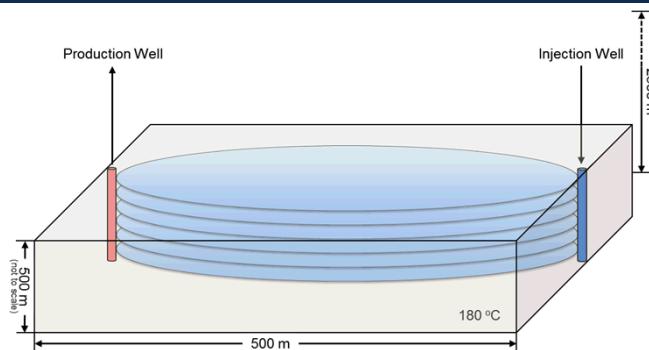
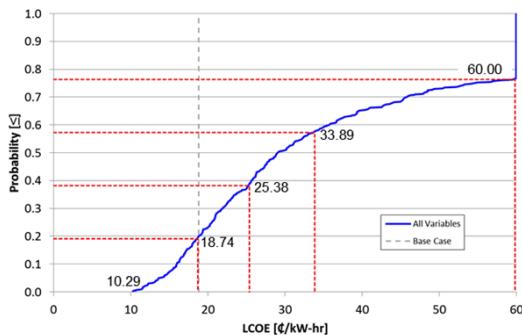


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# A Probabilistic Assessment of Enhanced Geothermal Systems, Uncertainty, and Levelized Cost of Electricity

Thomas S. Lowry, Doug Blankenship, Elena Kalinina, Teklu Hadgu



Sandia National Laboratories is a multi-program laboratory managed and operated by Sandia Corporation, a wholly owned subsidiary of Lockheed Martin Corporation, for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-AC04-94AL85000.

# Introduction

According to the U.S. Energy Information Administration (EIA) exploration and production **risk** is one of the factors responsible for slow development of EGS resources (<http://www.eia.gov>):

- Even in well-characterized resource areas, there is **significant exploration and production risk**, which can result in **high development costs**
- Risk =  $f(\text{probability})$  – **analogous to uncertainty**.

This analysis links uncertainties in physical performance and cost forecasting to better understand the integrated dynamics between probability, risk, and economic viability.

**The objective is to build a framework to determine the probability of reaching a given LCOE given a variety of uncertainties and future unknowns:**

- Start with a representative EGS Project
- Vary uncertain physical and economic parameters over realistic ranges
- Develop distribution curves of the LCOE

# Approach

- Representative EGS Project
  - Binary power plant
  - Plant performance varies as  $f(\text{production temperature})$

Parameter	Value	Parameter	Value
Depth	2500 m	Target Power Sales	25 MW
# of Production Wells (incl. confirmation wells)	10	Resource Temperature	180 C
# of Injection Wells	5	Well Separation Distance	500 m
# of Confirmation and Exploration Wells	3 ea.	Screened Interval	500 m
Production Well Cost	\$9,295,048	Pre-heater/Evaporator Pinch Point	5 C
Injection Well Cost	\$11,868,686	Evaporator Pressure	1 MPa
Confirmation Well Cost	\$11,154,058	Condenser Temperature	40 C
Exploration Costs	\$5,905,380	Turbine Efficiency	85%
Stimulation Cost / Inj. Well	\$2,000,000	Feedpump Efficiency	75%
Total Brine Mass Flow Rate	~450.0 kg/s	Project Lifetime	30 yrs

