

# Joint Optimization of Economic Project Life and Well Controls

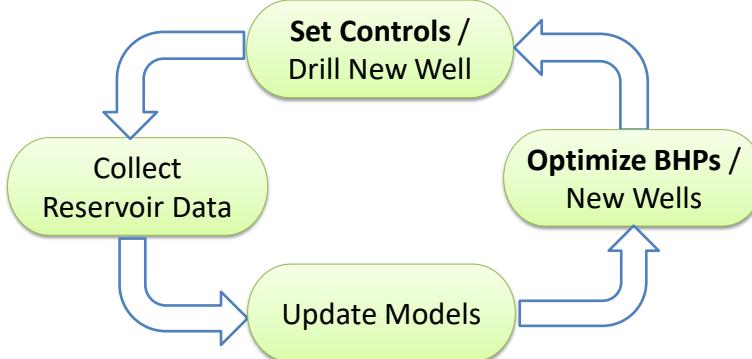
Mehrdad G. Shirangi  
Oleg Volkov      Louis J. Durlofsky

SPE-182642



Stanford University

## Closed-loop Field Development (CLFD)



- How to determine optimal project life in reservoir operation?

Shirangi & Durlofsky, SPEJ 2015

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## Outline

- Motivation
- Rate of return for reservoir optimization
- Joint optimization of well controls and economic project life (EPL)
- Computational results

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## Motivation

- In optimization, **project life** typically specified a priori
- Often assume that decisions are solely based on **NPV**
- In investment science, **rate of return** is as important as **NPV**
- Here we develop a new formulation that incorporates both **NPV** & **rate of return**

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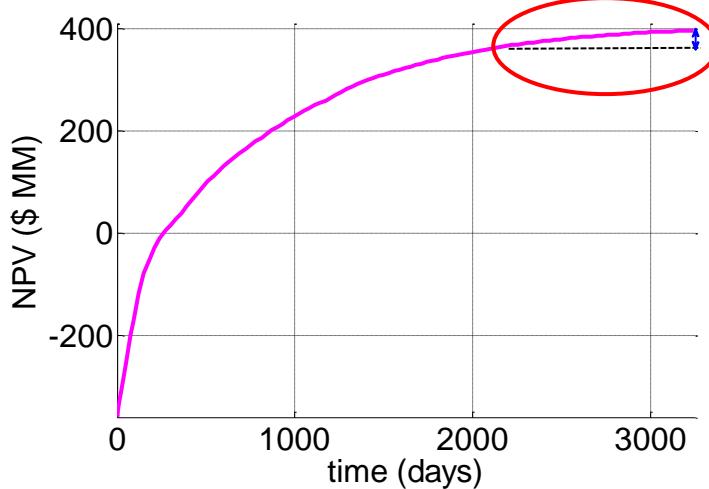
## Motivation

- In optimization, **project life** typically specified a priori
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- Here we develop a new formulation that incorporates both **NPV & rate of return**
- **Project life** refers to operation with current configuration (distinct from reservoir/contract life)

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## NPV Trajectory



- Last 1/3 of project life increases NPV by only 3.5%

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## Rate of Return Computation

- Internal rate of return (**IRR**): discount rate for which NPV=0
- Modified internal rate of return (**MIRR**): requires specification of reinvestment rate for intermediate cash flows
- Companies also specify minimum attractive rate of return (**MARR**, hurdle rate)

IRR: Hazen (2003), Hartman & Schafrick (2004)

MIRR: Lin (1976), Kierulff (2008), Balyeat et al. (2013), Magni (2010, 2013)

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## Present Value vs Future Value

- Specify  $T = n_{cs} \Delta t_{cs}$
- Net **present value**:  $\sum$ (cash flow)  $\times$  (discount factor)

$$PV = CAP + \sum_{l=1}^{n_{cs}} F^l \frac{1}{(1+r)^{t_l/365}}$$

$$\text{Cash flow: } F^l = Q_o^l p_o - Q_w^l c_w - Q_{wi}^l c_{wi} - f_c$$

- Can also compound the cash flow to the end of project life, and compute net **future value**:

