

Forecasting Production in Shale Gas Reservoirs- A Better Assessment of Reserves

Occidental Petroleum Corporation ■ GCS Reservoir Study Group ■ Anadarko Petroleum Convention Center ■
10th May ■ Krunal Joshi, Reservoir Engineer



Disclaimer

This presentation in no way represents or bears upon the Reserves process of Oxy or any of its subsidiaries



Outline

- Problem
- Deterministic forecasting models
- Fixes to the Duong method
- Comparison of deterministic forecasting models for Individual wells
- Comparison of deterministic forecasting models for grouped well sets
- Conclusions



We Have a Problem

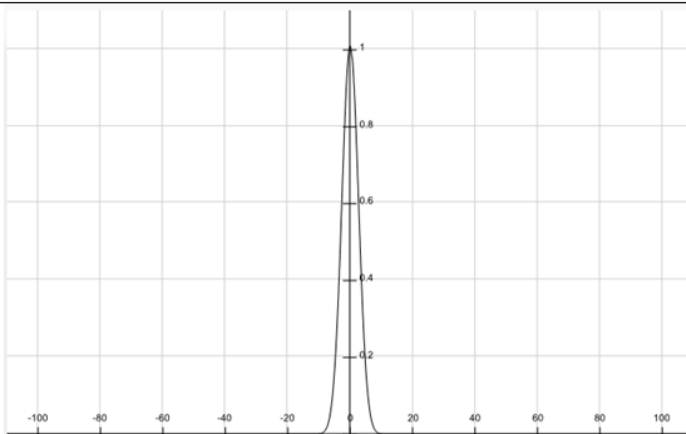
- Forecasting methods we use in conventional reservoirs may not work well in
 - Tight oil, gas
 - Oil, gas shales
 - Unconventional resources generally

- There have been various methods proposed

Criteria for Ideal Decline Model in Ultra-Tight Reservoirs

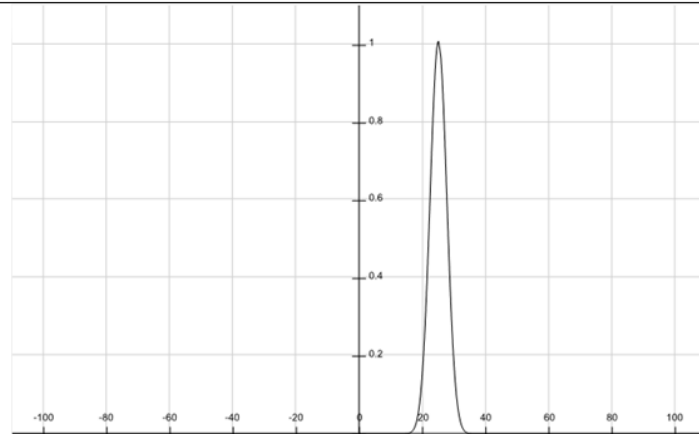
- Forecasts are reasonable and realistic for the well life
- Forecasts reasonable even with <2 years historical production data
- Valid during transient or radial flow
- Valid for boundary-dominated flow
- Easy to use and couple with economics software

