

### How Disruptive Technologies are Changing the Energy Industry & Trading

The New York Energy Forum February 11, 2020

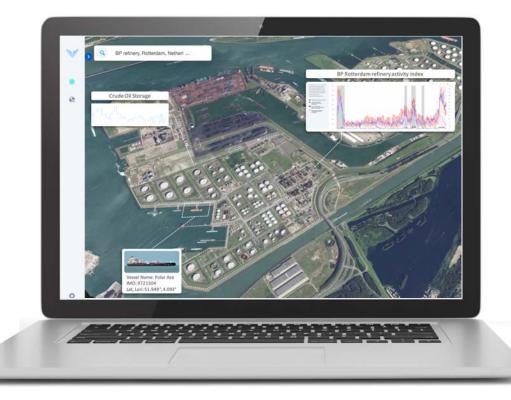
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## An asset-centric technology platform



## IoT and ground sensor data

Multiple sensor data (including ground emission sensors, imagery, and more)





## **3D** Reconstruction and satellite measurements

Dynamic offering of satellite measurements (gas emissions, temperature, water levels, and more)



#### **Position tracking**

Multiple updates per day (AIS)

**200,000+ Assets monitored** O&G Wells, storage tanks, refineries, landfills, power plants and more



#### News & social media alerts

Realtime on targeted assets

## Diverse customers Multiple use cases

Oil & gas producers



Chemical companies





Banks & insurers







Physical traders



Hedge funds & asset managers



## ayrros is bringing transparency to opaque markets

Rapid response (KRR)

Price regime analysis
Operator benchmarking

Emissions detection &

measurement



## KRR – Two-speed country

### China labor-intensive & non-intensive industries in wake of coronavirus outbreak

Wuhan Iron and Steel corp. steel plant; Wuhan coal-fired power plant

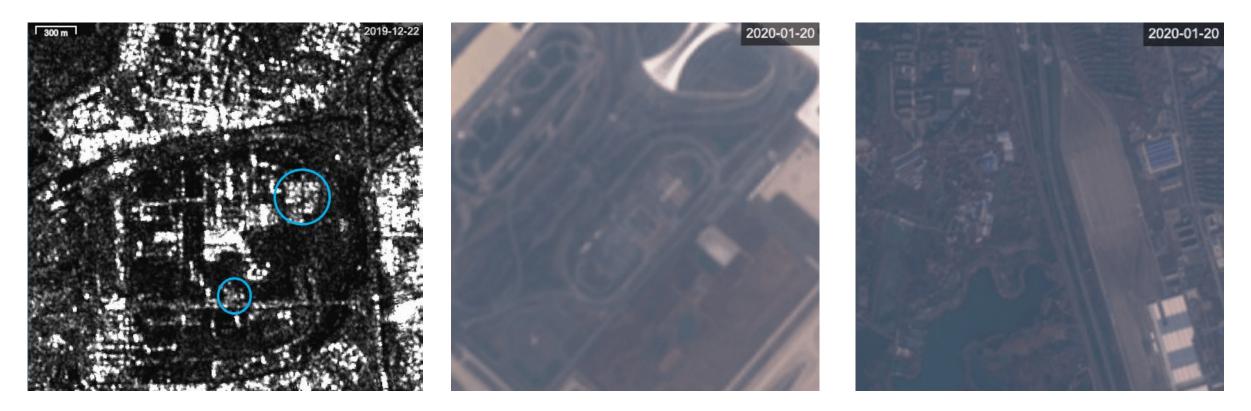






#### China labor-intensive & non-intensive industries in wake of coronavirus outbreak

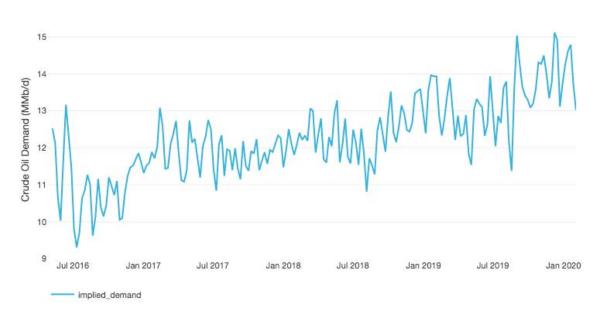
Empty parking lots at Donfeng-Renault car factory (left); and at Wuhan airport (middle); railway cars stuck at Wuhan station (right)