$$FV = PV(1+r)^{T/365}$$

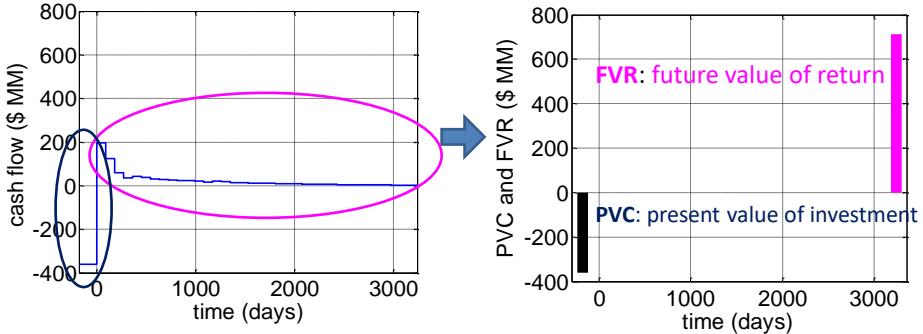
$r$ : discount rate

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## Cash Flow Stream

- Cash flow = Revenue – Cost



- Simplify cash flow stream to initial investment of **PVC** and total income of **FVR** at the end of project life

Refs: Lin (1976), Kierulff (2008), Balyeat et al. (2013)

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## Modified Internal Rate of Return (MIRR)

- MIRR** is the discount rate such that future value of return equals present value of investment
- Compute MIRR ( $i_m$ ) at each  $t$  :

$$\text{PVC} = \frac{\text{FVR}}{(1 + i_m)^{t/365}}$$

**PVC:** capital investment

**FVR:** future value of all positive cash flows (until  $t$ )

- Require  $i_m \geq r_{\text{hurd}}$  (hurdle rate, MARR)

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## Joint Optimization of Life and Controls

- Optimization problem:

$$\max_{\mathbf{T}} \left\{ \max_{\mathbf{x}(\mathbf{T})} \text{NPV}(\mathbf{x}, \mathbf{T}) \right\},$$

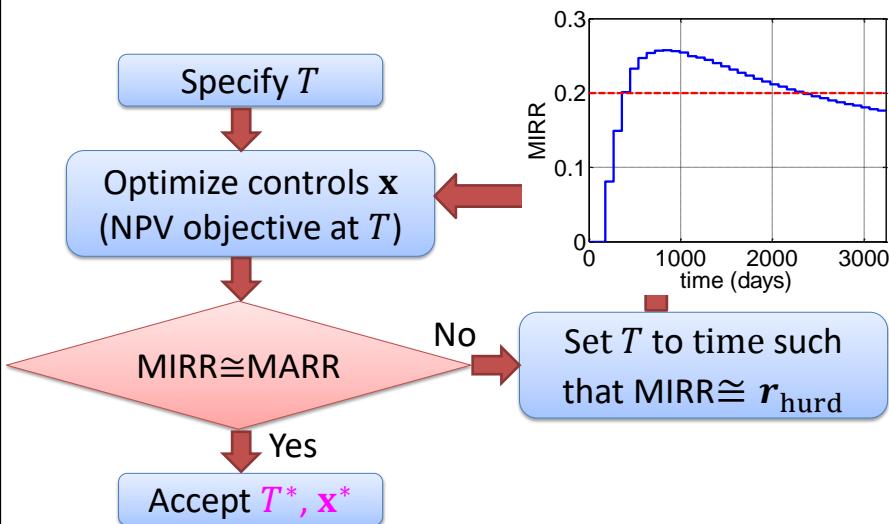
subject to  $|i_m - r_{\text{hurd}}| \leq \epsilon$

- Apply nested optimization
  - outer loop entails specification of  $\mathbf{T}$  (project life),
  - inner loop optimizes  $\mathbf{x}$  (well controls)
  - apply adjoint-gradient-based ADGPRS + SNOPT
- Specify hurdle rate  $r_{\text{hurd}} = r + 0.1$

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## Joint Optimization Flowchart

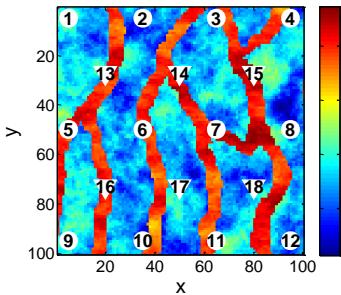


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## 2D Bimodal Reservoir Example

- Determine optimal project life and optimal well controls
- Porosity=0.2 (sand), 0.1 (shale)
- 18 wells, capital investment of \$360 MM
- Discount rate is  $r = 0.1 \rightarrow r_{hurd} = 0.2$