A Superior Model Has Higher Accuracy and Precision For a Large Number of Wells



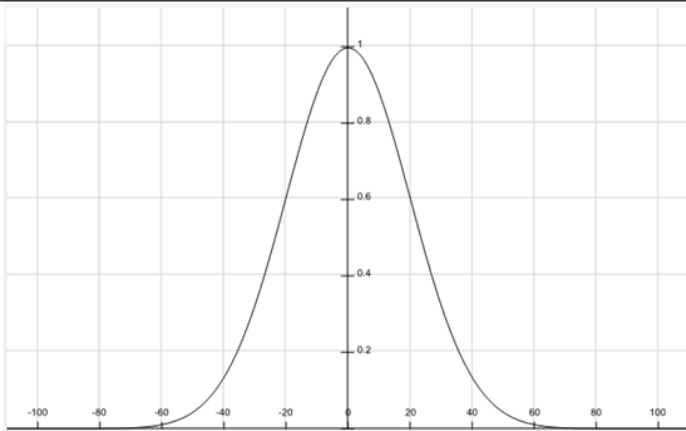
% Error in Reserves

Fig.6a- High Precision & High Accuracy



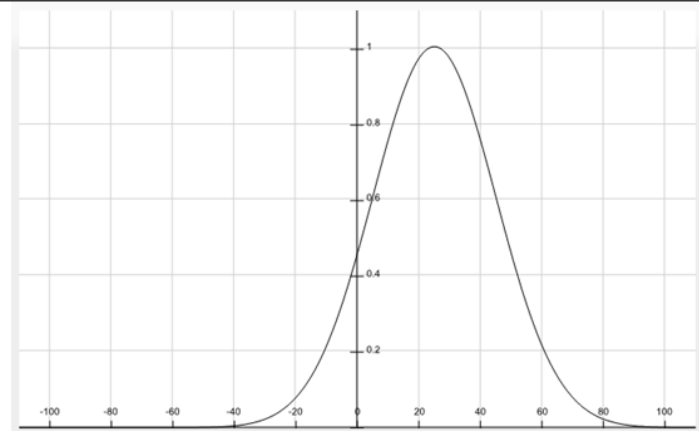
% Error in Reserves

Fig.6b- High Precision but Low Accuracy



% Error in Reserves

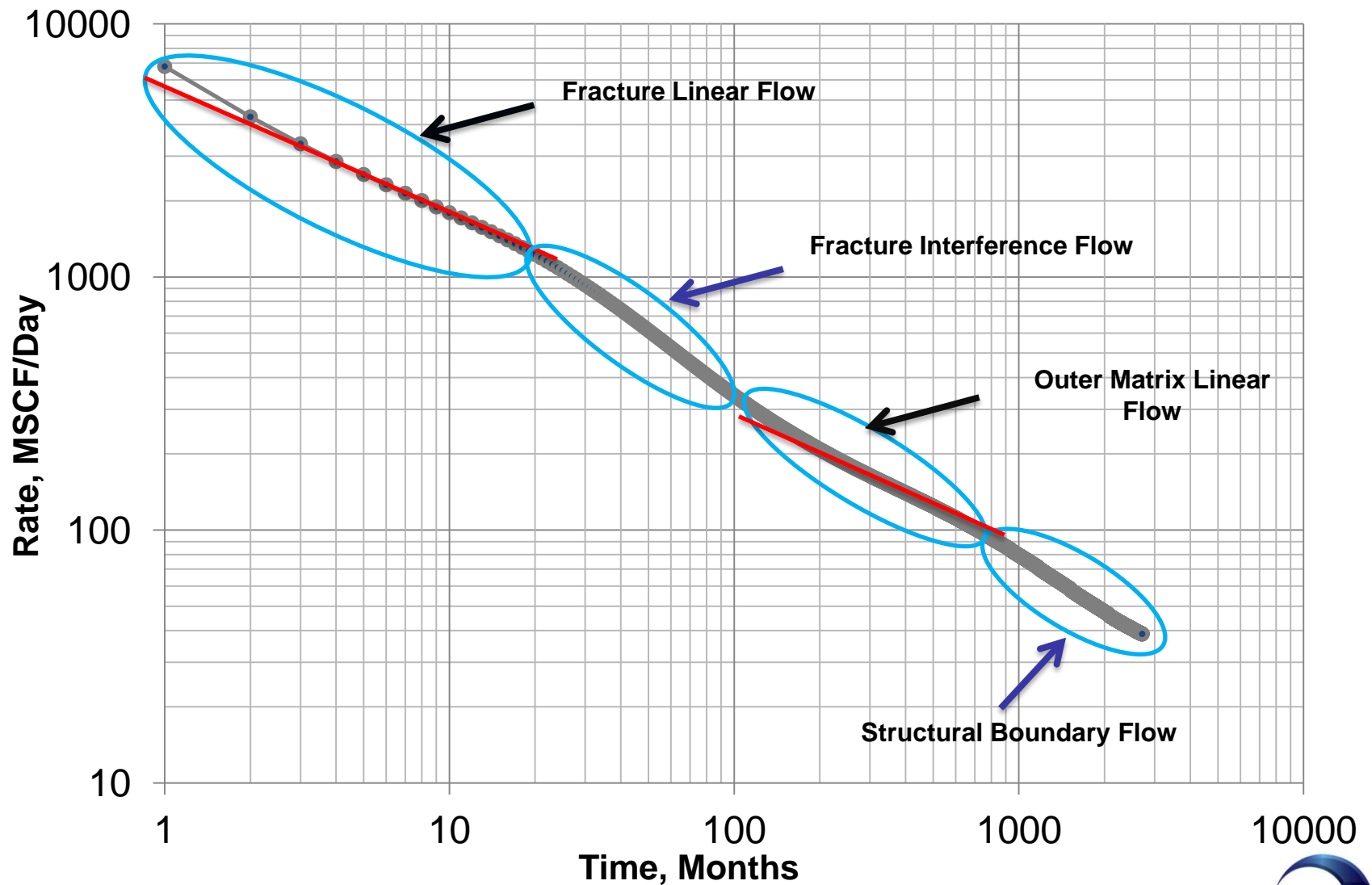
Fig.6c- Low Precision & High Accuracy



% Error in Reserves

Fig.6d- Low Precision & Low Accuracy

Long-Term Horizontal Shale Gas Well Simulation: Linear Flow Plot



Forecasting Models

- **Arps(Minimum Decline)**: Hyperbolic decline followed by exponential decline after a predetermined decline rate. (Arps, 1945 & Long, 1988)
- **Duong Model**: A decline model based on long-term flow regime approximating linear flow: $\frac{q}{G_p} = at^{-m}$ (Duong, 2010)
 - Modified Duong : With a Dswitch of 5% followed by a Arps curve of $b=0.4$
- **SEDM/SEPD Model**: A decline model that is a summation of simultaneous exponential declines in different 'cells' within a reservoir. (Valko et.al, 2009)

$$q = q_i \exp \left[- \left(\frac{t}{\tau} \right)^n \right]$$



Arps (Minimum Decline)

- Best-fit “ b ” until predetermined minimum decline rate reached; then impose exponential decline (SPE 16237)

$$q = q_i \frac{1}{(1 + bD_i t)^{(1/b)}}$$

- Problems
 - Apparent “best” b decreases continually with time
 - Appropriate minimum decline rate based on observed long-term behavior in appropriate analogy – unavailable in new resource plays



SEPD/SEDM Model

$$q = q_i \exp \left[- \left(\frac{t}{\tau} \right)^n \right]$$

- ‘Validated’ for wells with both transient and stabilized flow in Barnett Shale
- Forecasts unreliable for <18 months of data
- n varies from 0.1 to 1 (exponential decline)
- Practical τ range is 0.01 to 80



