



Accelerating PETRONAS' Production Enhancement (PE) Candidates Generation Through Data Analytics Solution

07.09.22

PETRONAS Group adopts zero tolerance against all forms of bribery and corruption. As an employee, it is incumbent upon each and everyone of us to internalise and abide by the PETRONAS Code of Conduct and Business Ethics (CoBE) & Anti-Bribery and Corruption (ABC) Manual while remain guided by our shared values of loyalty, integrity, professionalism and cohesiveness.

© 2022 Petroliam Nasional Berhad (PETRONAS)

All rights reserved. No part of this document may be reproduced in any form possible, stored in a retrieval system, transmitted and/or disseminated in any form or by any means (digital, mechanical, hard copy, recording or otherwise) without the permission of the copyright owner.

We need to maximize every opportunities and improve the rate of success in sustaining our production safely at the lowest cost

PE Candidate Generation solution, is an **AI/ML solution** that provides an automated and integrated system to support PETRONAS with Production Enhancement (PE) P* well candidate selection process driven by data analytics.



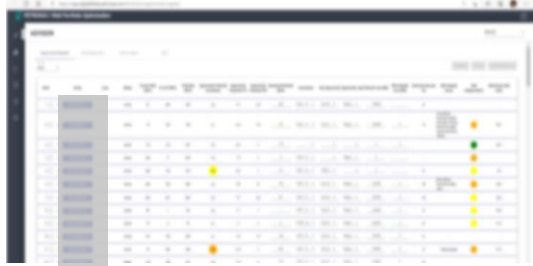
Protecting the base: Bringing additional PE P candidates*

Process Improvement: Improving well-by-well review using AI/ML & automation.

Well ID	Area	Depth	Pressure	Temperature	Flow Rate	Completion Status
W1	A	1000	100	100	100	Complete
W2	B	1200	120	120	120	Complete
W3	C	1400	140	140	140	Complete
W4	D	1600	160	160	160	Complete
W5	E	1800	180	180	180	Complete
W6	F	2000	200	200	200	Complete
W7	G	2200	220	220	220	Complete
W8	H	2400	240	240	240	Complete
W9	I	2600	260	260	260	Complete
W10	J	2800	280	280	280	Complete

The solution has improved the way we work. PE P* candidates being ranked automatically for our engineers to validate and mature

Well PE Candidate Generation



P funnel by AI/ML engine based on ranking (e.g. potential gain, chance of success) + well integrity (barrier).*

Automated daily execution.

Opportunity Maturation

Data feedback loop for next execution

Non-Routine	ACCOUNTABILITY					
	SE & PAE	PE/TAG			WIS	PE/TAG
		SE				
Routine	WIS/SE					
PE Proposal Status	P0	P1	P2	P3	P4	P5

P*

Value Tracking & Approval



PE BPW

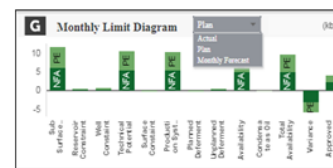


Integrated Well Review Process



PE Routine & Non-Routine

Limit Diagram



Croc Chart



The 'engine' leveraged good data hygiene and data science methods to propose PE proposal, estimate gain and chance of success



Extraction of data is performed from numerous data sources & consolidated into one central datastore.

Following ingestion, various calculations & data validation are performed.

Category	Item Type	Location	Production and Well logs
Well Data	Well ID	Well Name	Well Name
	Well Type	Well Status	Well Status
	Well Depth	Well Completion	Well Completion
	Well Diameter	Well Orientation	Well Orientation
	Well Perforation	Well Production	Well Production
	Well Completion	Well Completion	Well Completion
	Well Perforation	Well Perforation	Well Perforation
	Well Completion	Well Completion	Well Completion
	Well Perforation	Well Perforation	Well Perforation
	Well Completion	Well Completion	Well Completion
Well Perforation	Well Perforation	Well Perforation	
Production / Well logs	Production Rate	Well Logs	Well Logs
	Well Pressure	Well Logs	Well Logs
	Well Temperature	Well Logs	Well Logs
	Well Vibration	Well Logs	Well Logs
	Well Torque	Well Logs	Well Logs
	Well Flow	Well Logs	Well Logs
	Well Pressure	Well Logs	Well Logs
	Well Temperature	Well Logs	Well Logs
	Well Vibration	Well Logs	Well Logs
	Well Torque	Well Logs	Well Logs
PVT Data	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data
	PVT Data	PVT Data	PVT Data

