

- Reference group:

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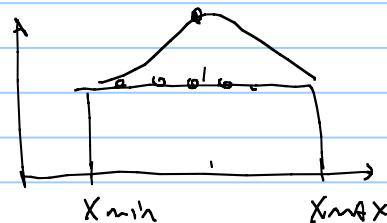
Mkinga, Oras Joseph

- Uncertainty quantification and management.

for each variable in my field development process it is necessary to determine

$$\left. \begin{array}{l} \Phi \\ P_{xi} \end{array} \right\}$$

a probability distribution



Probabilistic estimation of total recoverable reserves

oil G

TRR G_{pu} ultimate cumulative gas production

gas N

N_{pu} ultimate cumulative oil production

recovery factor

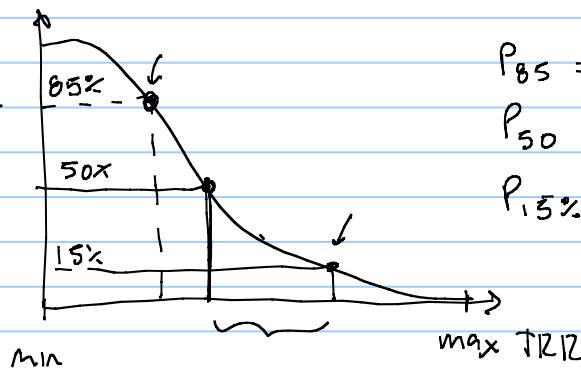
$$RF, F_{RU} = \frac{N_{pu}}{N}$$

$$= \frac{G_{pu}}{G}$$

$$\left. \begin{array}{l} 20\% \\ 50\% \\ 30\% \end{array} \right\}$$

$$N_{pu} = \int_0^{t_{end}} q_{\bar{o}}(t) dt$$

Defined output
cumulative distribution probability
TTR

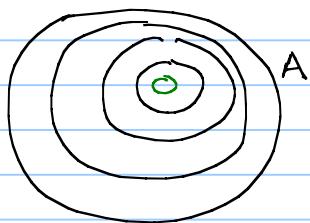
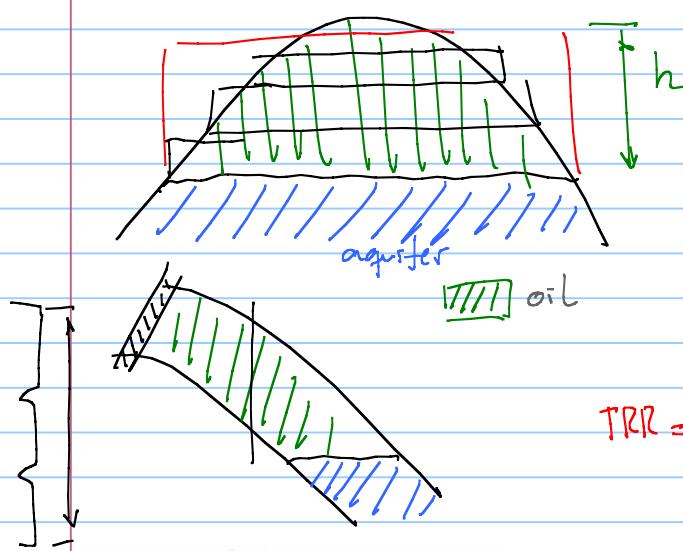


$$P_{85\%} = \text{proven}$$

$$P_{50\%} = \text{proven + probable}$$

$$P_{15\%} = \text{proven + probable + possible}$$

oil reservoir

 \sim view from top

$$V_{PR} = h \cdot A$$

$$V_{PR} = \sum_{i=1}^{M_{layers}} h_i \cdot A_i$$

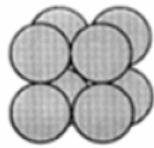
rock bulk volume

pore volume adimensional

$$TRR = N_{Pr} = \frac{V_{Pr} \cdot \phi \cdot (1 - S_w) \left(\frac{N}{G} \right)}{F_r} \quad \text{m}^3, \text{stb}$$

$$\phi = \frac{\text{pore volume}}{\text{total volume}}$$

Cubic:



$$\text{Porosity} = \frac{\text{Pore volume}}{\text{Bulk volume}} =$$

$$B_o = \frac{V_o}{V_c} \quad \text{N}$$

$$15.56^\circ\text{C} \quad 101325 \text{ bar}$$

$$p, T$$

$$\frac{V_o}{V_c}$$

$$V_{Sc}$$

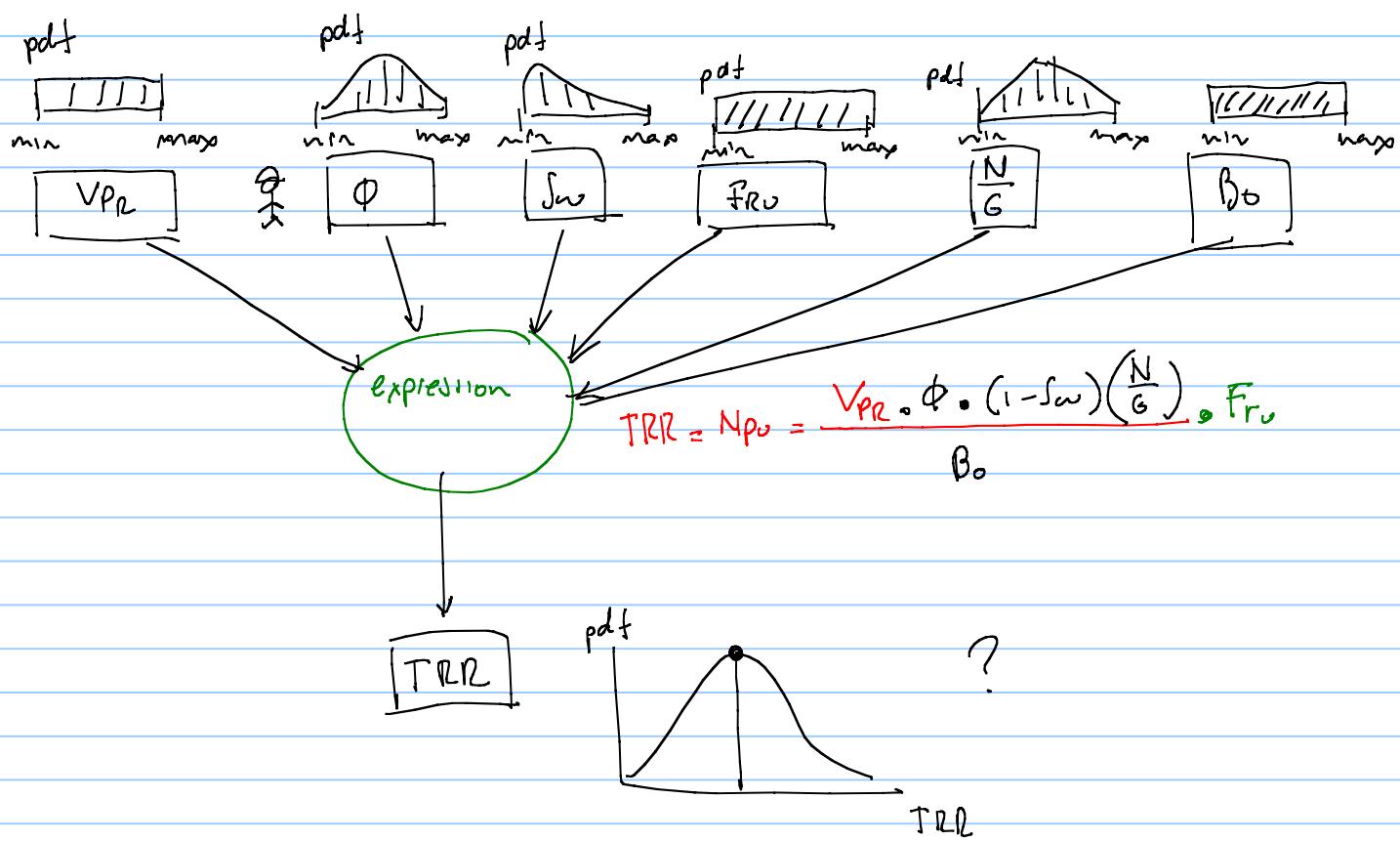
$$B_o = \frac{V_o}{V_c} (p, T)$$

Uncertainties in IOIP Estimation

Factor	Typical source of estimate	Approximate range of expected accuracy (%)
Area	drill holes geophysical data regional geology cores	$\pm 10-20$ $\pm 10-20$ $\pm 50-80$ $\pm 5-10$
Pay thickness	logs drilling time records and samples regional geology	$\pm 10-20$ $\pm 20-40$ $\pm 40-60$
Porosity	cores logs production data drill cuttings correlations	$\pm 5-10$ $\pm 10-20$ $\pm 10-20$ $\pm 20-40$ $\pm 30-50$
Interstitial water saturation	capillary pressure data oil base cores saturation logs routine cores with adjustments correlations	$\pm 5-15$ $\pm 5-15$ $\pm 10-25$ $\pm 25-50$ $\pm 25-60$
Formation volume factor	pressure volume temperature analysis of fluid samples correlation	$\pm 5-10$ $\pm 10-30$

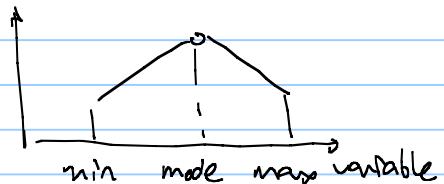
- Recovery factor, F_R depends on:

- Permeability and Permeability distribution
- Relative permeability characteristics
- Drive mechanism
- Pressure support, displacement and sweep efficiency
- Reservoir architecture-continuity, shape, layering, fault blocks
- Reservoir anisotropy
- Reservoir fluid properties
- Well placement. Number of wells
- Artificial lift
- Minimum economical field rate



for the input variables engineers usually use a ^{rectangle} uniform distribution or a triangle distribution

to obtain the probability distribution of TIRR
engineers often use the Monte-Carlo method