Duong Model

- Based on Long-term linear flow

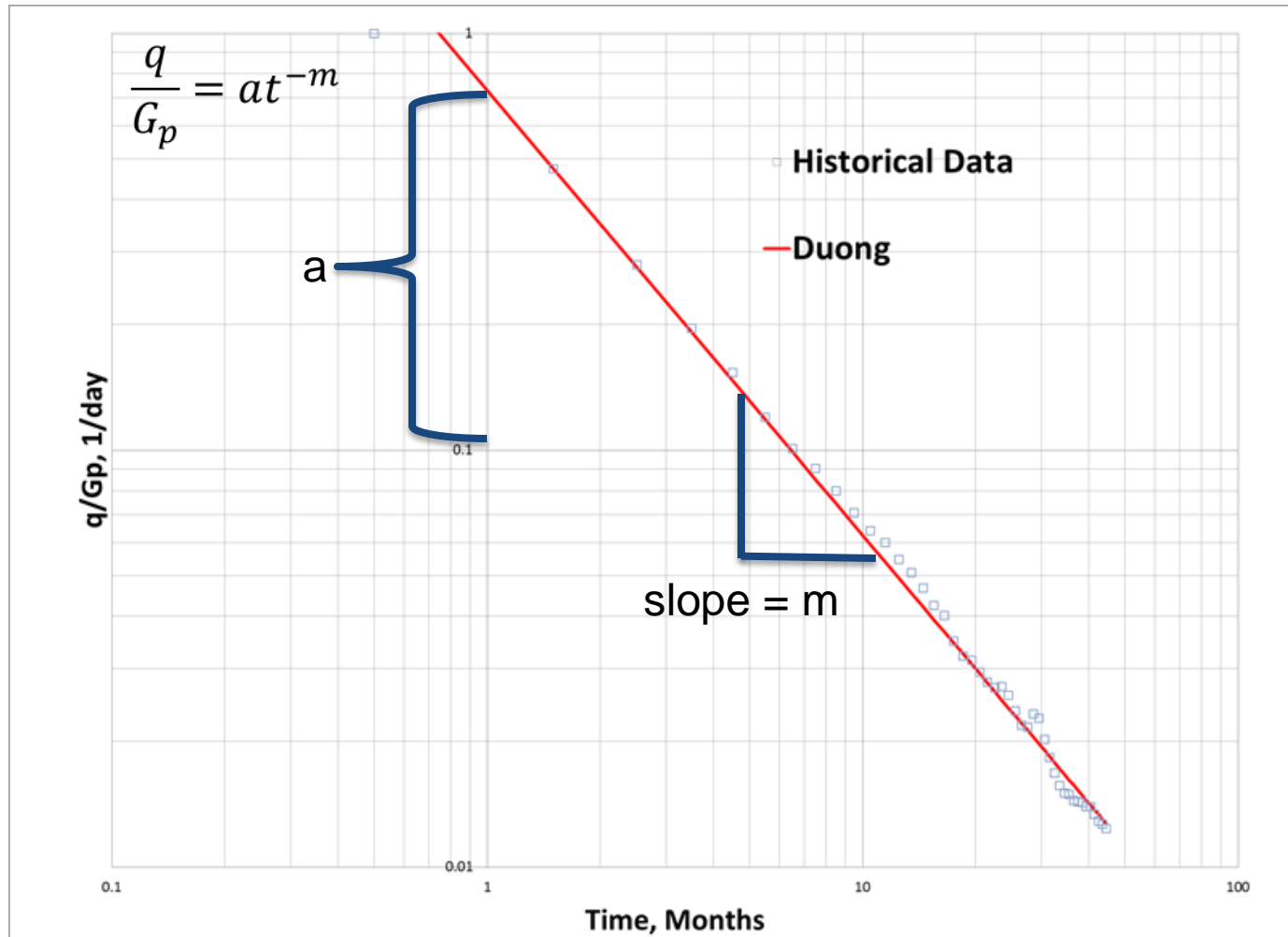
- $\frac{q}{G_p} = at^{-m}$

- $q = q_1 t(a, m) + q_\infty$

- $t(a, m) = t^{-m} e^{\frac{a}{1-m}} (t^{1-m} - 1)$

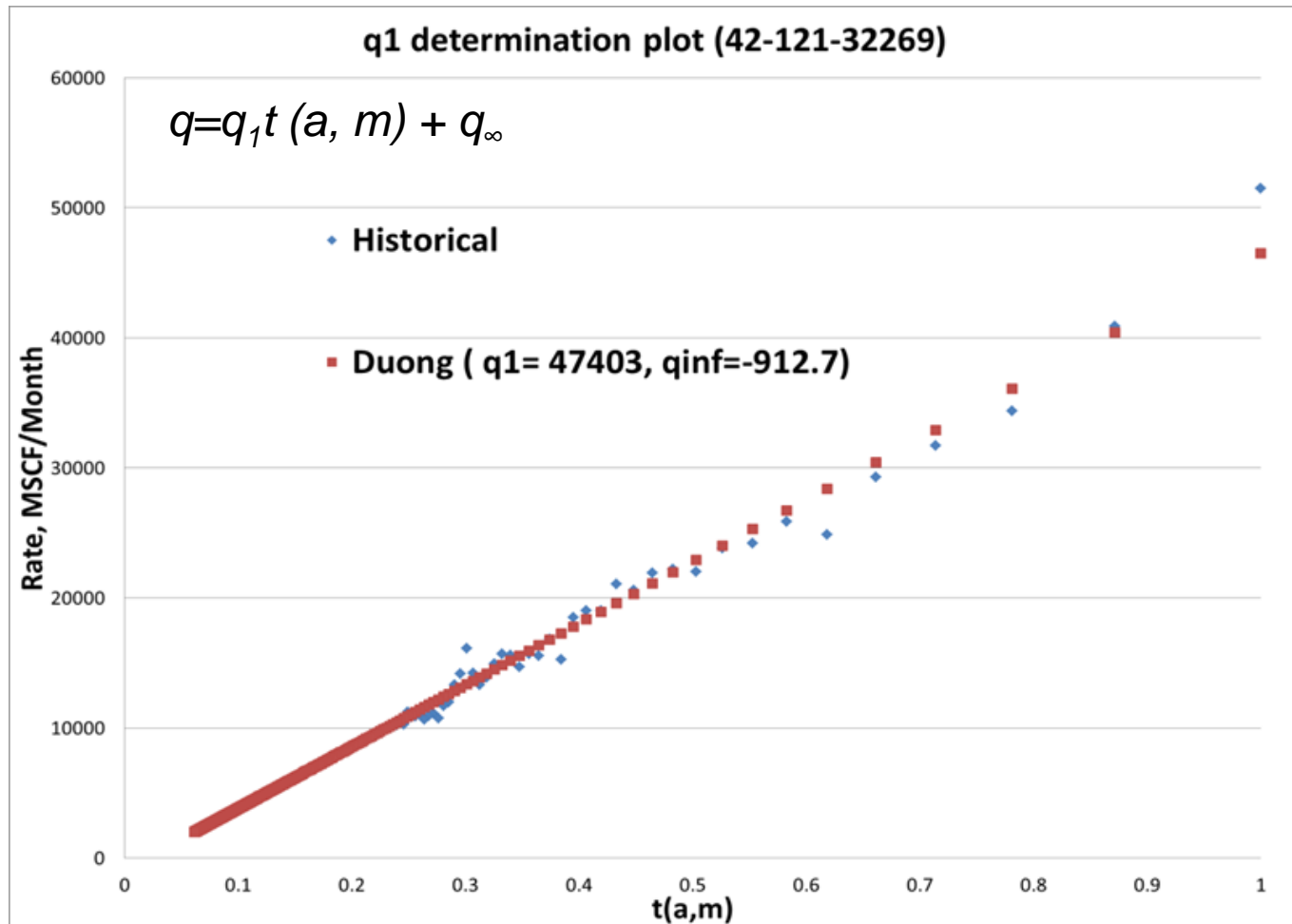


Determination of a & m (Duong)



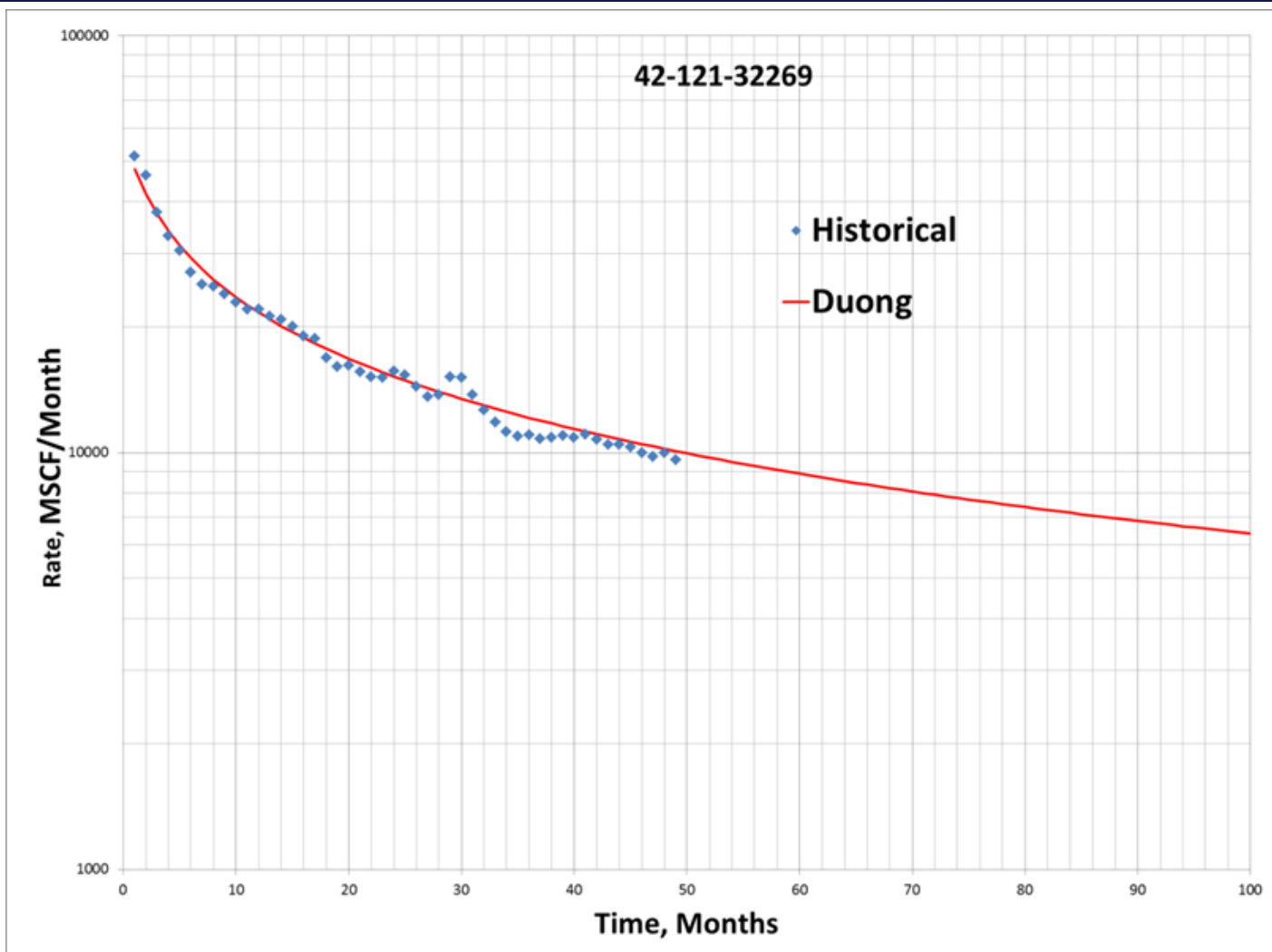
$$a=0.731, m=1.067$$

Determination of q_1 & q_∞ (or q_{inf})



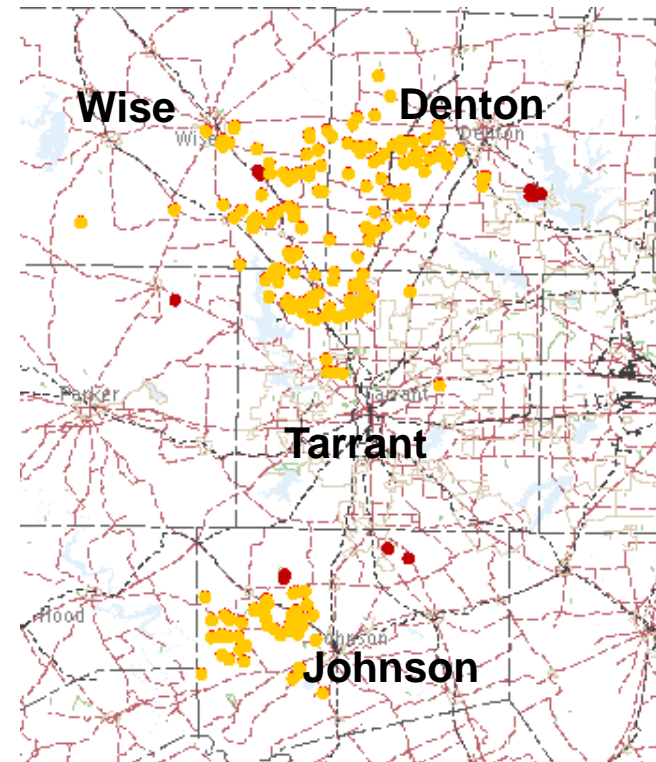
q_{inf} or q_∞ is the x-intercept on the above plot

Duong Forecast



Field Data Set

- 250 Well Dataset
 - Barnett Shale (200wells)
 - Denton
 - Tarrant
 - Wise
 - Johnson
 - Fayetteville Shale (50 wells)
 - Van Buuren
 - Drilling Info
 - Horizontal Wells
 - Monthly Rate Data
- 1st production starts 1/1/2004
- Range of total production: 30 to 85 months