blue = power plant parameters

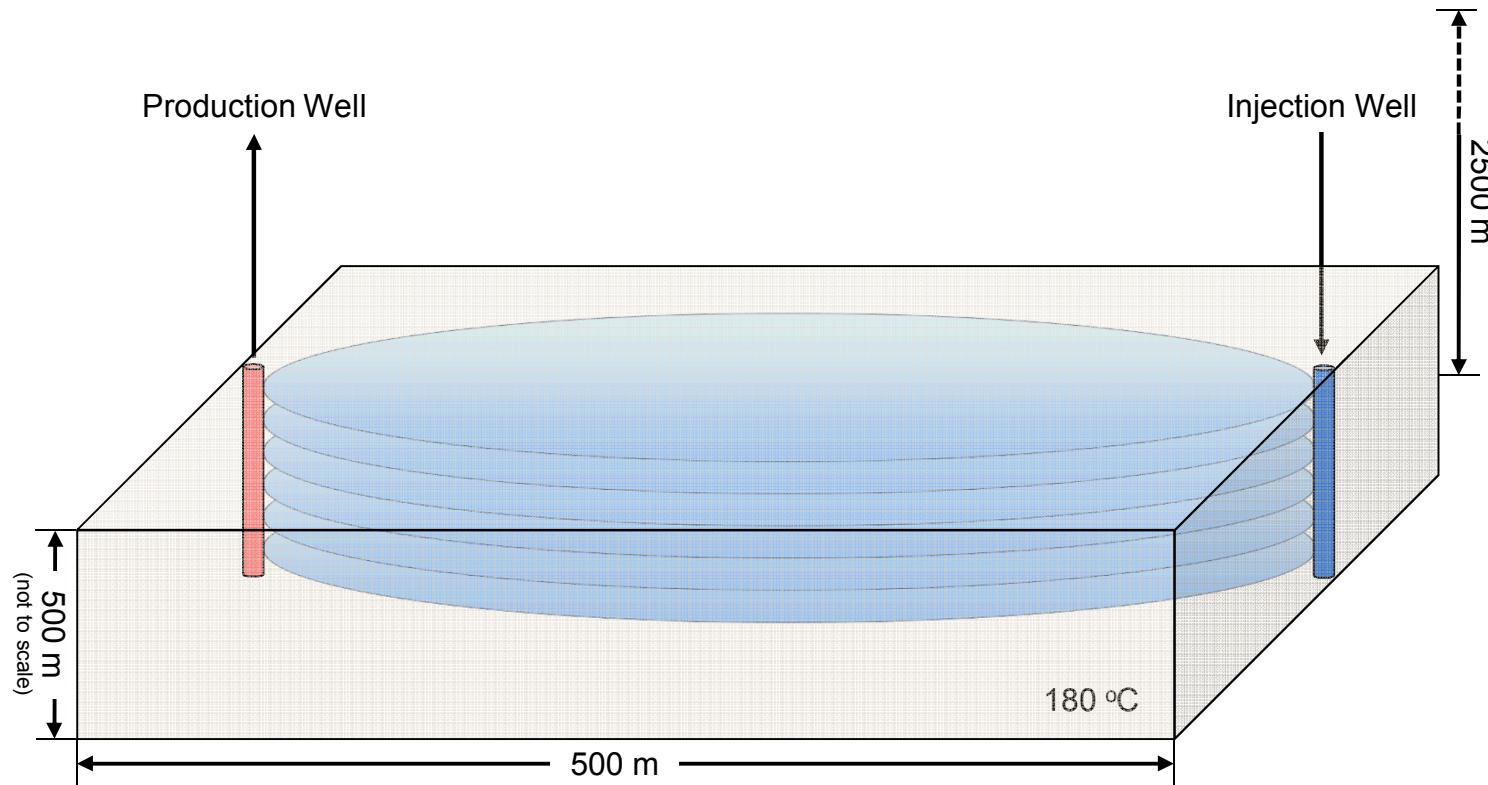
- Uncertainty
  - Physical
    - Reservoir width
    - # of fractures
    - Fracture aperture
  - Economic
    - Well Costs
    - Plant Costs