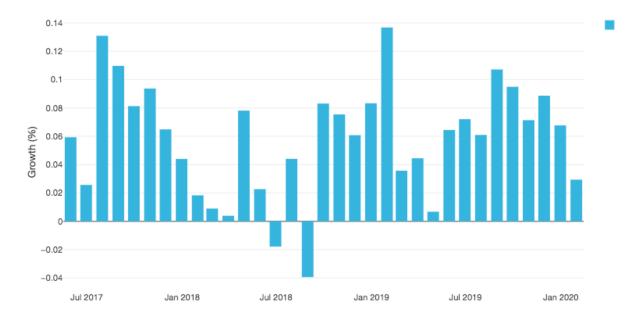


#### China apparent crude demand in wake of outbreak

China crude oil implied demand, two-week average



#### China crude oil implied demand, monthly, y/y growth

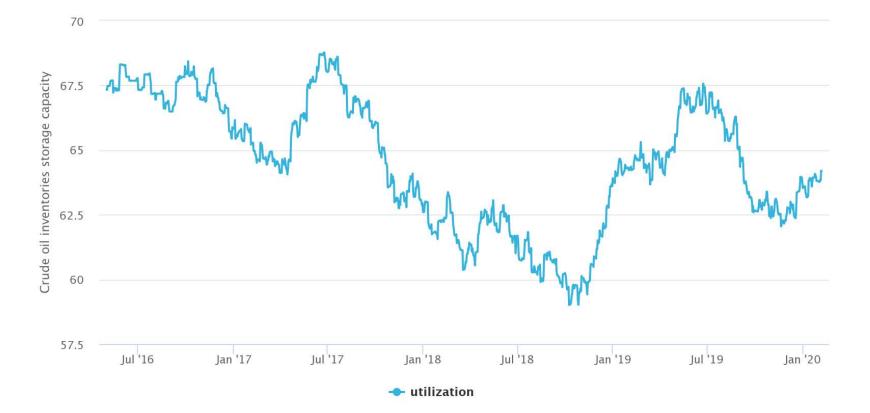


#### Sources: Kayrros analysis



### Chinese inventories show first signs of building pressure as runs slow

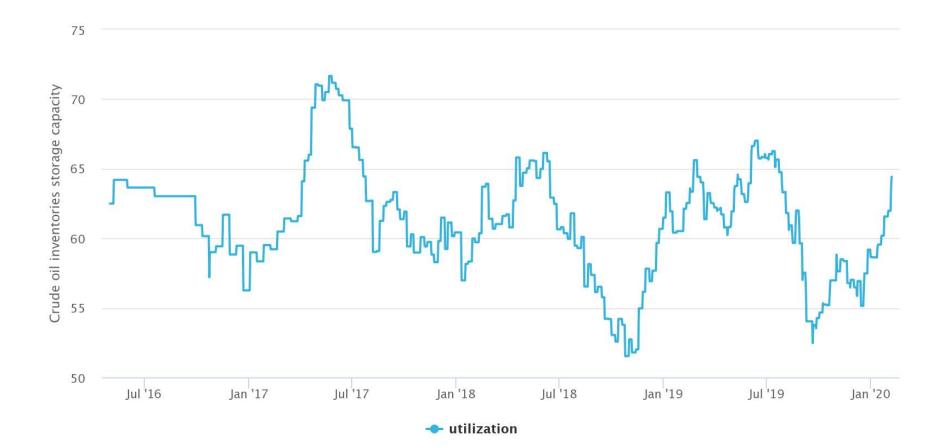
Kayrros crude oil inventories capacity utilization in China





#### Shandong crude stocks lead nationwide builds

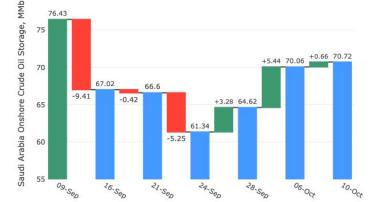
Kayrros China crude oil inventories capacity utilization in Shandong region



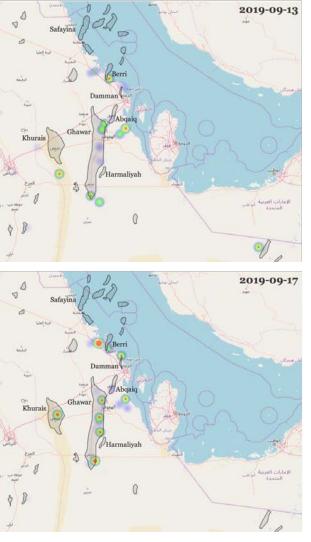
### KRR – Abqaiq: first disruption in satellite era

Kayrros leveraged its expertise in satellite imagery to track Saudi output in the wake of the September Abqaiq attack