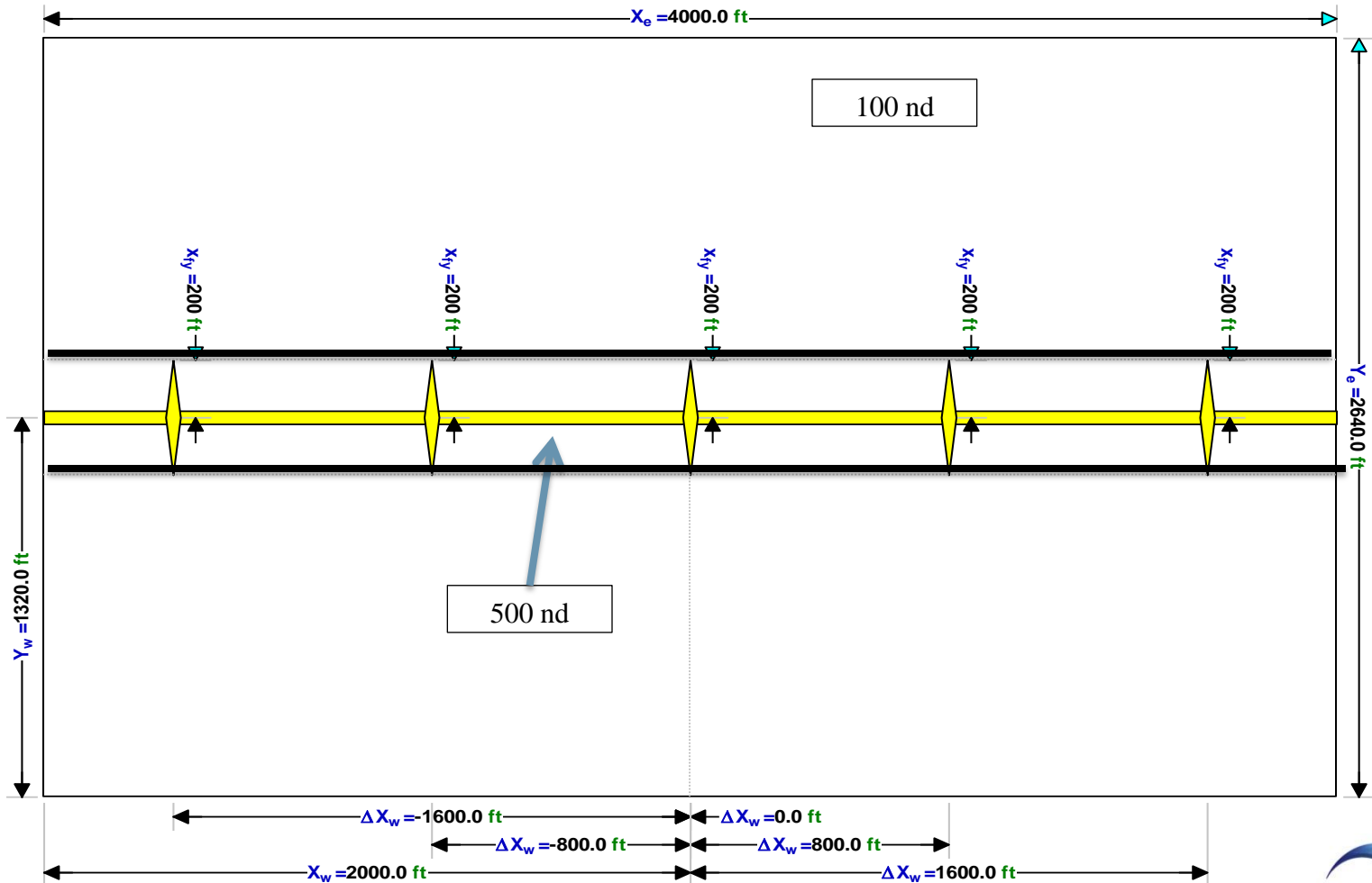


Simulated Data Set

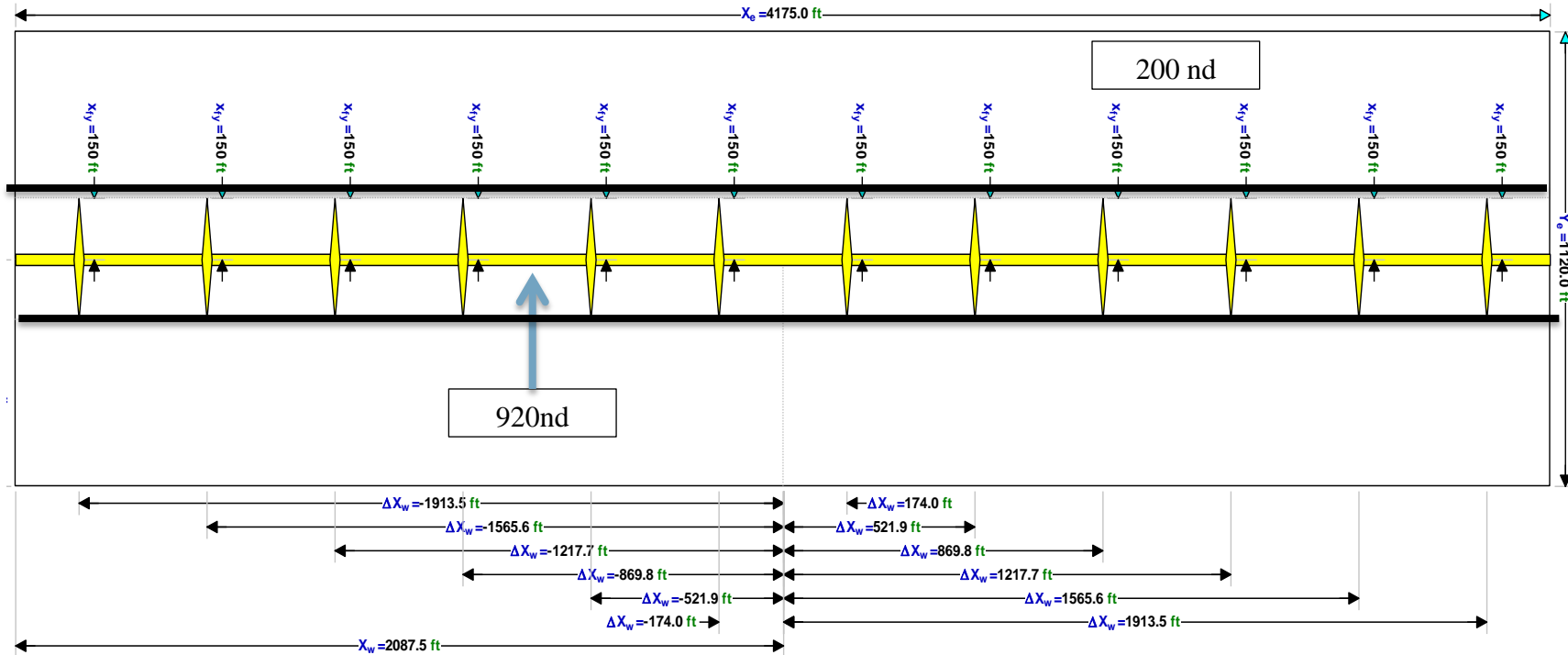
- Composite Model
 - Analytical Simulator (Fekete WellTest)
 - SRV permeability different from Outer Matrix permeability
- Barnett (25 simulations)
 - 133874([Chong et al. 2010](#)), 146876([Cipolla et al. 2011](#)), 144357([Strickland et al. 2011](#)), 96917([Frantz et al. 2005](#)), 125530([Cipolla et al. 2010](#)) and 147603([Ehlig-Economides and Economides 2011](#))
- Marcellus (25 simulations)
 - 133874([Chong et al. 2010](#)), 125530([Cipolla et al. 2010](#)), 144436 ([Thompson et al. 2011](#)) and 147603([Ehlig-Economides and Economides 2011](#)).
- Properties Varied:
 - Fracture stages, fracture length and fracture conductivity.
 - Stimulated Reservoir Volume (SRV) permeability
 - In accordance with the ranges in the above papers

Barnett Shale Simulation (Base Case)

Hz Multifrac-Comp Model
Schematic



Marcellus Shale Simulation (Base Case)

