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Why do Firms Hold Oil Stockpiles?

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June 13, 2022

Introduction
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Motivation

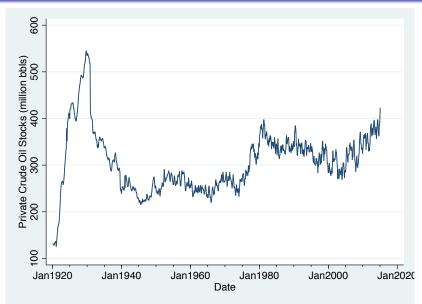
- Since at least the 1920s, private interests in the US have held significant petroleum inventories
 - $\triangleright~$ averaged \approx 325 million barrels
 - Fluctuated from 215 million to roughly 400 million barrels
- inventories only mildly responsive to current, future prices
 - roughly constant for long periods of time
 - though big run-up of reserves from mid-70s into early 80s
 - steady increase over past two decades
 - some inventories liquidated when prices collapsed in 2008
 - similar to experience in mid- to late-80s

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Monthly U.S. Petroleum Stocks, 1920 - 2015

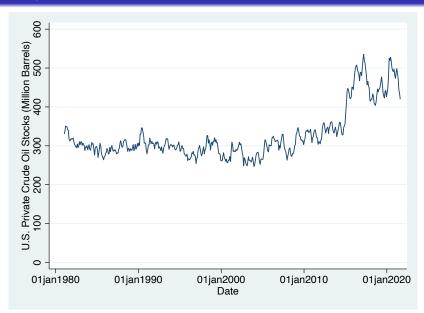


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Weekly U.S. Petroleum Stocks, 1980 - 2021



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Vertical inte	egration		

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- petroleum industry has at least 4 channels
 - ▷ extraction, transportation, refining, marketing
- many firms have presence in multiple areas

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Vertical integration

- petroleum industry has at least 4 channels
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rank	company	assets	Refinery cap
1, 3	ExxonMobil	362.597	1762.8
2, 5	Chevron	237.428	1037.7
3, 1	Marathon	98.556	2870
4, 4	Phillips 66	58.72	1694.3
5	ConocoPhillips*	70.514	
6, 2	Valero ^a	53.864	2181.3
7	Occidental ^b	109.93	
8	EOG ^b	37.125	
9, 12	HollyFrontier ^a	12.165	466.6
10, 6	PBF Energy ^a	9.132	950.2

Notes: rank: # emp, cap; assets: 10⁹ USD; cap: 10³ barrels per day; *: divested Phillips 66 in 2005, a: refining only, b: production only

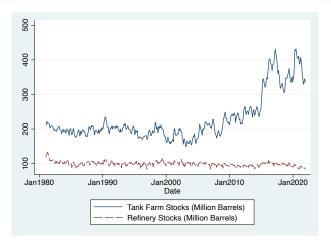
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Decomposing Stocks



- stocks reported for refineries, tank farms
- 'tank farm' stocks are more significant
 - particularly in last few decades

Why hold inventories?

- Potential motives:
 - speculation?
 - hold inventories anticipating price run-ups, then cash in
 - alleged culprit summer of 2008 (Saudis; some in U.S. Congress – Senator Barasso; Rep J.P. Kennedy II)
 - has implications for relation of stockpiles to prices
 - ▷ stock-out?
 - hold inventories to avoid running out
 - daily throughput at U.S. refiners \approx 15 million bpd
 - so typical inventory = roughly 21 days' worth of throughput
 - production smoothing?
 - hold inventories to minimize impact of rapid variation in costs
 - requires upward-sloping MC
 - also requires sufficient volatility in prices
- difficult to rationalize in deterministic world
 - ▷ inter-temporal optimization of production \rightarrow rents rise at r
 - inventory holding requires price rises at rate r
 - incompatible unless costs are stock dependent (still hard)

Assumption	~~		
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A1 costless to hold inventories

A2 $dP_t/P_t = \mu dt + \sigma dz$ (geometric Brownian motion)

- dz increment of standard Wiener process
- ▷ require $\mu < r$ for convergence
- ► Instantaneous profits are $\pi_t = P_t[y_t w_t] c(y_t, R_t)$
- Let $V(t, R_t, S_t, P_t)$ = optimal value function for firm
 - \triangleright depends on *in situ* reserves, R_t , inventories, S_t , price, P_t
- Fundamental equation of optimality is then

$$\max_{y_t, w_t} \left\{ \pi_t e^{-rt} + \frac{\partial V}{\partial t} - y_t \frac{\partial V}{\partial R} + w_t \frac{\partial V}{\partial S} + \frac{\mu P_t \frac{\partial V}{\partial P}}{\frac{\partial P^2}{t}} \right\} = 0$$

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Stochastic control results

Optimal levels of extraction, inventory additions satisfy:

$$P_t - rac{\partial c}{\partial y}(y_t^*, R_t) - \partial V / \partial R = 0$$
 (y_t^*)

$$-P_t + \partial V / \partial S \ge 0 \quad (w_t^*)$$

- if LHS negative then stockpile is liquidated
 - > withdrawal, delivery constraints would limit this result
- ▶ if LHS positive then all extraction is stockpiled
 - injection constraints would limit this result
- if LHS zero then w_t is indeterminate
 - only outcome that does not violate market clearing?