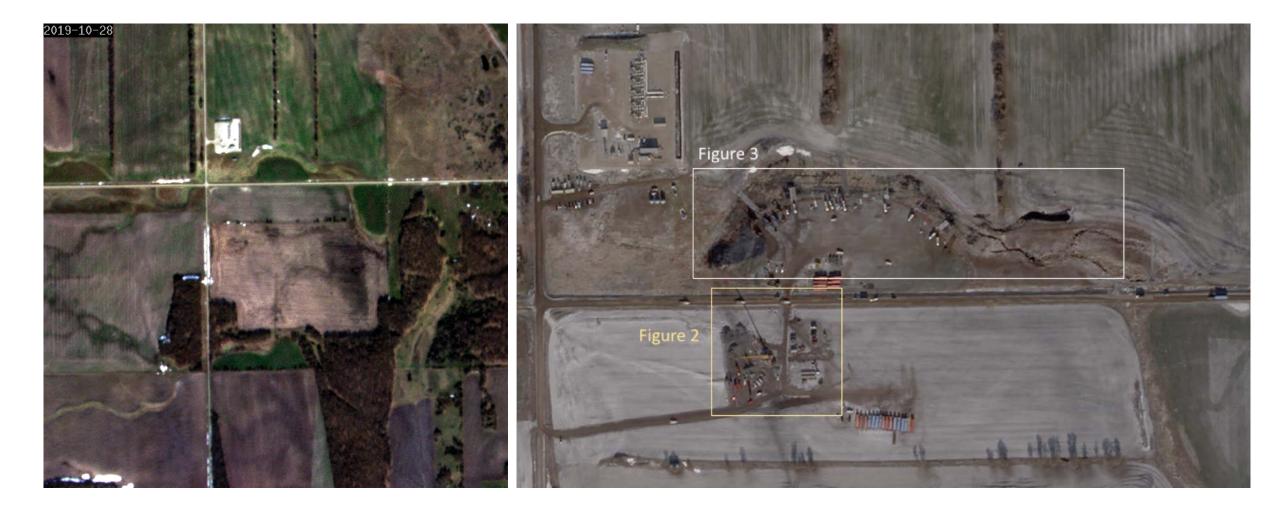






## KRR – Keystone pipeline peak

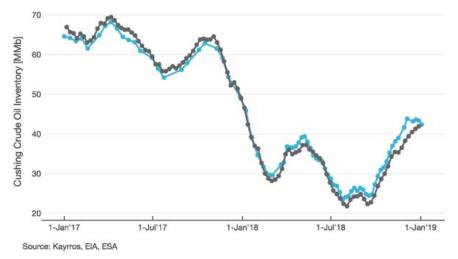
Kayrros analysts sprang into action to track TC Energy after the November Keystone pipeline leak



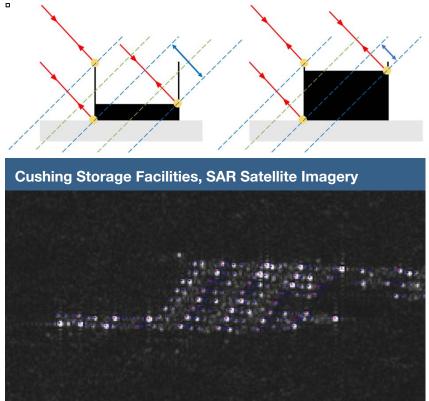
## **Price regime: global stocks as leading indicators**

SAR satellite technology ensures reliable, accurate, timely measurements

Reliable Benchmarking Against Publicly Available Data



---- Kayrros Cushing Crude Oil Inventory ---- EIA Weekly Report



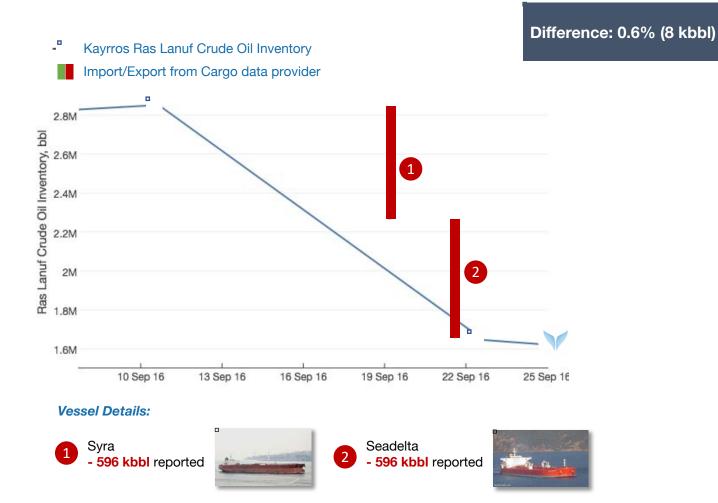
Our storage monitoring has a demonstrated accuracy level of 97.2% (based on 2017-18 figures)

Source: Kayrros

## Stock change accuracy crosschecked by cargo data

#### Kayrros Ras Lanuf Crude Oil Inventories and Cargo Data

MMb



Kayrros

## **Global stocks vs. Brent flat price**

Kayrros Global Crude Oil Inventories Capacity Utilisation (including US crude stocks deseasonalized) versus Brent 1m (reversed axis)

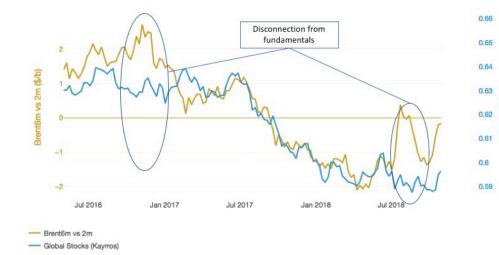


Brent1m

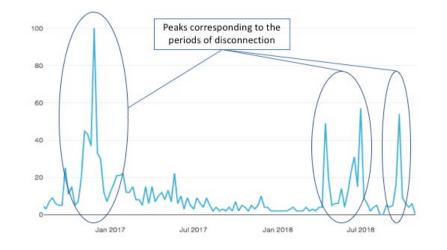
Global Stocks (Kayrros)



