



# University College of Southeast Norway

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# Survival of the fittest: US oil productivity during business cycles

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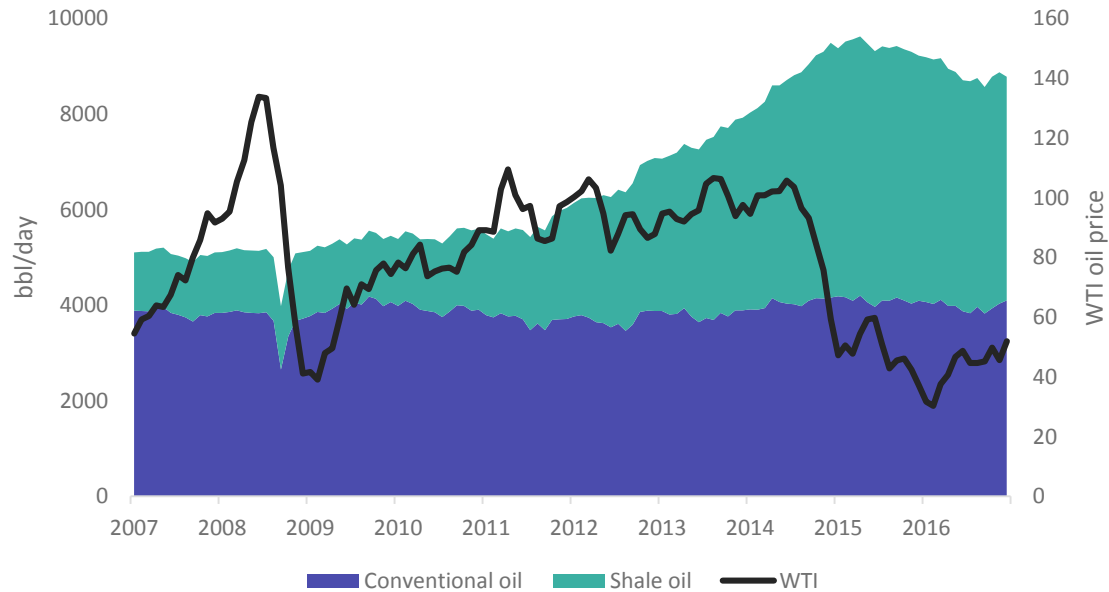
# Objective

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- Studying production behavior in US oil production
  - In which way has the business cycles (measured by oil price variability) affected the supply of oil, the productivity within the industry and the sector size?
  - Are there differences between conventional oil and shale oil?



# Background

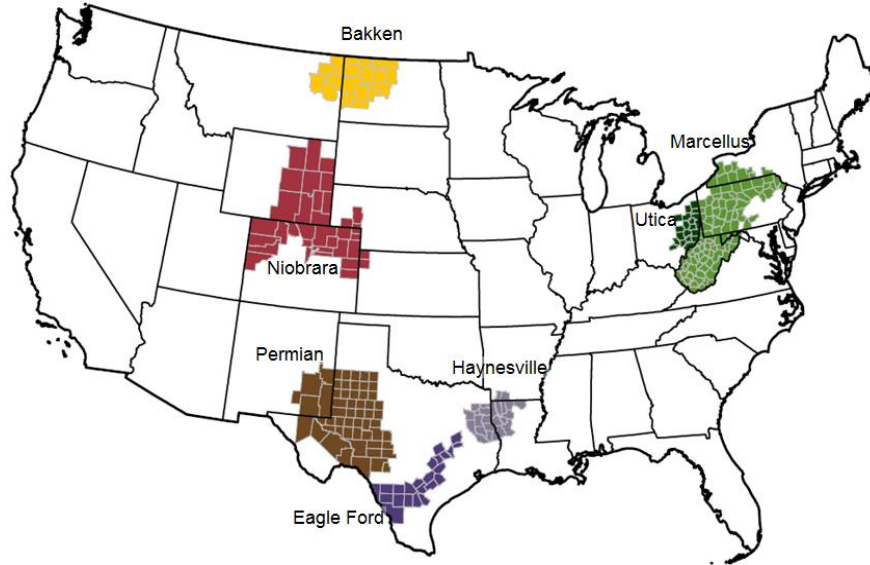




# Litterature

- A number of studies has been conducted for explaining pricing and production behavior in the petroleum industry.
  - Griffin (1985)
  - Jones, (1990)
  - Mabro (1992)
  - Ramcharran (2001, 2002)
  - Dees et al. (2007)
  - Ringlund et al. (2008)
  - Hamilton (2013)
  - Güntner (2014)
  - Cologni and Manera (2014)
  - Gallo et al. (2010)
- The main focuses in previous litterateur:
  - *supply differences between OPEC and non OPEC members*
- This study focus on:
  - *differences between conventional oil and shale oil production*
  - WTI crude oil price influence on both production/supply, productivity and sector size