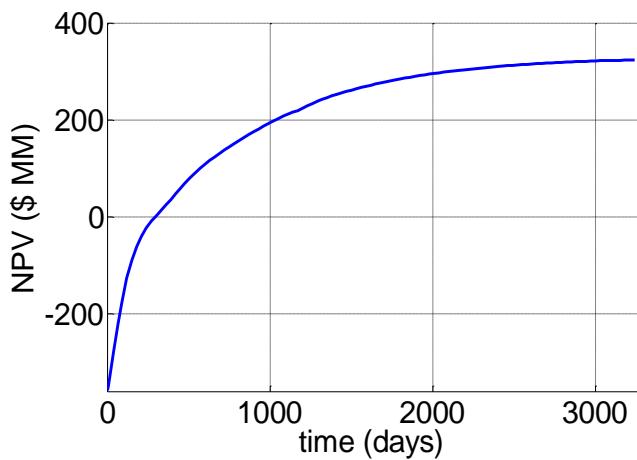
Parameter	Value
Prod BHP	70-310 bar
Inj BHP	310-483 bar
Oil price	\$ 70 / bbl
Water cost	\$ 7 / bbl
Discount rate	10%
Control step	90 days

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## NPV Trajectory

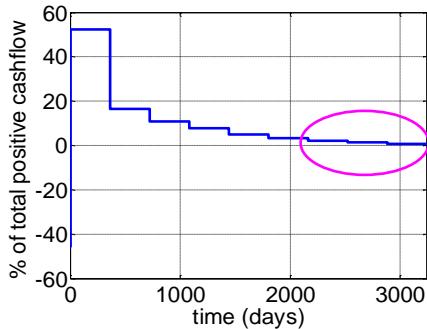
- Specify  $T = 3240$  days and optimize



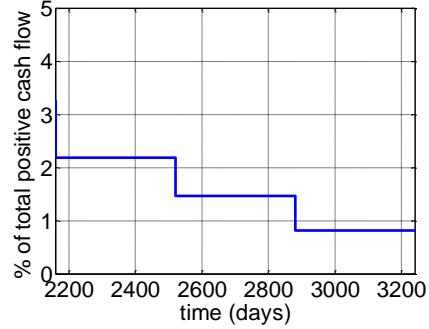
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## Cash Flow Stream for $T= 3240$ days



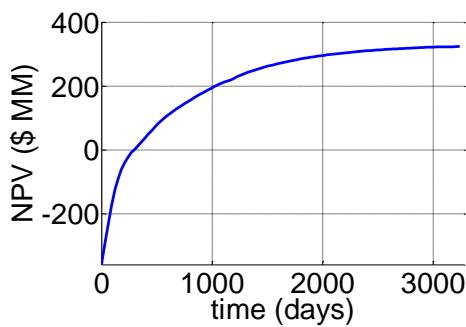
Cash flow percentage

Magnification for last 3 years  
(4.5% of total cash flow)

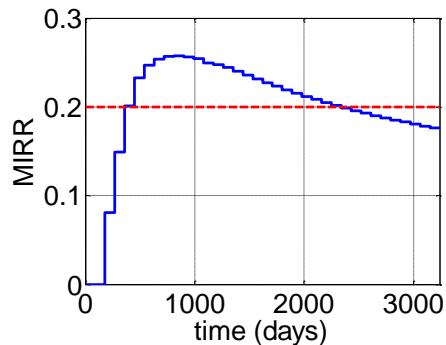
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## Modified Internal Rate of Return ( $r_{\min} = 0.2$ )



NPV trajectory



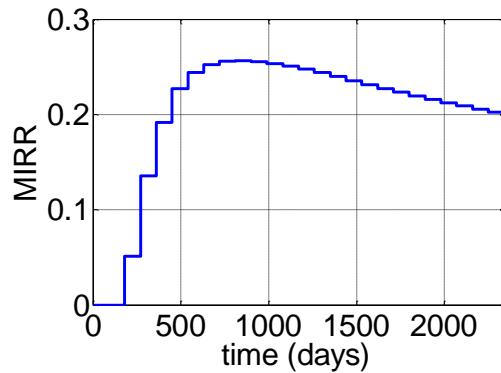
MIRR trajectory

- Specify  $T = 2340$  and repeat the inner control optimization

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## NPV & MIRR with $T^* = 2340$ days

