



RESERVOIR CHARACTERIZATION PROJECT

# Raudhatain Field Project, North Kuwait

*Nadima Dwihusna and Liwei Cheng*

*November 14<sup>th</sup>, 2019*



RESERVOIR CHARACTERIZATION PROJECT

# Rock Physics Analysis and Post Stack Inversion in Raudhatain Field, North Kuwait

*Liwei Cheng*

*November 14<sup>th</sup>, 2019*

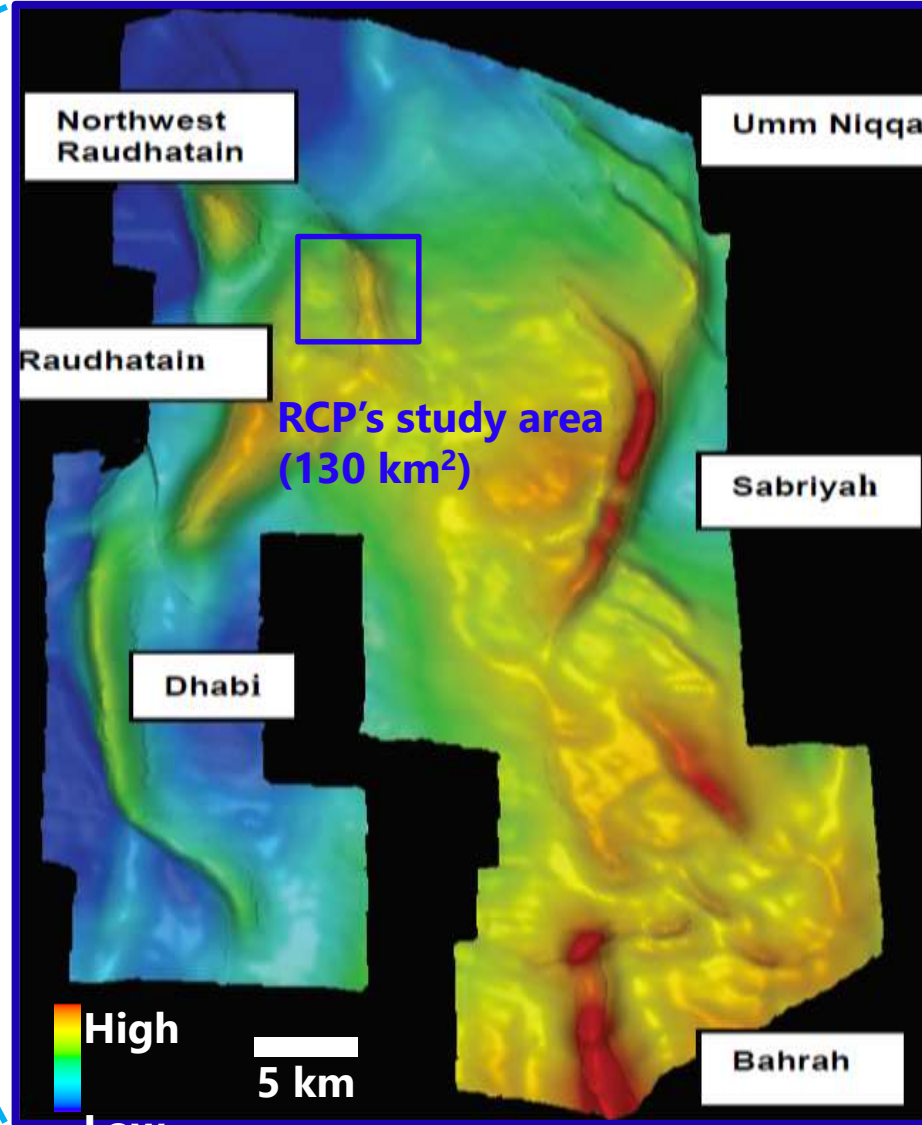
# Outline

- 💧 Introduction of Raudhatain field
- 💧 Overburden velocity and ray tracing model
- 💧 Rock physics analysis
- 💧 Post stack seismic inversion

# Raudhatain Field



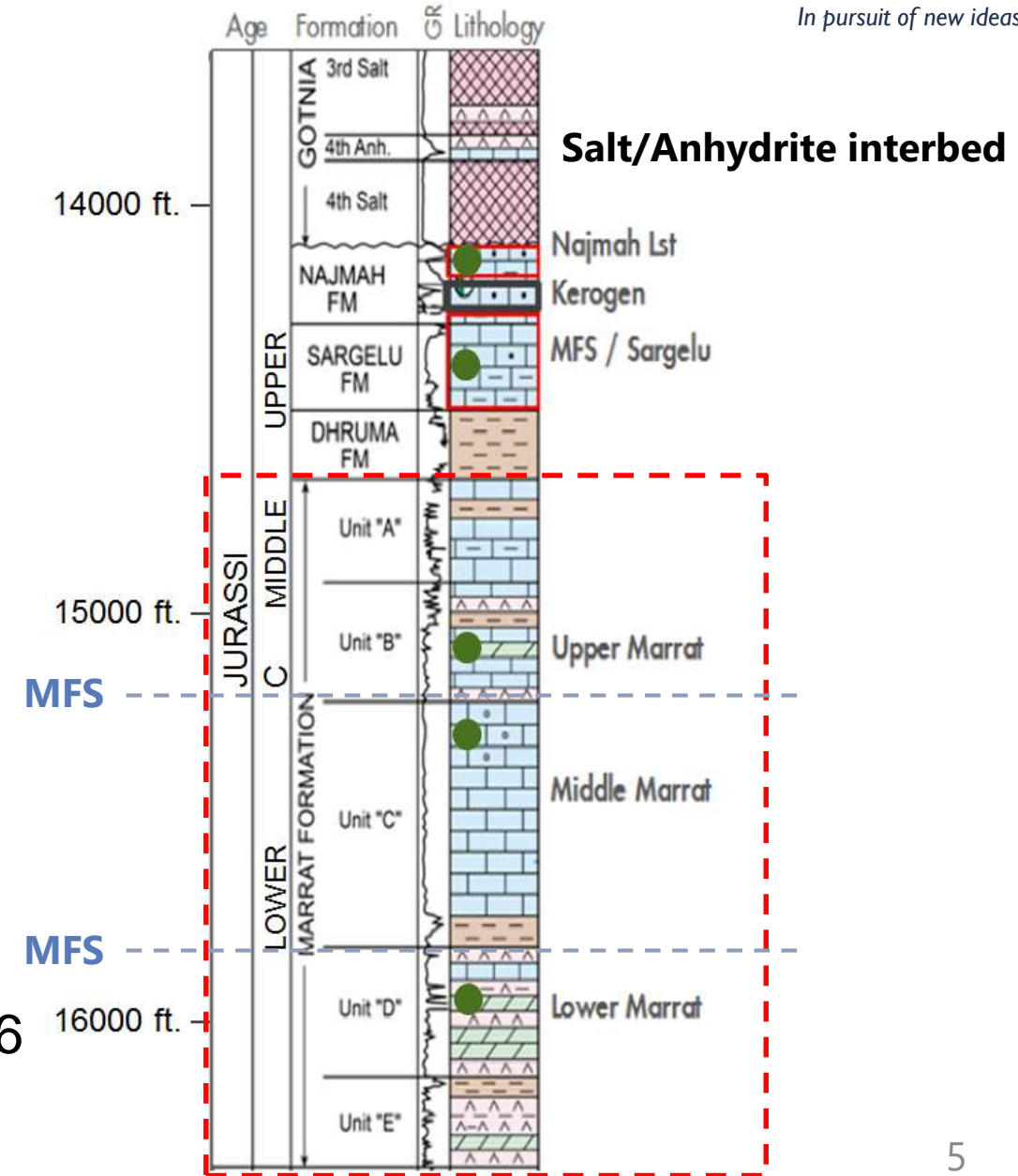
## North Kuwait Jurassic Gas Fields (1800 km<sup>2</sup>)



(Top of Najmah time structure map, modified from Al-Eidan, 2010) 4

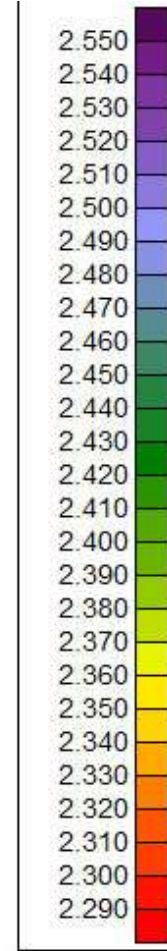
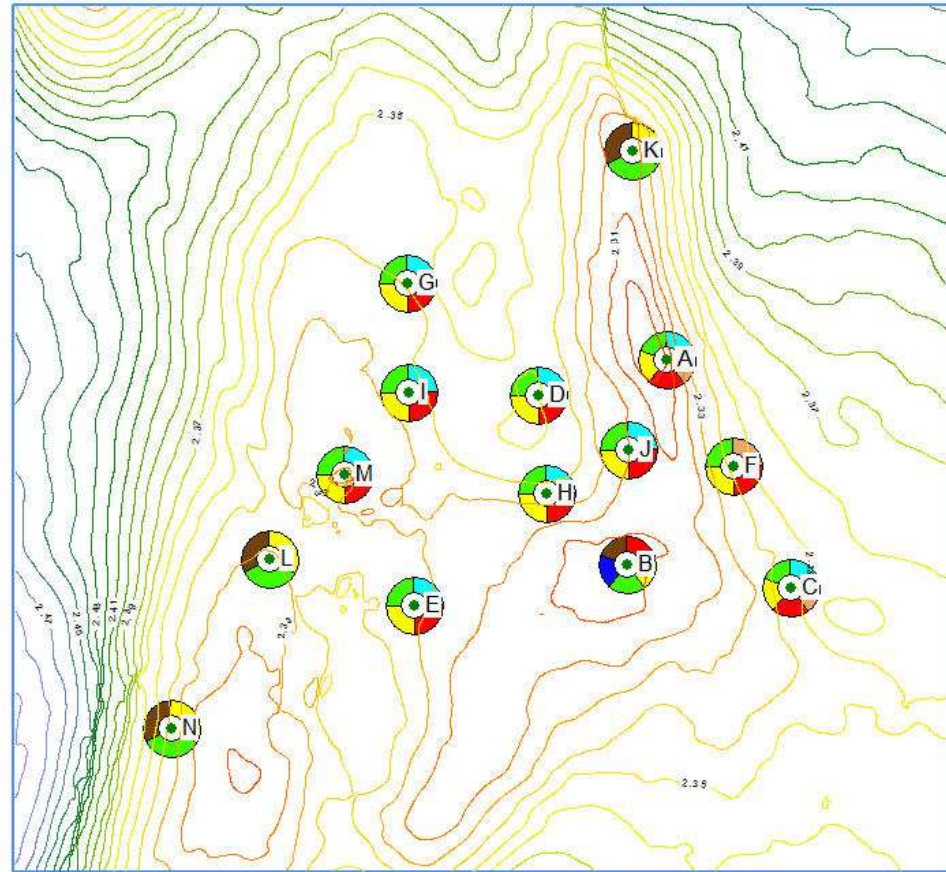
# Marrat Formation

- Deposited on carbonate-evaporite platform during Early Jurassic age
- Total thickness is up to 2,000 ft
- Middle Marrat (MMR) is the most prolific unit and consists of a sequence of limestones, frequently with anhydrite, dolomite and rare shale
- Total porosity is up to 20%
- Production from 2,500 to 5,000 bopd and from 6 to 20 MMscfd per well





# Data

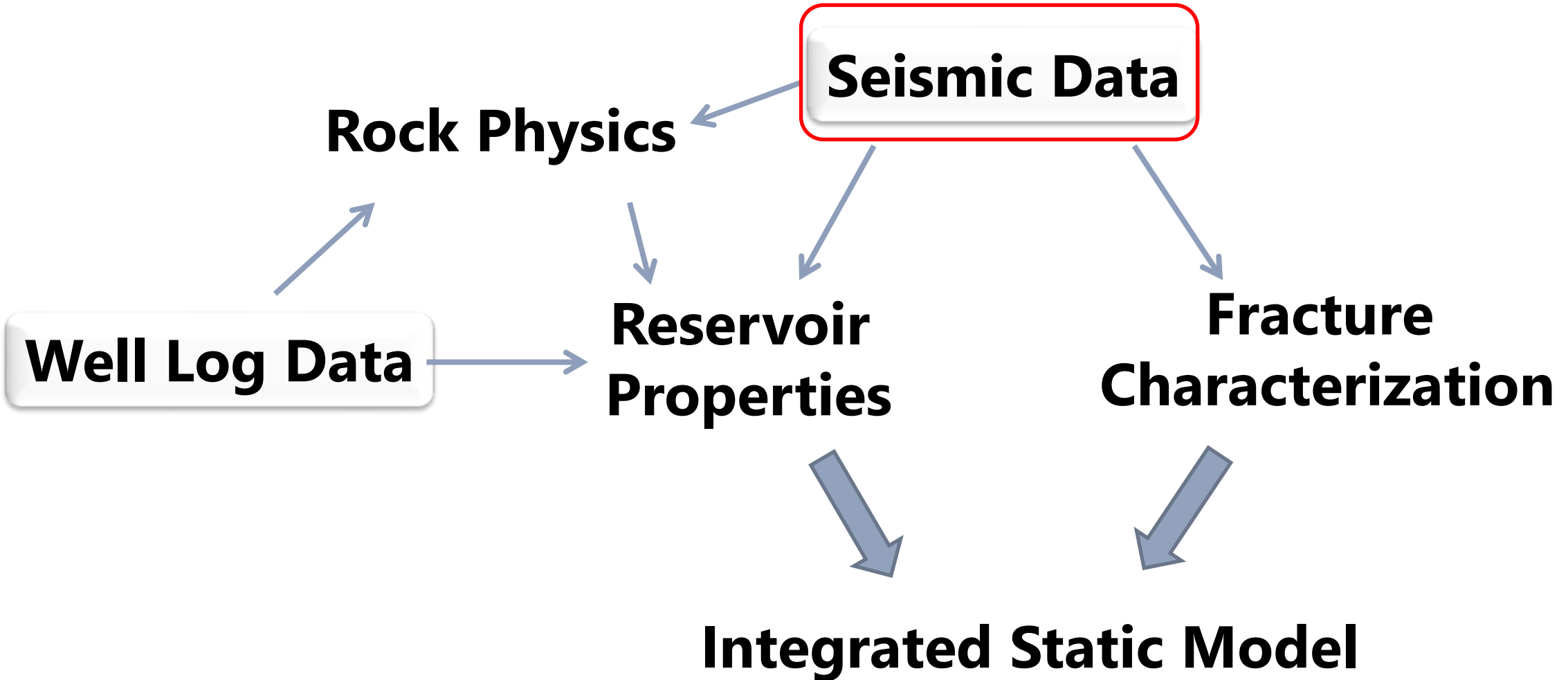


- ZVSP IS PRESENT
- 3DVSP IS PRESENT
- DTCS IS PRESENT
- RHOB IS PRESENT
- GR IS PRESENT
- NPHI IS PRESENT
- AT90 IS PRESENT

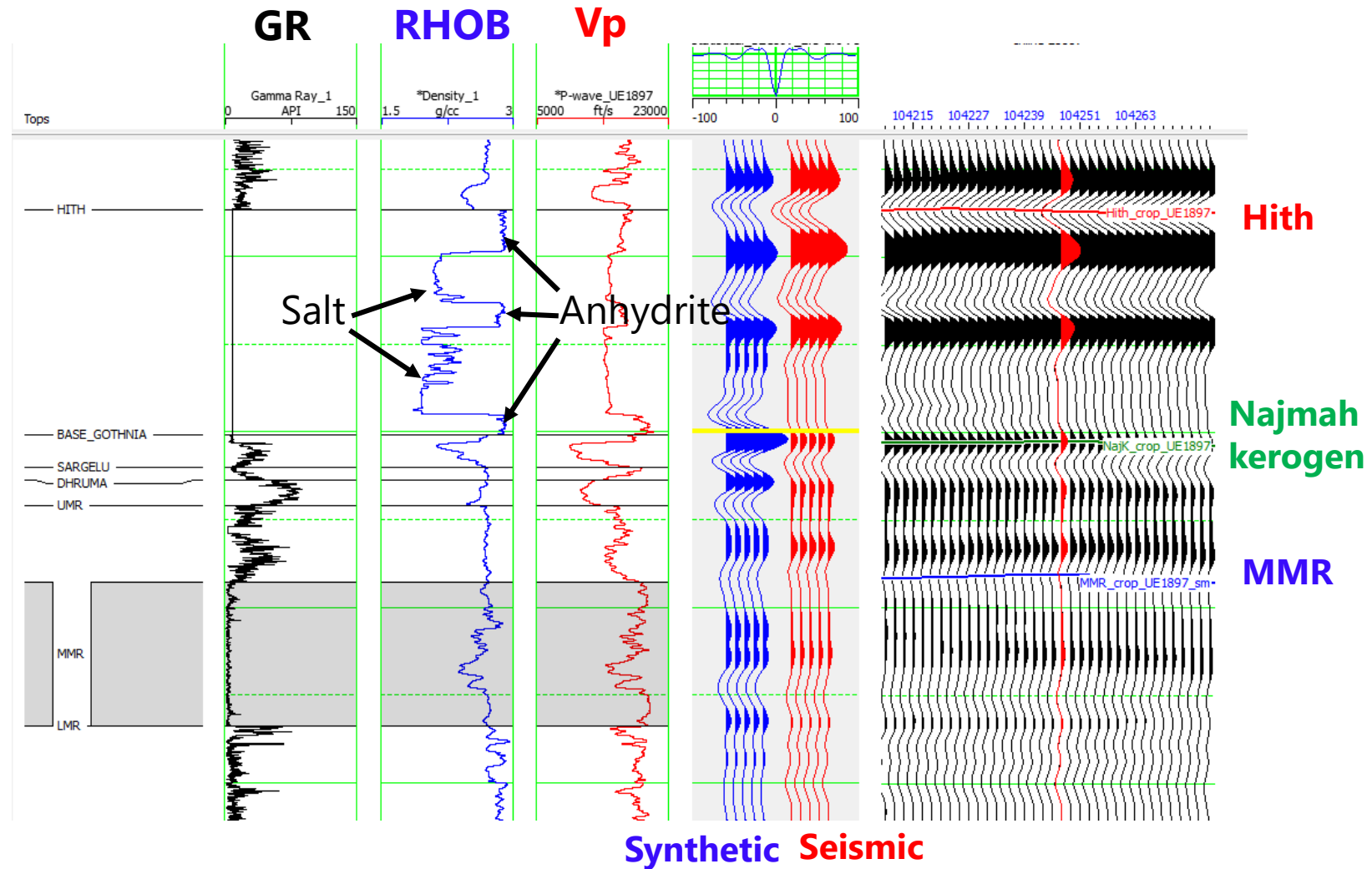
Najmah kerogen  
Time structure (s)