Wells are screened & ranked based on a set of production & petrophysical KPIs using a Multi-Criteria-Decision-Making-Process (MCDMP) called AHP (Analytic Hierarchy Process).

Higher the rank of a well, the better the candidate it is from a technical analysis standpoint.



Based on Petronas guidelines & workflow processes, well data is screened to determine constraints & appropriate remedial interventions are provided.

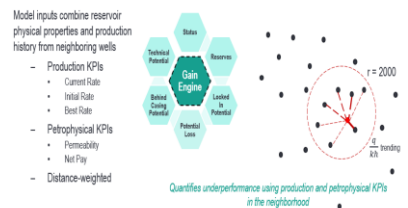
Constraints:

- Water Prod
- Gas Lift / Sand
- Well Integrity



Data based models were developed to probabilistically quantify post-intervention production. Based on status, potential loss or locked in-potential is estimated via a set of production & petrophysical KPIs.

If applicable, find the deliverability of new zones (BCO's) that could be opened in a well (e.g. PL, LIP, BCO).



Probability of success is estimated for each intervention using a continuously-enriched look-back knowledge base.

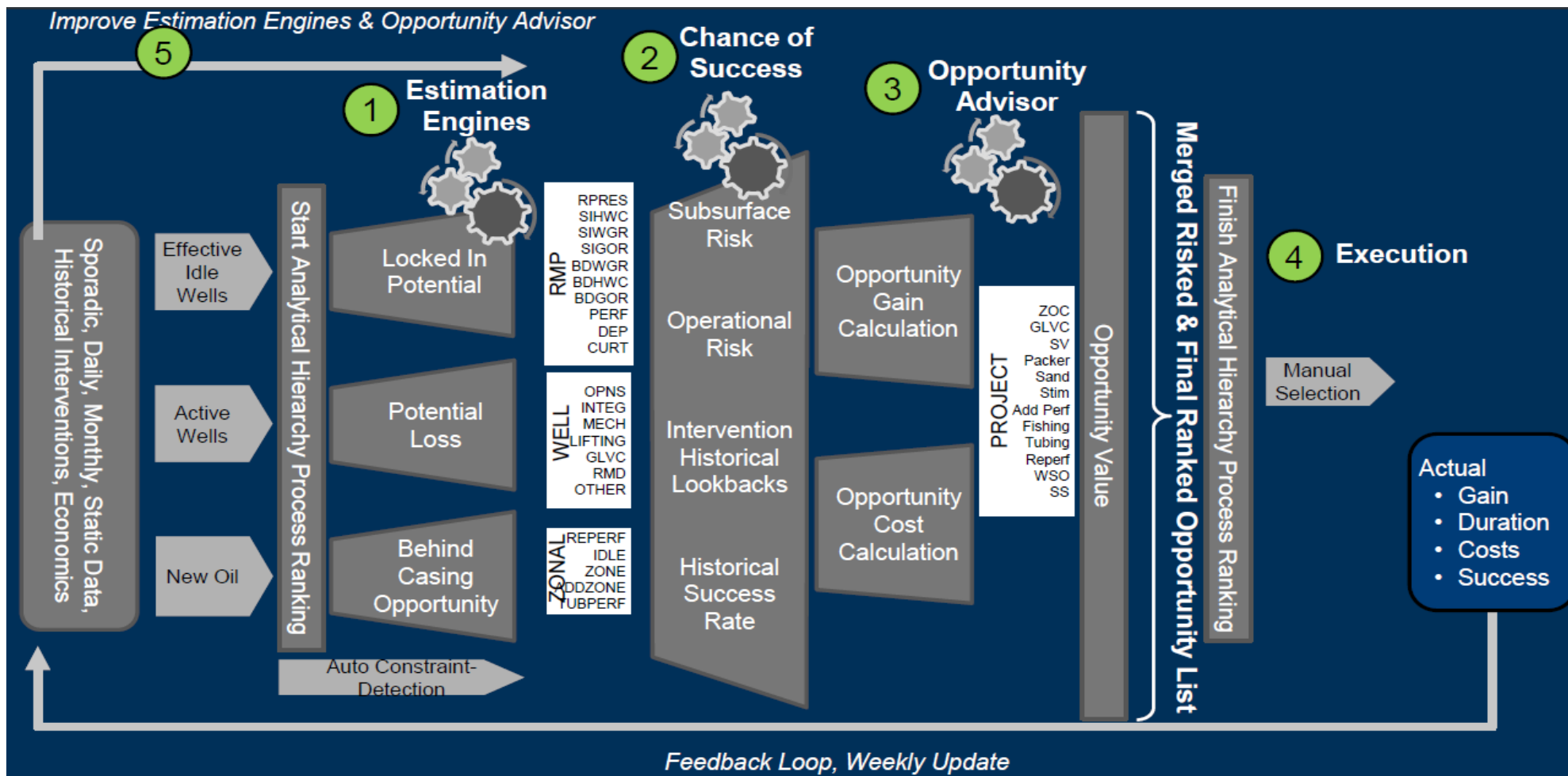
The historical success module utilizes Bayesian Belief Network (BBN) to capture the probability of success from historical intervention data.