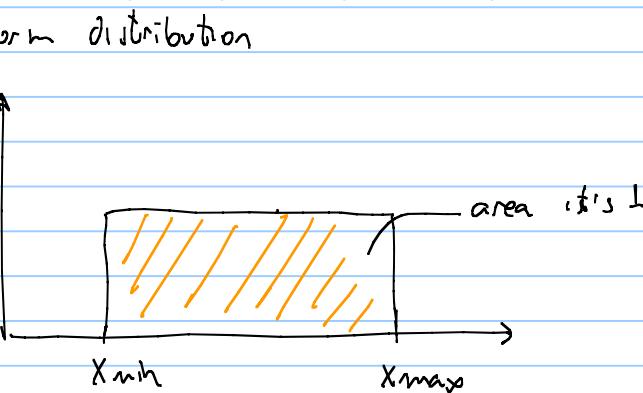
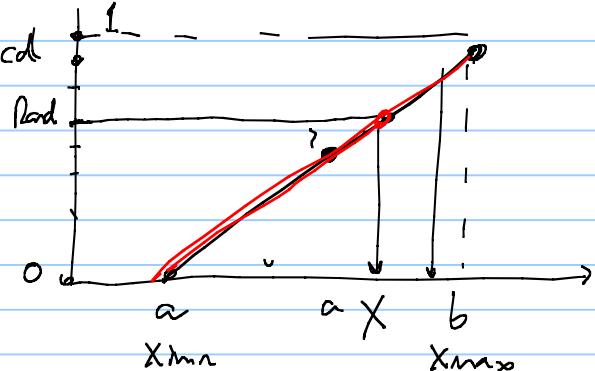


Stanislaw Ulam, Los Alamos 1940 } Monte-Carlo
Von-Neumann }

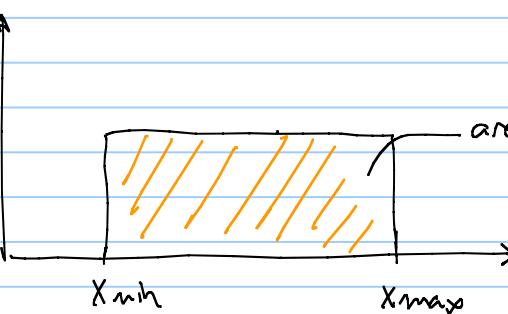
- ① • Define a domain of possible values for each input variable } propose, find
} a probability distribution
- ② • Generate a random input for each variable using its pdf
- ③ • Perform a deterministic calculation using } ~ equation
compute the value(s) of interest. } simulator
} routine } depending on the model available
- ④ • Repeat step 2. for "many" time. for our case 8000 iterations
achieved required number of iterations
- Aggregate all results TRN(s) and perform, compute its pdf, cd

The applicability of Monte-Carlo method depends on how long it takes for step 3 to complete

	Net to Gross	Oil Saturation		Formation Volume Factor	Ultimate Recovery Factor	\approx pseudo Goliat
	Rock volume	Porosity	N/G	$S_o = (1-S_w)$	B_o	Fr
	bbl	fraction	fraction	fraction	Res bbl/STB	fraction
Min	2000000000	0.18	0.3	0.8	1.35	0.42
Max	2500000000	0.3	0.5	0.9	1.6	0.65

$$f(x) =$$



$$\frac{1 - 0}{x_{\max} - x_{\min}} \leq \frac{\text{Rand} - 0}{(X) - x_{\min}}$$

$$X = x_{\min} + (x_{\max} - x_{\min}) \text{Rand}$$

we excel
 $\text{Rand}()$
 $\text{RandC}()$

	Net to Gros	Oil Saturation		Formation Volume Factor	Ultimate Recovery Factor	
Rock volume	Porosity	N/G	$S_o = (1 - S_w)$	B_o	Fr	
bbl	fraction	fraction	fraction	Res bbl/STB	fraction	
Min	2000000000	0.18	0.3	0.8	1.35	0.42
Max	2500000000	0.3	0.5	0.9	1.6	0.65

$$\rightarrow V_{Pr} = V_{Pr\min} + \text{Rand}_{V_{Pr}} (V_{Pr\max} - V_{Pr\min})$$

$$V_{Pr} \left(\frac{\phi}{[-]} \right) \frac{N/G}{[-]} \frac{S_o}{[-]} \frac{B_o}{[bbl/STb]} \quad \text{fr}_o \quad \left| \begin{array}{l} \text{Trn} \\ \text{Trn} = \frac{\phi \cdot V_{Pr}(S_o) R^2 / N}{B_o} \end{array} \right.$$

① ○

②

③

3000

compute pdf for this
cd column

- Usually Monte Carlo is non practical for heavy models (Reservoir Simulator).
thus another method called Latin Hypercube Sampling is used.