## Big Data: What is a significant sample size?

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21 June 2023
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## Introduction: Why do we seem to continually predict poorly?

A famous financier once asked, "Why is an MBA student who's learned about discounted cash flow, like a baby with a hammer?"

## Answer:

"Because to a baby with a hammer, everything looks like a nail".


- Decision Makers are continuously bombarded with requests for funding supported with NPV's
- Don't ignore the assumptions of the input forecasts to the discounted cash flow NPV's
- How do you distinguish NPV's that are positive from those that merely result from forecasting errors?


## Why do samples matter?

- Why do we sample?
- Why does sample size matter?
- Improves predictability of outcome
- Resource size forecasts only 'credible' if portfolio contains a statistically significant number of samples.




## Distributions

- Normal distribution P50 = Mean = Mode (most likely).
- Lognormal distribution P50 $=$ Mean $\neq$ Mode.
- Descriptive term 'Most Likely' is misleading as it contains no information about variance.



- Variance is a measure of dispersion / spread of all data points in a data set



Limited \& More Predictable Range of Outcomes

- Example: Prospects from two geological basins with same P50/Mean volume of 250 MMstb
- Red distribution has mean/mode 250 MMstb of oil and variance 10,000
- Blue distribution has mean/mode 250 MMstb of oil and variance 625



## Confidence: When distributions not available

- Forecasts rely on 2 terms: Confidence Level \& Level of Accuracy
- Confidence Level tells you how "sure" you can be.
- Represents how often the true percentage of the population who would pick an answer lies within the confidence interval.
- $95 \%$ confidence level means you can be $95 \%$ certain;
- Level of Accuracy is +/- number (e.g.: US\$45 million +/- \$5)

- Put Confidence Level together with Confidence Interval
- $95 \%$ sure that the true percentage of population is between US $\$ 40$ million and US\$50 million.
- The wider the confidence interval you're willing to accept, the more certain you can be that the answers from the whole population would be within that range.


## Factors that Affect Confidence Intervals

- Size of a significant sample of a population depends on what level of confidence we want in our prediction (e.g.: Low $<50 \%$, High $>90 \%$ etc.) and the size of the total population of data.
- We don't always know the exact size of the total population of data, but we can estimate this, and precision is not required.
- There are three factors that determine the size of the confidence interval for a given confidence level:

1) Sample size
2) Population size
3) Margin of error

| Confidence <br> level | Population <br> Size | Sample <br> Size | Margin of <br> error |
| :---: | :---: | :---: | :---: |
| $99 \%$ | 2,000 | 20 | $29 \%$ |
| $95 \%$ | 2,000 | 20 | $22 \%$ |
| $90 \%$ | 2,000 | 20 | $18 \%$ |
| $85 \%$ | 2,000 | 20 | $16 \%$ |
| $80 \%$ | 2,000 | 20 | $14 \%$ |



## What is a good sample size?

- Before you can calculate a good sample size, you need some idea about the degree of precision you require or, the degree of uncertainty you are prepared to tolerate
- Many sample size calculators and statistical guides available but as a guide........
- Good maximum sample size is usually around $10 \%$ of the population, as long as this does not exceed 1000.
- Population of 5,000 North Sea wells, $10 \%$ would be 500.
- Population of 200,000 onshore North American wells sampling 1,000 ( $0.5 \%$ ) will usually give a fairly accurate result.
- Sampling $>1,000$ wells won't add much to the accuracy regardless of Big Data processing power \& dataset size

|  |  | Size of Population |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 200 | 500 | 1,000 | 2,500 | 5,000 | $\mathbf{5 , 0 0 0}$ |  |  |
|  | $+/-10 \%$ | 65 | 81 | 88 | 93 | 94 | 96 |  |
|  | $+/-7.5 \%$ | 92 | 127 | 146 | 160 | 165 | 171 |  |
|  | $+/-5 \%$ | 132 | 217 | 278 | 333 | 357 | 384 |  |
|  | $+/-3 \%$ | 169 | 341 | 516 | 748 | 880 | 1,067 |  |

## Human Bias in Sampling

- All humans are subject to biases, regardless of technical competency, or level of education

- 'Belief in the law of small numbers', Tverskey¹, Kahneman ${ }^{1}$
- Humans regard a sample randomly drawn from a population as highly representative.
- 'Sample size neglect' is tendency to underestimate how variability of average estimates changes with sample size.
- 'The Difficulty of Assessing Uncertainty' by Ed Capen ${ }^{2}$ ARCO
- Glenn McMaster ${ }^{3}$ \& Peter Carragher ${ }^{3}$



## Closing Remarks

- Shaky ground: Using P50 blindly
- Variance is a vital value for describing an estimate
- Monte Carlo simulations are not just for geoscientists

- Monte Carlo simulation most beneficial to fully understand and appreciate the variance when the sample size is at its smallest.
- A level of accuracy provides a useful index of variability, and it is precisely this variability that we tend to underestimate.
- The associated confidence is implicit in the P90/P50/P10 figures, but many upstream documents typically only report one of these (e.g.: Accountants) and therefore lose all information about variability .this is not good for making decisions, or decision makers!



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