

# SPE Distinguished Lecturer Program



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## **Economic and Risk Analysis Applied to Petroleum Engineering Recent Developments and Application Examples**



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## Outline

- Introduction
- Definitions
- Risk Analysis and the Oil & Gas Industry
- Application Examples
- Final Remarks

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## Introduction

- “Decision Analysis”
  - 1964 by Ronald Howard, Stanford University.
- Decision analysis
  - Procedures, methods and tools
    - Identify, clearly represent, and formally assess important aspects of a decision situation.

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## Risk Analysis

- Systematic use of information to determine how often specified events may occur and the magnitude of their likely consequences.\*
- Quantitative Risk Analysis
  - It is a numerical approach to assess project risks.

\*AS/NZS 4360:2004: Australian/**New Zealand** Standard on Risk Management

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## Risk Analysis and the Oil & Gas Industry

- One of the first applications for the oil industry:
  - Paul Newendorp, 1967
  - “Application of Utility Theory on Drilling Investment Decisions”

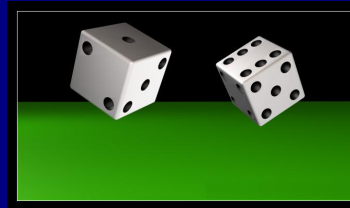


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## Risk and Uncertainty - Definitions

Risk is uncertainty based on a well grounded (quantitative) probability.

Example



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## Misconception on the Use of Risk Analysis

Risk analysis will not eliminate risk in the decision making process.

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## Risk and Economic Analysis Applications for Petroleum Engineering

- Examples:
  - Reserve quantification;
  - Reservoir characteristics;
  - Recovery factor;
  - Expected production;
  - Operations schedule;
  - Budget;
  - Etc.

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## Risk and Economic Analysis Tools

- Monte Carlo Simulation;
- Decision trees;
- Commercial Software;
- Engineering Economy;
- Economic Indicators;
- Database.

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## Application Examples

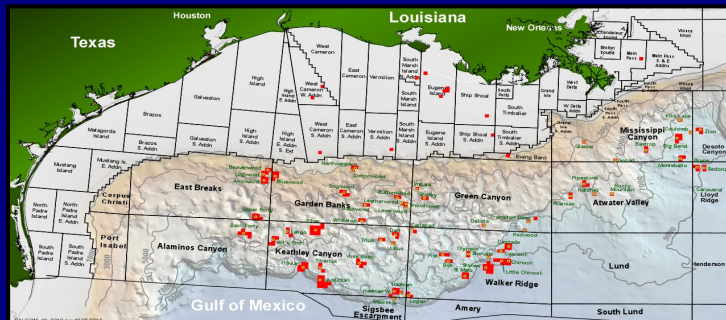
- Well Drilling – Planning and Budget
- Heavy Oil Field Development
  - Reservoir
  - Production
  - Economics
- Well Completion – Time and Cost Estimate

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## Well Drilling – Planning and Budget

- The challenge:
  - Two fields (GOM);
  - Four wells (three areas);
  - Ultra-deepwater;
  - Deep wells.

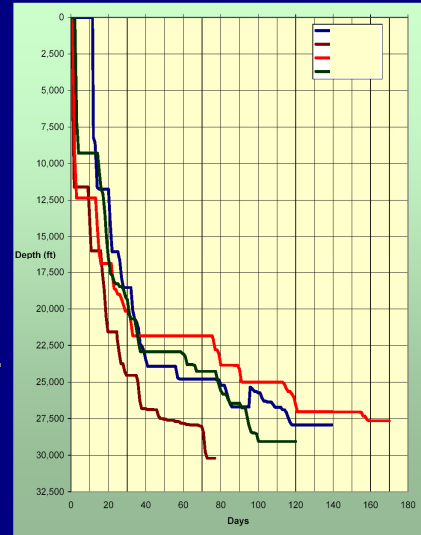
Planning and  
Budgeting for Field  
Development.



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## Basis for Analysis

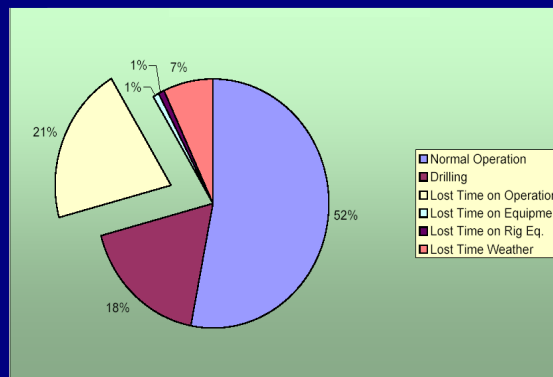
- For each well:
  - Summary of operations;
  - Time and cost analysis;
  - NPT analysis;
  - Well Planning;
  - Cost and time estimates.