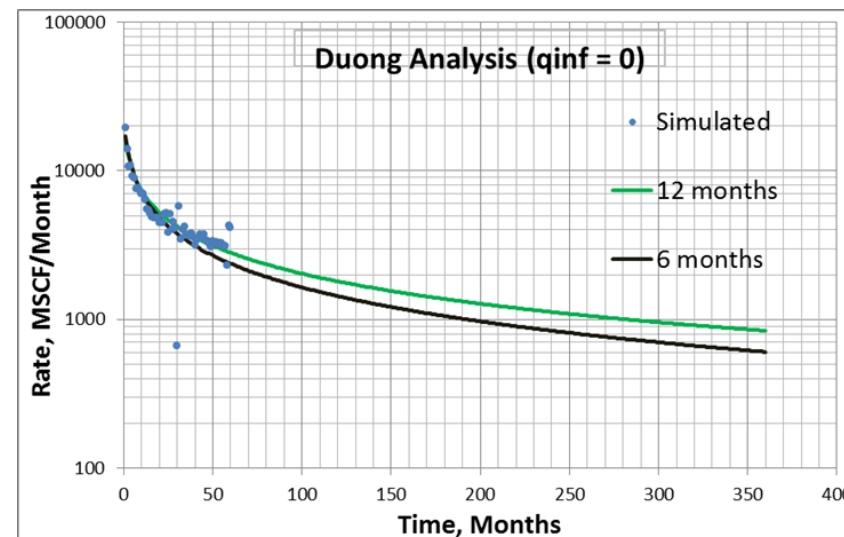
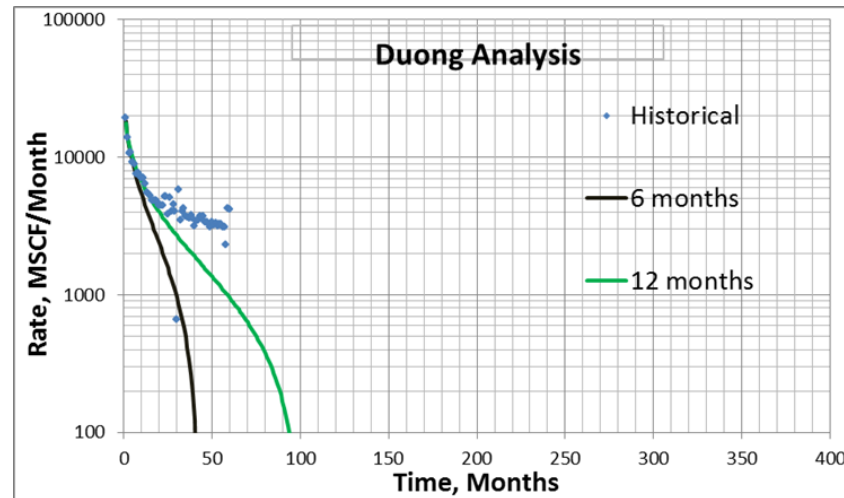


Fixes to the Duong Model

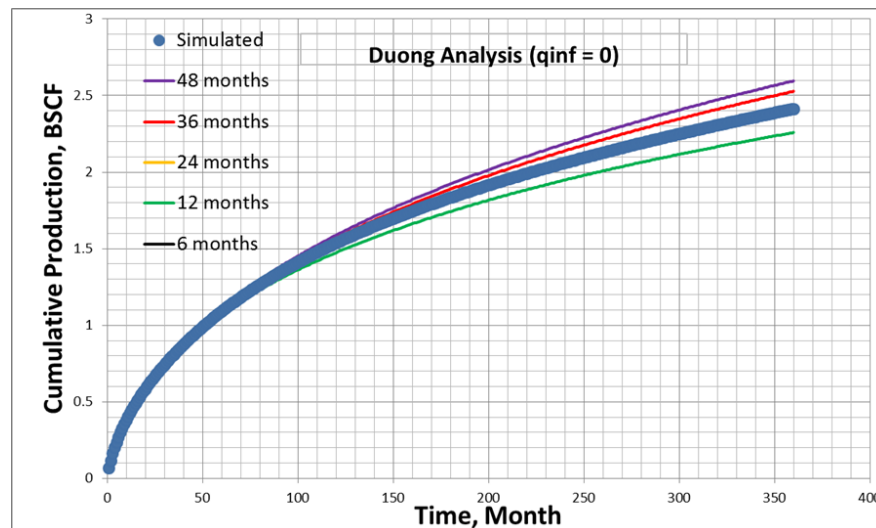
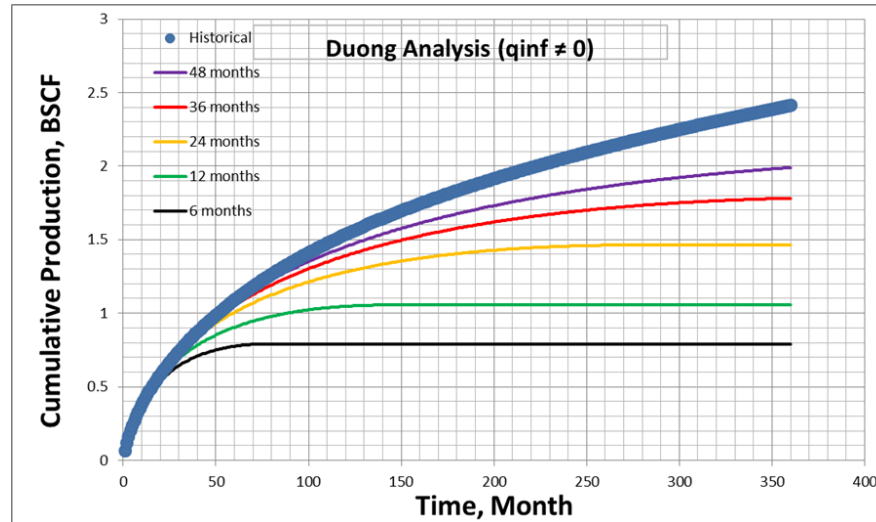
- Use of q_{inf}
 - Not suggested for short term data.
 - Debatable for long-term data
 - Simulated data can solve the conundrum of whether q_{inf} is necessary or not.

- Modified Duong
 - Accounts for fracture interference
 - D_{switch} of 5%, i.e. when decline rate reaches 5%, forecast switches to Arps

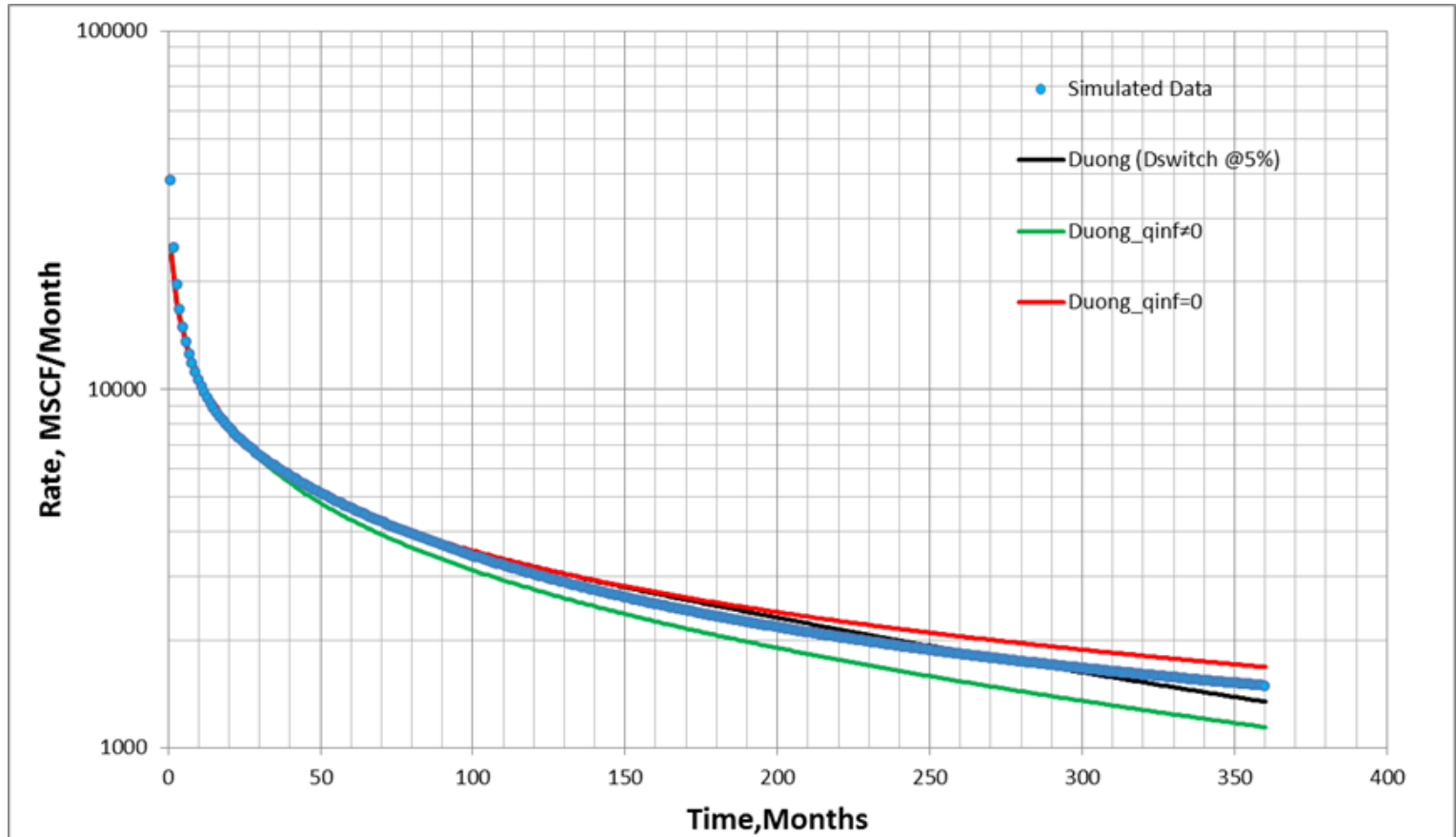
Using qinf Does Not Work For Short Term Field Production Data