# Uncertainty – Physical System

Reservoir Width

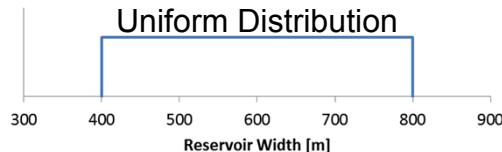
Number of Fractures

Aperture



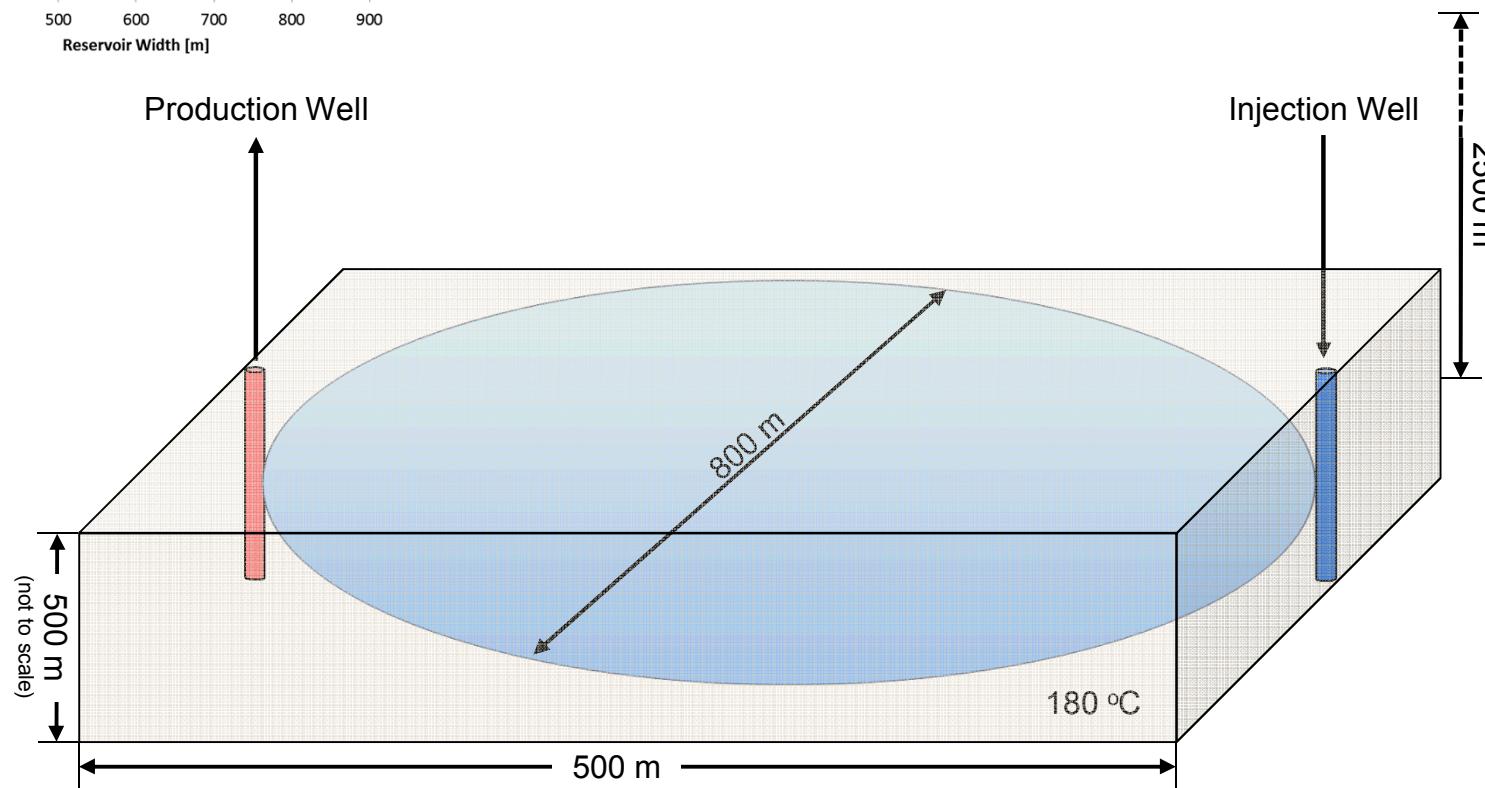
# Uncertainty – Physical System

## Reservoir Width



## Number of Fractures

## Aperture

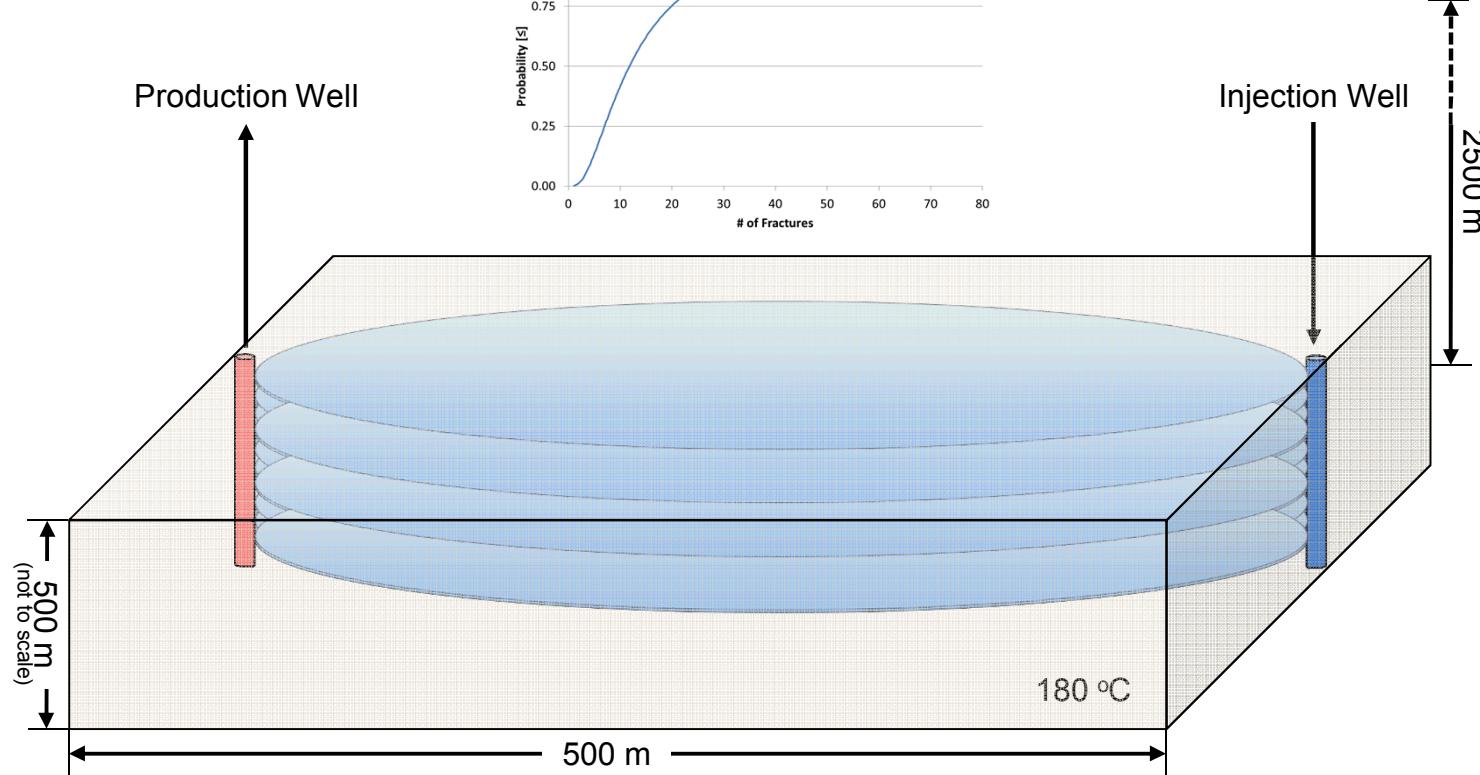


# Uncertainty – Physical System

Reservoir Width

Number of Fractures