# Reservoir Characterization



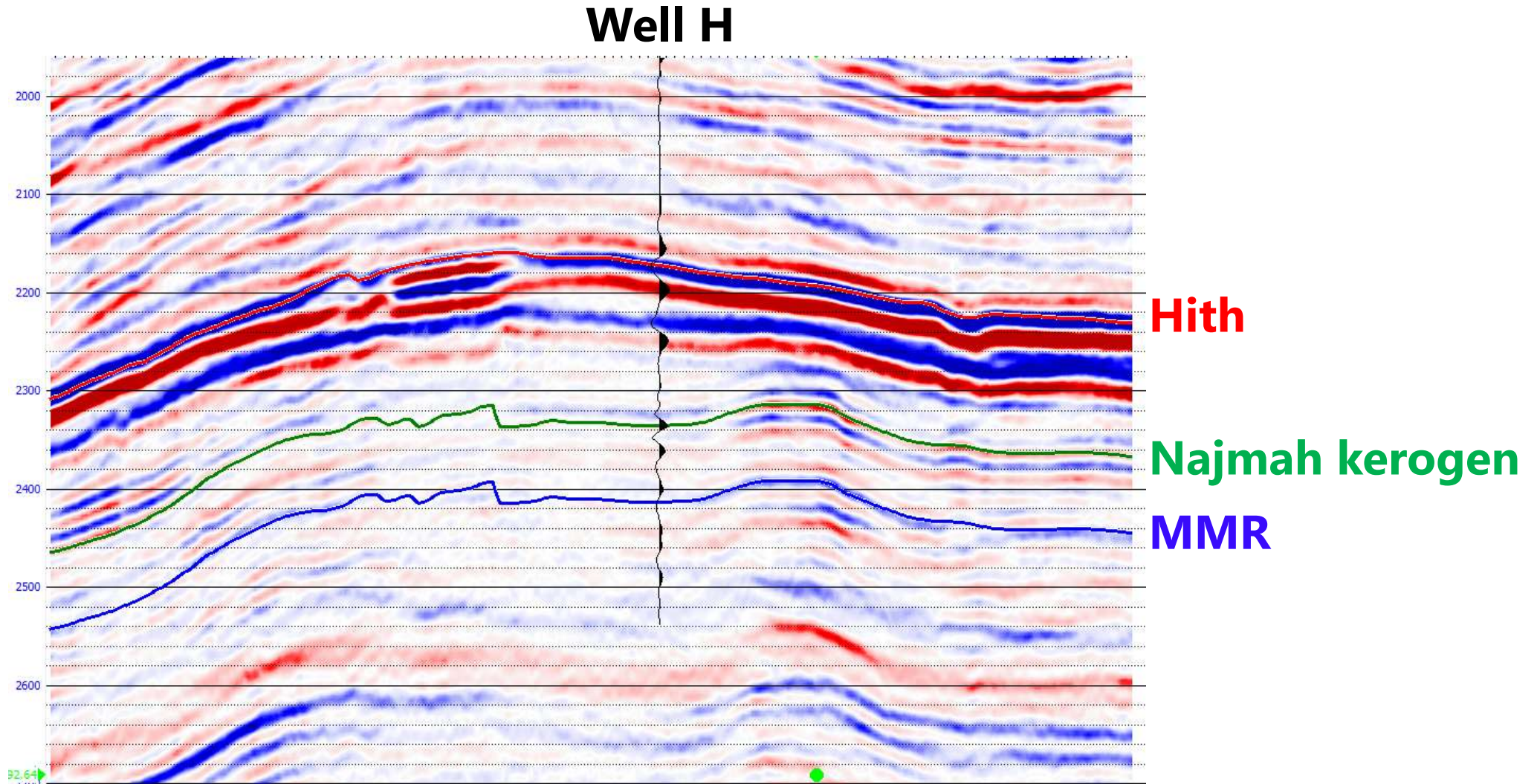
# Seismic-well Tie at Well B



Correlation coefficient (from Najmah Kerogen to TD) = 0.686



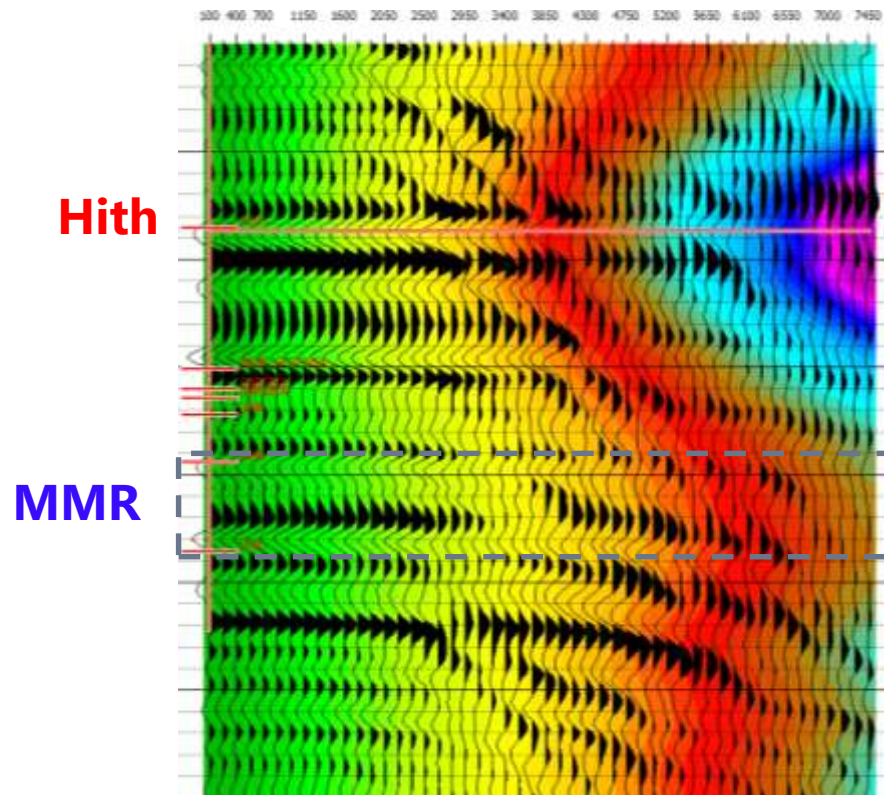
# Amplitude Issue Under Salt/Anhydrite



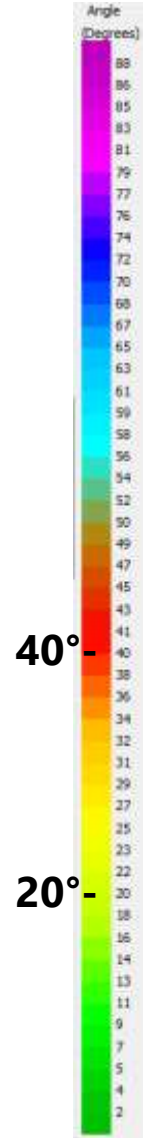
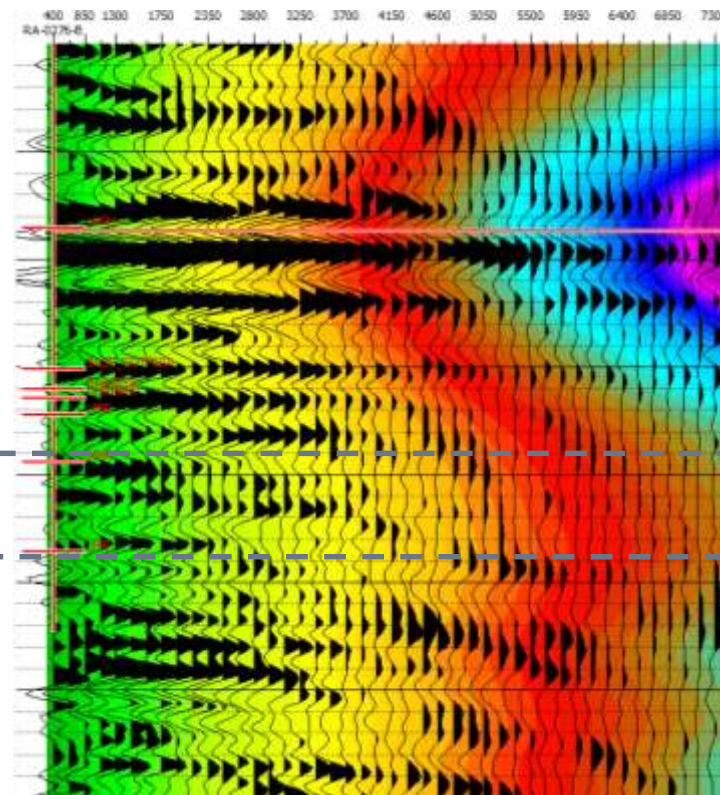


# Elastic Reflectivity Model and Field Data

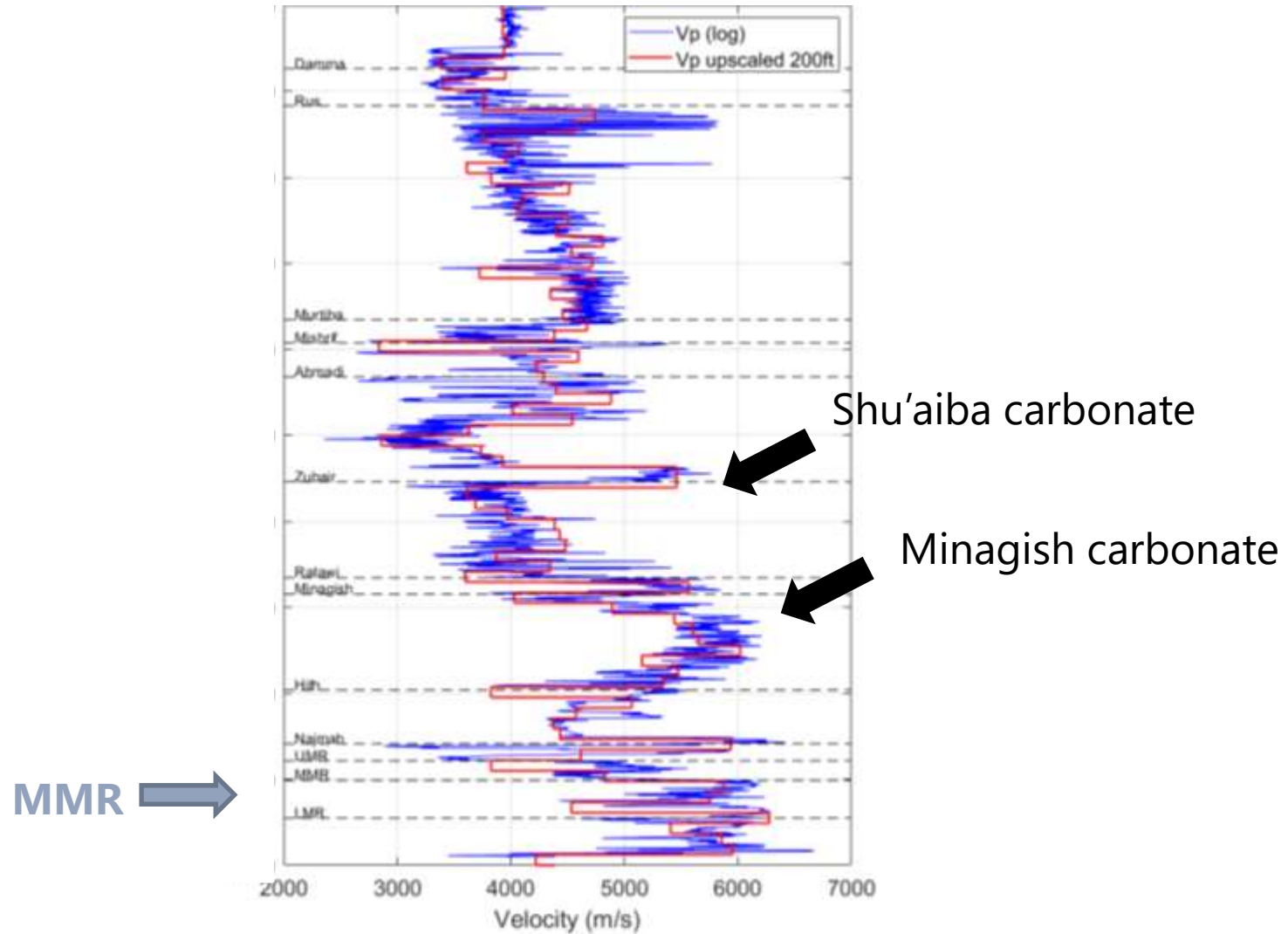
**Primaries + multiples  
+ converted waves**



**Surface seismic data**

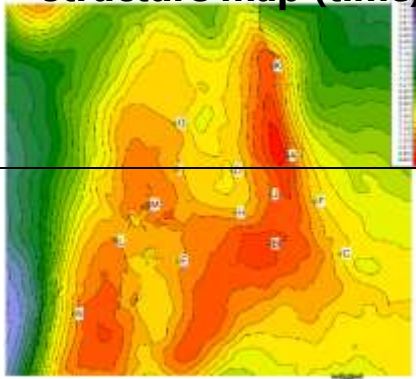


# High Velocity Overburden Layer

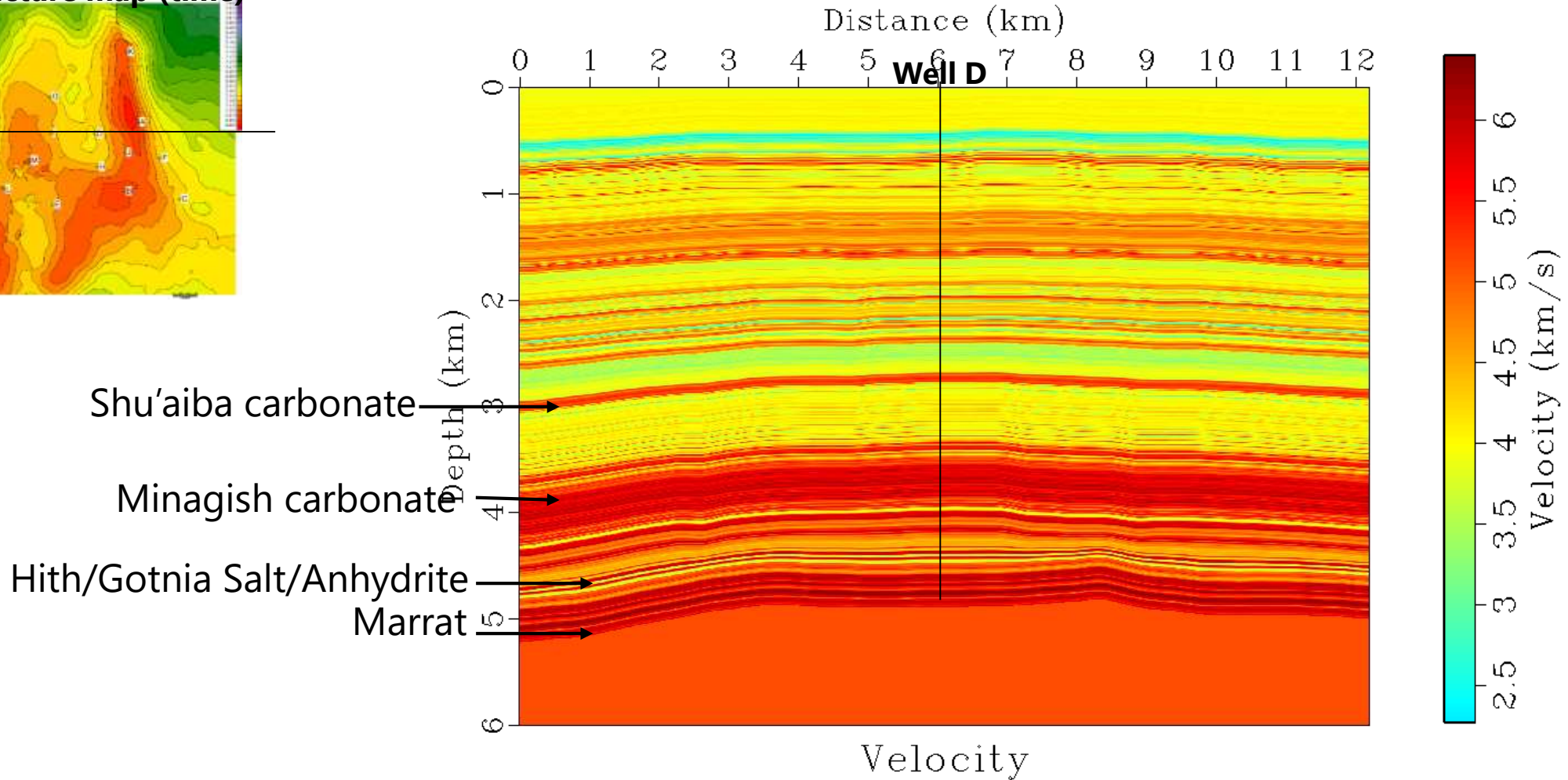


# 2D Velocity Model

Najmah Kerogen  
structure map (time)



Velocity sample interval: 20 m

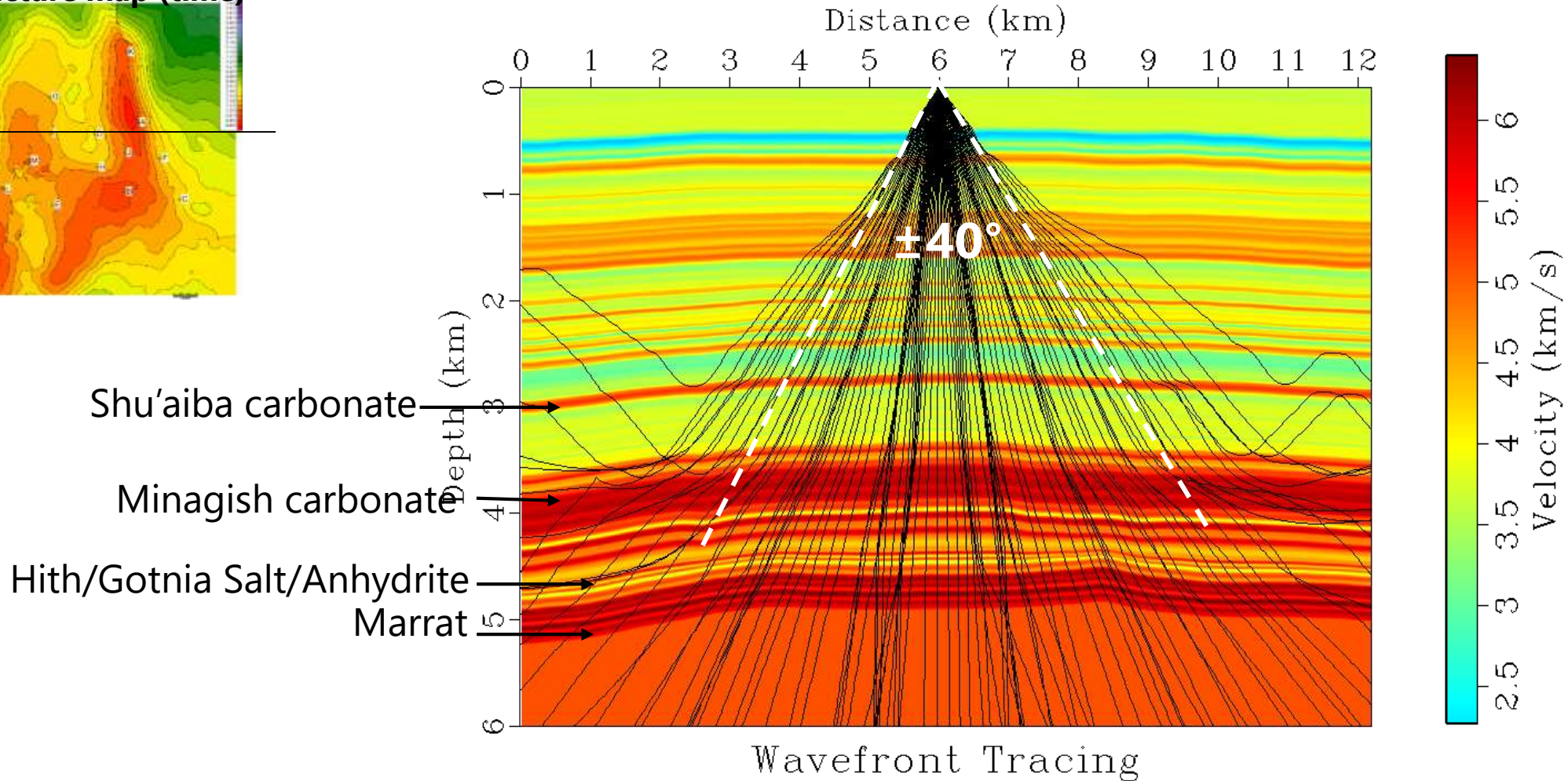
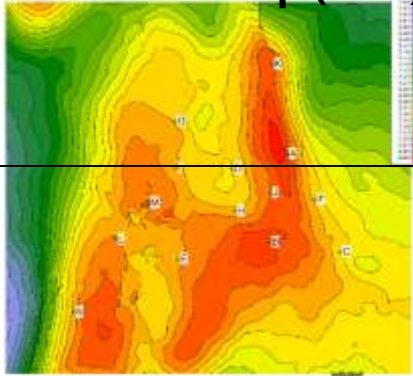