Using Petronas standard practices, economic model was integrated with the analytics engines.

- Total Gain Calculation
- Total Cost Calculation
- Cash Flow vs UEC

It automates Potential Loss (PL), Lock-In-Potential (LiP) & Behind Casing Opportunities (BCO) candidates through rigorous work processes

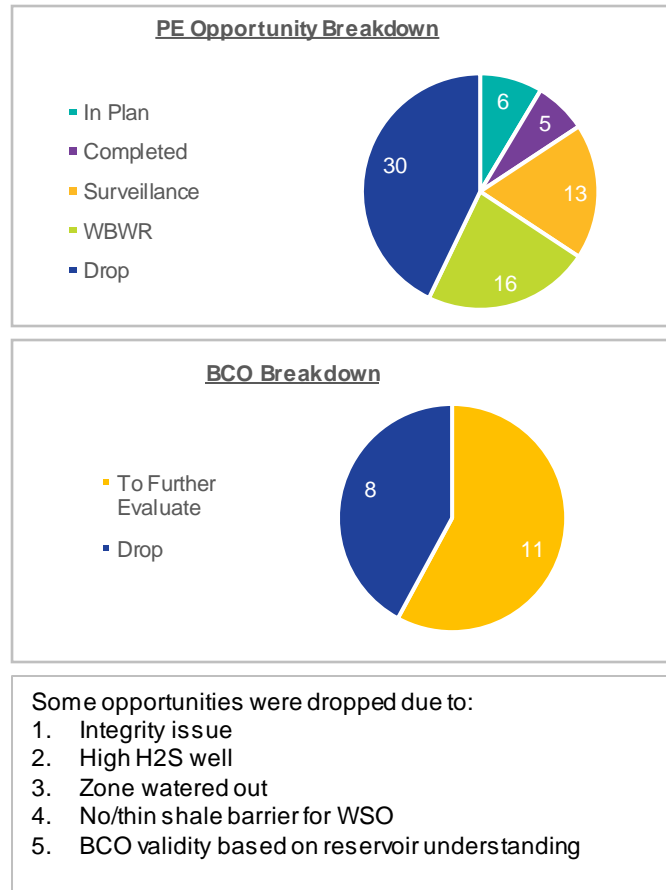


An example of PE Candidate Generation solution in action that resulted to successful Zone Change (ZOC) job execution with approved recorded gain