# Data



The major US tight oil and shale oil regions (Source: EIA)

- Data:
  - monthly data from EIA on rigs and production in US oil fields from January 2007 until December 2016.
  - we differentiate between conventional oil fields and oil fields in tight oil formation where shale oil is a considerable part of the production
  - business cycle - WTI oil price

# Production model

Production/supply model

$$\ln Q_{ct} = \beta_0 + \beta_p \ln P_{t-n} + \beta_t t + \beta_s \ln Q_{st}$$

$$\ln Q_{st} = \beta_0 + \beta_p \ln P_{t-n} + \beta_t t + \beta_c \ln Q_{ct}$$

$Q_{ct}$ : the production in 1000 bbl/day of conventional oil in time period  $t$ .

$Q_{st}$ : the production in 1000 bbl/day of shale oil in time period  $t$ .

$P_{t-n}$ : the lagged WTI crude oil price

$t$ : a time trend

$\beta_p$ : measuring the supply elasticity,

If  $\beta_p > 0$  the supply function is positively sloped and the competitive model is supported,

If  $\beta_p < 0$  the supply-curve is backward bending and that the target-revenue theory (TRT) is supported

# Productivity and sector size models

Productivity model:

$$\ln q_{ct} = \beta_0 + \beta_p \ln P_{t-n} + \beta_t t$$

$$\ln q_{st} = \beta_0 + \beta_p \ln P_{t-n} + \beta_t t$$

$q_{ct}$ : production of conventional oil per rig in time period  $t$

$q_{st}$ : production of shale oil per rig in time period  $t$

Sector size model

$$\ln S_{ct} = \beta_0 + \beta_p \ln P_{t-n} + \beta_t t$$

$$\ln S_{st} = \beta_0 + \beta_p \ln P_{t-n} + \beta_t t$$

$S_{ct}$ : the number of rigs operated in conventional oil formations in time period  $t$

$S_{st}$ : the number of rigs operated in shale oil formations in time period  $t$

# Correlation between production/productivity/rig count and lagged WTI oil price

|  | $wti_t$        | $wti_{t-1}$ | $wti_{t-2}$    | $wti_{t-3}$    | $wti_{t-4}$    | $wti_{t-5}$   | $wti_{t-6}$ |
|--|----------------|-------------|----------------|----------------|----------------|---------------|-------------|
| Production<br>Conv.oil ( $Q_{ct}$ )    | -0.4081        | -0.4597     | -0.5007        | <b>-0.5191</b> | -0.4959        | -0.4443       | -0.3749     |
| Production<br>Shale oil ( $Q_{st}$ )   | <b>-0.3894</b> | -0.3548     | -0.3163        | -0.2772        | -0.2341        | -0.1902       | -0.1452     |
| Productivity<br>Conv. oil ( $q_{ct}$ ) | -0.3920        | -0.4667     | -0.5318        | -0.5742        | <b>-0.5877</b> | -0.5705       | -0.5226     |
| Productivity<br>Shale oil ( $q_{st}$ ) | -0.6807        | -0.7043     | <b>-0.7188</b> | -0.7154        | -0.6899        | -0.6398       | -0.5719     |
| Nr. rigs<br>Conv. oil ( $S_{ct}$ )     | 0.4135         | 0.4640      | 0.5072         | 0.5366         | 0.5528         | <b>0.5560</b> | 0.5486      |
| Nr. rigs<br>Shale oil ( $S_{st}$ )     | 0.5558         | 0.6105      | 0.6553         | 0.6828         | <b>0.6912</b>  | 0.6807        | 0.6515      |

Price-lag with the highest correlation in bold

# Results from multivariable regression model

|           | Production         |                    | Productivity       |                    | Sector size        |                    |
|-----------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
|           | $Q_{ct}$           | $Q_{st}$           | $q_{ct}$           | $q_{st}$           | $S_{ct}$           | $S_{st}$           |
| $\beta_0$ | 7.9786<br>(0.000)  | 2.0787<br>(0.331)  | 8.6111<br>(0.000)  | 6.0376<br>(0.000)  | -0.4267<br>(0.332) | -0.1194<br>(0.708) |
| $\beta_p$ | -0.0789<br>(0.000) | 0.1553<br>(0.000)  | -1.3844<br>(0.000) | -1.2032<br>(0.000) | 1.4109<br>(0.000)  | 1.4176<br>(0.000)  |
| $\beta_t$ | -0.0010<br>(0.112) | 0.0161<br>(0.000)  | -0.0147<br>(0.000) | 0.0092<br>(0.000)  | 0.0135<br>(0.000)  | 0.0063<br>(0.000)  |
| $\beta_s$ | 0.0875<br>(0.018)  |                    |                    |                    |                    |                    |
| $\beta_c$ |                    | 0.4945<br>(0.0500) |                    |                    |                    |                    |
| $R^2$     | 0.2921             | 0.9446             | 0.7303             | 0.8448             | 0.7785             | 0.7891             |