### Kayrros Global Crude Oil Inventories vs Brent time spreads

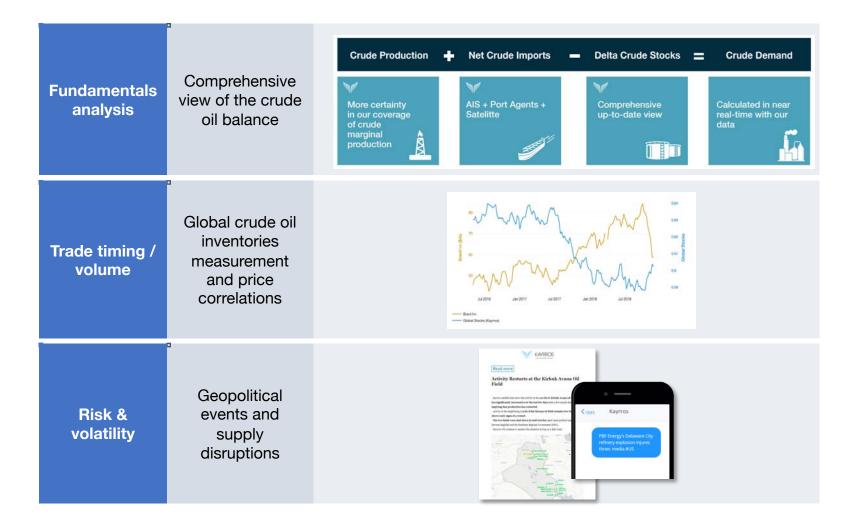


### Intensity of "geopolitics of oil" keywords in the news



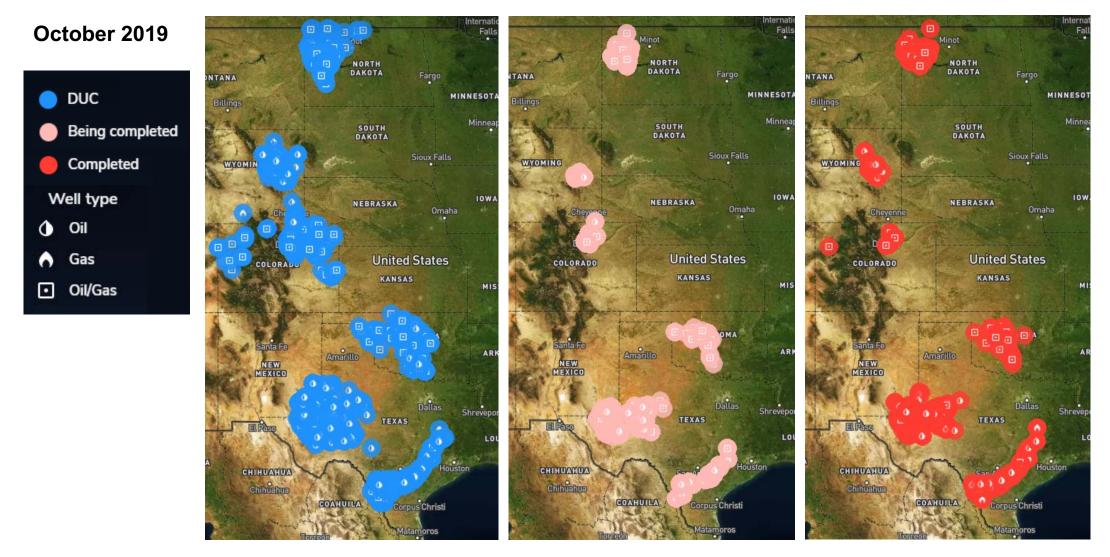
Kayrros uses natural language processing to identify when the market is driven by sentiment

## From fundamental analysis to trading signals



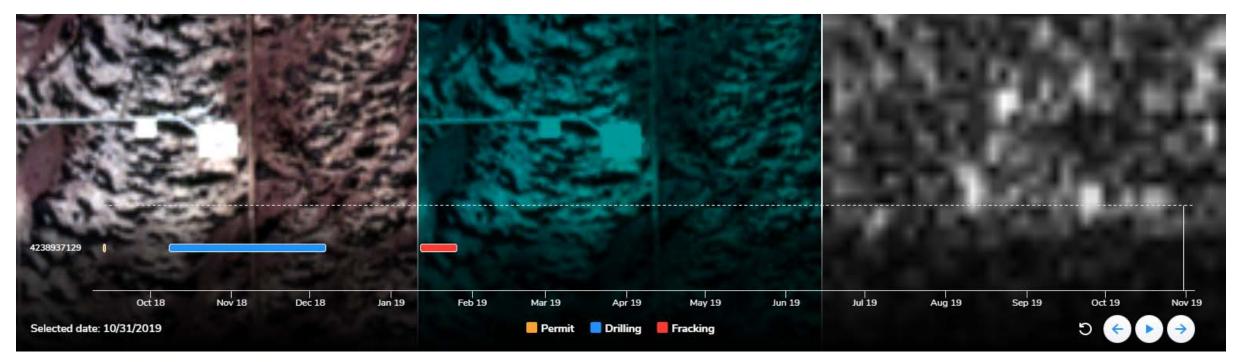
## **Operator benchmarking**

Kayrros monitors every well permitted, drilled and completed in the five largest tight oil basins



## Kayrros portal shows progress of every well location

Kayrros Dashboard allows users to browse complete satellite history of a well, from pre-permit to after completion