# 2D Velocity Ray Tracing Model

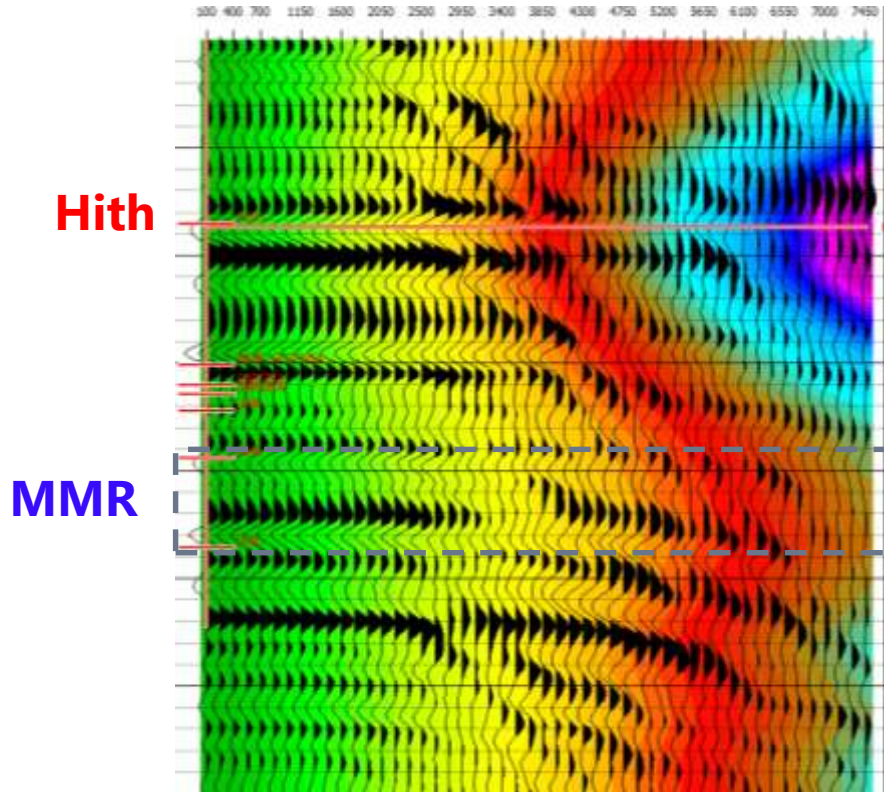
5 by 5 smoothing applied

Najmah Kerogen  
structure map (time)

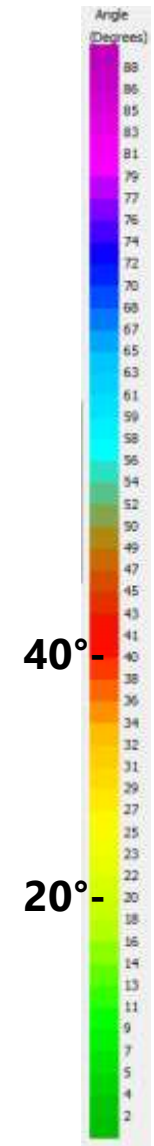
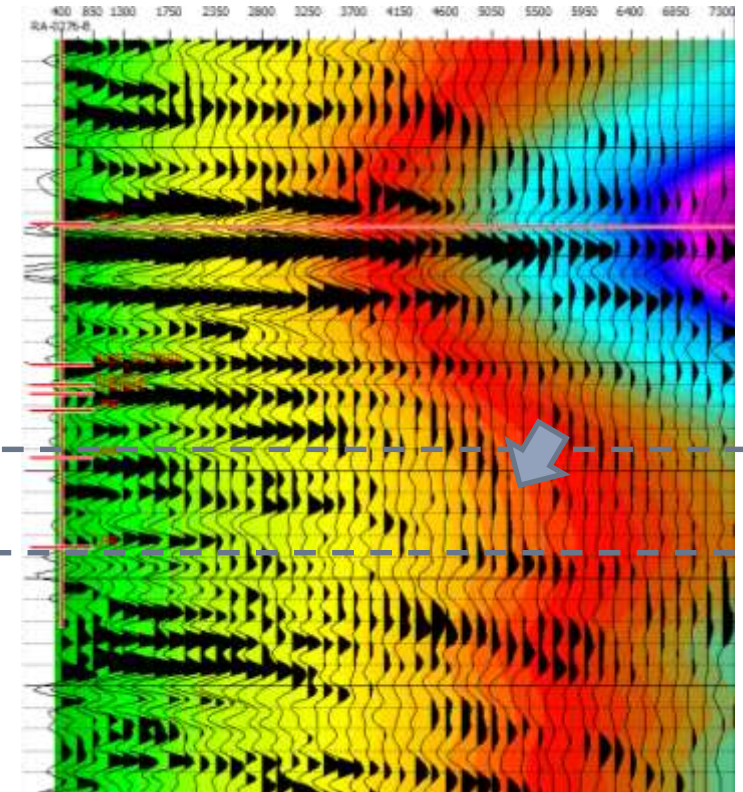