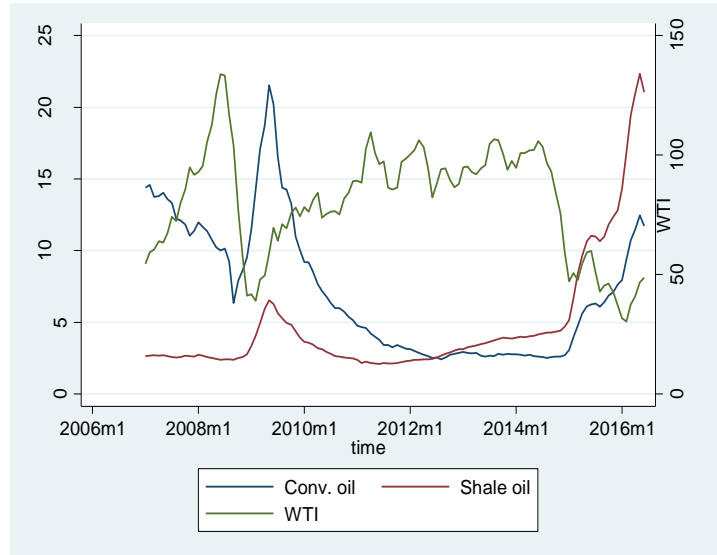
*p*-values in parentheses

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*p*-values in parentheses

# WTI and productivity (bbl/d per rig) over time for conventional oil and shale oil



# Results from multivariable regression model

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|-----------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
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| $R^2$     | 0.2921             | 0.9446             | 0.7303             | 0.8448             | 0.7785             | 0.7891             |

*p*-values in parentheses

# Conclusion

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- Increase in productivity during periods with low oil prices
  - selection of the most efficient and profitable oil fields and rigs
- Increased productivity for shale oil and decreased productivity for conventional oil
  - A more mature technology applied on conventional oil fields
  - A steeper learning curve for shale oil sector.
  - Different market structure.
  - Different cost structure

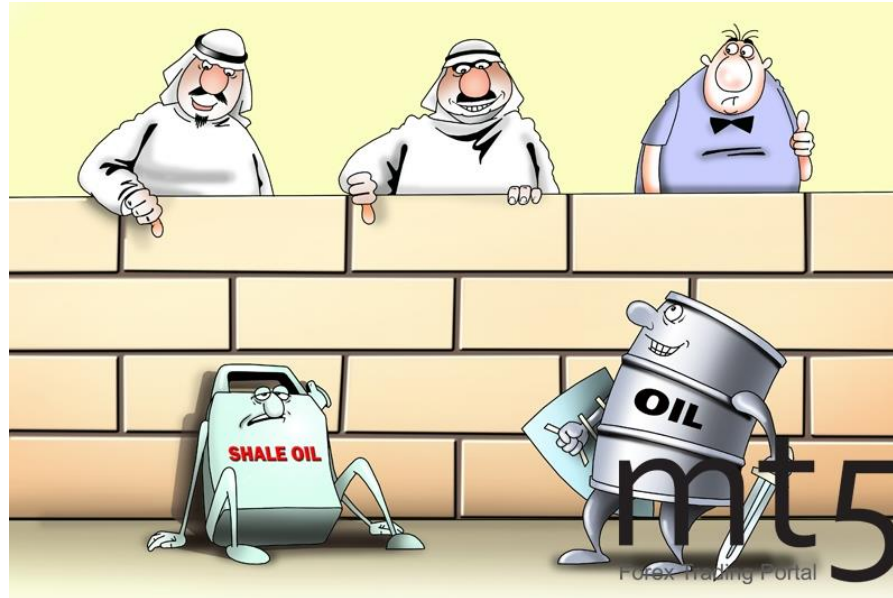
# Conclusion

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- Shale oil extraction is relative expensive compared to conventional oil production
- If the goal of the oil companies are a stable profit rather than a higher, but also more fluctuating profit
  - shale oil production should be conducted in periods of high oil price
- The shale oil sector has shorter response time to the economic cycles than conv. sector
  - technological leapfrogging
- The supply of conventional oil is less vulnerable to the business cycles, and will therefore insure that a stable supply persist by operating as a buffer

# Conclusion

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Thank you for your attention!

Question?