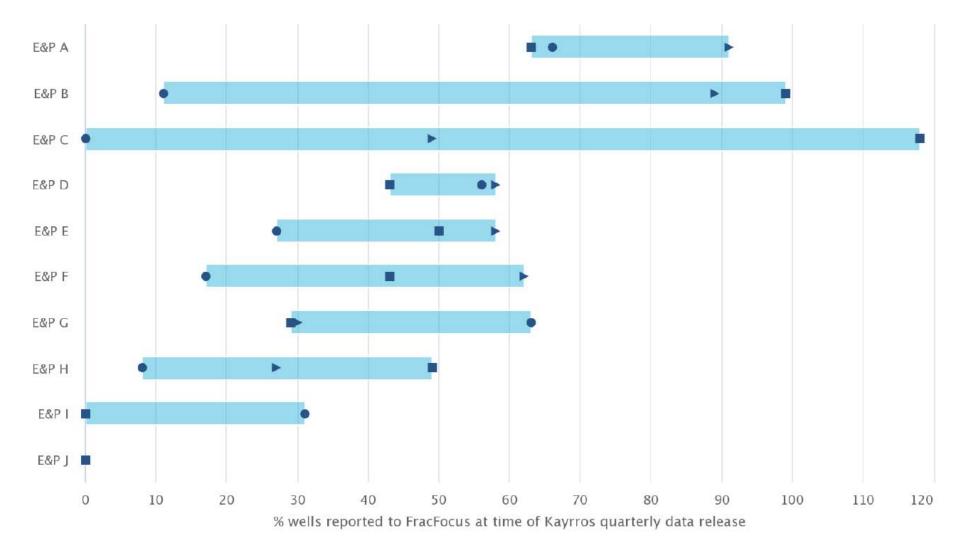


Location : 31.0246969333, -103.3660835312

ΑΡΙ	Well orientation	Permit date	Drill Beg.	Drill End	Drill Durat.	Frac Beg.	Frac End	Frac Duration
4238937129	Horizontal	09/13/2018	10/08/2018	12/07/2018	60 days	01/12/2019	01/26/2019	14 days

## **Reporting delays vary by operator**

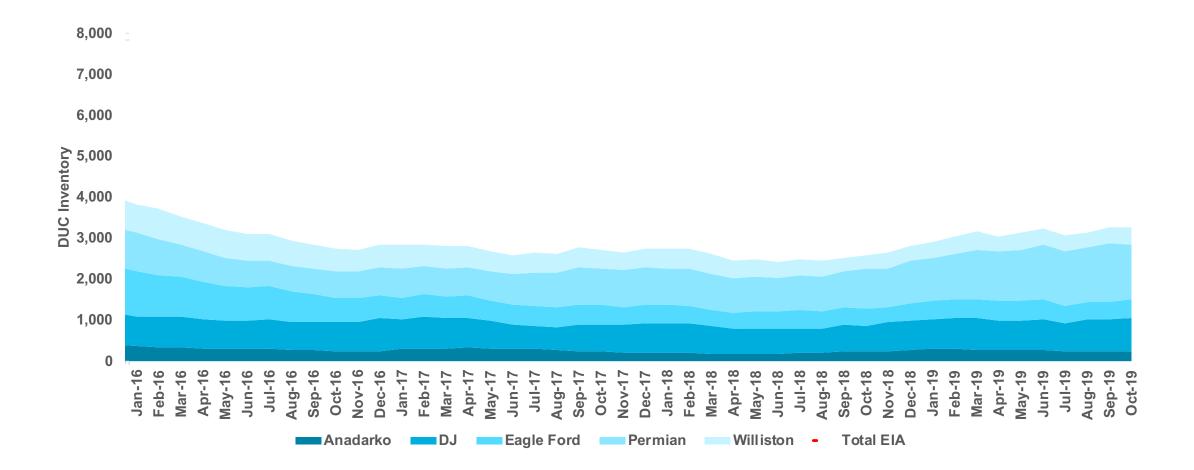
Most publicly-traded operators report completions to FracFocus, virtually none do so in a timely fashion



● Q1-2019 ■ Q2-2019 ▲ Q3-2019

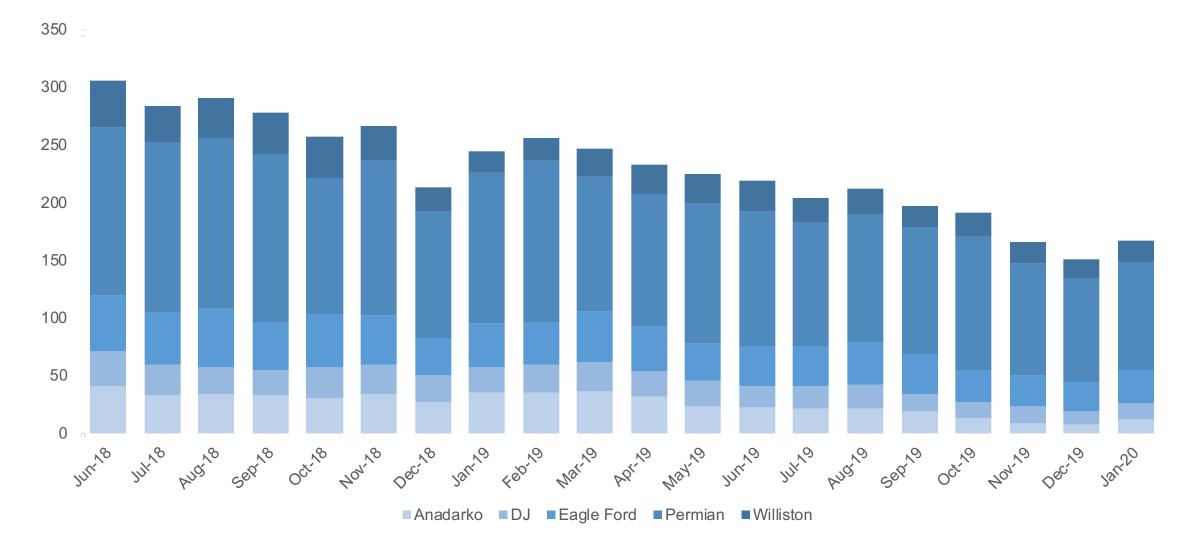
## **Debunking the DUC inventory myth**

Kayrros-measured DUC well inventories across the 5 major tight oil basins continues to diverge from EIA estimates