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Stochastic control results, cont.

proceed by 'time-differentiating' FOC (using Ito's operator)

$$\frac{1}{\mathrm{dt}} E[\mathrm{d}(P)] - \frac{1}{\mathrm{dt}} E[\mathrm{d}(\frac{\partial c}{\partial y})] = \frac{1}{\mathrm{dt}} E[\mathrm{d}(\partial V/\partial R)] = r \partial V/\partial R + \partial c(y, R)$$
$$= r(P - \frac{\partial c}{\partial y}) + \partial c(y, R)/\partial R$$

 rents anticipated to rise at rate r (subject to stock effects on extraction costs)

$$\frac{1}{\mathrm{dt}} \boldsymbol{\mathsf{E}}\big[\mathrm{d}(\boldsymbol{\mathsf{P}})\big] = \boldsymbol{\mu} \boldsymbol{\mathsf{P}}$$

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• combined: $\frac{1}{\mathrm{dt}} E\left[\mathrm{d}\left(\frac{\partial c}{\partial y}\right)\right] = -(r-\mu)P + r\frac{\partial c}{\partial y} - \partial c(y,R)/\partial R$

condition o	n variance		
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Proceed further by assuming $c(y, R) = y^2/R$ $\rightarrow \frac{\partial^3 c}{\partial y^3} = 0; \partial c(y, R)/\partial R = -c/R)$

Condition for holding inventories reduces to

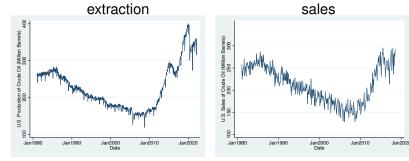
$$\frac{\partial c}{\partial y} \left\{ \frac{y}{R} - \frac{\partial y}{\partial R} + \sigma^2 \left(\frac{\sigma^2 P^2}{2y} \right) \frac{\partial^2 y}{\partial P^2} - r \right\} = 0$$
$$\Leftrightarrow \frac{y}{R} - \frac{\partial y}{\partial R} + \sigma^2 \left(\frac{P^2}{2y} \right) \frac{\partial^2 y}{\partial P^2} - r = 0$$

- ► so require sufficient price volatility ($\sigma^2 \ge \underline{\sigma}^2$)
- still true if inventory holding is costly

lower bound on price volatility would be somewhat larger

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extraction vs.	sales		

- model predicts greater variation in sales than extraction
- comparison of monthly values for these variables confirms this prediction



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Data			

Sources:

U.S Energy Information Administration (EIA) website

- data on spot prices, production, inventories, oil stocks (monthly); reserves (annual)
- Baker-Hughes
 - data on number of rigs actively drilling for oil (weekly)
- changes in reserves related to production, finds

hence drilling

$$R_t = R_{t-1} - y_t + F_t$$

true at both monthly and annual level

- ► $R_t R_{t-1} + y_t$ highly correlated with number of rigs (annual)
- apply at monthly level

▷ pro-rate annual reserve change prop'n'l to monthly drilling

- assume spot prices exogenous w.r.t. firm decisions
- ► aggregate firm decisions to national level

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Production as a function of price, reserves and stocks

- use preceding results to form fitted value of reserves at monthly level, R

 R
- observed production should depend on price, reserves and stocks
- use linear, squared terms and cross-effects
 - non-linear relation
 - important to consider second-order effects
 - think of Taylor's series approximation
- monthly data from January 1986 December 2009 (289 obs.)
- allow for serial correlation
- use results to estimate $\frac{\partial y}{\partial R}$ and $\frac{\partial^2 y}{\partial P^2}$
- can then calculate lower bound on price variance

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Regression results

variable	coefficient	std. err.
Р	-4.456*	2.551
PR	.00035**	.0018
PR^2	-7.01e-09**	3.0e-09
PRS	-2.06e-09*	1.09e-09
PR ² S	3.95e-14**	1.55e-14
$\hat{ ho}$ = .926		
R-squared = .685		
SSE = 4.869		

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Implied lower bound on σ^2

statistic	<u>σ</u> ²(.01)	<u></u> <i>σ</i> ² (.02)	<u></u> <i>σ</i> ² (.03)
25%	0.0297	0.0600	0.0918
mean	0.0695	0.1417	0.2141
median	0.0642	0.1295	0.1927
75%	0.0922	0.1874	0.2825
90%	0.1248	0.2577	0.3911
s.d.	0.0525	0.1086	0.1649

note: $\underline{\sigma}^2(r)$ listed for annual discount rates: r = .01, r = .02 and r = .03variance of monthly real spot price during sample period = .2086

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Implications

- variance in spot prices during sample period is .2086
- Iower bound on variance is smaller than sample variance
 - ▷ for over 50% at relatively conventional real interest rate
 - ▷ for over 75% at low real interest rates
- evidence supports production smoothing as motive for inventories

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extensions			

above model employs some simplifying assumptions

- ⊳ GBM
- costless delivery to market
- no constraints on delivery
- costless inventory holding
- central results is robust to these assumptions
 - price movements likely influenced by 'jumps'
 - these would increase value of holding inventories as hedge against cost variations
 - costly delivery to market exerts similar impacts on production and inventory addition paths
 - delivery constraints induces stock-out motive
 - costly inventory holdings raises critical value of price variance