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## Summary of Operations

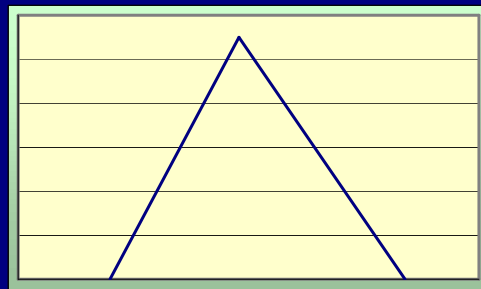
- Summary by well section
  - Problems, possible solutions, lessons learned;
  - Monte Carlo simulation to estimate for each well section:
    - Time;
    - Total cost;
    - Cost excluding NPT;
    - Cost per foot x Feet per day.



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## Simulation

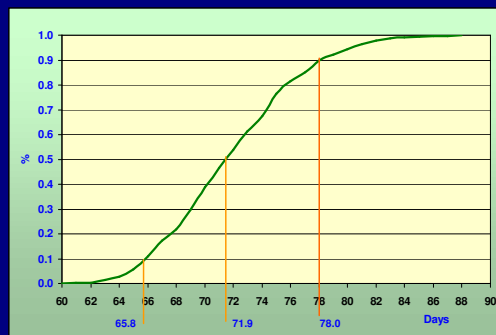
- Monte Carlo Simulation was performed:
  - For each well section, a value for cost per foot and feet per day was obtained;
  - Using these values and the planned depth of the well section, it was determined the cost and period of time expected for the section;
  - 1000 runs;



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## Simulation (cont.)

- Results of each run in one well section were added to correspondent results for the other sections;
- Table containing 1000 results for cost and time;
- Histograms for cost and time;
- Cumulative Probability Function (CDF).



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## Deliverables

- Estimates of costs and time to perform operations;
- Sensitivity analysis to types of NPT;
- Easy adaptation to new realities;
- Partners relationship.

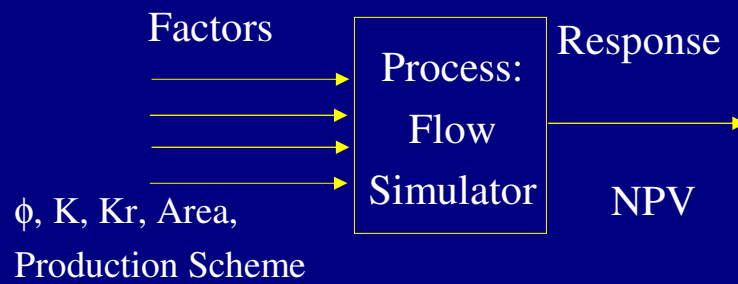
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## Example 2 Offshore Heavy Oil Recovery

- Objective:
  - Risk Analysis techniques to assess the uncertainty of NPV for an offshore heavy oil field during its initial development stage;
  - Reservoir, Production, Economics.

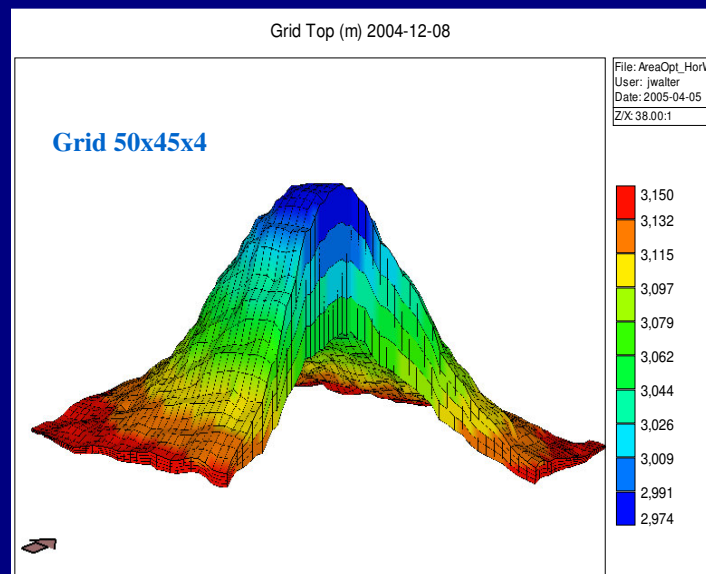
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# Methodology