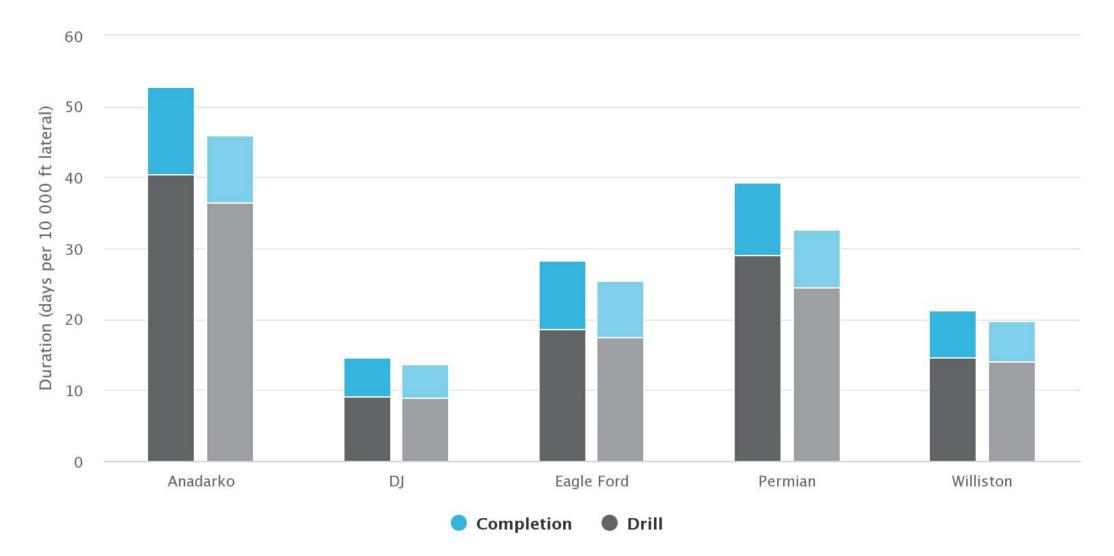
## Dropping frac spreads

Kayrros-monitored active frac crews across the five largest oil basins fell below 200 in 2019



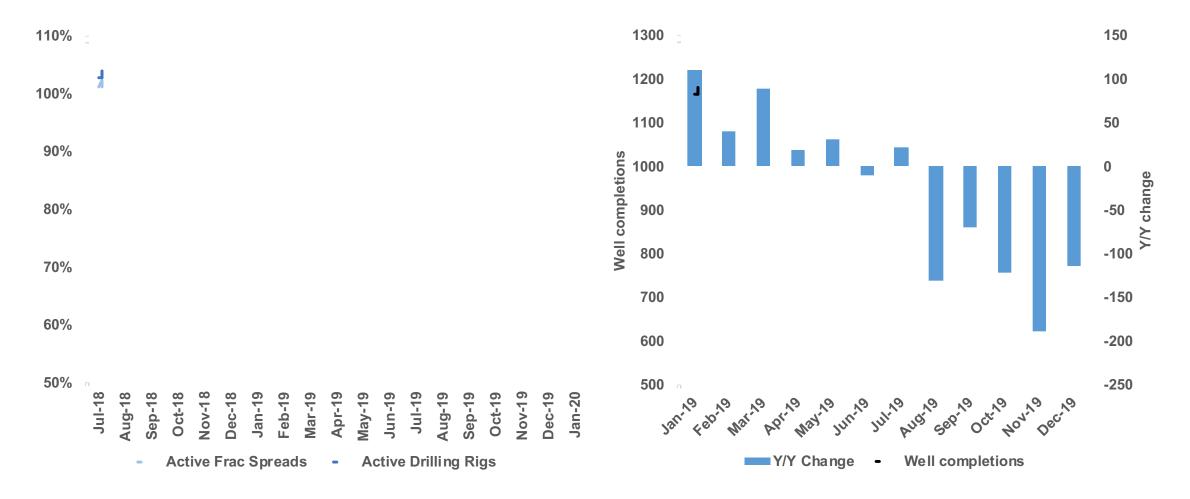
## **E&Ps continue operational efficiency gains...**

Drilling and completion (normalized to 10k ft lateral) faster y/y in every basin



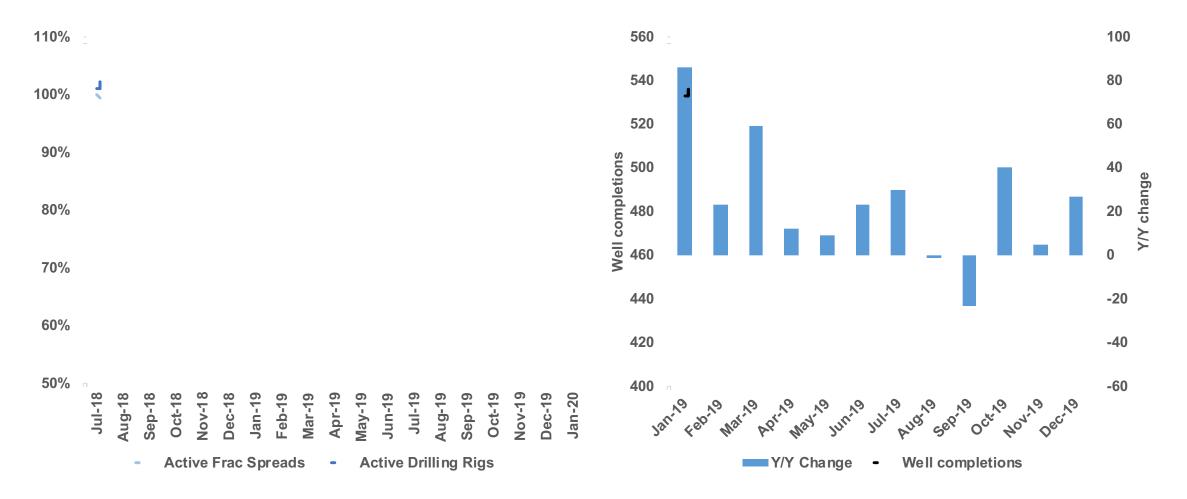
### ...but tight oil activity drop shows up in H2 2019