Using q_{∞} For Simulated Production Data Does Not Work Well



Modified Duong (Dswitch @5%) Works Better Than the Original Duong



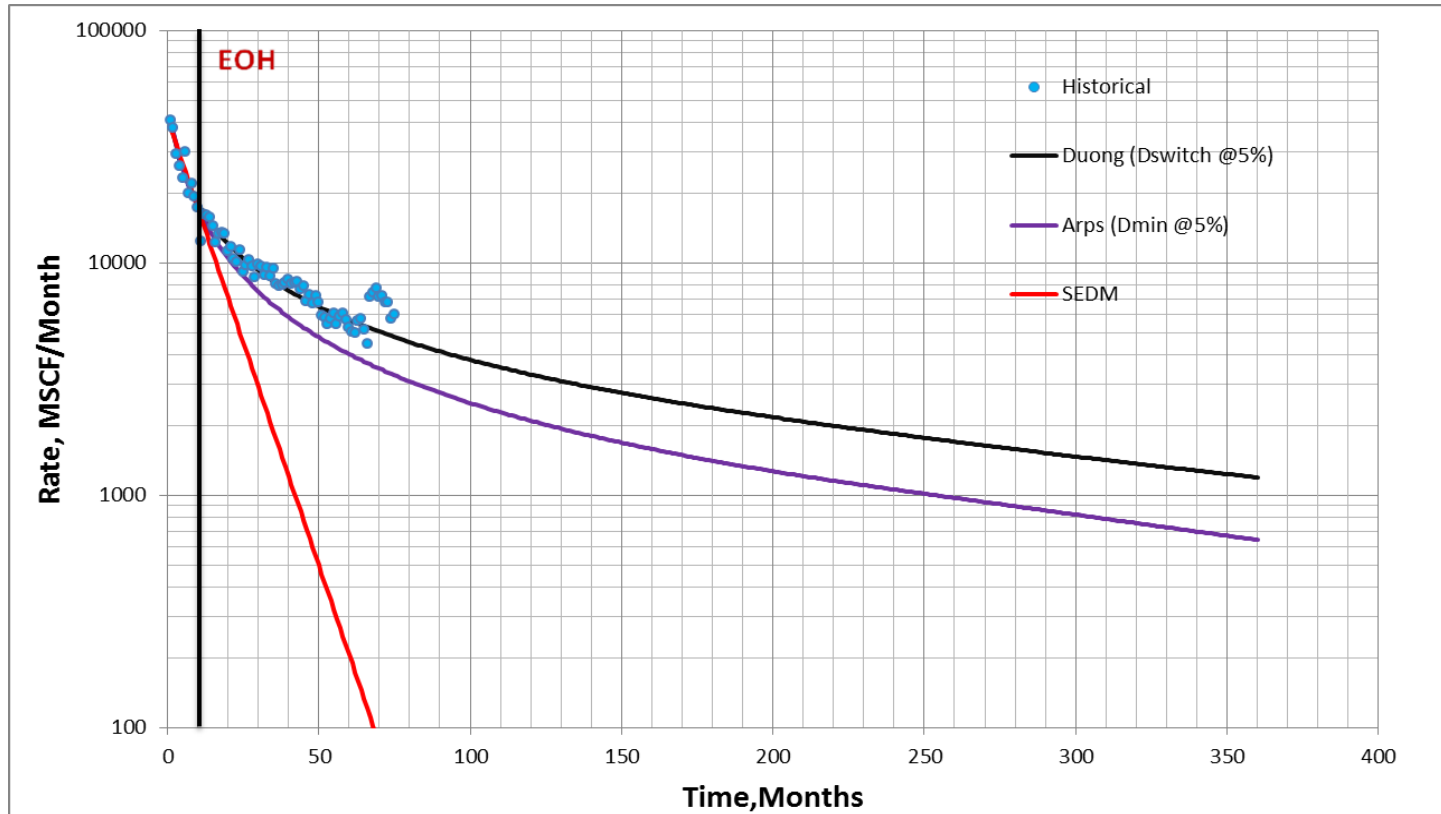
Individual Well Field Production Data

Comparison of The Modified Duong, SEDM and Arps For a Field Data Set

Discrepancy (error%) in remaining production for a field dataset				
History Matched		Duong_Dswitch@5%	SEDM	Arps (Dmin 5%)
6	Mean	-15.98	40.91	10.97
	Std.Dev	29.24	39.06	33.16
	% Wells <15 % error	45.60	22.00	43.20
12	Mean	-7.77	6.44	5.04
	Std.Dev	17.48	27.75	22.57
	% Wells <15% error	66.80	48.40	63.20
18	Mean	-6.90	5.06	3.03
	Std.Dev	14.41	21.90	19.01
	% Wells <15 % error	71.60	59.20	69.20
24	Mean	-2.49	4.49	2.21
	Std.Dev	16.13	20.51	18.92
	% Wells <15 % error	72.80	64.40	71.60
36	Mean	-5.04	4.41	2.77
	Std.Dev	17.88	21.93	22.54
	% Wells <15 % error	71.93	64.91	68.86
48	Mean	-5.45	1.63	-0.05
	Std.Dev	18.08	27.12	26.99
	% Wells <15 % error	77.16	69.04	77.66

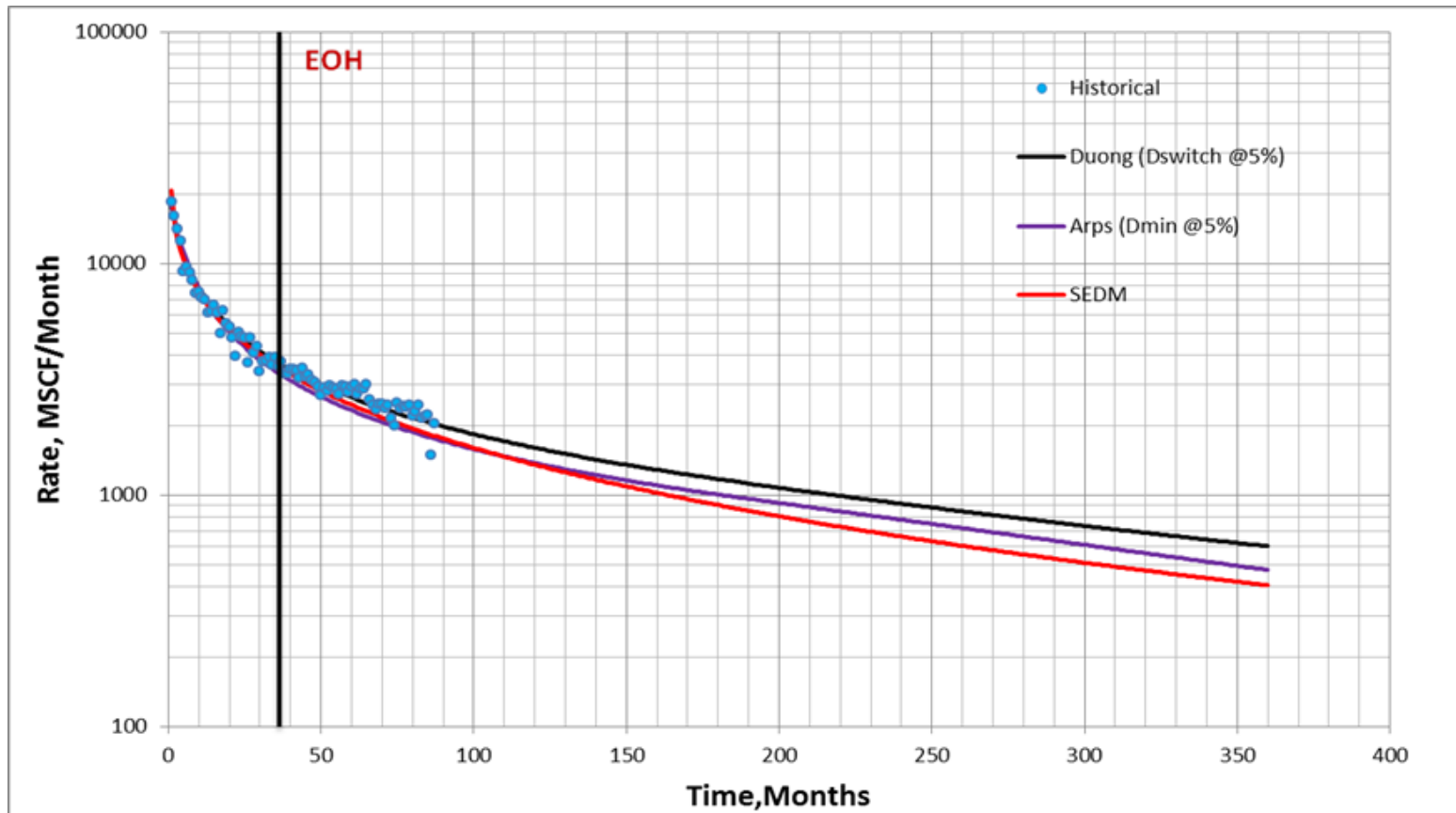


How Well Do Different Models Forecast With Short Term Data ?



