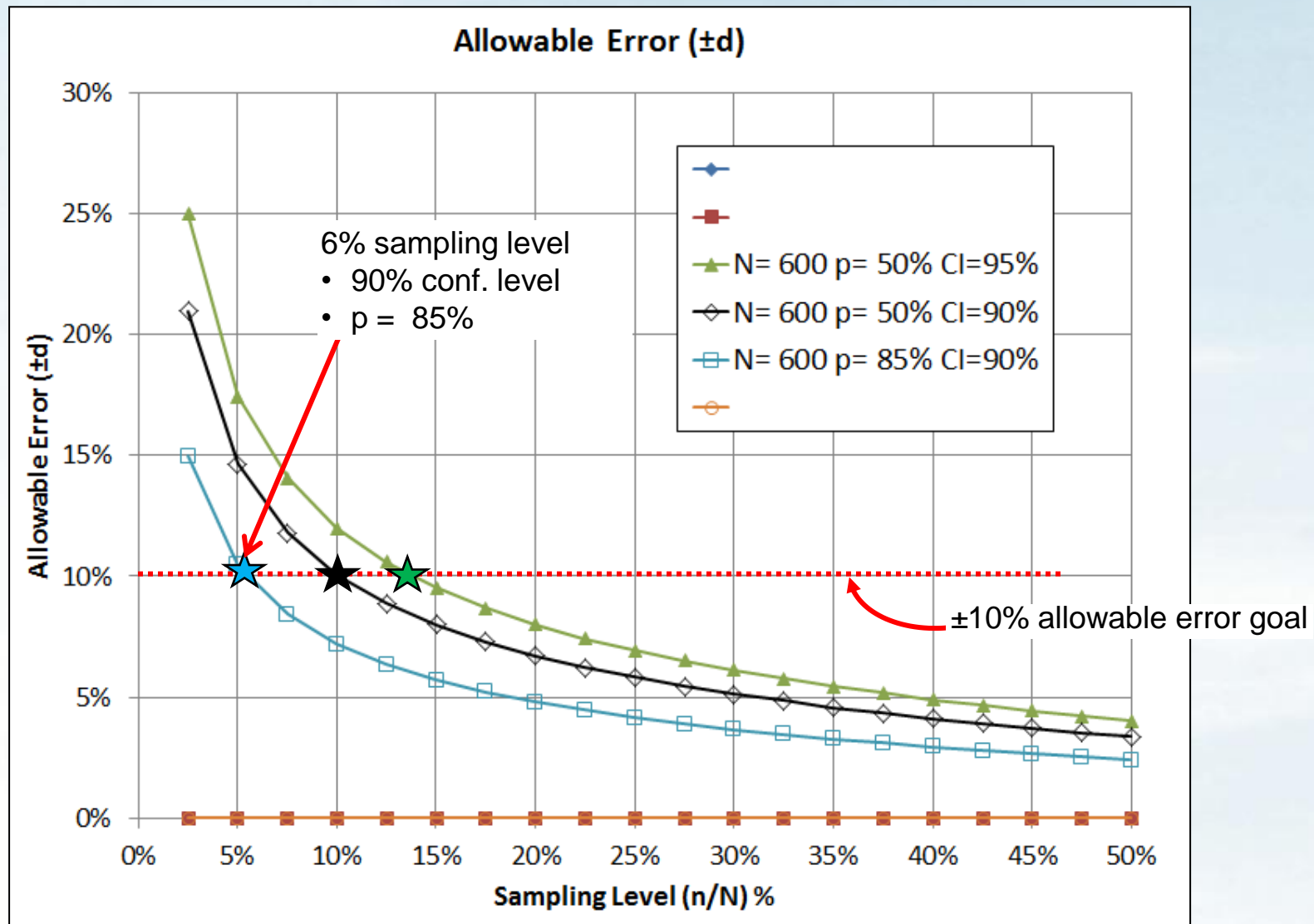
$n$  = number of samples (adjusted for finite population)