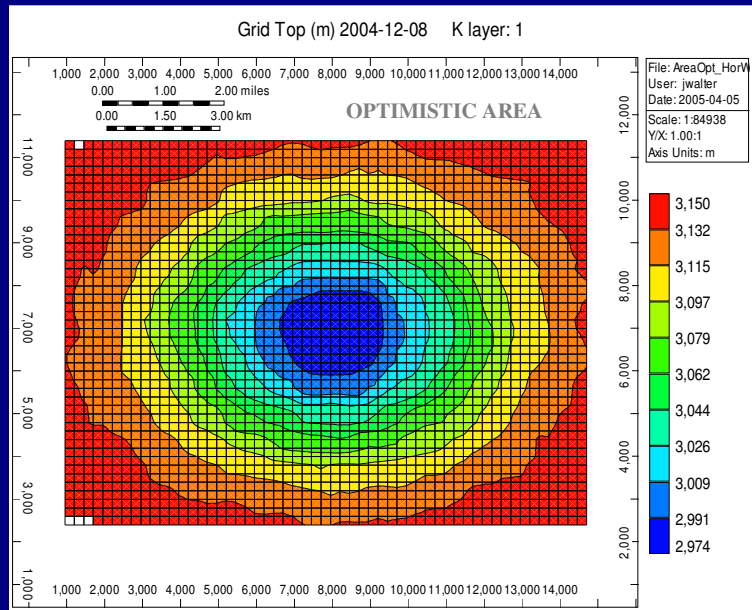


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# Reservoir Model and Uncertain Parameters

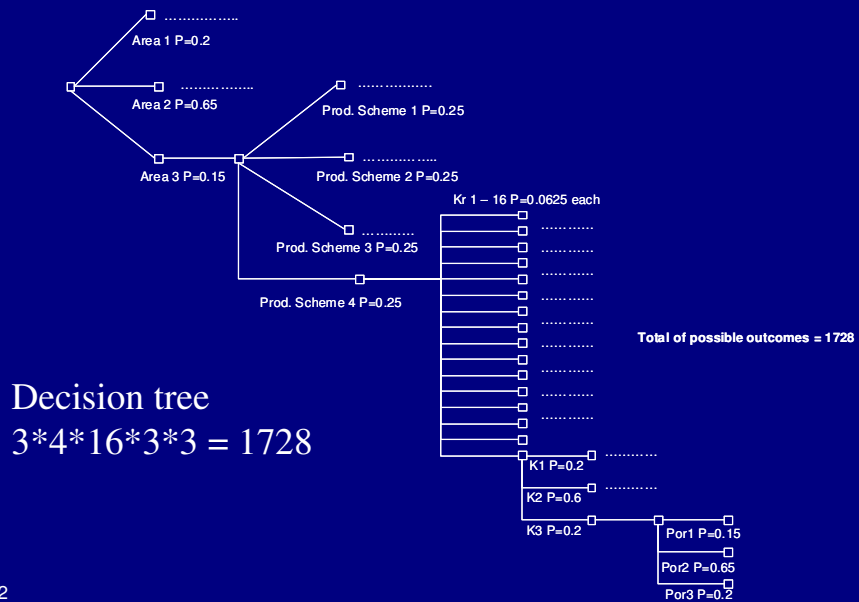


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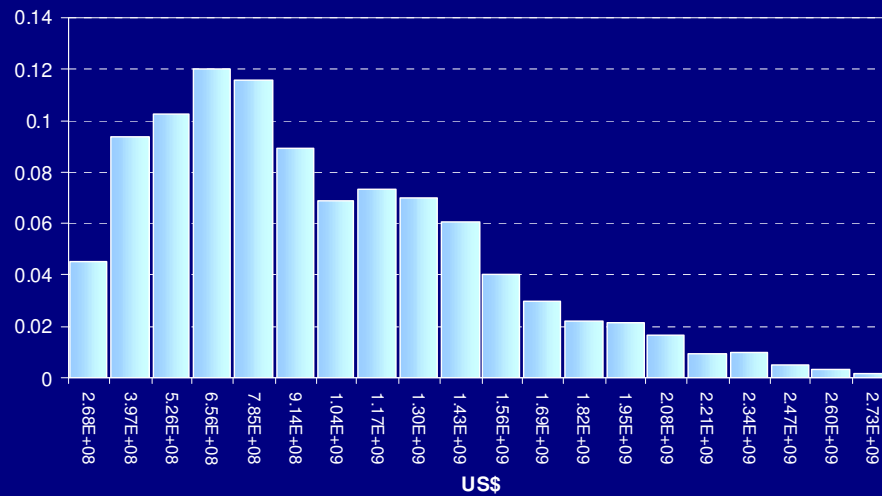
## Uncertainty Analysis



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### NPV (Net Present Value) uncertainty distribution, Horizontal Well

EMV (Expected Monetary Value) = US\$ 9.9 E8



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## Deliverables

- Expected Monetary Value (EMV) for project;
- Easy sensitivity analysis;
- Consideration of:
  - Reservoir characteristics;
  - Production scheme;
  - Economic conditions.