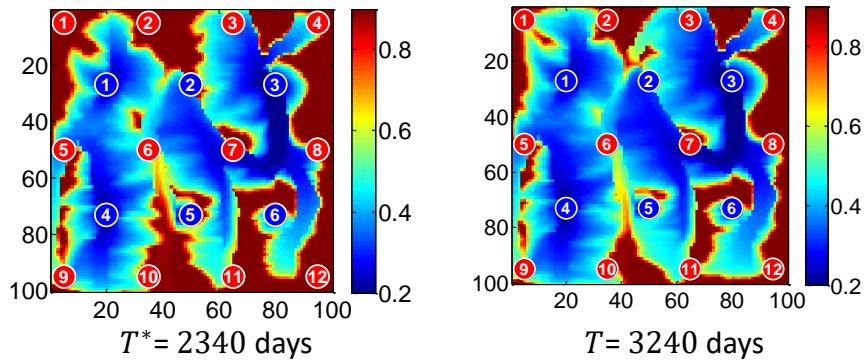


- Optimization required 3 outer iterations (optimizing  $T$ ), inner control optimization takes about 100 simulations ( $r_{hurd} = 0.2$ )

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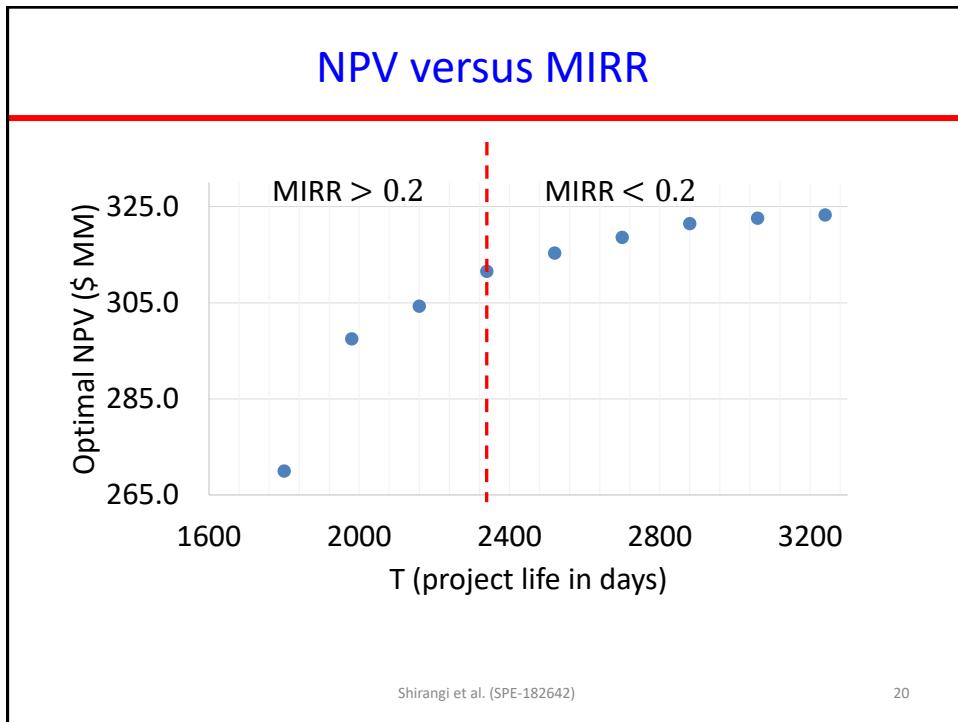
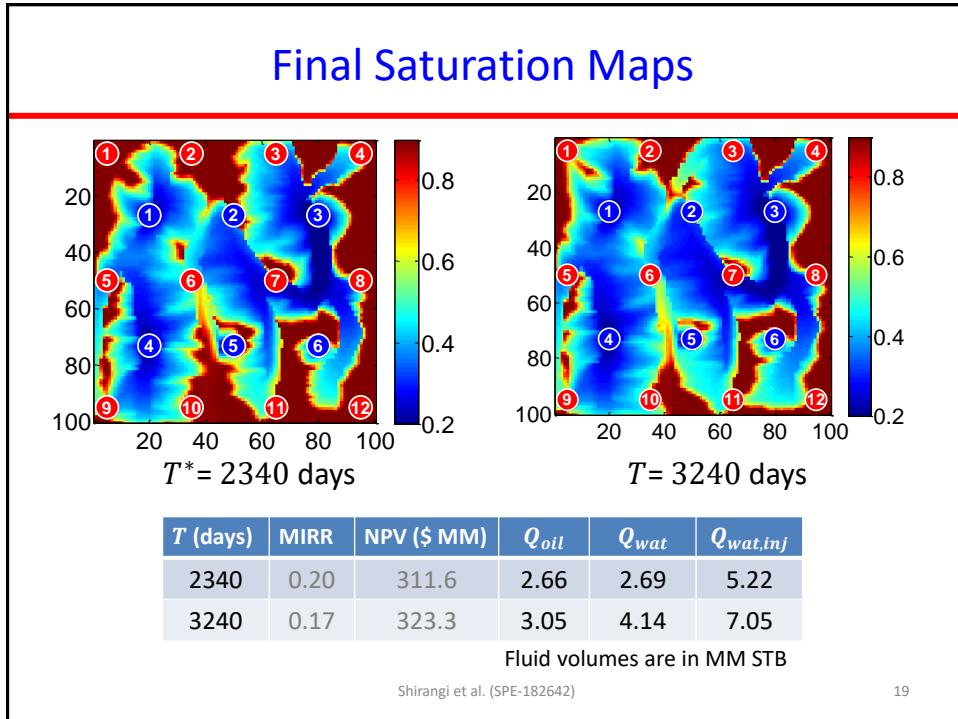
## Final Saturation Maps