Completions across the 5 largest US tight oil basins begin to decline after holding steady in H1 2019



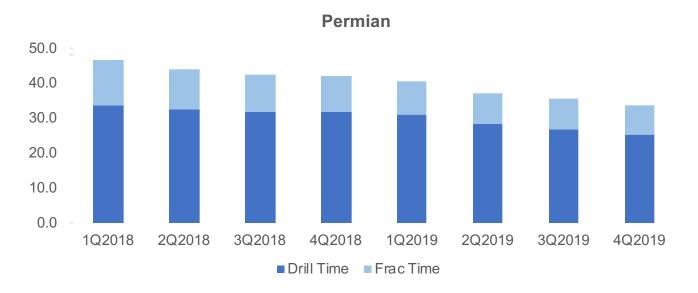
### Permian well completions hold steady

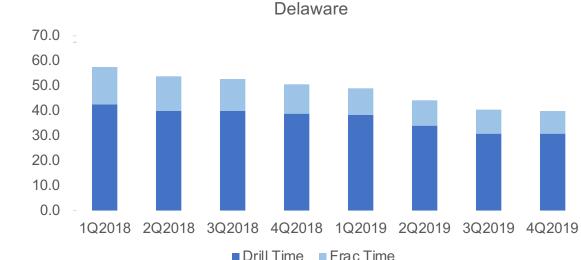
Kayrros-monitored Permian activity down nearly 40% from 2018 peak, but completions remain above 2018 levels

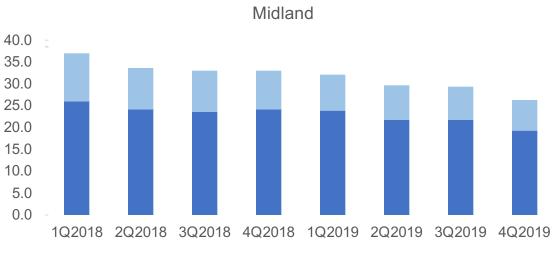


### Permian operators steadily more efficient...

Delaware operators drill and complete wells more efficiently, shaving off nearly 11 days per well y/y in Q4 2019