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## Example 3

### Well Completion – Time and Cost Estimate

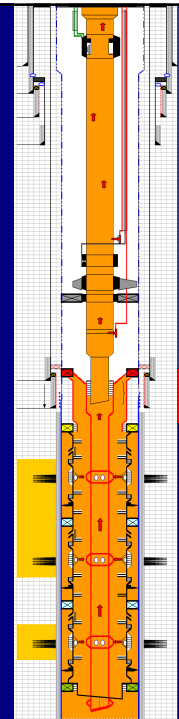
- GOM deepwater completion;
  - Rig factor;
  - Efficiency factor;
  - Cost factor.

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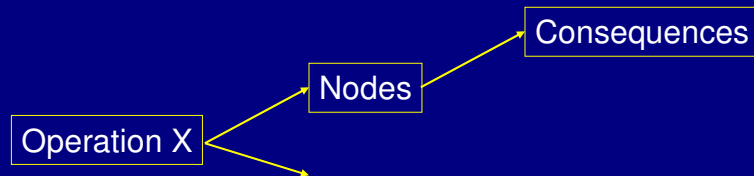
## Completion Program

### Probabilistic Model

- Detailed completion time study;
- NPT assumptions built in the model;
- Probability analysis approach.
  - Decision tree (commercial software).
  - Sensitivity Analysis.



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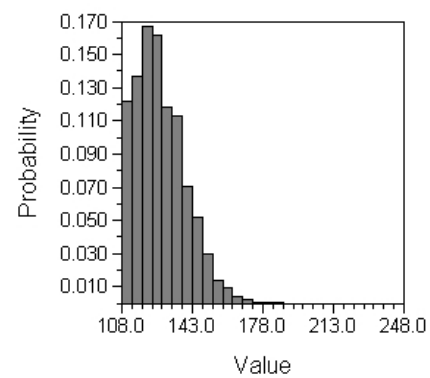
## Probabilistic Model

- Decision Tree
  - 116,734 events

### DISTRIBUTION STATISTICS (days)

Mean	126.84
Mode	109.72
Std. Dev	12.45
Min	108.08
2.5%	108.08
10%	111.50
50%	124.75
90%	145.50
97.5%	154.48
Max	243.15

Probability Distribution



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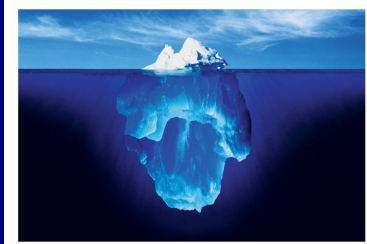
## Deliverables

- Sensitivity analysis:
  - Very important due to rig uncertainty;
- Estimates of costs and time;
- First oil.

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## Final Remarks

- Just the tip of the iceberg;
- Useful tool for cost/budgeting;
- Allow better timing prediction;
- Gives information about chances of success and failures;
- Various applications;
- Recommended reading.



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SPE 20908  
**Quantitative Risk Assessment of  
Subsurface Well Collisions**  
J. Thorogood et al.

SPE 52864  
**Borehole Stability Assessment Using  
Quantitative Risk Analysis**  
S. Ottesen et al.

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SPE 9414  
**Risk Analysis of Well Completion  
Systems**  
Alan Woodyard

SPE 139628  
**Challenging Multilateral and  
Completion Design for a Deepwater  
Well in Italy: Decision Support through  
Risk Analysis**  
C. Repetto et al.

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SPE/PS-CIM/CHOA SPE-97917-PP

Uncertainty Assessment Using Experimental Design and  
Risk Analysis Techniques, Applied to Offshore Heavy Oil  
Recovery

J.W. Vanegas Prada, J.C. Cunha and L.B. Cunha



**University of Alberta**

**QUANTIFICATION OF RESERVOIR  
UNCERTAINTY FOR OPTIMAL DECISION  
MAKING**

by

**Alshehri, Naeem Salem**

[http://repository.library.ualberta.ca/dspace/bitstream/10048/833/1/Alshehri\\_Naeem\\_Spring+2010.pdf](http://repository.library.ualberta.ca/dspace/bitstream/10048/833/1/Alshehri_Naeem_Spring+2010.pdf)



SPE 28726

Risk Analysis Theory Applied to Fishing Operations: A New Approach on the Decision-Making Problem

J.C.S. Cunha, Petrobrás S.A.

SPE Member

# Thank you!!!

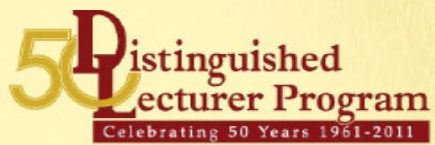
# Questions???



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