# Elastic Reflectivity Model and Field Data

**Primaries + multiples  
+ converted waves**

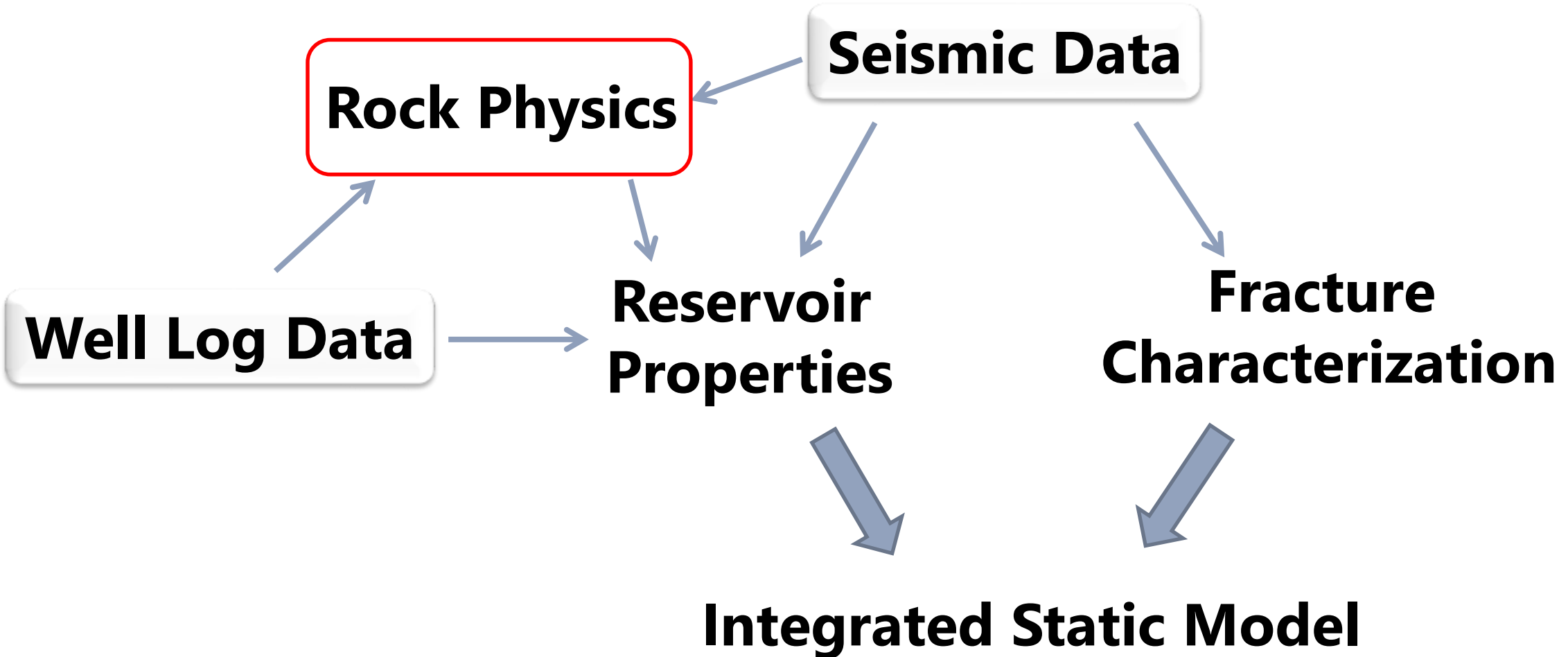


**Surface seismic data**



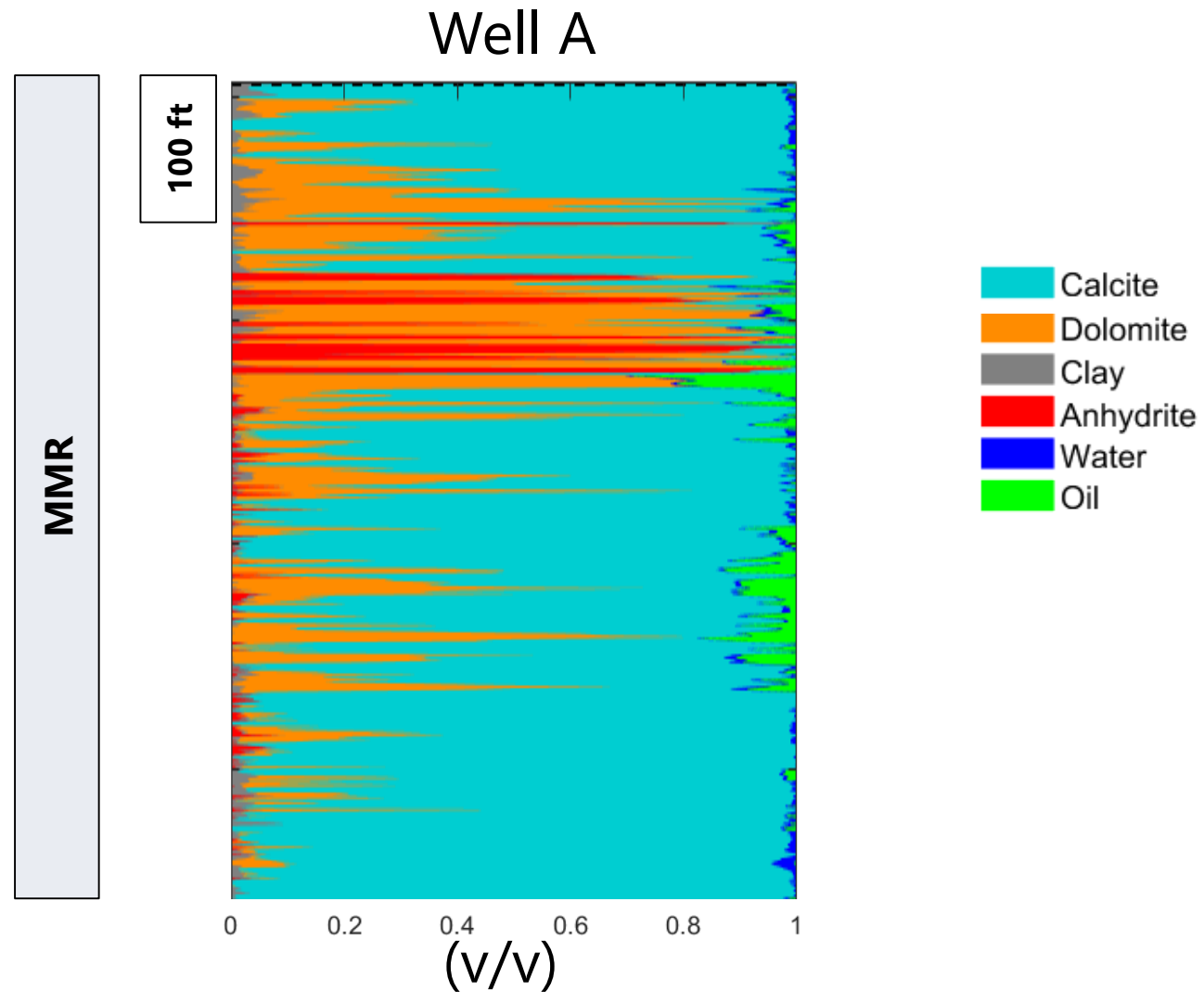


# Reservoir Characterization



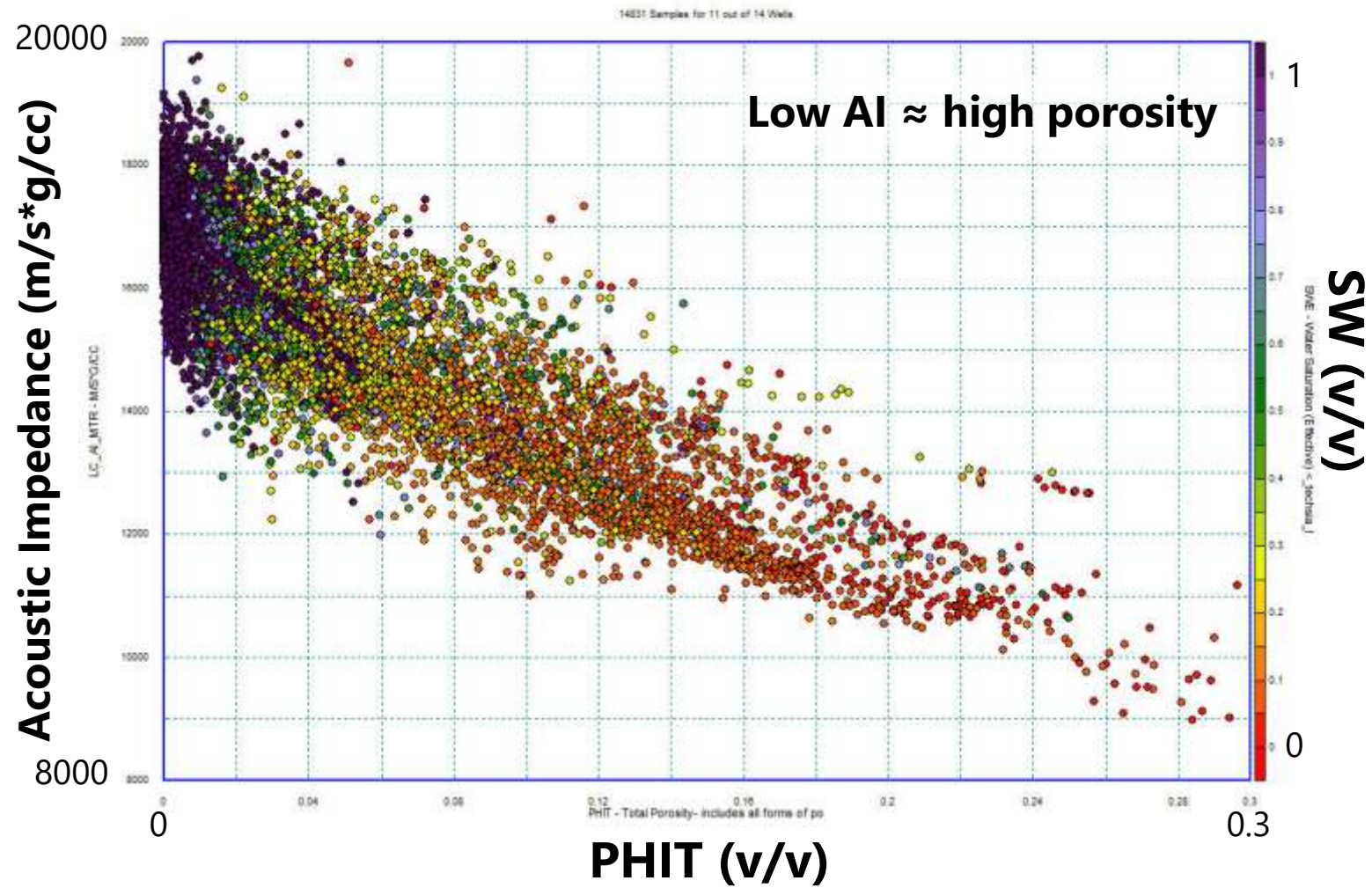
# Multi-mineral Analysis

Petrophysical inversion from GR, RHOB, DTC, NPHI, resistivity logs



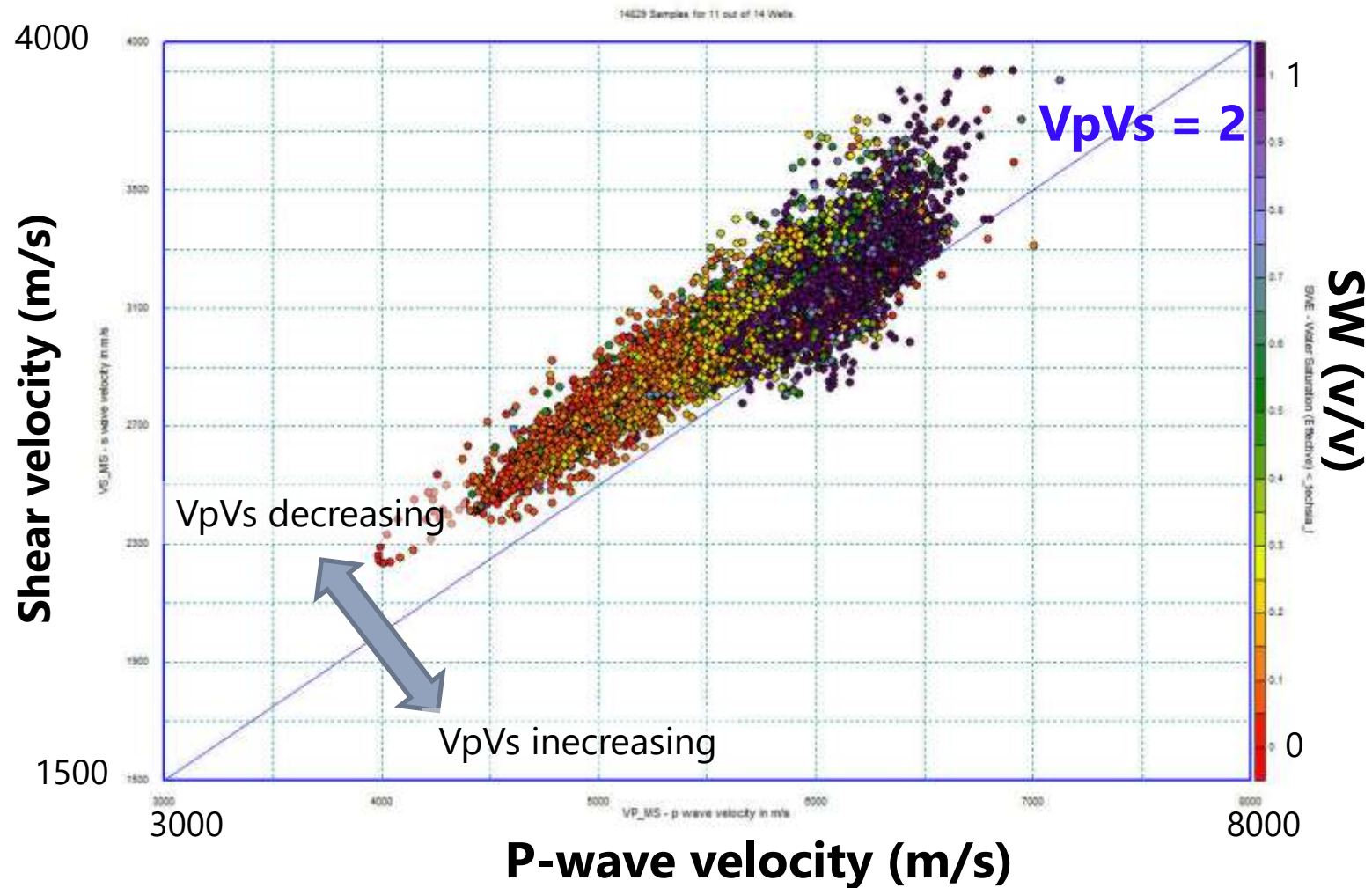
# Acoustic Impedance vs. Total Porosity

Middle Marrat only; 11 wells combined



# Compressional vs. Shear Velocity

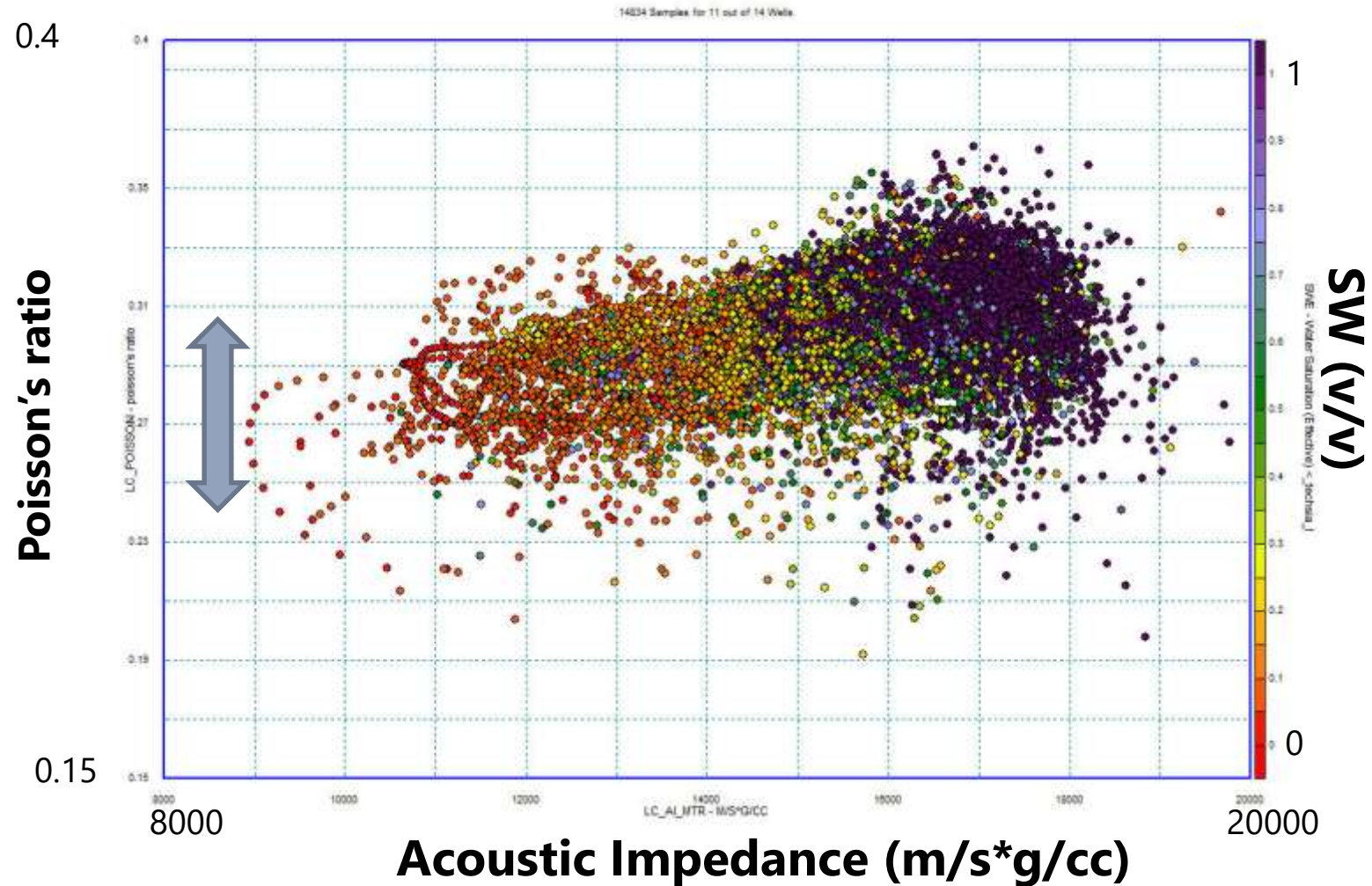
Middle Marrat only; 11 wells combined





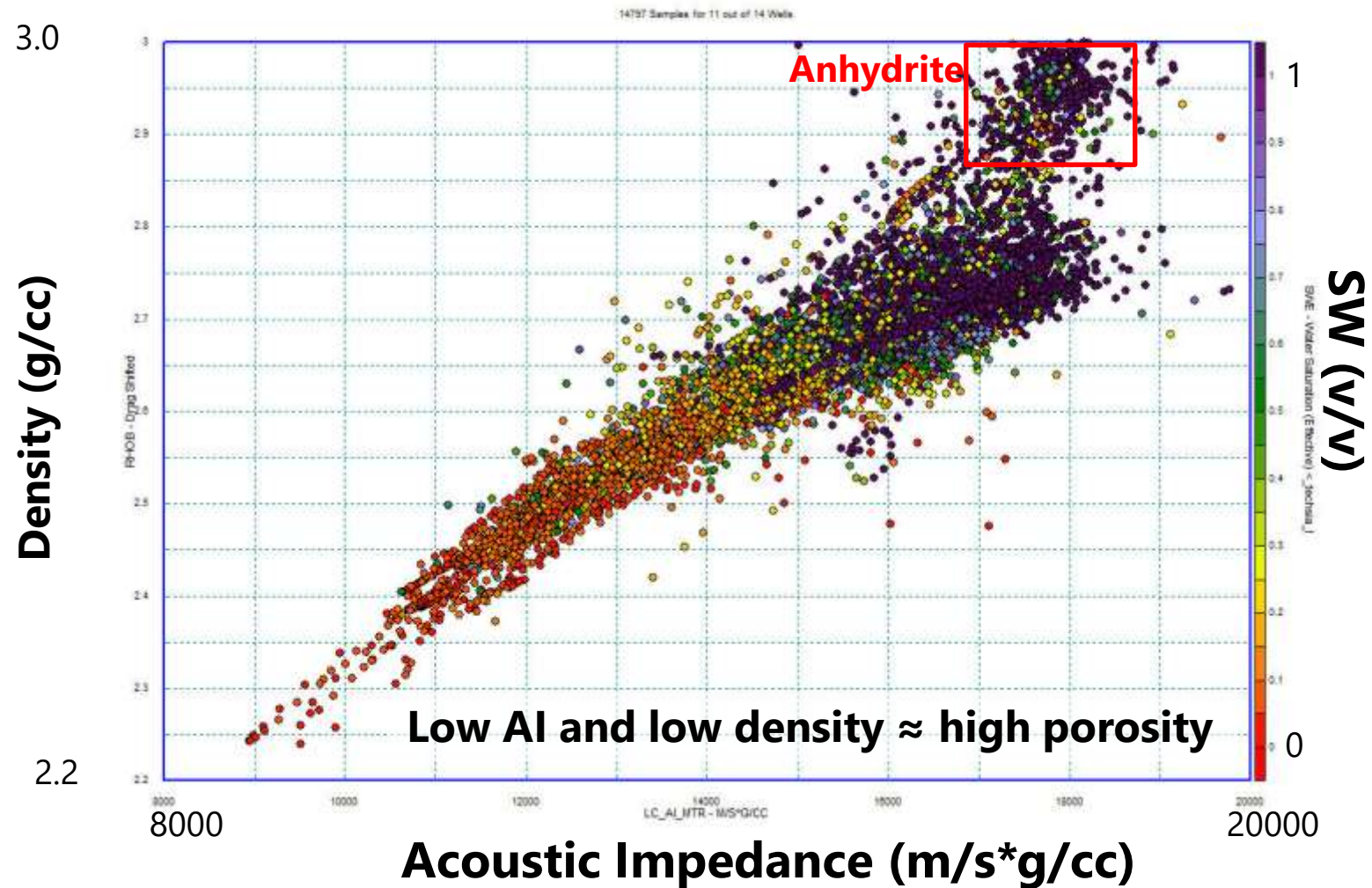
# Acoustic Impedance vs. Poisson's Ratio

**Middle Marrat only; 11 wells combined**



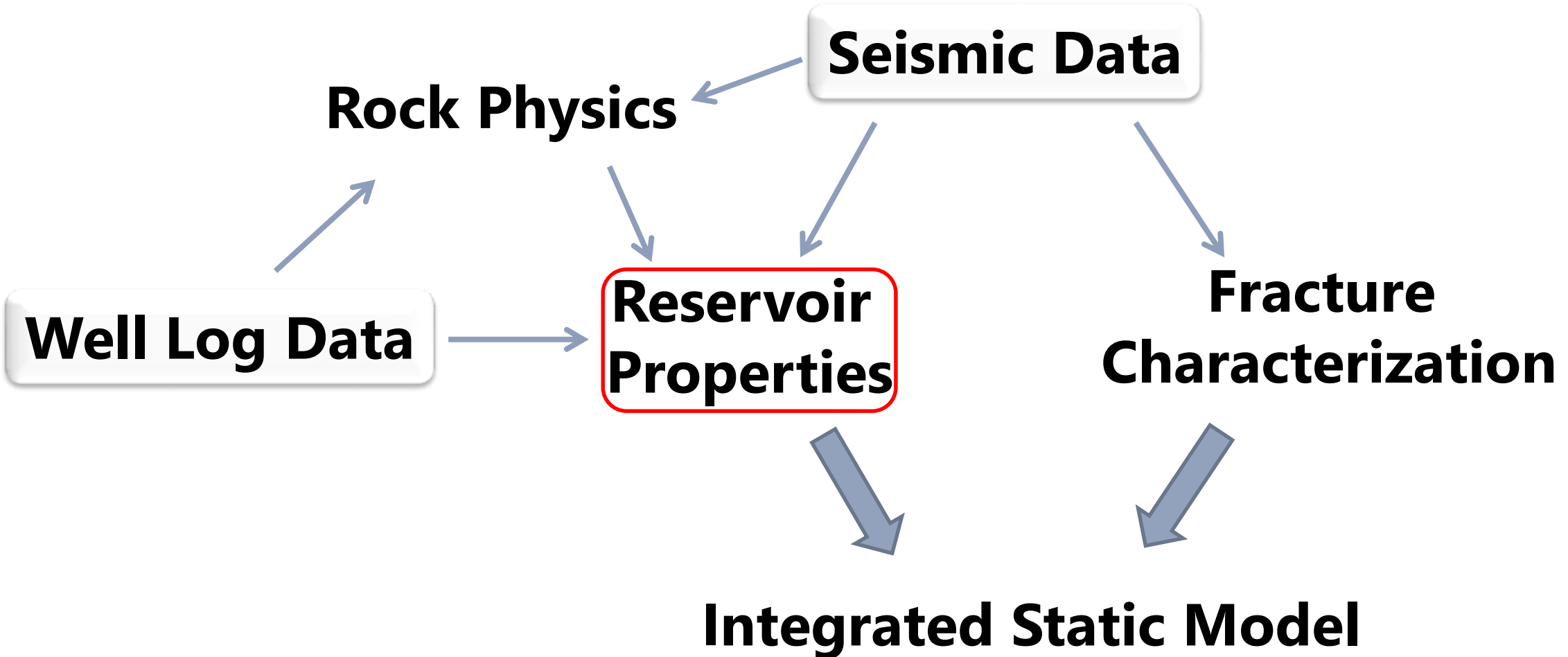
# Acoustic Impedance vs. Density

Middle Marrat only; 11 wells combined

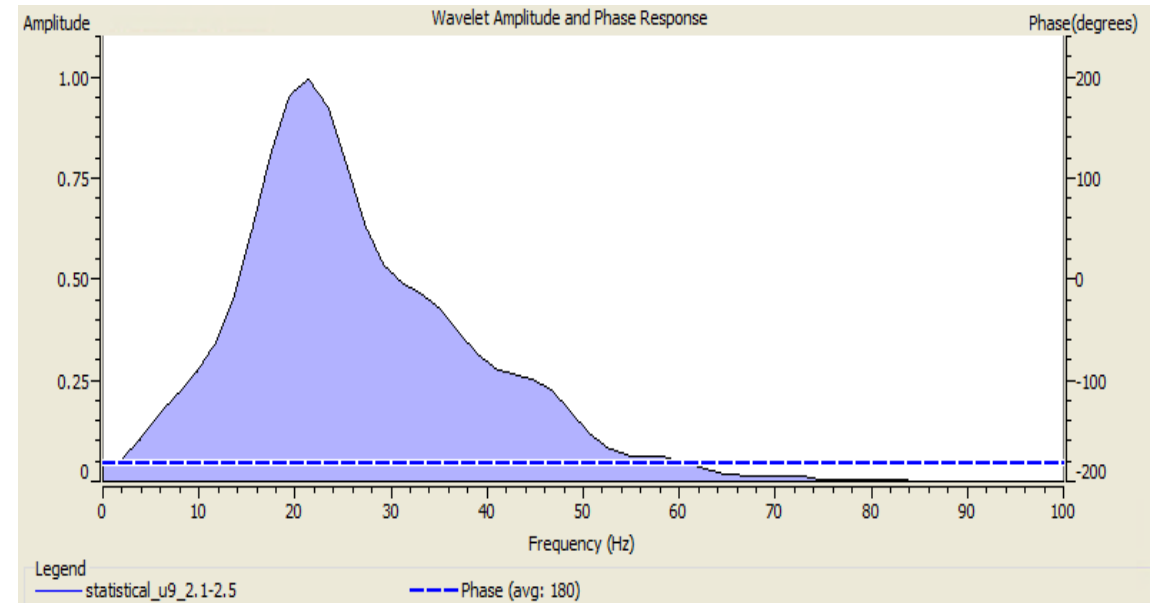
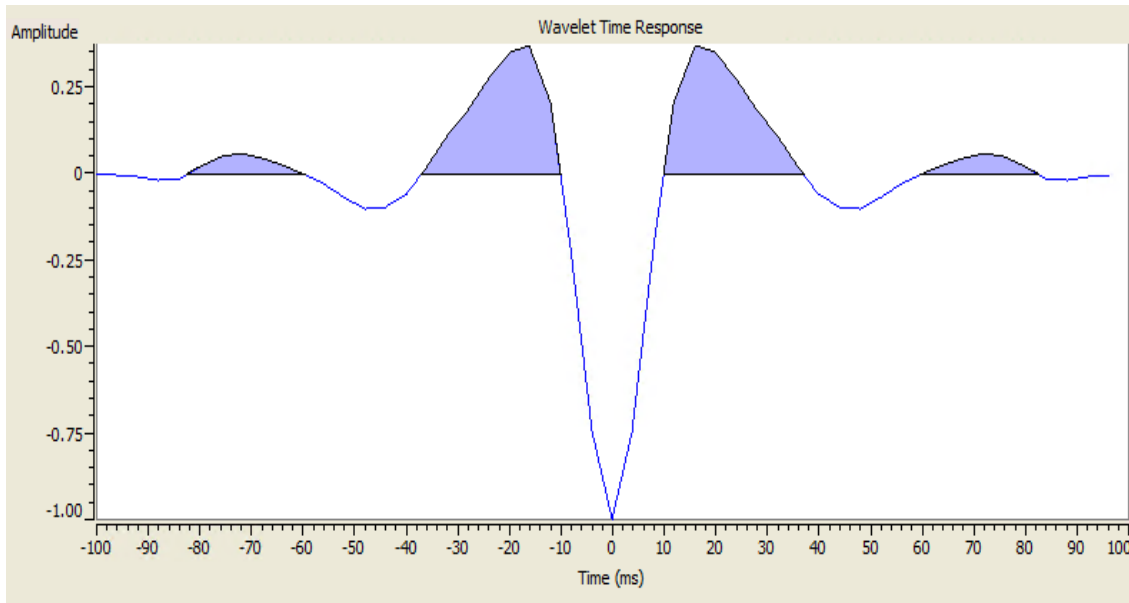




# Reservoir Characterization

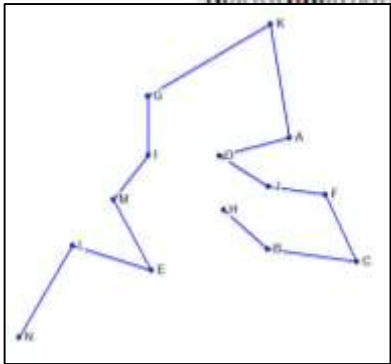
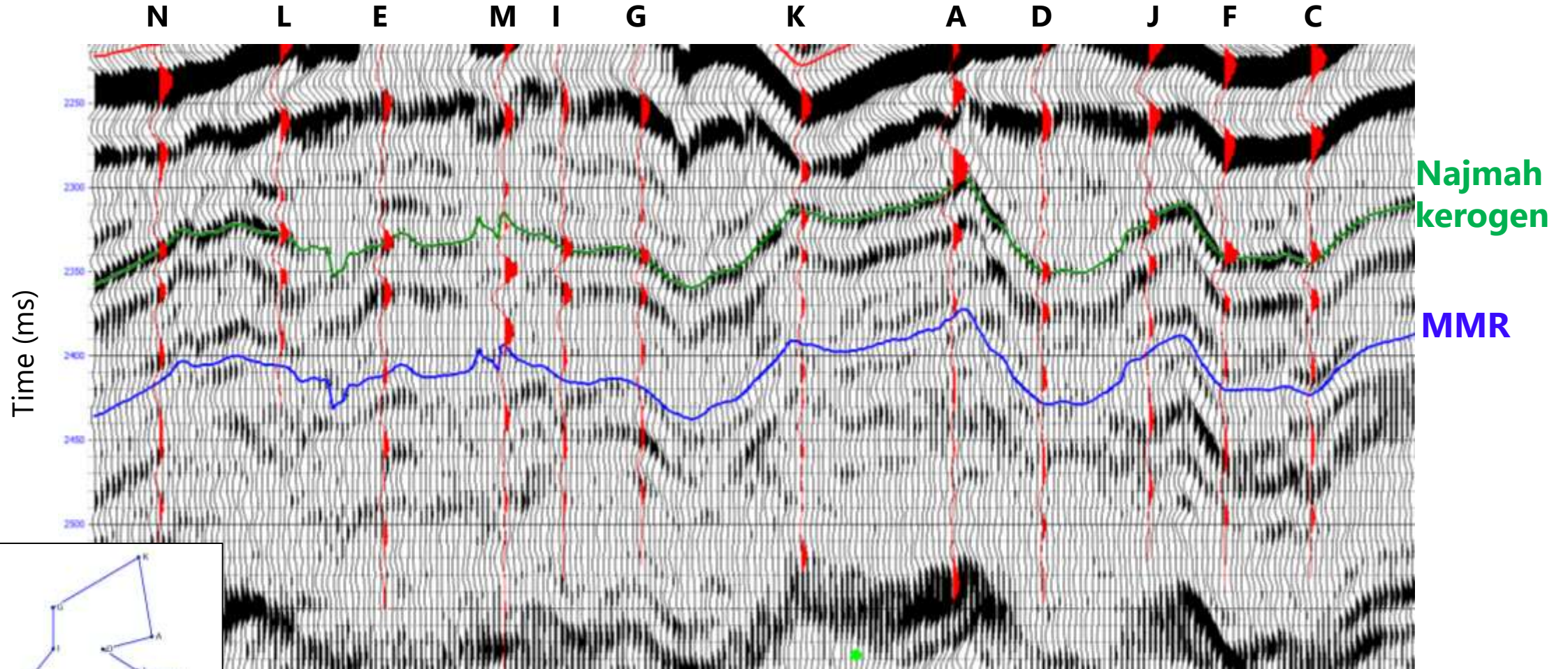


# Wavelet



Statistical wavelet extracted from 2.3 – 2.6 s; phase rotated 180°

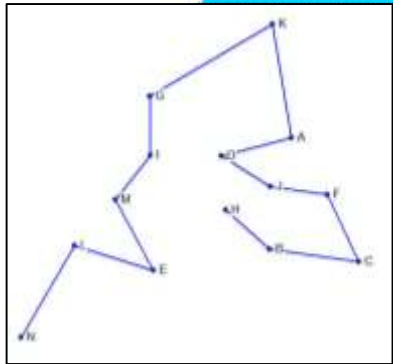
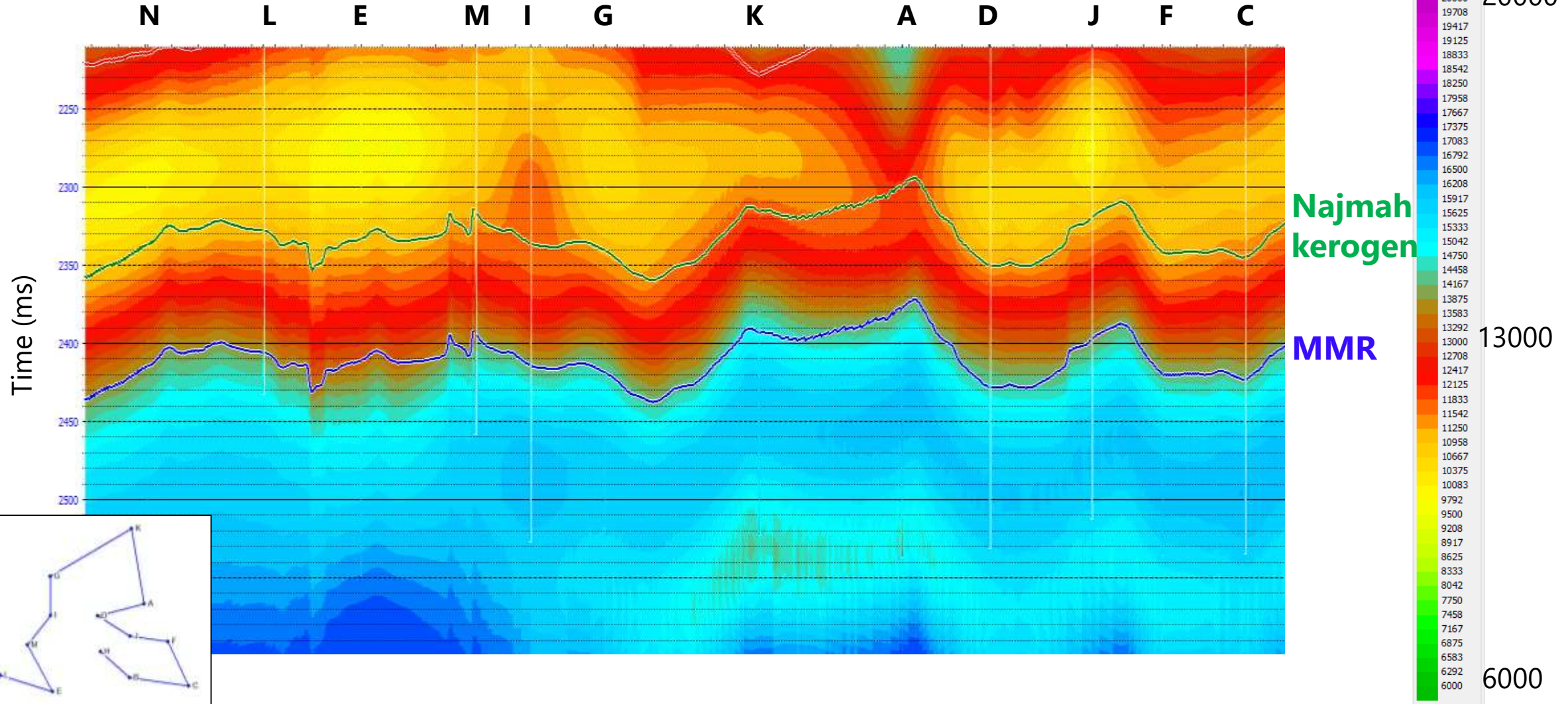
# Seismic Arbitrary Line