Aperture



# Uncertainty – Physical System

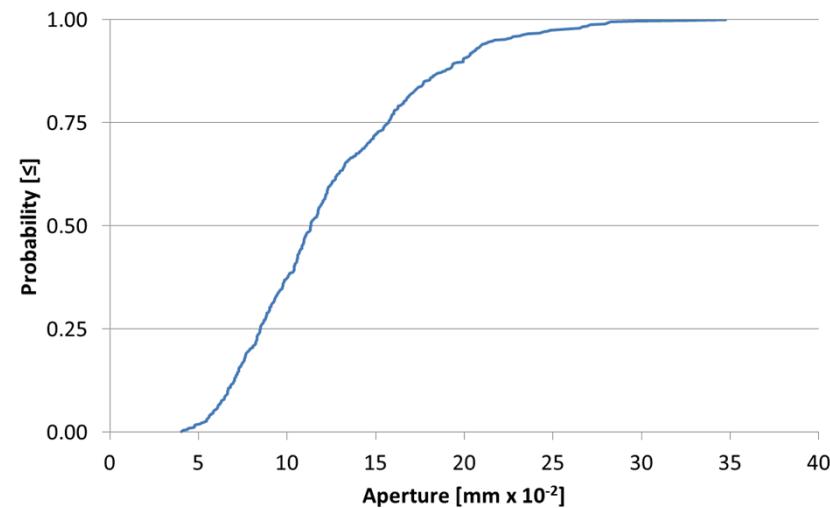
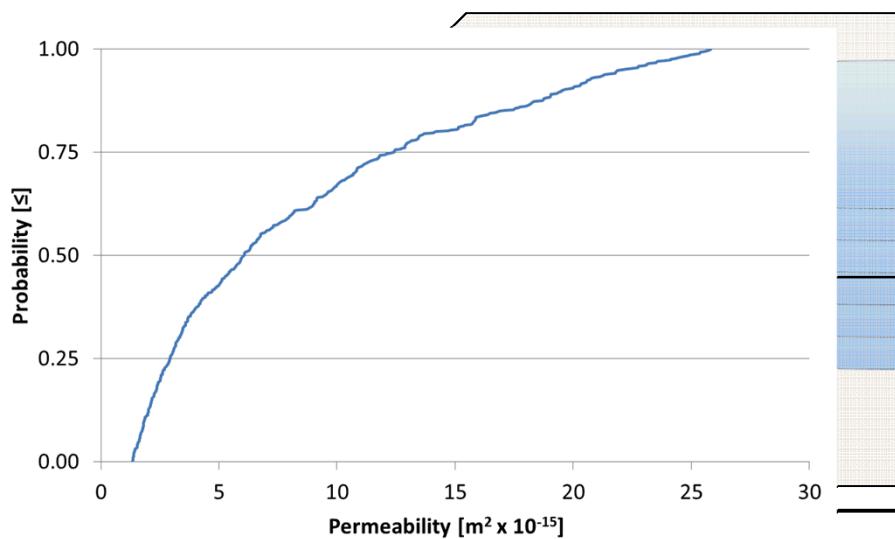
## Reservoir Width

- $k_{targ}$  (k<sub>targ</sub>) is a normalized value between 95-105% permeability:  $k_{targ} = 5 \times 10^{-15} \text{ m}^2$ .
- Aperture (calculated as a function of fracture spacing,  $a$ ) (Hibbit, 1968) (also random)