# Allowable Error—Decreasing Conf. Level

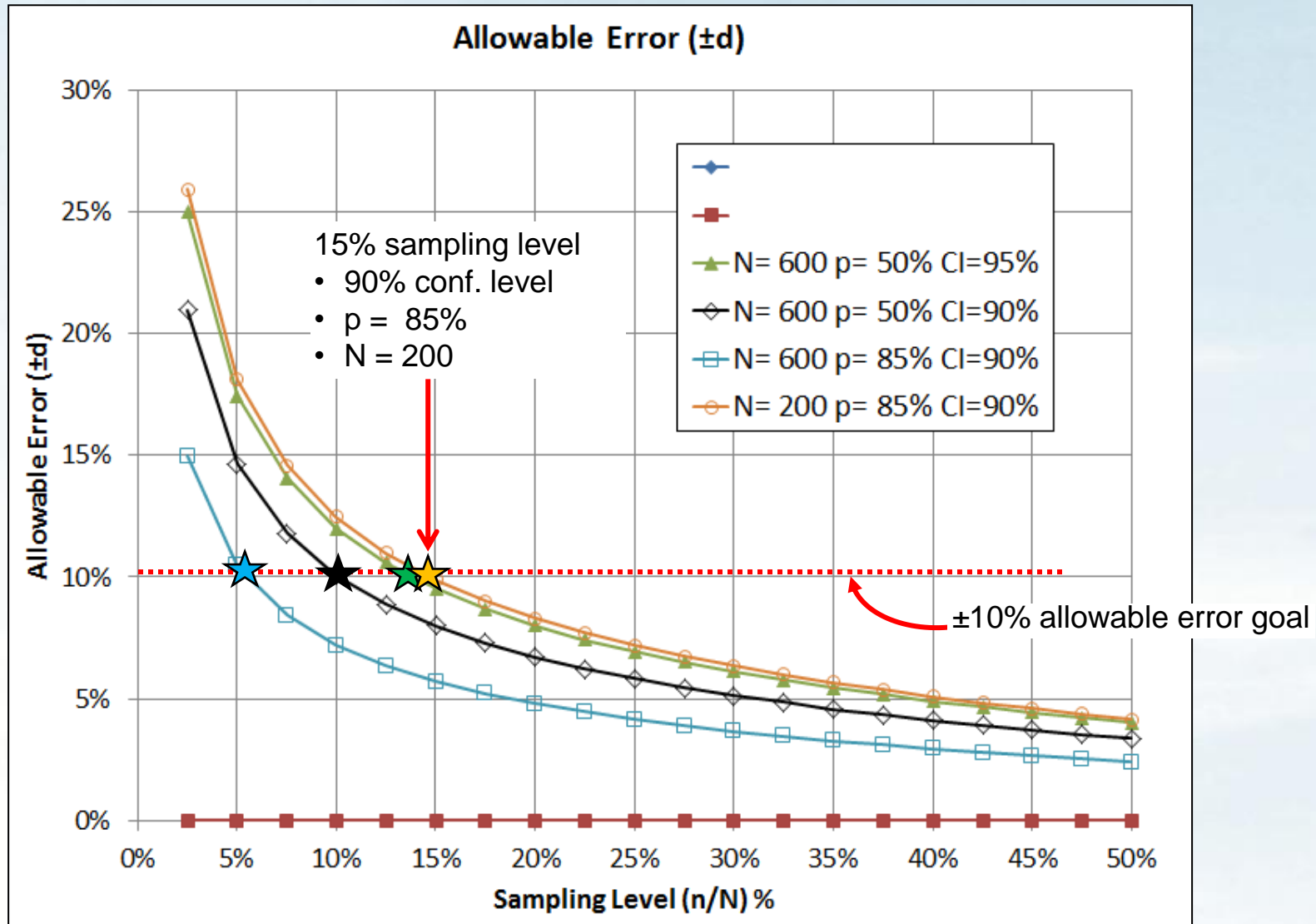




# Allowable Error—A Priori Knowledge

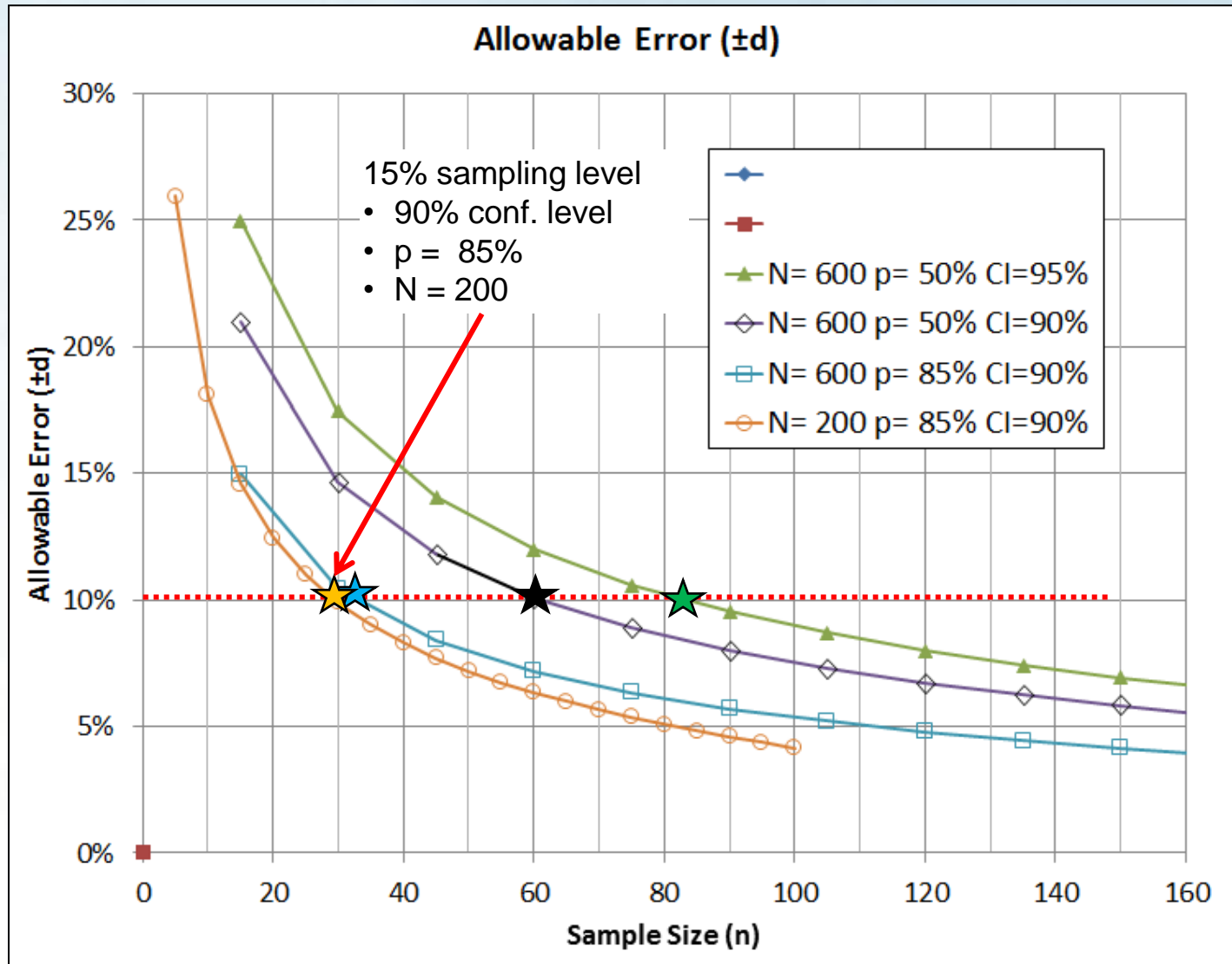


# Allowable Error—Smaller Population





# Allowable Error—Smaller Population



# Observations

- ▶ Improved precision
  - More sampling
- ▶ Reduce sampling costs
  - Lower confidence level (e.g., 95% CI → 90% CI)
  - Increased allowable error,  $d$ , (e.g.,  $\pm 10\%$  →  $\pm 15\%$ )
- ▶ Less sampling is needed to maintain precision if the percentage of BMPs maintained is closer to 100%
  - A priori knowledge is important
  - 50% BMP maintenance is a conservative assumption
  - But don't overestimate
- ▶ Finite Populations
  - Sampling from small populations can result in large errors.