Red trace : synthetic trace

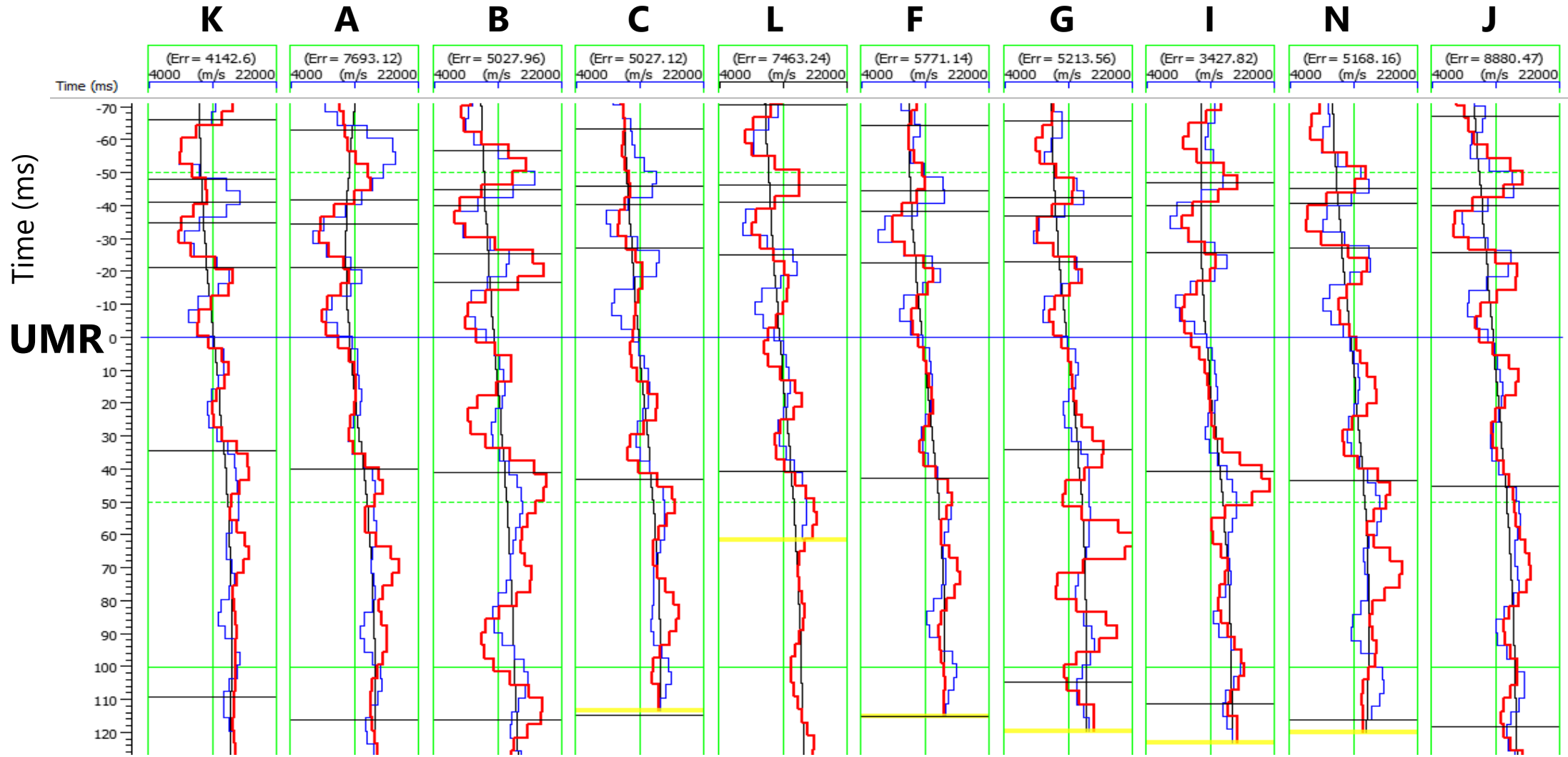


# Acoustic Impedance Background Model



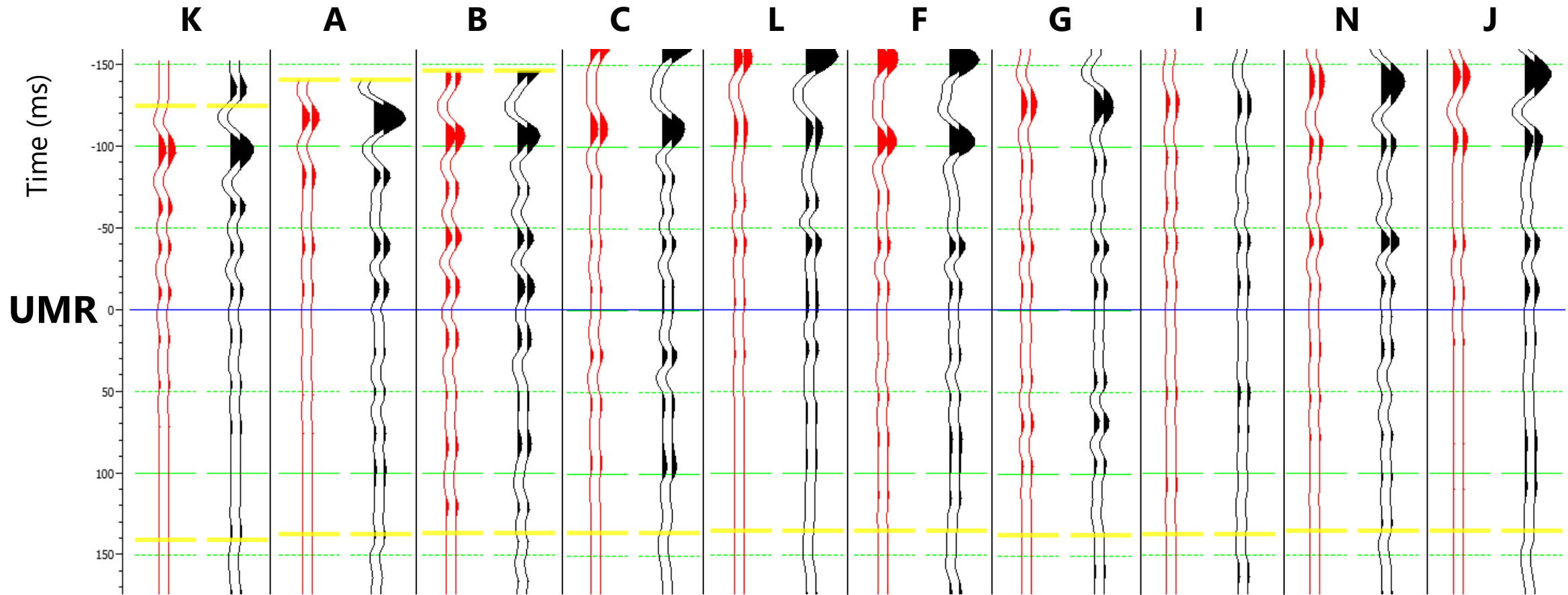
Frequency high cut = 5 - 10 Hz

# Inversion Analysis



— Background model    
 — Filtered well log    
 — Inversion

# Inverted Prediction and Field Data Comparison

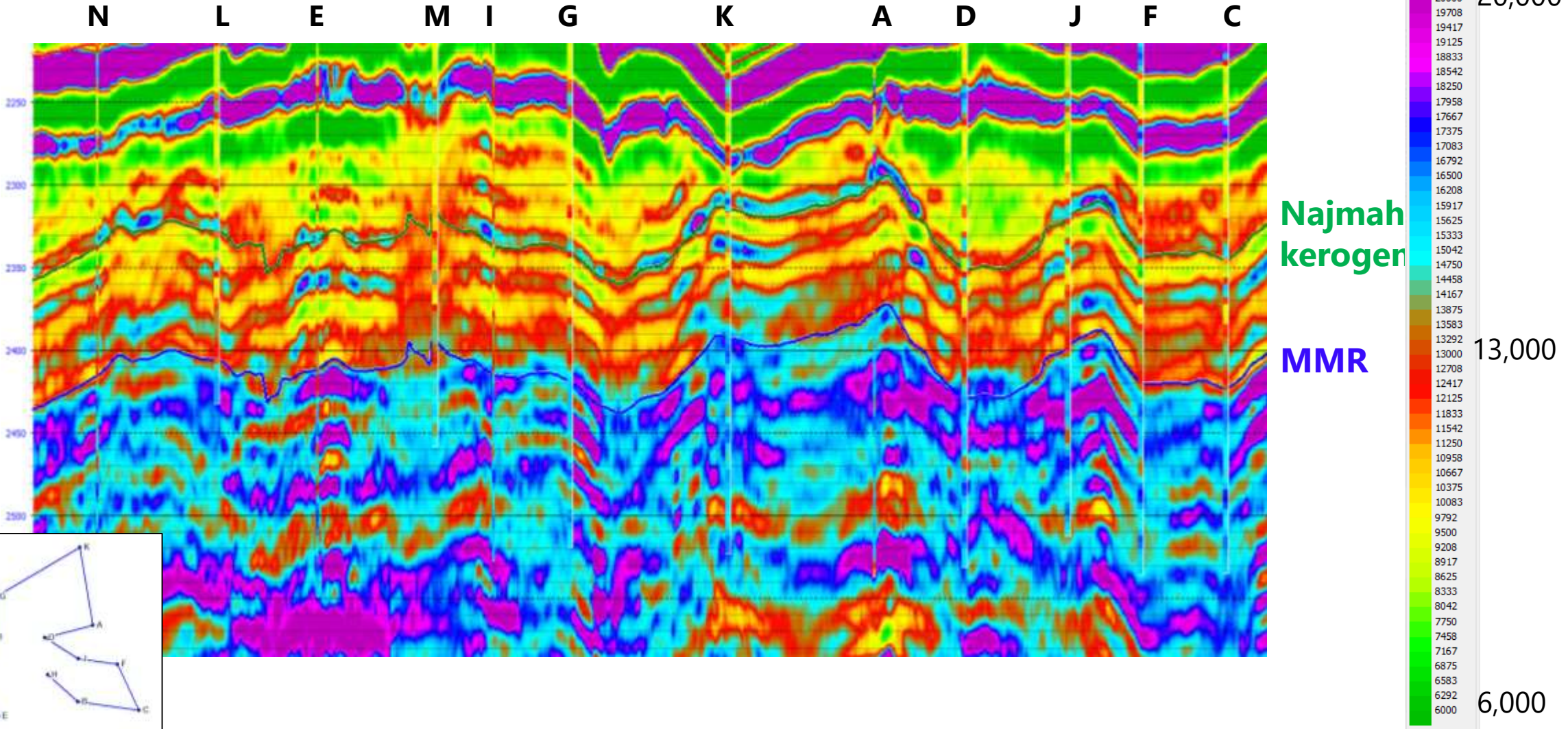


— Seismic data

— Inverted prediction



# Acoustic Impedance Inversion



# Summary

- Based on the 2D ray tracing model, the higher incident angle waves ( $> 40^\circ$ ) may never be able to reach the reservoir interval
- Multiple and converted waves also add challenges on the imaging of high angle of incidence
- Based on rock physics cross-plots, acoustic impedance and density are good indicators of the porous zone in middle Marrat
- The seismic inversion is dominated by the high amplitude of Gotnia and Najmah kerogen intervals. An inversion focused on Marrat interval will be needed in the future work



RESERVOIR CHARACTERIZATION PROJECT

# New KOC Raudhatain Field Projects

*Nadima Dwihusna and Liwei Cheng*

*November 14<sup>th</sup>, 2019*



COLORADOSCHOOLOFMINES

# Outline

- 💧 New KOC Dataset
- 💧 Project 1: Facies Inversion through Machine Learning
- 💧 Project 2: Multiple Attenuation

# Outline

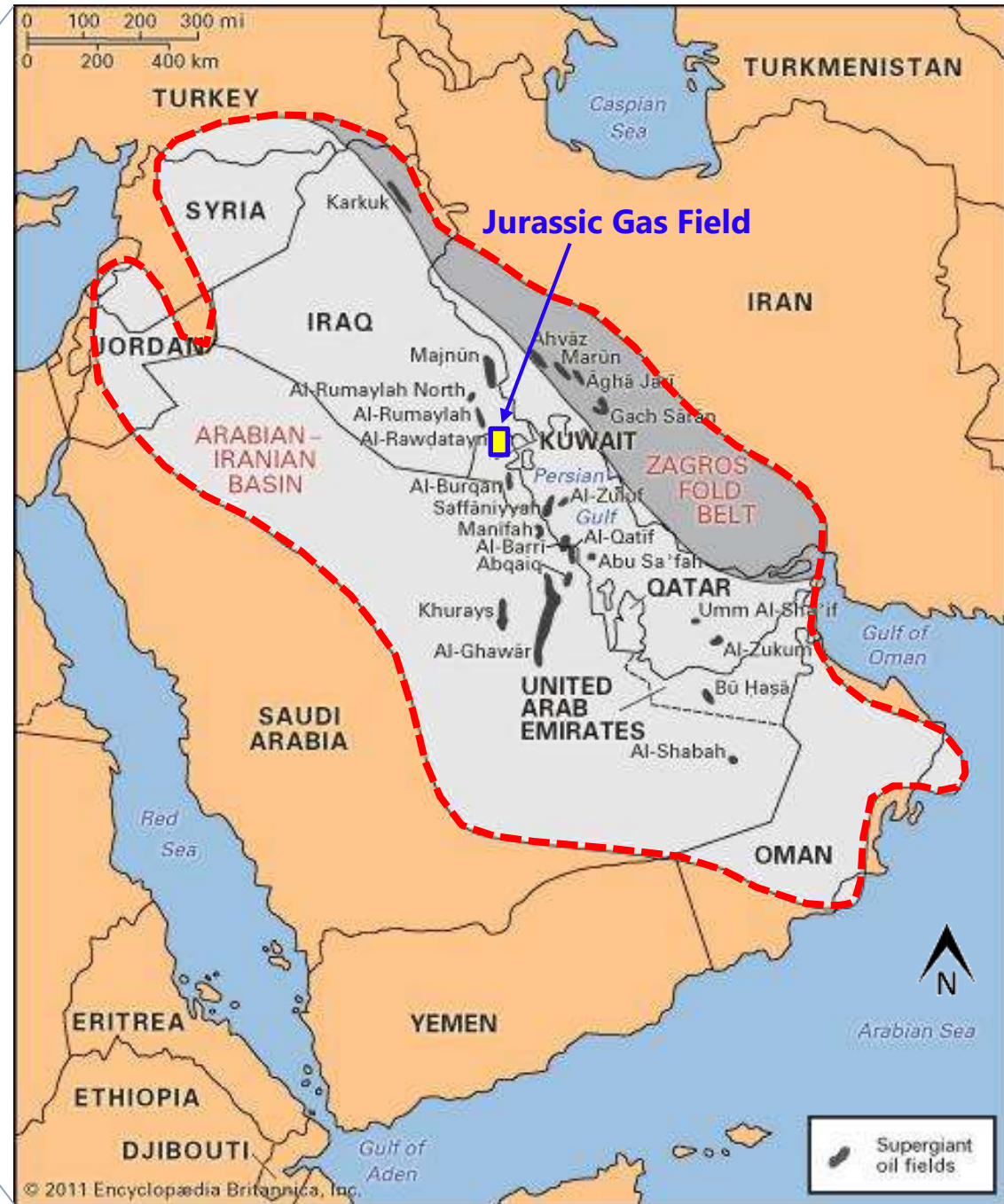
- 💧 **New KOC Dataset**
- 💧 Project 1: Facies Inversion through Machine Learning
- 💧 Project 2: Multiple Attenuation