Comparison of various empirical models for API# 42-121-32245, matching 12 months of historical data.

How Well Do Different Empirical Models Forecast With Long Term Data ?



Comparison of various empirical models for API# 42-497-35453, matching 36 months of historical data.

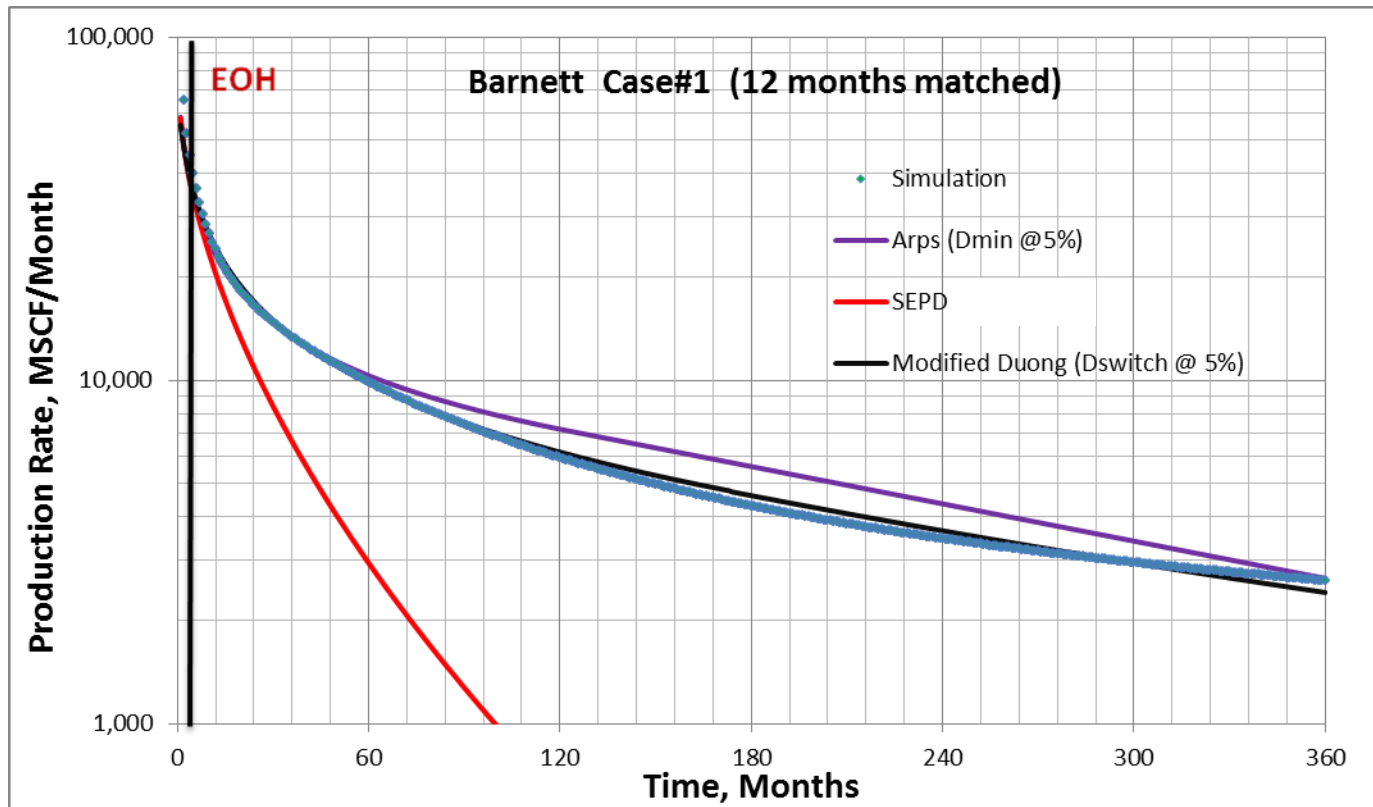
Individual Well Simulated Data

Discrepancy (% error) in Remaining Production For the 3 Empirical Methods on Simulated Wells

Discrepancy (Error %) in remaining production				
History Matched		Duong_qinf=0 (Dswitch @5%)	Arps (Dmin @ 5%)	SEPD
6	Mean	22.23	-12.38	38.62
	Std.Dev	19.56	19.80	14.39
12	Mean	5.55	-15.17	22.37
	Std.Dev	17.43	20.98	17.96
18	Mean	-4.33	-18.27	21.40
	Std.Dev	16.09	21.16	19.36
24	Mean	1.00	-18.64	14.96
	Std.Dev	13.10	18.47	18.31
36	Mean	-13.97	-16.79	10.32
	Std.Dev	9.84	13.31	16.24
48	Mean	-13.88	-13.75	10.41
	Std.Dev	7.99	10.81	18.72

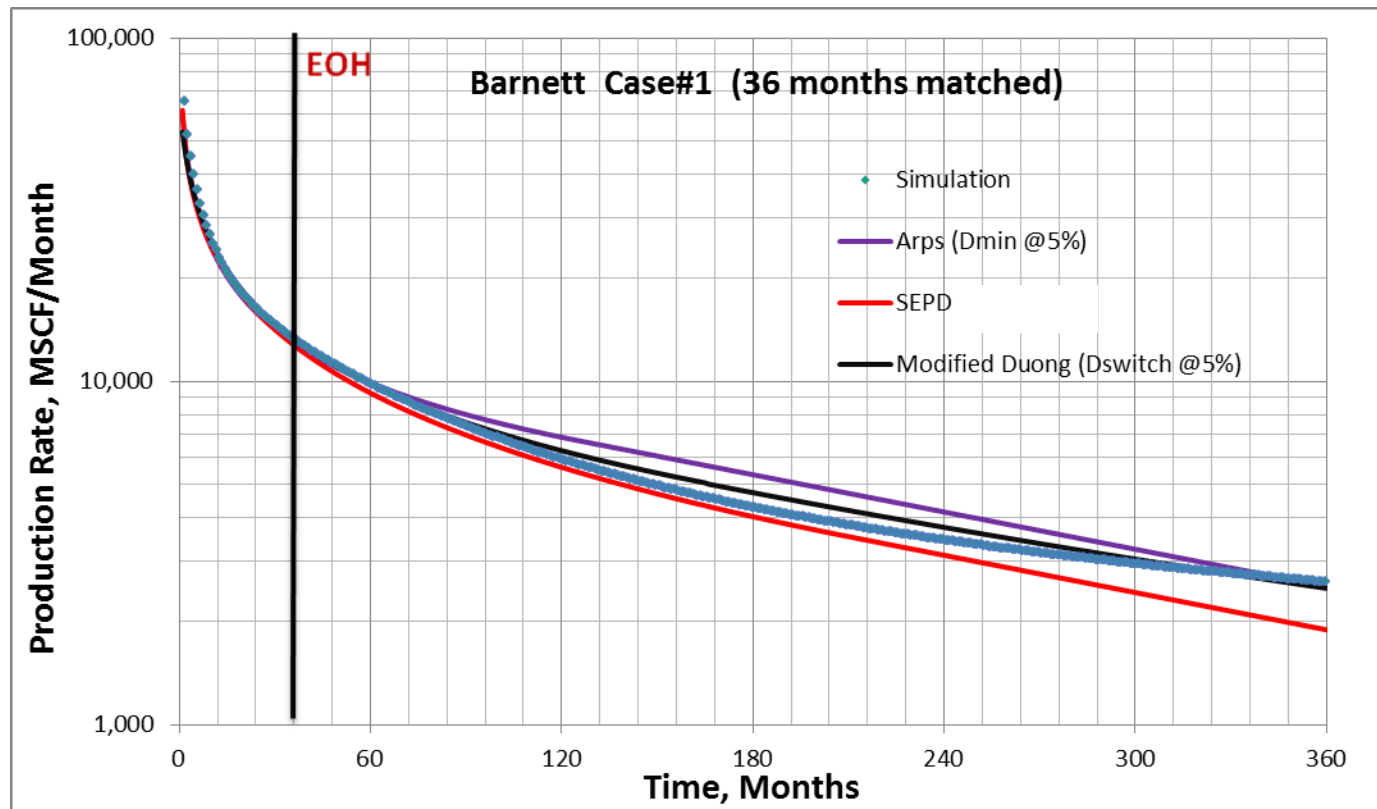


How Well Do Different Models Forecast With Short Term Data ?