## Number of Fractures

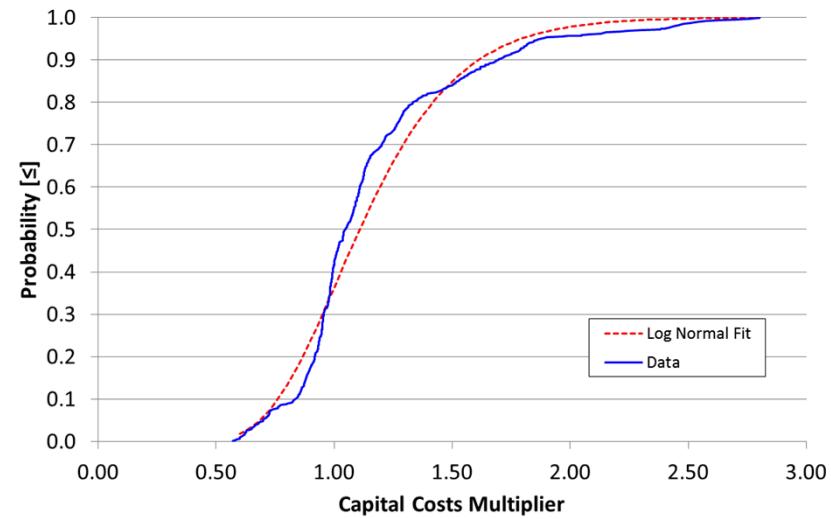
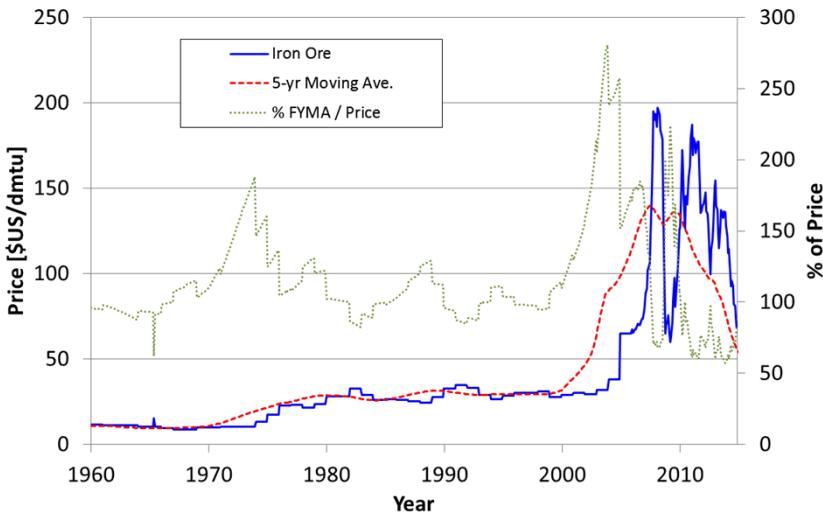
$$k_{rand} = \exp(\ln(k_{targ}) v_k)$$

$$a = \sqrt[3]{\frac{6Hk_{rand}}{n_{frac}}}$$



# Uncertainty - Economic

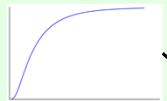
- Begin with default costs as calculated in GETEM
- Iron Ore Monthly Prices – World Bank Commodity Price Data\*
- % 5-yr moving average (FYMA) to each months' price (1960 – 2014)



# Probabilistic Modeling

## Uncertainties

Aperture



# of Fractures



Width



Well Costs



Plant Costs



## 500 Simulations

Random Sample from Distributions

Run #	LCOE	Capital	O&M
1	20.566	17.452	3.114
2	22.269	18.714	3.555
3	19.587	16.552	3.035
4	21.933	18.828	3.105
5	24.551	21.193	3.358
6	23.190	19.818	3.371
7	19.214	16.156	3.058
8	26.758	23.066	3.690
9	23.918	20.426	3.492
10	27.295	23.543	3.751
11	24.707	21.246	3.462
12	29.383	25.582	3.801
13	18.176	15.310	2.866
14	25.030	21.504	3.526
15	15.384	12.796	2.588
16	14.678	12.219	2.459
17	16.575	13.862	2.713
18	21.852	18.756	3.097
19	21.031	17.680	3.342
20	16.359	13.464	2.895
21	27.155	23.574	3.583
22	20.271	16.974	3.301
23	16.176	13.306	2.870
24	23.286	19.751	3.535
25	16.618	13.781	2.837
26	17.127	14.365	2.762
27	19.851	16.924	2.927
28	17.978	15.019	2.959
29	34.006	29.568	4.438
30	13.255	10.857	2.398
31	17.008	14.214	2.793
32	18.600	15.657	2.942
33	30.453	26.567	3.885
34	18.035	15.005	2.940
35	17.053	14.093	2.960
36	19.008	14.395	2.906
37	17.626	14.757	2.869
38	24.574	18.278	3.296
39	17.695	14.853	3.842
40	32.791	28.743	4.048
41	18.848	15.880	2.968
42	21.973	18.656	3.315
43	16.799	14.100	3.699
44	35.850	31.547	4.203
45	21.076	17.861	3.214
46	20.466	17.258	3.208