# Location



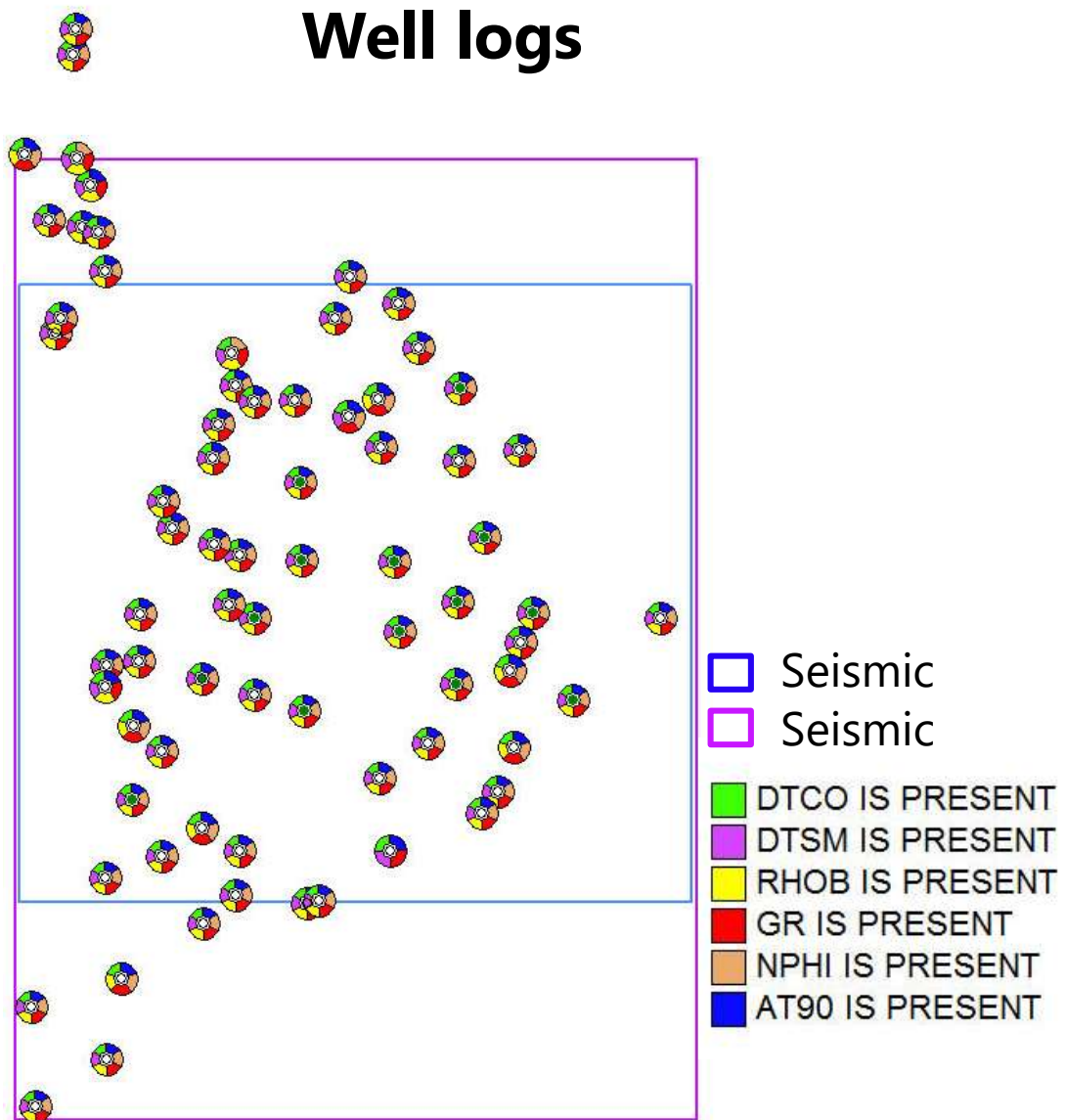
Source: <http://www.freeworldmaps.net>



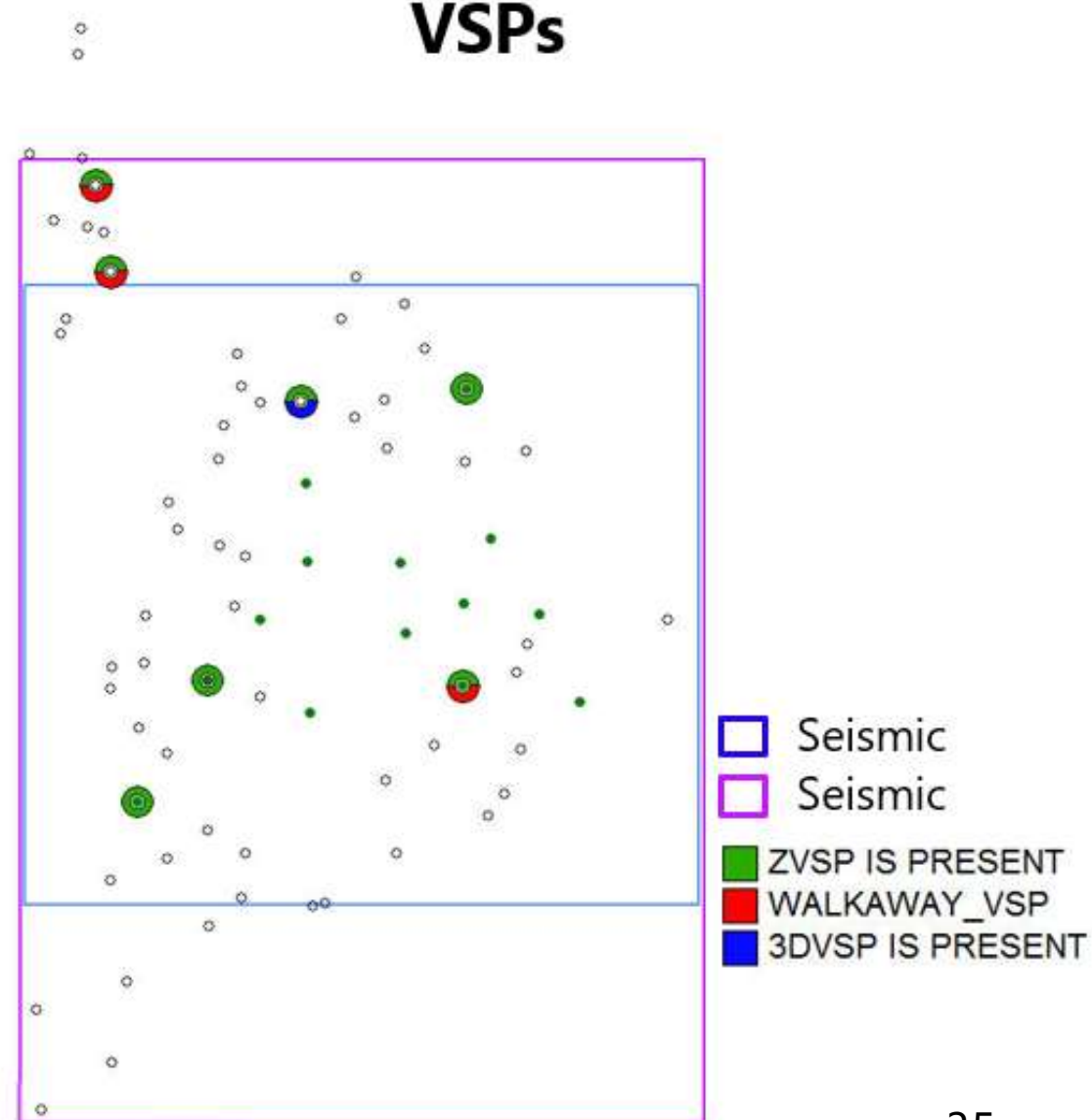


# New Data

## Well logs



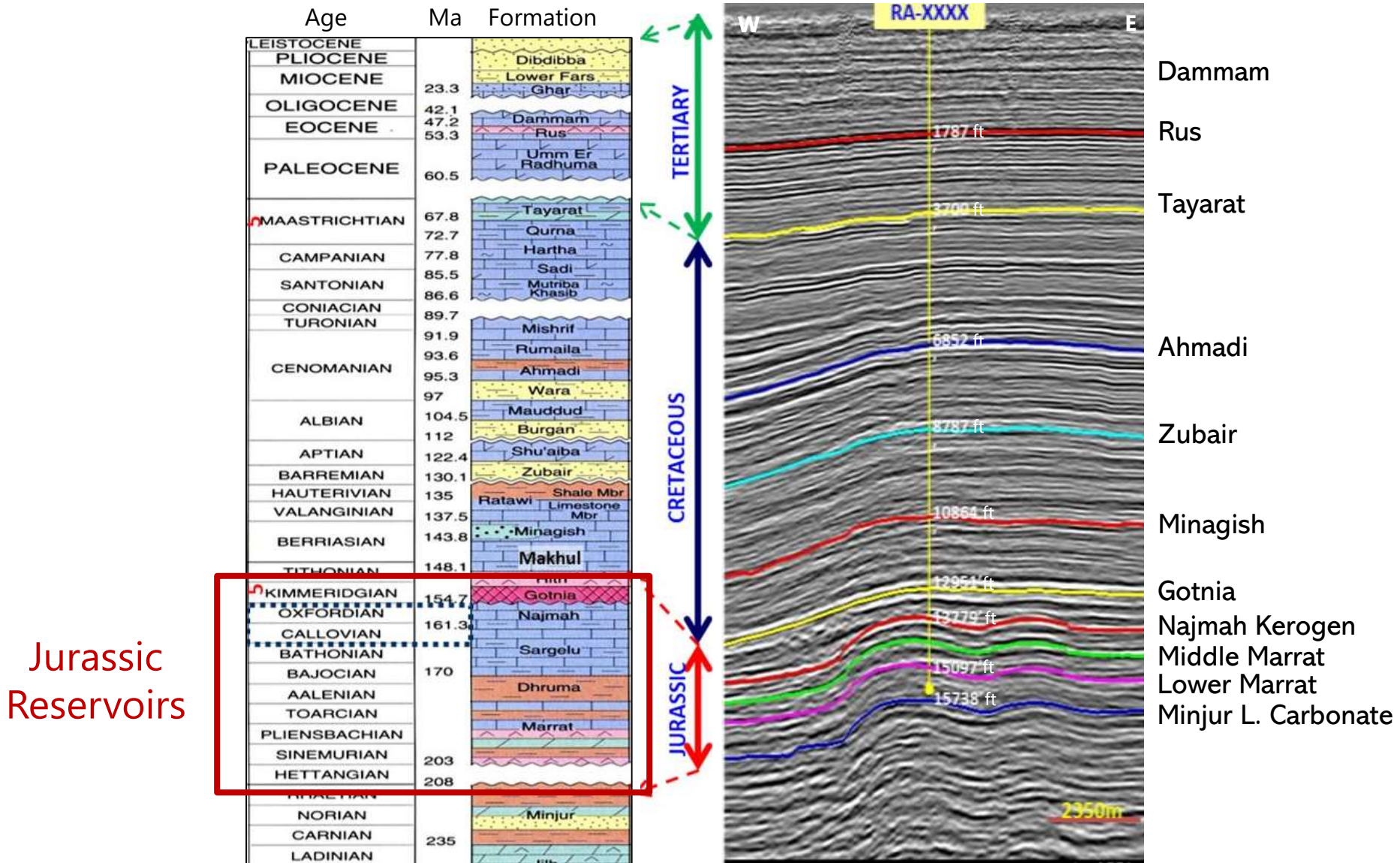
## VSPs



# Outline

- 🔹 New KOC Dataset
- 🔹 **Project 1: Facies Inversion through Machine Learning**
- 🔹 Project 2: Multiple Attenuation

# Generalized Stratigraphy and Seismic Section



Source: KOC







## 💧 Seismic resolution at depths

- Identify and map the internal facies variation within Gotnia and Najmah and propagation of Facies in 3D using ML
- Conventional inversion workflows

## 💧 Reservoir characterization

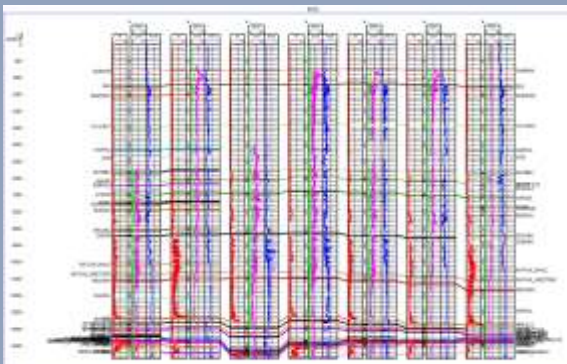
- Better understanding of depositional setting, fractures, and facies
- Facies variation within highly pressurized HP/HT overburden (Salt-Anhydrite) with limestone stringers

# Objective

- Develop Machine Learning facies inversion workflow for mapping of reservoirs

## Step 1

Apply ML in well logs for facies inversion

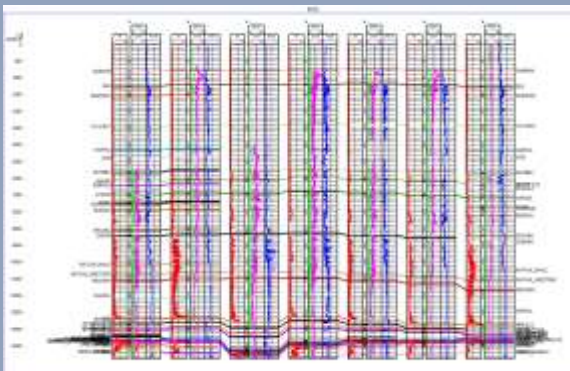


# Objective

- Develop Machine Learning facies inversion workflow for mapping of reservoirs

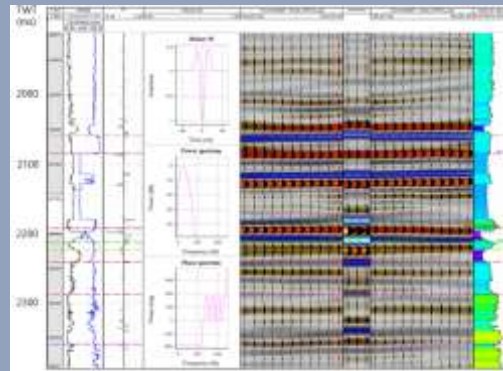
## Step 1

Apply ML in well logs for facies inversion



## Step 2

Apply ML on seismic trace surrounding each well as a new feature

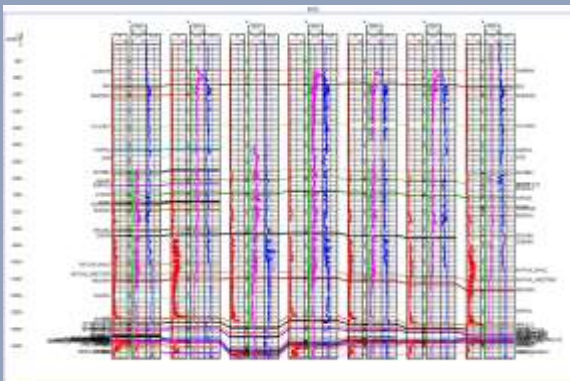


# Objective

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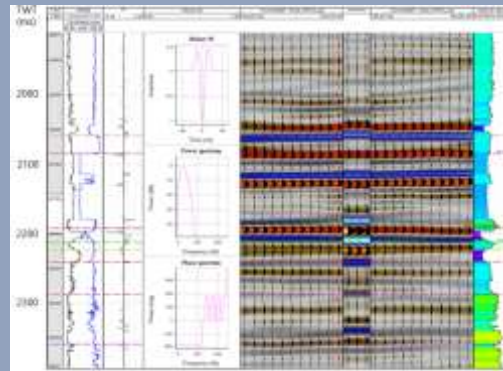
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Apply ML in well logs for facies inversion



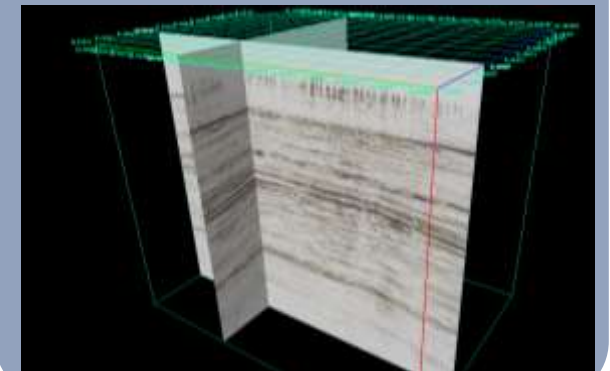
## Step 2

Apply ML on seismic trace surrounding each well as a new feature



## Step 3

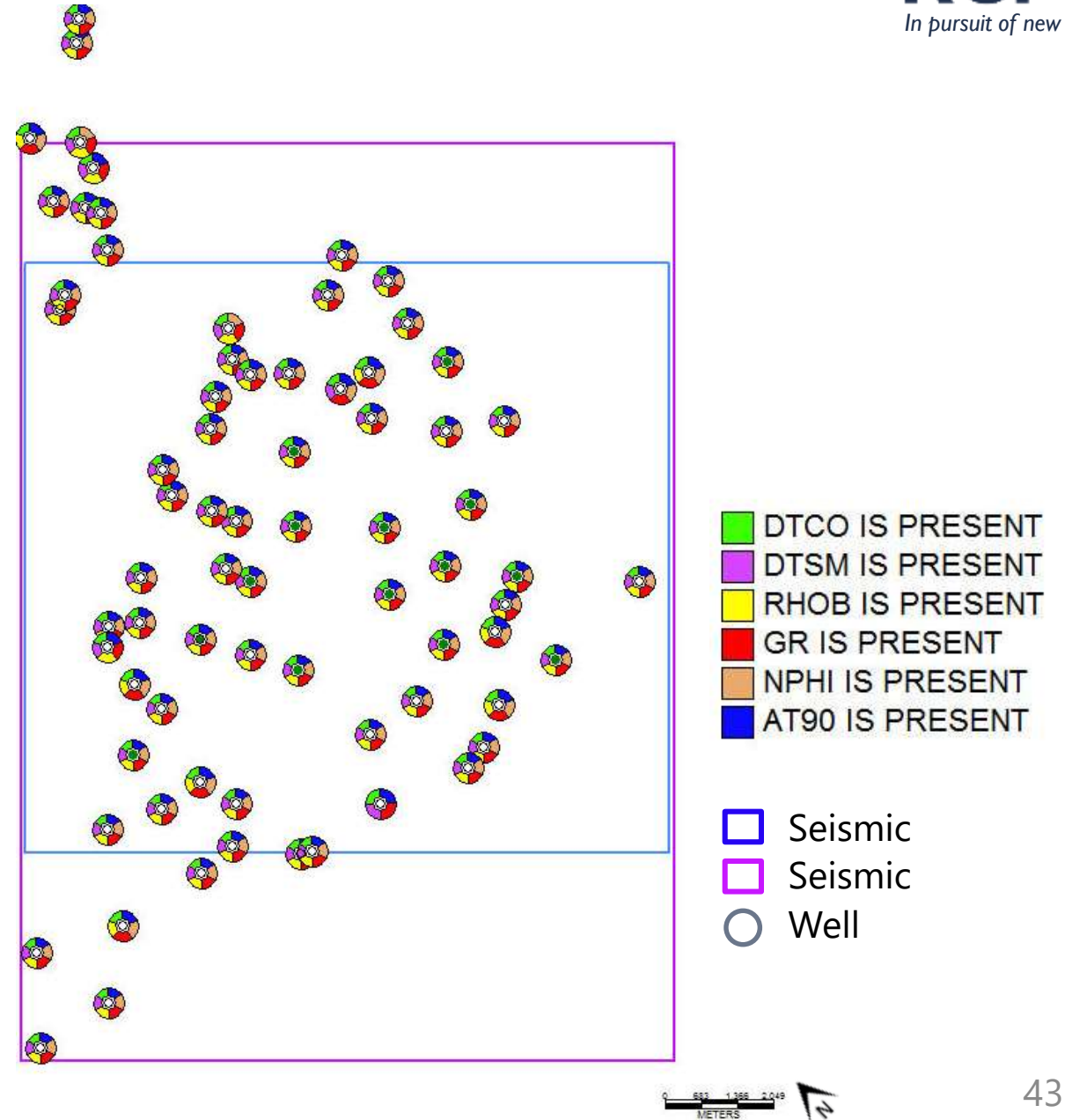
Utilize final ML facies inversion algorithm for entire seismic volume