Opportunity Identification



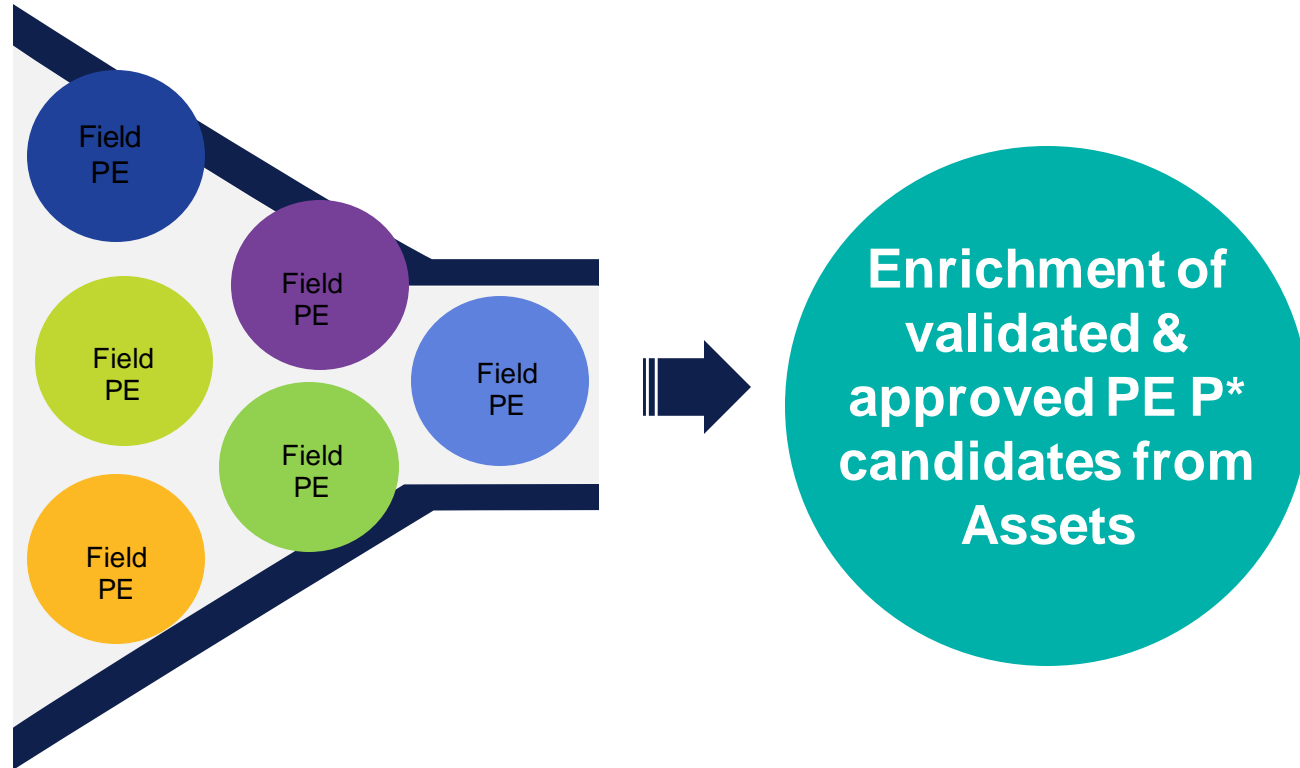
Opportunity Screening



Proposal Maturation & Approval



PE Candidate Generation solution has scaled to 42 assets in accelerating PETRONAS' Production Enhancement (PE) candidates generation through Data Analytics



- Substantially decrease time & effort for well reviews
- Automate current manual well opportunity maturation process, in particular the initial candidate screening
- Increase decision accuracy & quality
- Allow PETRONAS to go from reactive mode to a more proactive approach
- Allow PETRONAS team to focus efficiently on high value Petro-technical efforts (do more with less)

Automated PE candidates screening & ranking via AI/ML



PETRONAS

**THANK YOU FOR
YOUR PASSION**