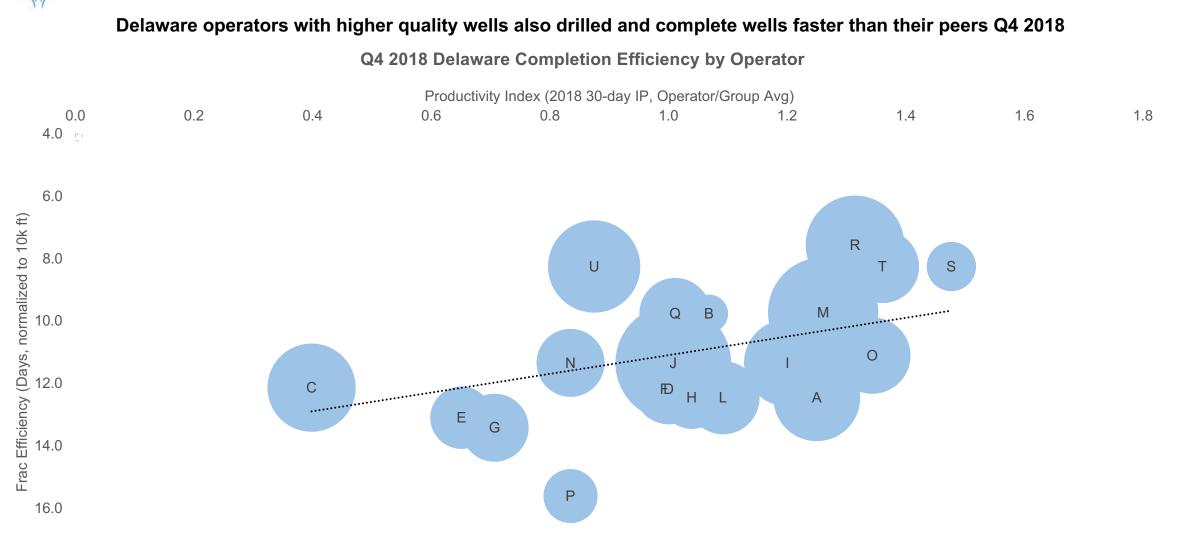






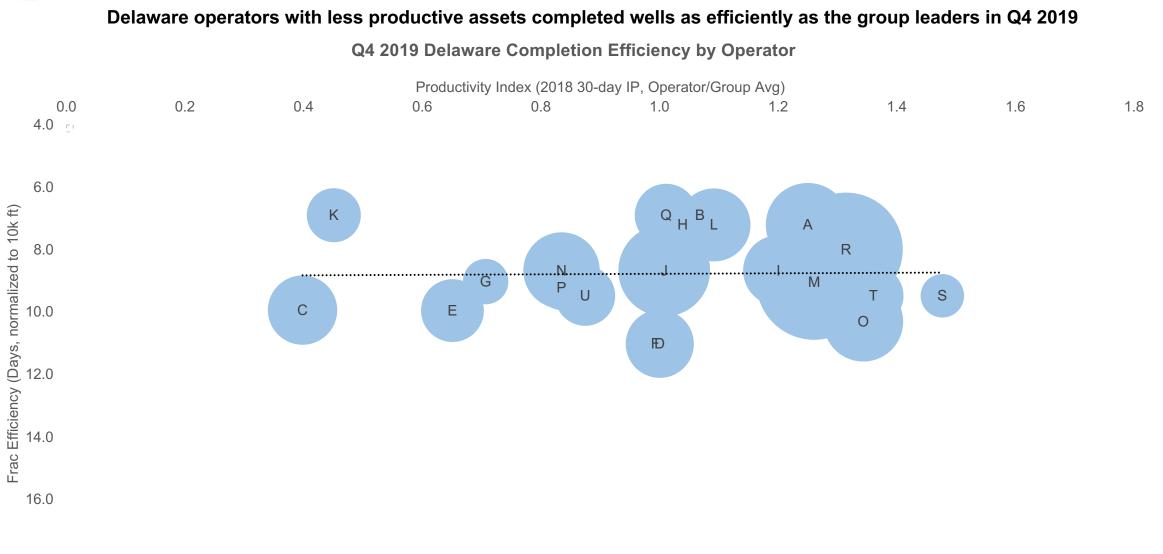
Source: Kayrros, state commissions

### Superior Del. operators completed faster in 2018...



18.0

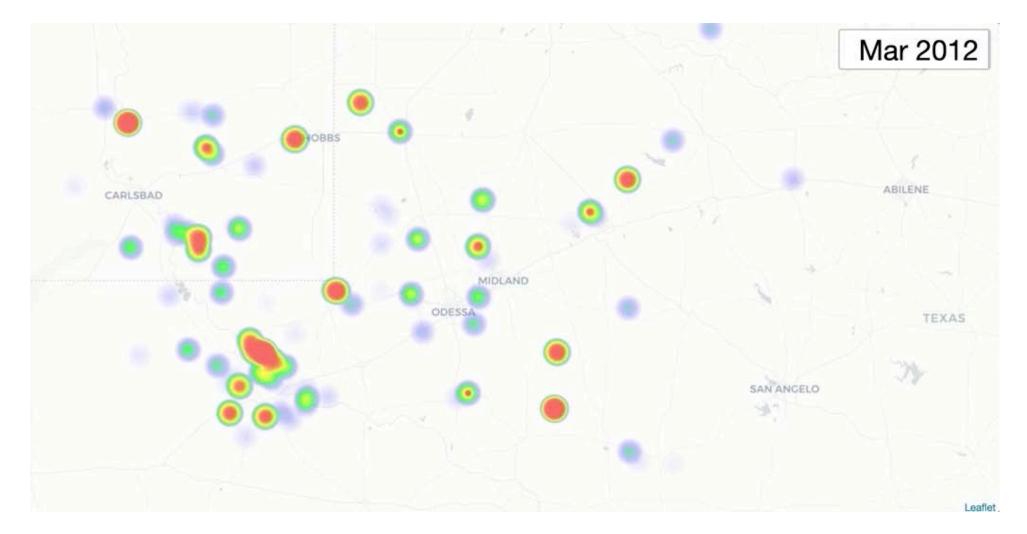
### ...but others caught up by end 2019



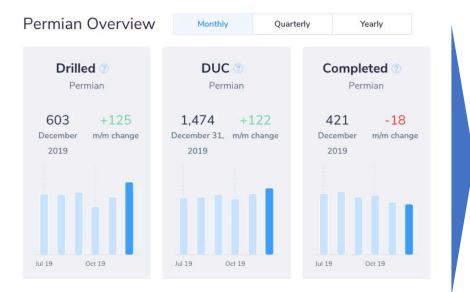
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## **ESG Investment: tracking flaring & emissions globally**

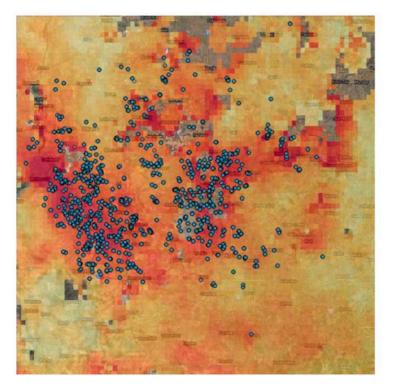
Kayrros uses optical satellite imagery to measure flaring intensity in OPEC countries, in the North Sea and in the Permian



## Leveraging O&G expertise to track Permian methane



Kayrros monitors completion activity at well level to study the impact on methane emissions



**Blue**: Nov 2018 – Jan 2019 well completions **Red**: high methane concentrations in Jan 2019

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