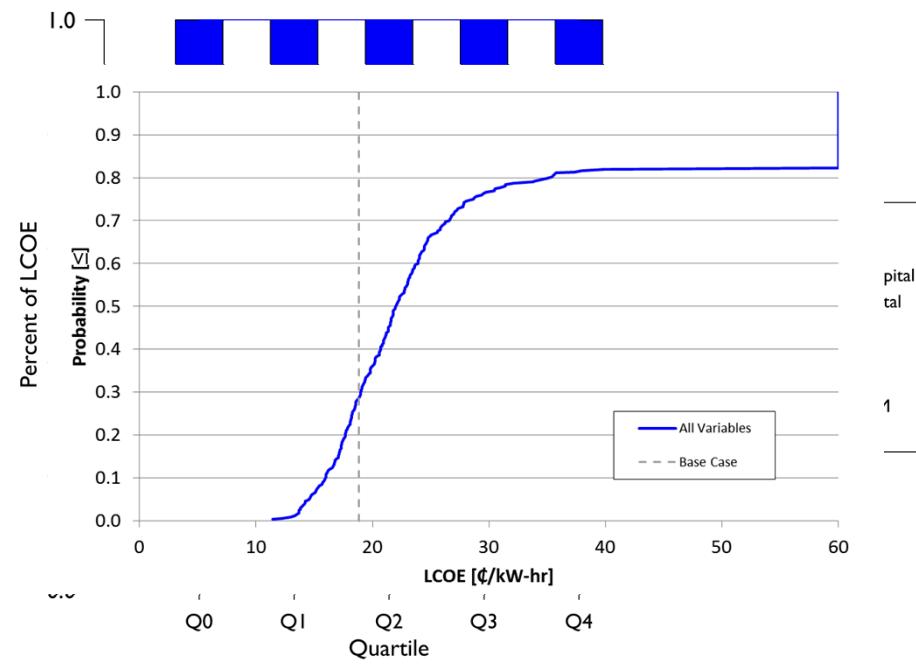
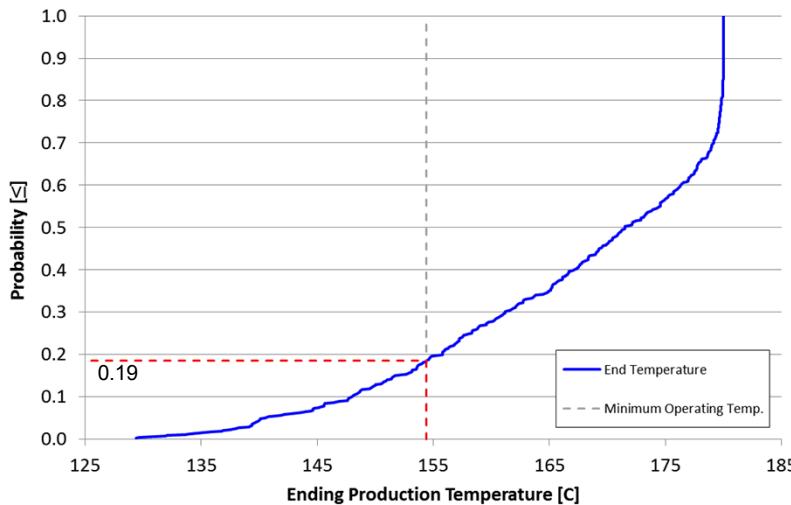
GT-Mod  
Dynamic Simulation Model

Constants

Cumulative Distributions  
Of Outputs Reflect  
Impact Of Uncertainty

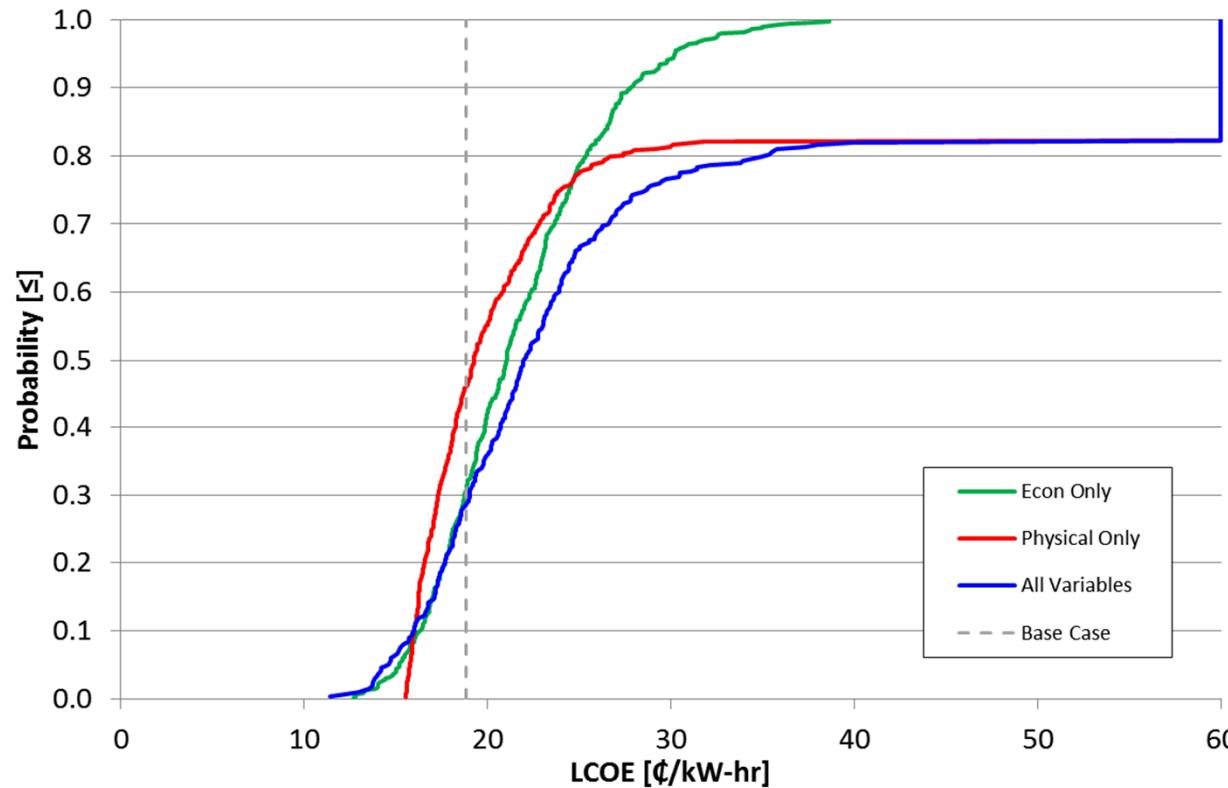
# Results

- 19% that ending production temperature < minimum
- 29 % LCOE < Base Case (default values, 18.831 ¢/kW-hr)
- Plant and well capital costs: 58% - 66% of LCOE