# Potential Application

## ► Precision Statement

- Estimate the percentage of BMPs maintained, **p**, to within  **$\pm d\%$**  using a  **$X\%$**  confidence level.

## ► Example:

- The percentage of BMPs maintained is 85%  $\pm 10\%$  with a 95% confidence level, or
- The range of maintained BMPs is 75-95% with a 95% confidence interval.

## ► Worked Example

- **p**: No information (50%), Good (70%), Excellent (85%)
- **$\pm d$** : 5%, 10%, and 15%
- **$X\%$** : 90% and 95%

# Work Example—Sample Size (n)

95% Confidence Level									
p		±d	Large N	100	200	600	1000	1,500	2,000
No Information	50%	5%	385	80	132	235	278	307	323
	50%	10%	97	50	66	★ 84	89	92	93
	50%	15%	43	31	36	41	42	42	43
Good Maintenance	70%	5%	323	77	124	210	245	266	279
	70%	10%	81	45	58	72	75	77	78
	70%	15%	36	27	31	34	35	36	36
Excellent	85%	5%	196	67	99	148	164	174	179
	85%	10%	49	33	40	46	47	48	48
	85%	15%	22	19	20	22	22	22	22
90% Confidence Level									
p		±d	Large N	100	200	600	1000	1,500	2,000
No Information	50%	5%	271	74	116	187	214	230	239
	50%	10%	68	41	51	★ 62	64	66	66
	50%	15%	31	24	27	30	31	31	31
Good Maintenance	70%	5%	228	70	107	166	186	198	205
	70%	10%	57	37	45	53	54	55	56
	70%	15%	26	21	24	25	26	26	26
Excellent	85%	5%	138	58	82	113	122	127	130
	85%	10%	35	26	★ 30	★ 34	34	35	35
	85%	15%	16	14	15	16	16	16	16

# Work Example—Sample Level (n/N)

>20%	●
10-20%	●
5-10%	●
<5%	●

## 95% Confidence Level

p			±d	Large N		100		200		600		1000		1,500		2,000
No Information	50%	5%		385	●	80%	●	66%	●	39%	●	28%	●	20%	●	16%
	50%	10%		97	●	50%	●	33%	●	14%	●	9%	●	6%	●	5%
	50%	15%		43	●	31%	●	18%	●	7%	●	4%	●	3%	●	2%
Good Maintenance	70%	5%		323	●	77%	●	62%	●	35%	●	25%	●	18%	●	14%
	70%	10%		81	●	45%	●	29%	●	12%	●	8%	●	5%	●	4%
	70%	15%		36	●	27%	●	16%	●	6%	●	4%	●	2%	●	2%
Excellent	85%	5%		196	●	67%	●	50%	●	25%	●	16%	●	12%	●	9%
	85%	10%		49	●	33%	●	20%	●	8%	●	5%	●	3%	●	2%
	85%	15%		22	●	19%	●	10%	●	4%	●	2%	●	1%	●	1%

## 90% Confidence Level

p			±d	Large N		100		200		600		1000		1,500		2,000
No Information	50%	5%		271	●	74%	●	58%	●	31%	●	21%	●	15%	●	12%
	50%	10%		68	●	41%	●	26%	●	10%	●	6%	●	4%	●	3%
	50%	15%		31	●	24%	●	14%	●	5%	●	3%	●	2%	●	2%
Good Maintenance	70%	5%		228	●	70%	●	54%	●	28%	●	19%	●	13%	●	10%
	70%	10%		57	●	37%	●	23%	●	9%	●	5%	●	4%	●	3%
	70%	15%		26	●	21%	●	12%	●	4%	●	3%	●	2%	●	1%
Excellent	85%	5%		138	●	58%	●	41%	●	19%	●	12%	●	8%	●	7%
	85%	10%		35	●	26%	●	15%	●	6%	●	3%	●	2%	●	2%
	85%	15%		16	●	14%	●	8%	●	3%	●	2%	●	1%	●	1%