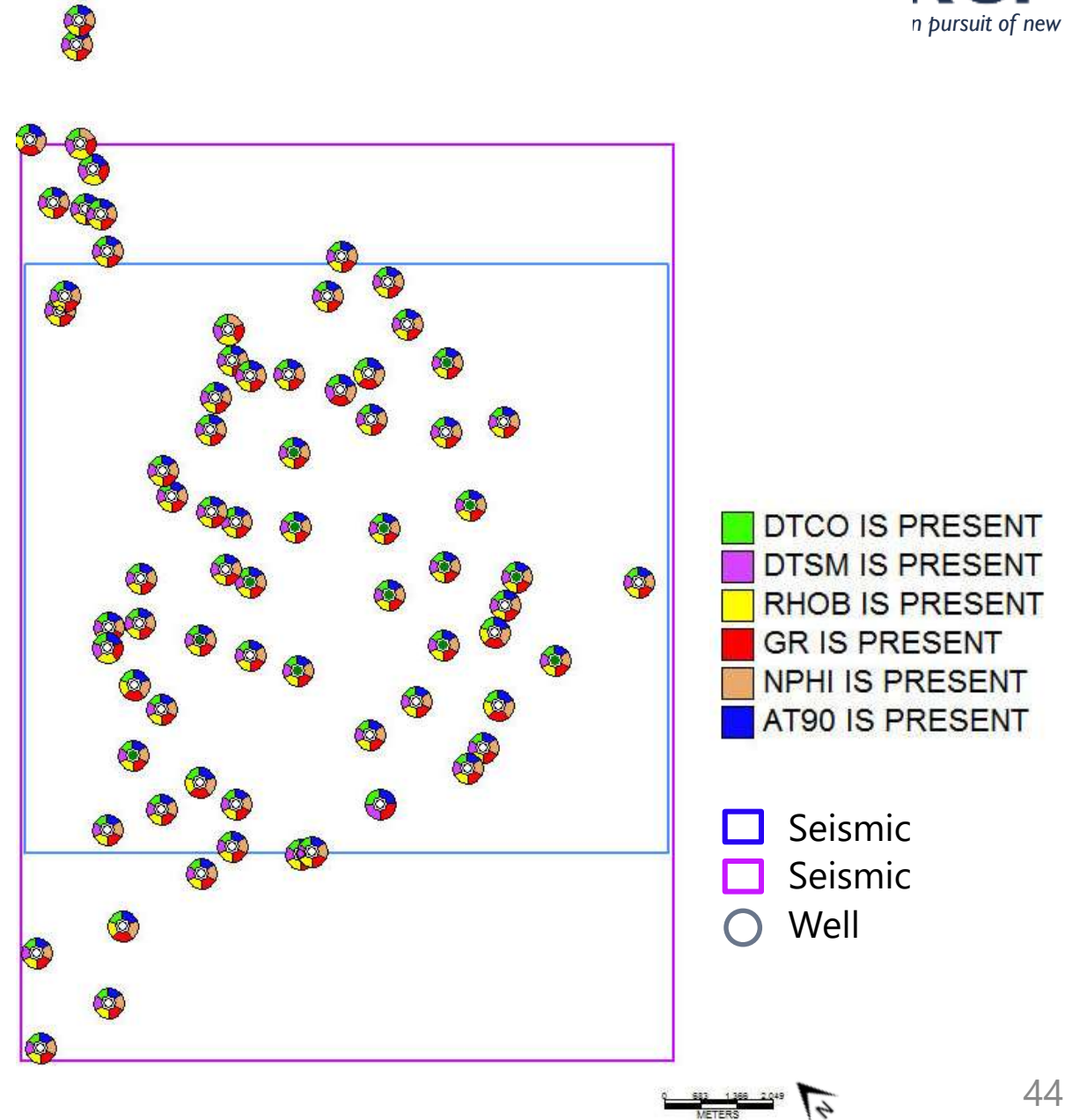
# Well Log Dataset

💧 Total of 76 wells



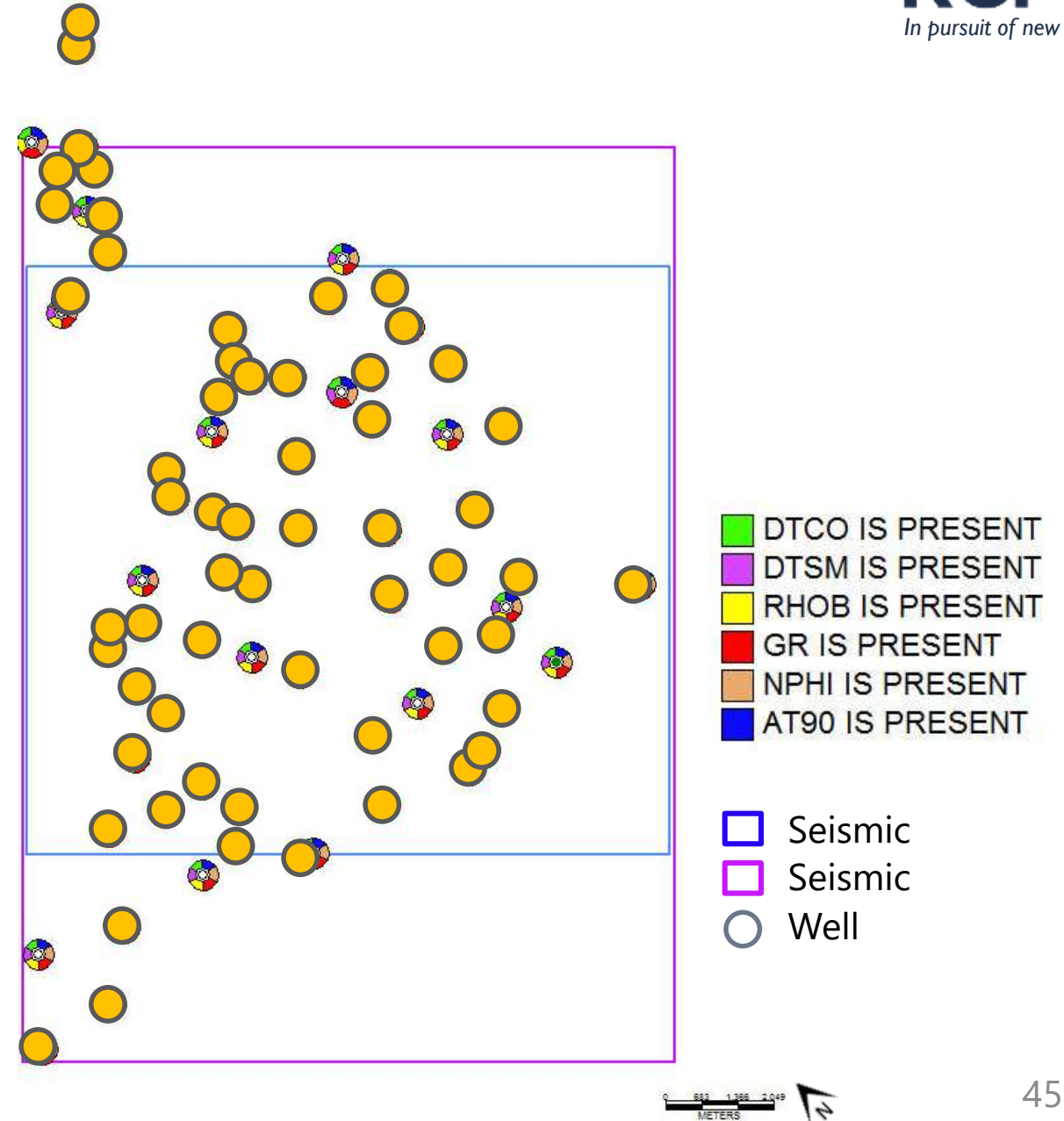
# Well Log Dataset

💧 Total of 76 wells



# Well Log Dataset

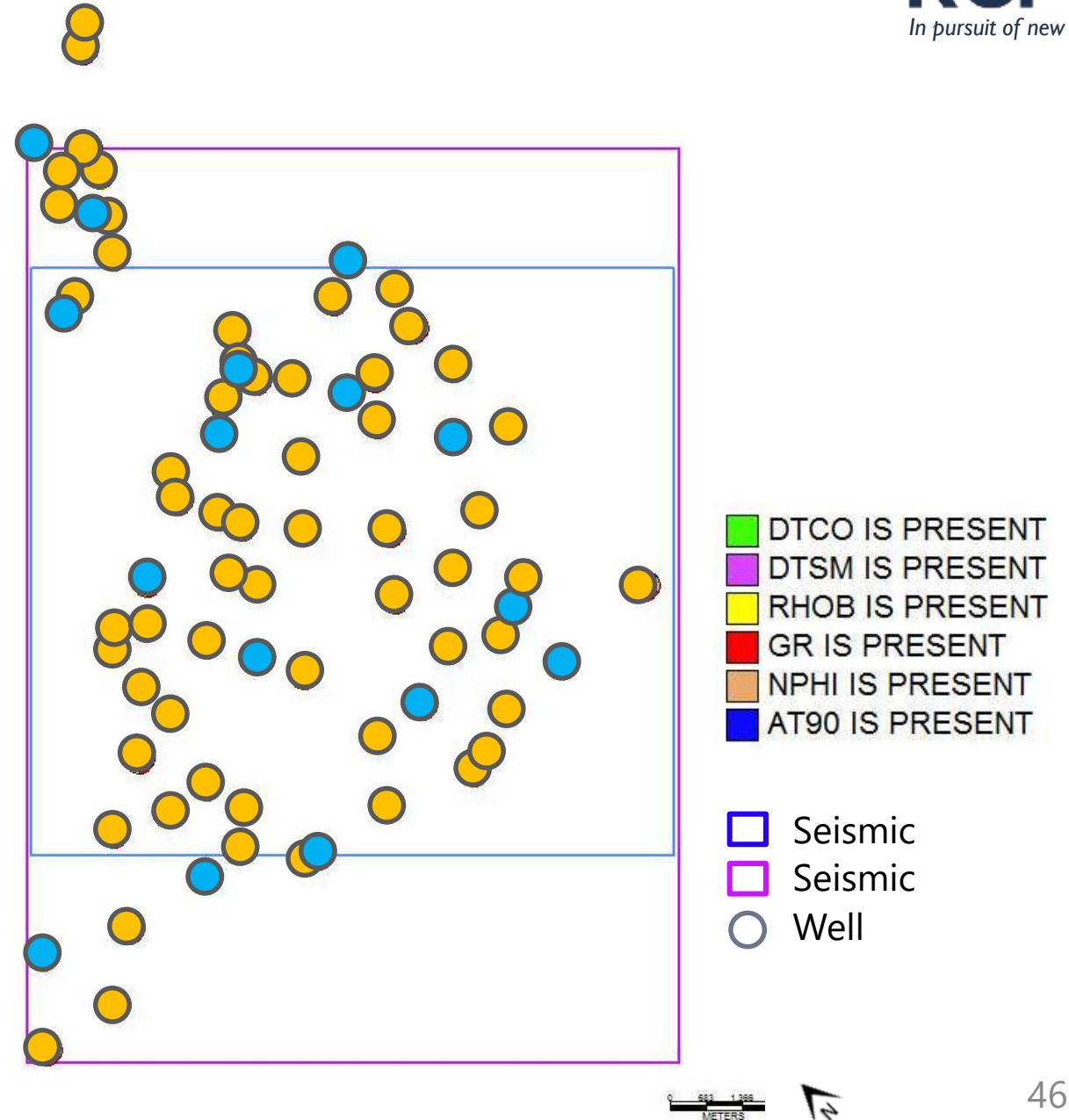
- Total of 76 wells
  - 60 Training Well (80%)



# Well Log Dataset

## 💧 Total of 76 wells

- 60 Training Well (80%)
- 16 Blind Test Well (20%)

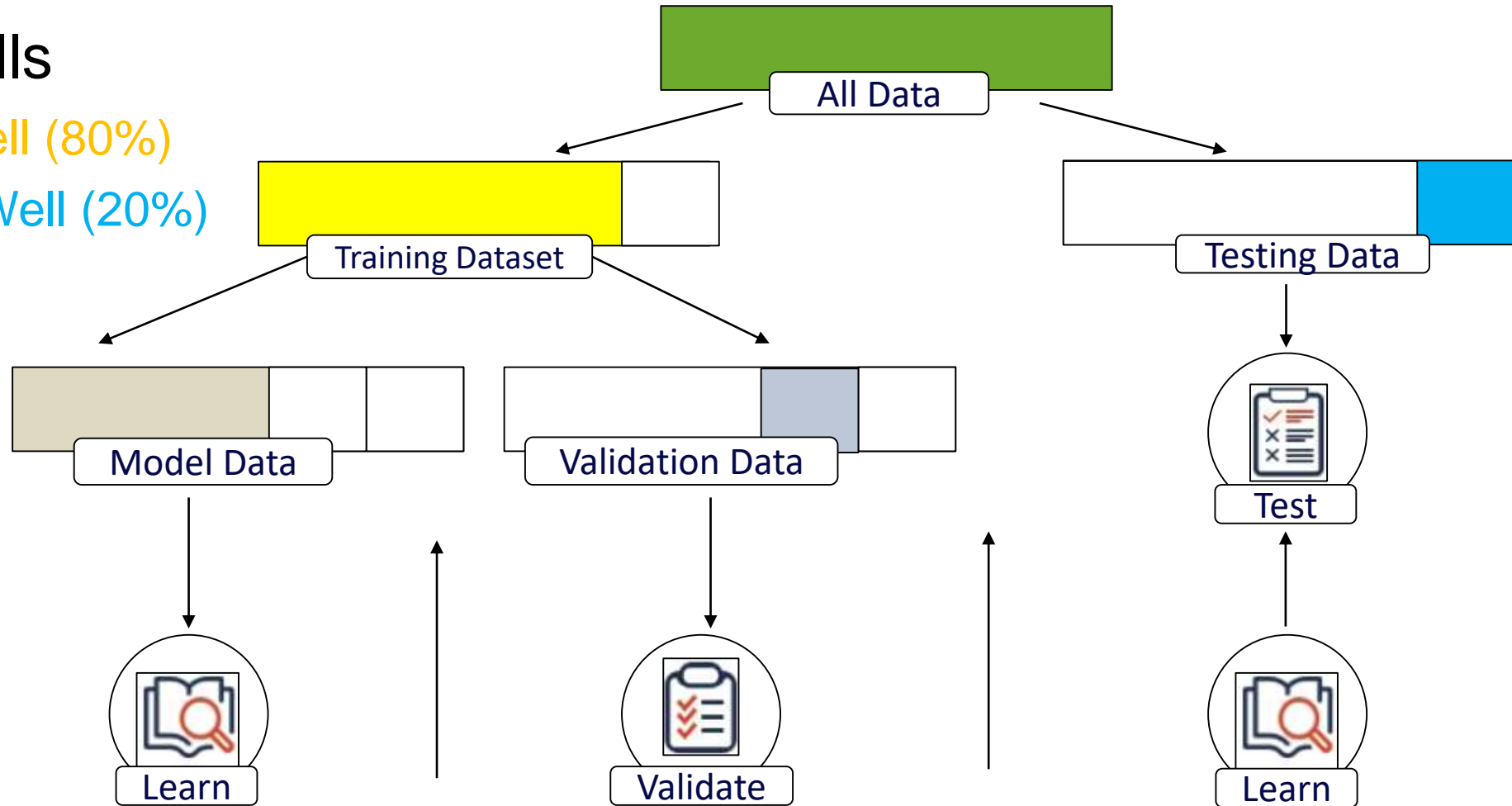
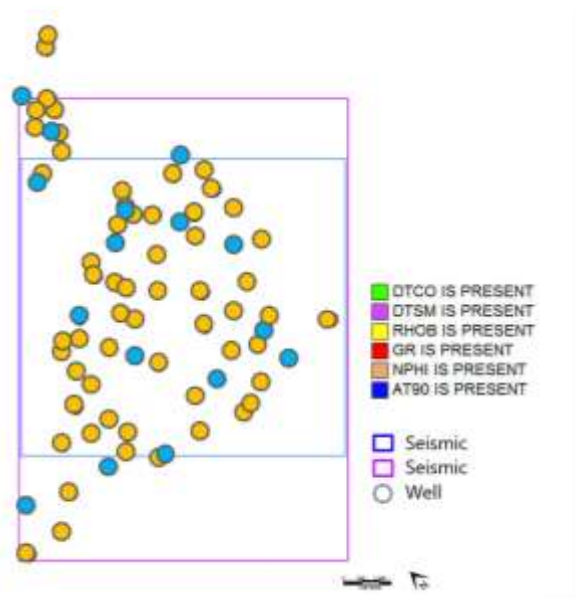




# Well Log Dataset

💧 Total of 76 wells

- 60 Training Well (80%)
- 16 Blind Test Well (20%)



# Log Measurements

## 18 Formations

1. Dammam
2. Rus
3. Tayarat
4. Ahmadi
5. Wara
6. Mauddud
7. Burgan
8. Shubaiba
9. Zubair
10. Ratawi
11. Minagish
12. Makhul
13. Hith
14. Gotnia
15. Najmah
16. Sargelu
17. Dhurma
18. Marrat

Well Name	MD	AT10	AT20	AT30	AT60	AT90	BS	DTCO	DTSM	GR	LCAL	RHOB	TNPH
RA-XXX	6375.0	2.5215	0.8217	1.4122	1.4514	0.9376	22.00	58.5373	105.5745	10.0984	28.1590	-9999.0	-9999.0
RA-XXX	6375.5	2.5495	0.8689	1.4357	1.5383	1.0280	22.00	58.5298	105.6357	9.4572	28.0553	-9999.0	-9999.0
RA-XXX	6376.0	2.4921	0.9219	1.4327	1.1811	0.9183	22.00	58.5510	108.0674	10.7395	25.9980	-9999.0	-9999.0
RA-XXX	6376.5	3.1600	1.0835	2.0672	1.3989	1.0125	22.00	58.6967	108.9381	13.0237	25.9223	-9999.0	-9999.0
RA-XXX	6377.0	1.5874	0.7683	1.1848	1.1985	0.8125	22.00	58.9838	108.1616	14.6268	25.8667	-9999.0	-9999.0
...	...	...	...	...	...	...	...	...	...	...	...	...	...

## Well Log Features

# Log Measurements

## Wireline Log Abbreviations

<b>MD (F)</b>	: Measured Depth
<b>BS (IN)</b>	: Bit Size
<b>GR (GAPI)</b>	: Gamma Ray
<b>HCAL (IN)</b>	: HRCC Caliper
<b>NPHI (V/V)</b>	: Neutron Porosity
<b>RT (OHMM)</b>	: True Resistivity
<b>AT10 (OHMM)</b>	: Resistivity A10
<b>AT20 (OHMM)</b>	: Resistivity A20
<b>AT30 (OHMM)</b>	: Resistivity A30
<b>AT60 (OHMM)</b>	: Resistivity A60
<b>AT90 (OHMM)</b>	: Resistivity A90
<b>RHOB (G/C3)</b>	: Bulk Density
<b>DTCO (US/F)</b>	: Compressional
<b>DTS (US/F)</b>	: Shear

Well Name	MD	AT10	AT20	AT30	AT60	AT90	BS	DTCO	DTSM	GR	LCAL	RHOB	TNPH
RA-XXX	6375.0	2.5215	0.8217	1.4122	1.4514	0.9376	22.00	58.5373	105.5745	10.0984	28.1590	-9999.0	-9999.0
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...	...	...	...	...	...	...	...	...	...	...	...	...	...

## Well Log Features

# Dataset Processing

## 18 Formations

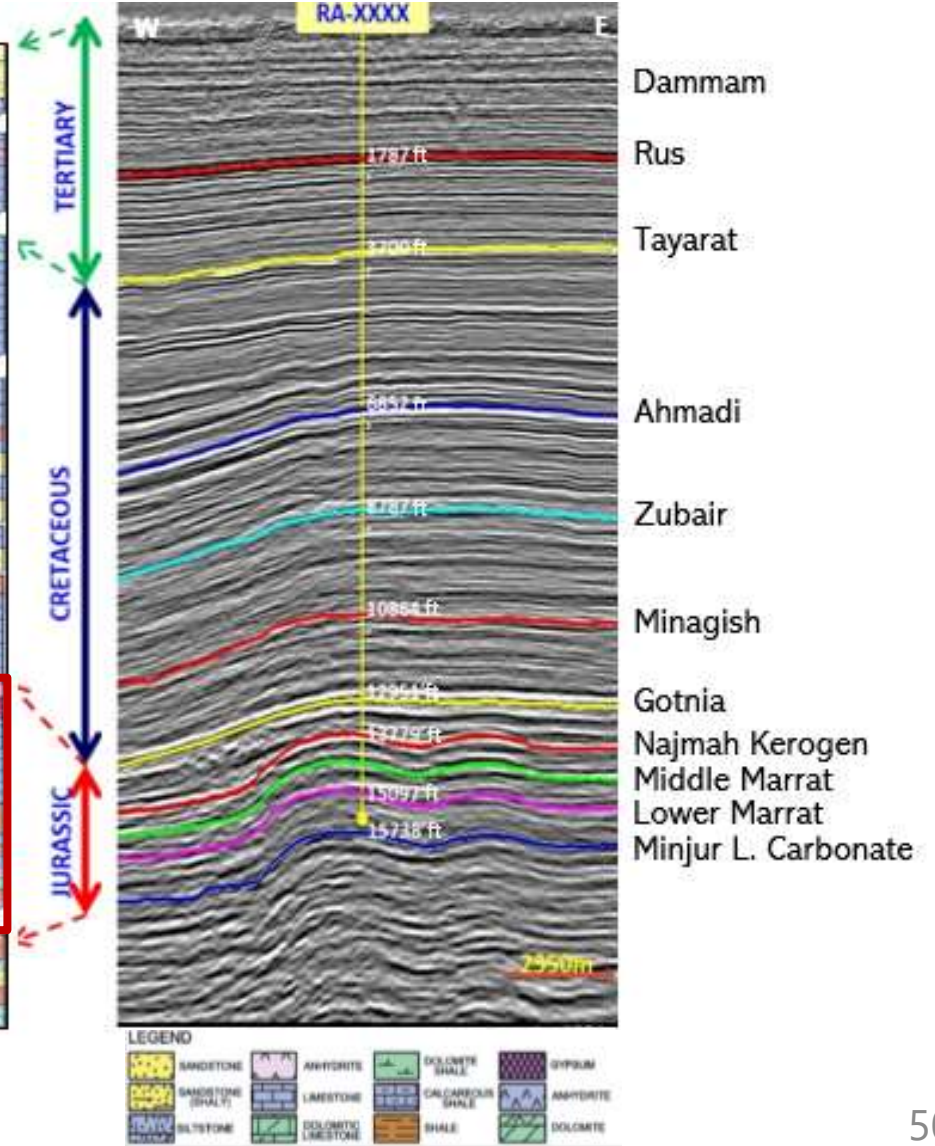
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13. Hith
14. Gotnia
15. Najmah
16. Sargelu
17. Dhurma
18. Marrat