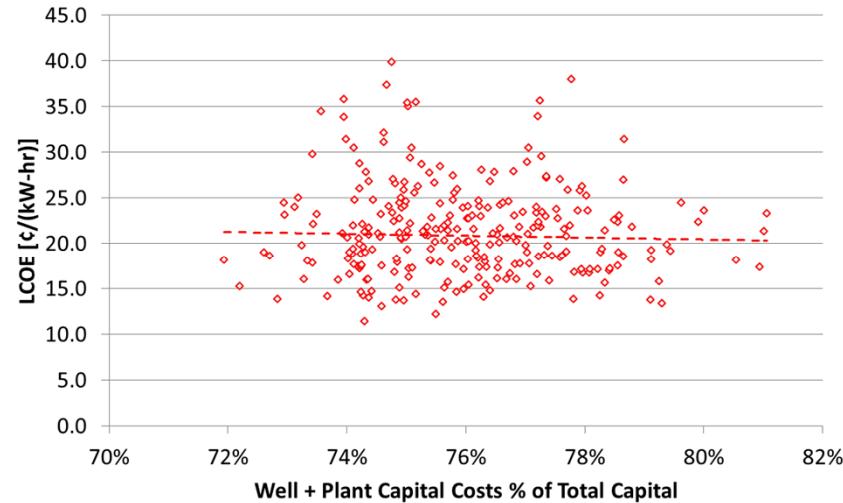
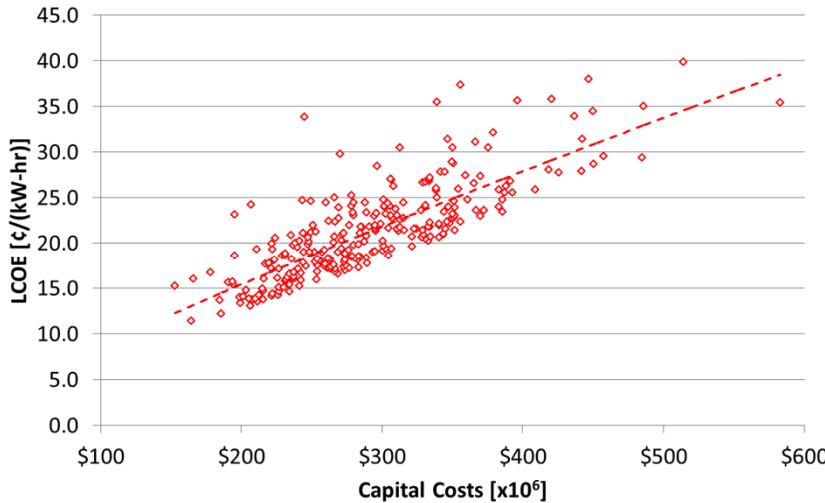
# Comparing LCOE Components

- Physical uncertainty contributes more to higher LCOE values
- Economic uncertainty contributes more to lower LCOE values