A Barnett Shale simulation matching 12 months of history

How Well Do Different Empirical Models Forecast With Long Term Data ?

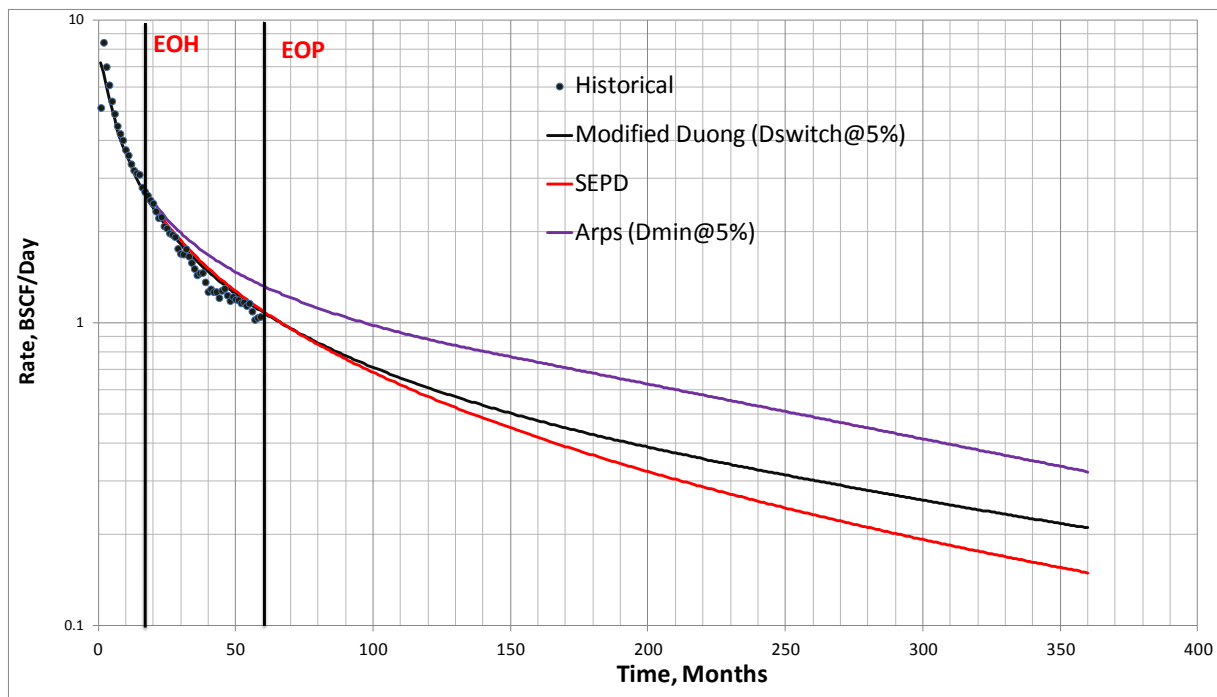


A Barnett Shale simulation matching 36 months of history

Field Grouped Data Sets

How Well Do Different Models Forecast For Short Term Grouped Data ?

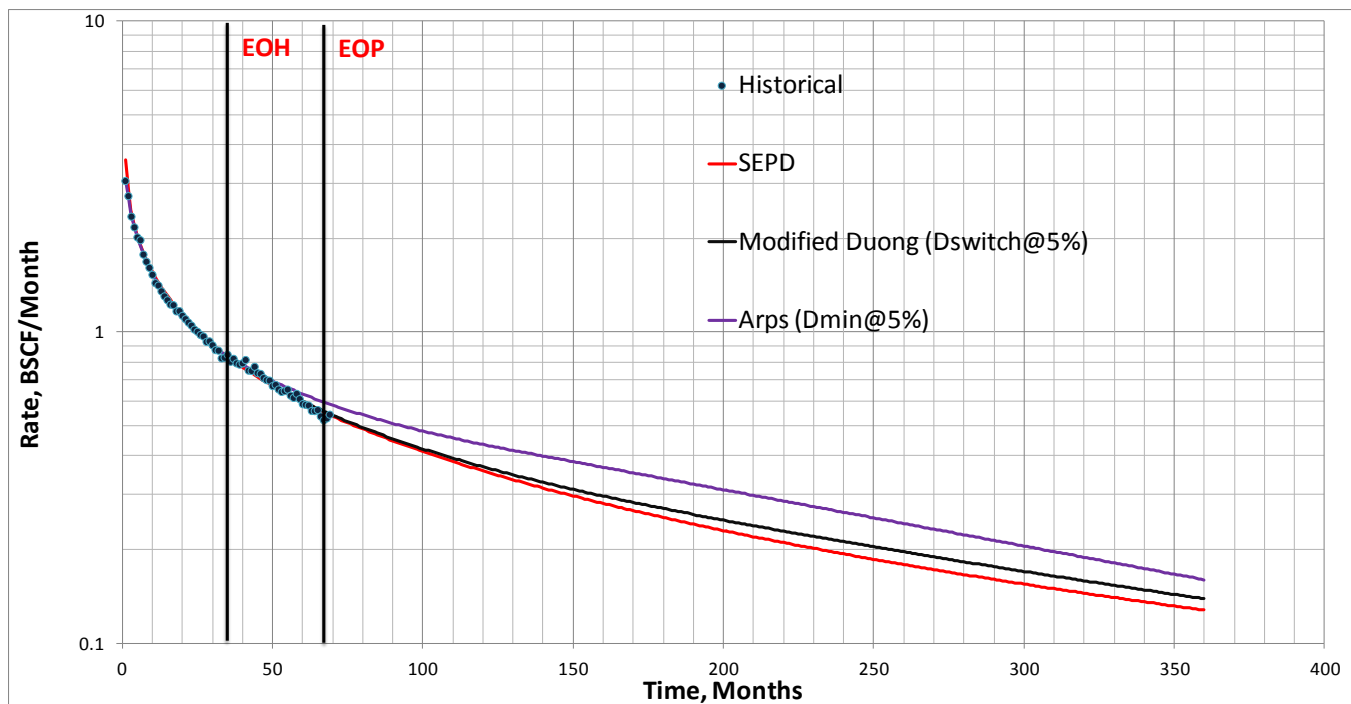
Johnson County (130 wells)- 18 months matched



Method	Reserves (After EOP)(BSCF)	Avg Reserves (After EOP) BSCF/Well	%Discrepancy
Arps (Dmin@5%)	197.168	1.517	-17.7
Modified Duong (Dswitch@5%)	132.856	1.022	-4.8
SEPD	116.648	0.897	-7.2

How Well Do Different Models Forecast For Long Term Grouped Data ?

Denton County (81 wells) – 36 months matched



Method	Reserves (After EOP)(BSCF)	Avg Reserves (After EOP) BSCF/Well	%Discrepancy
Arps (Dmin @5%)	90.007	1.111	-2.0
Modified Duong (Dswitch@5%)	75.244	0.929	1.5
SEPD	71.074	0.877	2.2

What About Oil Wells?

- Same as Gas Wells
 - $D_{\text{switch}}/D_{\text{min}}$ values vary for different plays
 - Interference
- Account for solution gas
- Operational issues need to be accounted for
 - Pump Issues, Paraffin Issues
 - Higher reserves potential if issues fixed



Conclusions

- Previously mentioned modifications to the Duong makes the Duong model even more robust and accountable for fracture interference
- The Modified Duong (D_{switch}) method provides more accurate results than the SEDM and Modified Arps (D_{min}) Model when more than 12 months of historical production data is available, although some error is still associated with those forecasts
- None of the models studied produces accurate forecasts with 6 months or less of historical production data
- For grouped well sets the SEPD and Modified Duong (D_{switch}) work exceptionally well providing reasonable forecasts



Acknowledgements

Crisman Institute at Texas A&M for their funding



Quiz

- With greater than 12 months of historical production data which of these decline models provided the lowest error in remaining production for an individual well?
 - a. SEPD/SEDM
 - b. Modified Duong (Dswitch @ 5%)
 - c. Arps (Dmin @ 5%)
 - d. Duong



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