$T$ (days)	MIRR	NPV (\$ MM)
2340	0.20	311.6
3240	0.17	323.3

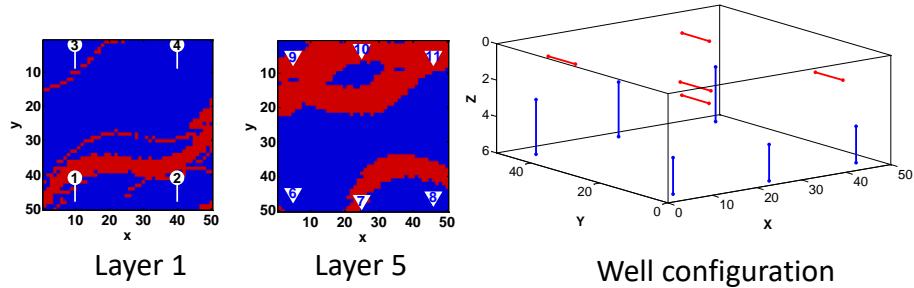
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## 3D Binary Channelized Reservoir ( $50 \times 50 \times 6$ )

- 5 horizontal producers & 6 vertical injectors
- Capital investment = \$700 MM, discount rate = 10%
- Jointly optimize well controls & economic project life

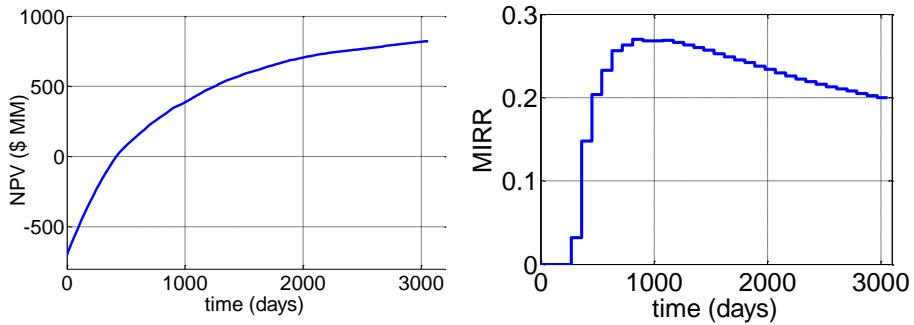


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## Results with Optimal Economic Project Life (EPL)

- Initial guess:  $T = 4950$  days
- Two outer iterations to get  $T^* = 3060$  and optimal controls  $\mathbf{x}^*$



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## Summary

- Introduced the joint optimization of well controls and economic project life (EPL)
- We believe this to be **the first formulation** for production optimization incorporating **rate of return** in addition to **NPV**
- Methodology provides optimal EPL and optimal controls
  - 1) **maximum NPV** is obtained at the end of project life
  - 2) **rate of return** of the project is equal to hurdle rate
- Enables formal short-term/long-term production optimization

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## Future Work

- Develop an approach for the **joint optimization of well location, control, and EPL**
- Extend EPL methodology to **include multiple realizations**
- Incorporate and test the methodology in the **closed-loop field development (CLFD)** framework

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## Acknowledgements

- Stanford Smart Fields Consortium
- Stanford Center for Computational Earth & Environmental Science (CEES)
- Prof. Carlo Alberto Magni (Univ of Modena)

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SPE-182642: Joint Optimization of Economic Project Life and Well Controls

*Thank you! Questions?*

<http://dx.doi.org/10.2118/182642-MS>

Mehrdad G. Shirangi, Oleg Volkov  
Louis J. Durlofsky



Stanford University