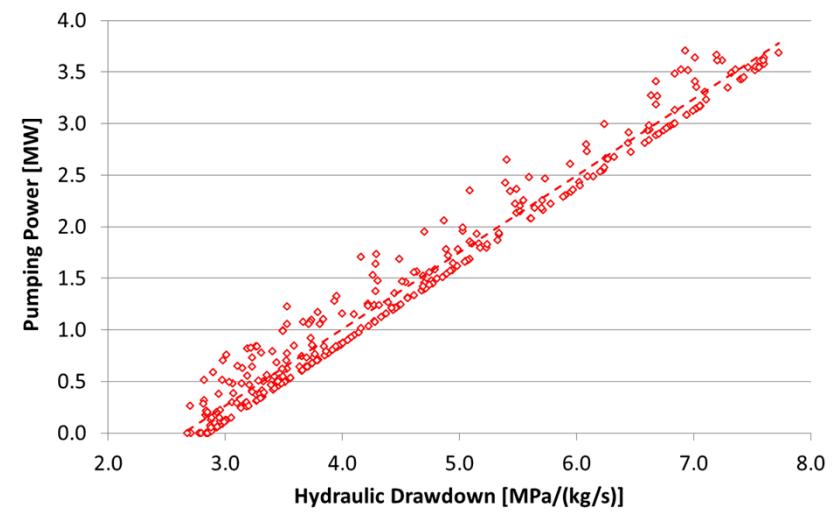
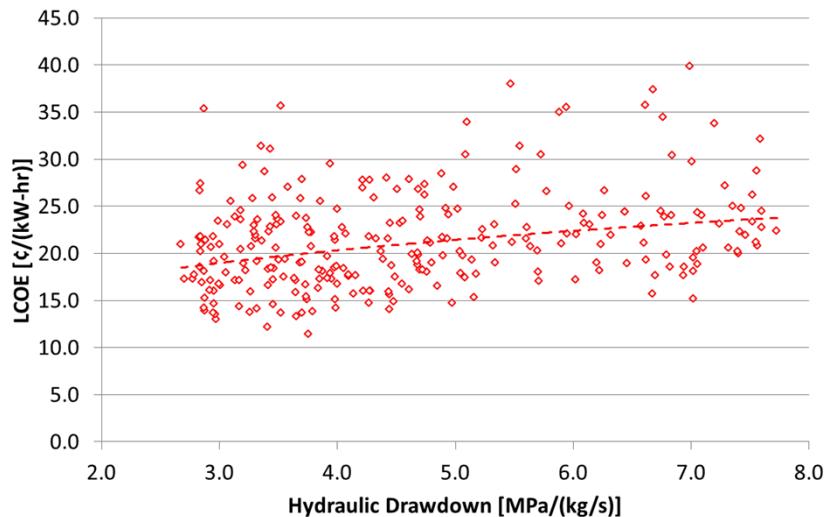
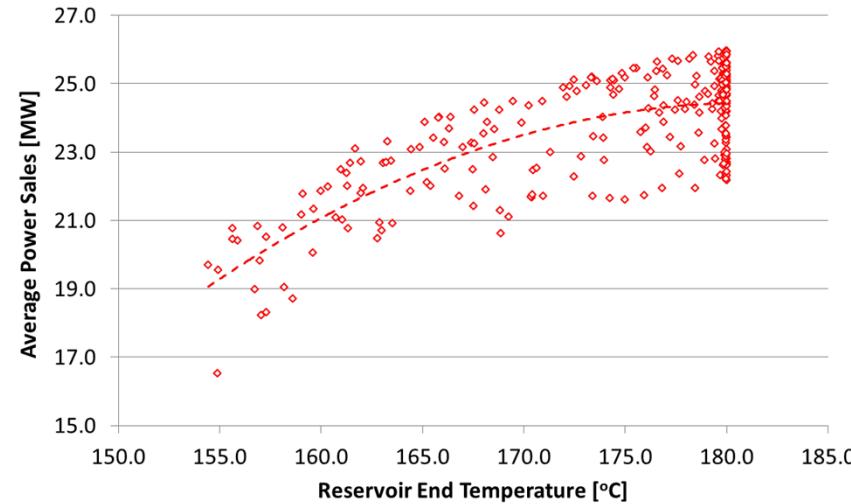
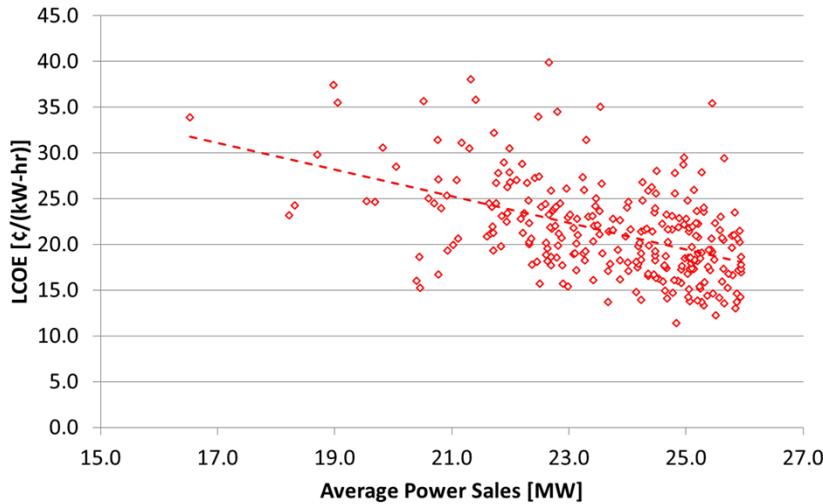
# Priority Influencers

- Capital Costs have a strong influence on the LCOE
- Well and Plant costs are the largest % of Capital Costs



# Priority Influencers

## Reservoir End Temperature & Hydraulic Drawdown



# Summary

- Objective: to build a framework to determine the **probability of reaching a given LCOE** given a variety of uncertainties and future unknowns
- Used **probabilistic modeling** to produce cumulative distributions of the LCOE as an integrated function of uncertainty
- The 3 physical uncertainties (**number of fractures, aperture, and reservoir width**) control thermal drawdown and pumping requirements
- The 2 physical uncertainties control capital costs (and by extension, O&M costs)

# Summary

- Results show that the final LCOE distribution is **skewed towards the high end**: 71% probability of doing worse than the default values
  - Physical uncertainties contribute more to **higher LCOE values** – lower performance is bounded
  - Physical performance is non-linear
- Economic uncertainties contribute more to **lower LCOE values**
- Most important factors are **capital costs and pumping requirements**

# Thank You