- Evaporite
- Sandstone
- Shale
- Carbonate

Jurassic  
Reservoirs



Source: KOC





# Dataset Processing

## 18 Formations

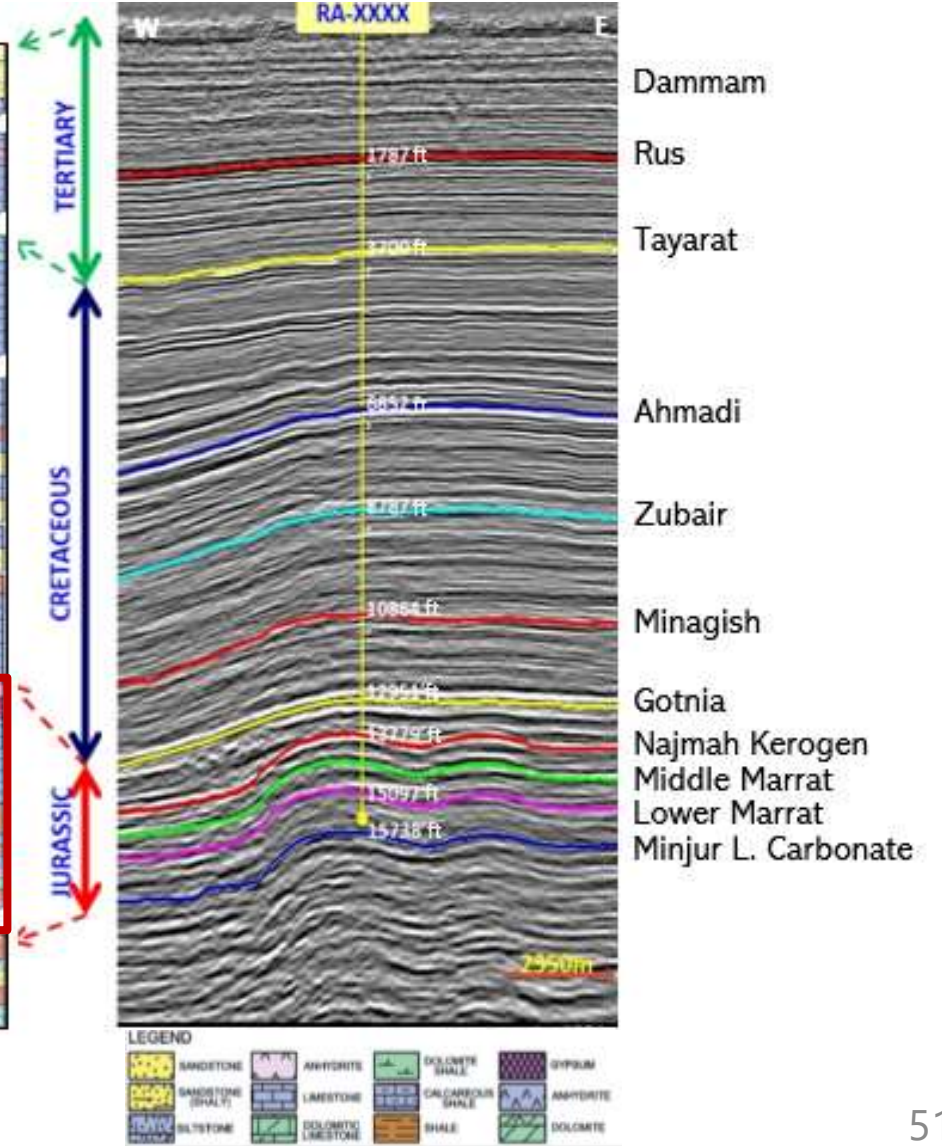
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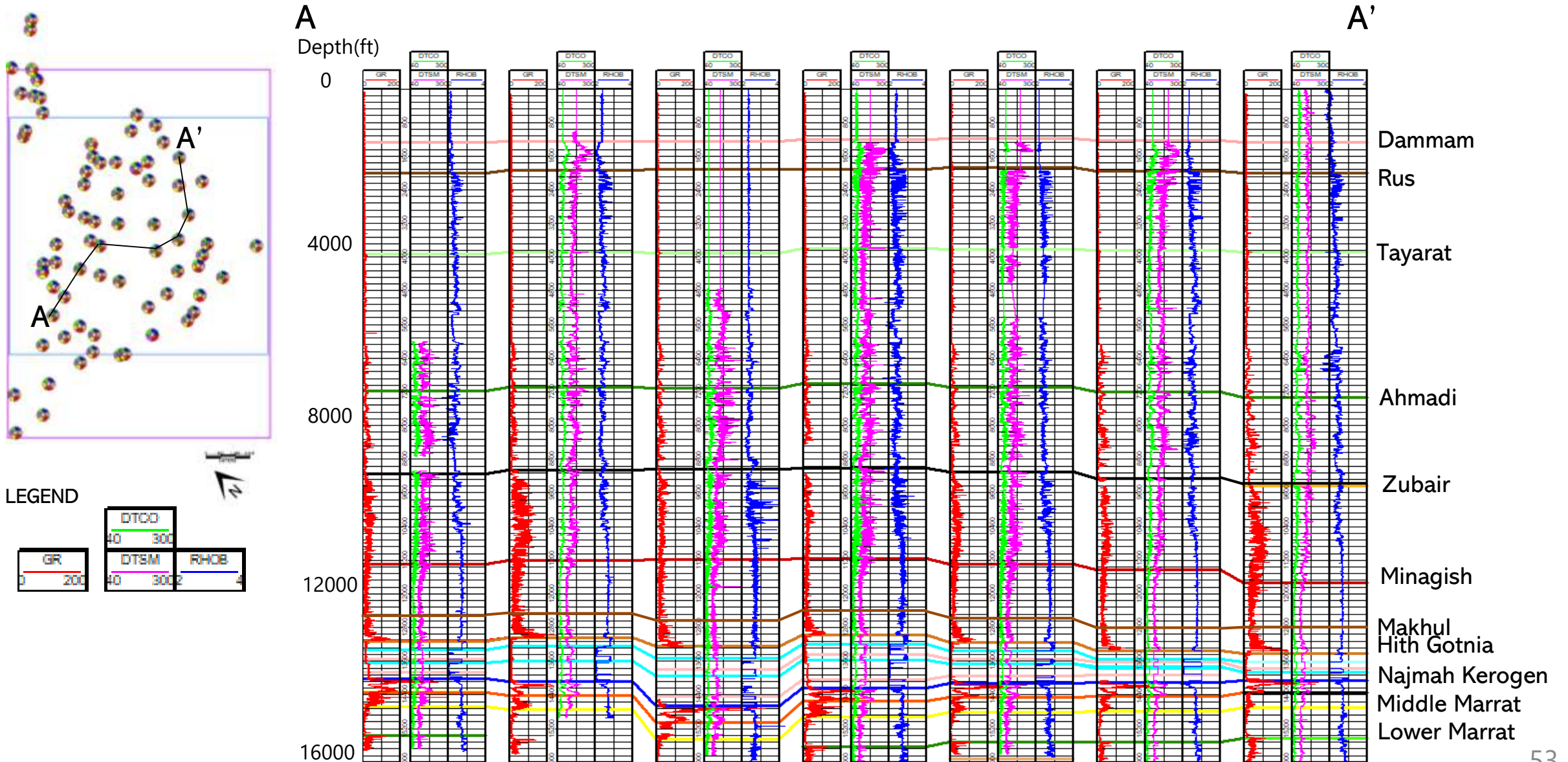
Jurassic  
Reservoirs



Source: KOC

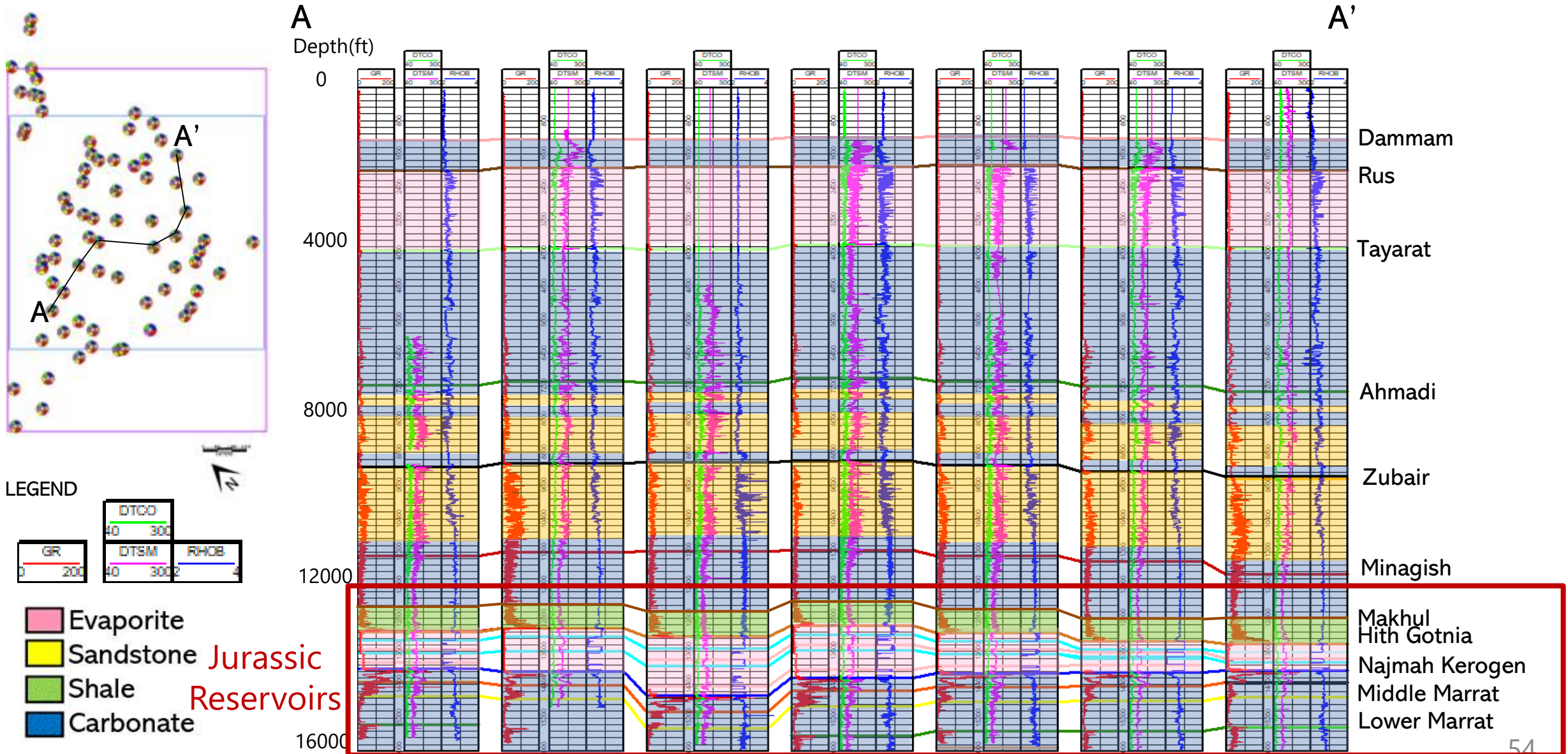


# West to East Cross Section

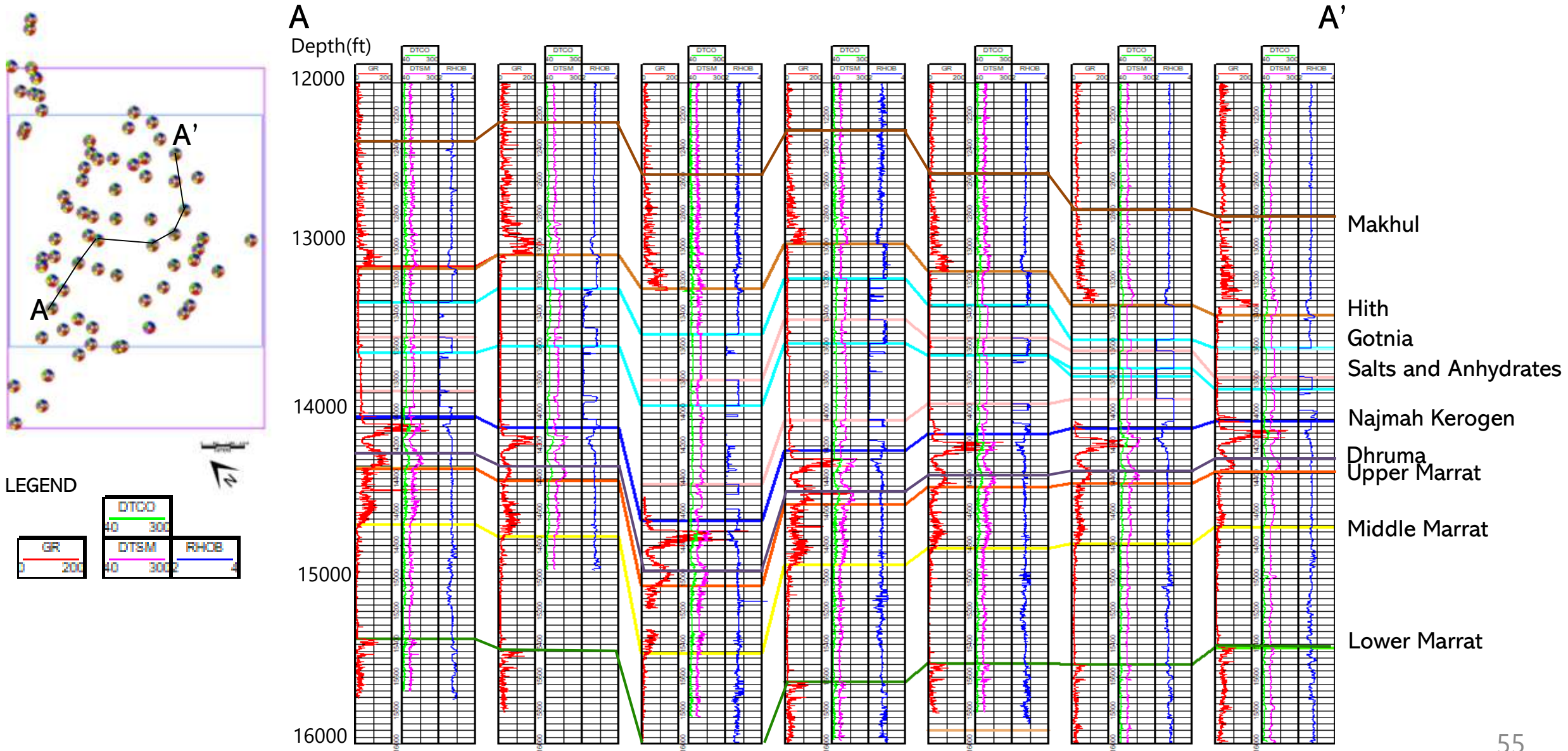




# West to East Cross Section



# West to East Cross Section (Jurassic Reservoirs)



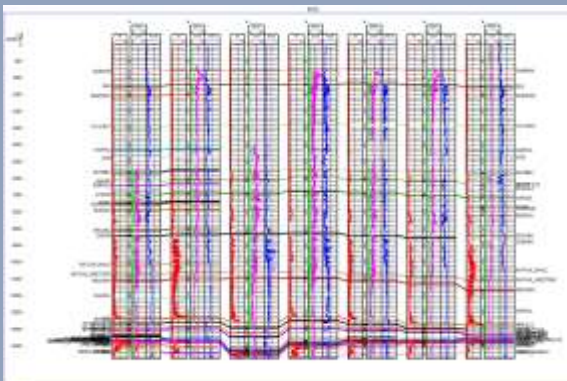


# Objective

- Develop Machine Learning facies inversion workflow for mapping of unconventional reservoirs

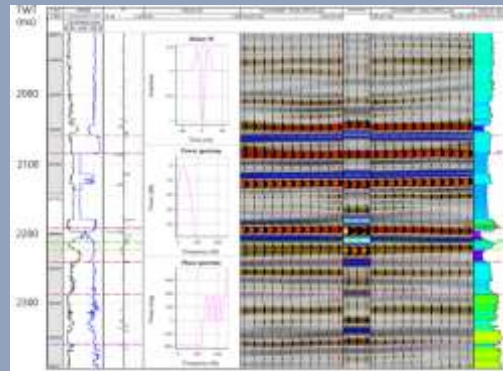
## Step 1

Apply ML in well logs for facies inversion



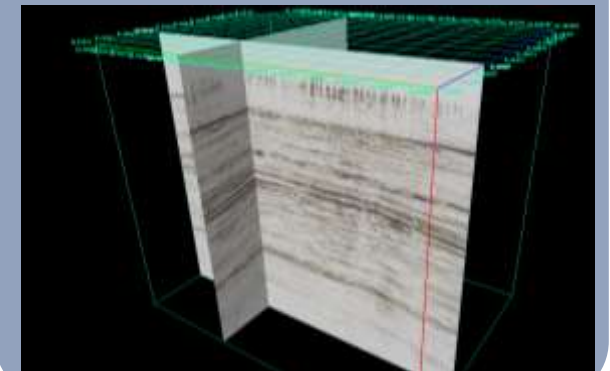
## Step 2

Apply ML on seismic trace surrounding each well as a new feature



## Step 3

Utilize final ML facies inversion algorithm for entire seismic volume



# Objective

- Develop Machine Learning facies inversion workflow for mapping of unconventional reservoirs
- Enhance the resolution at depths by identifying and mapping the internal facies variation
- Optimize reservoir characterization and update geological model with seismic facies from Machine Learning
  - Support complex well designs/profiles
  - Facilitate casing and well placement in the Jurassic reservoir
  - Reduce HSE risk

# Outline

- 💧 New KOC Dataset
- 💧 Project 1: Facies Inversion through Machine Learning
- 💧 **Project 2: Multiple Attenuation**

# Objectives

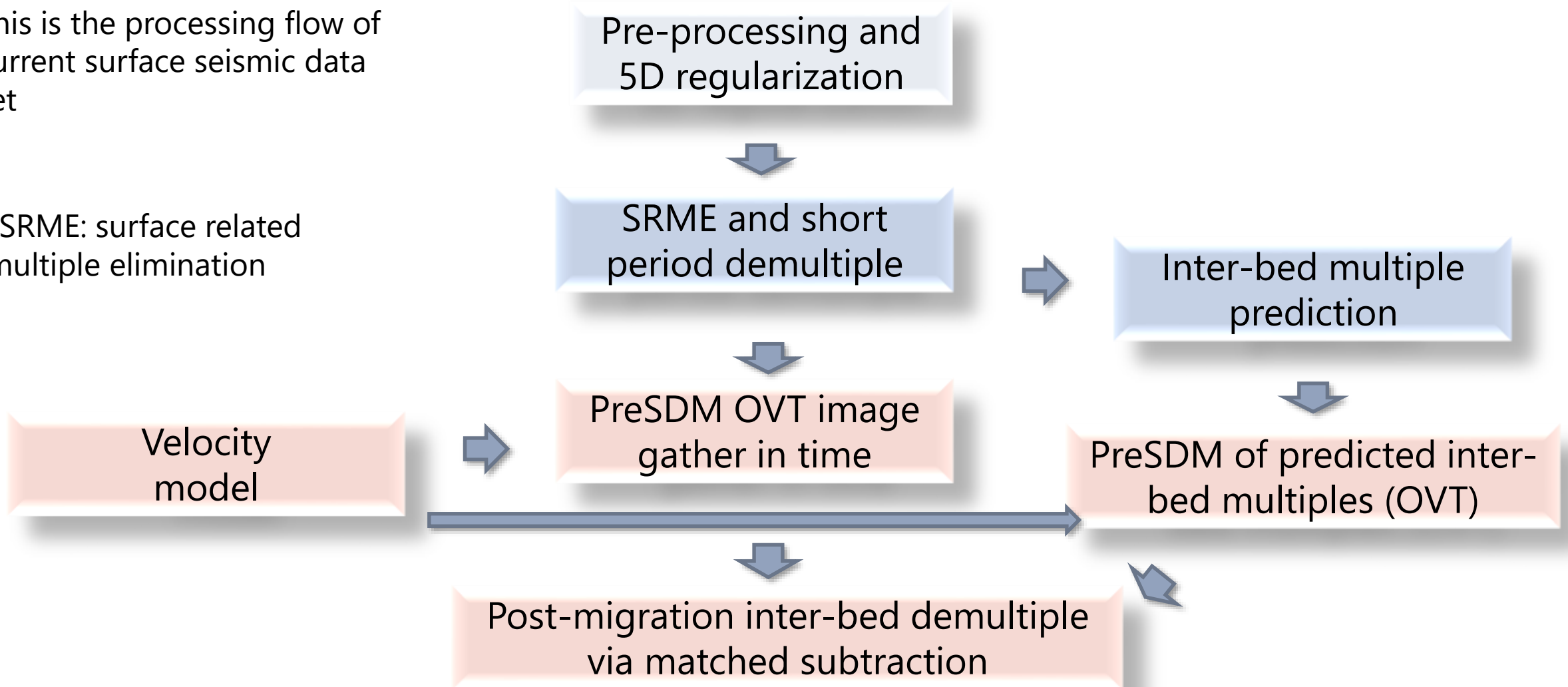
- Understand and predict the inter-bed multiples generated from the high velocity and high impedance contrast overburden layers
- Evaluate the multiple attenuation methods used in the industry
- Attenuate inter-bed multiples and improve imaging at deep Jurassic reservoir intervals
- If possible, characterize fractures from the multiple-attenuated seismic data for the reservoir development



# Demultiple-related Processing Flow

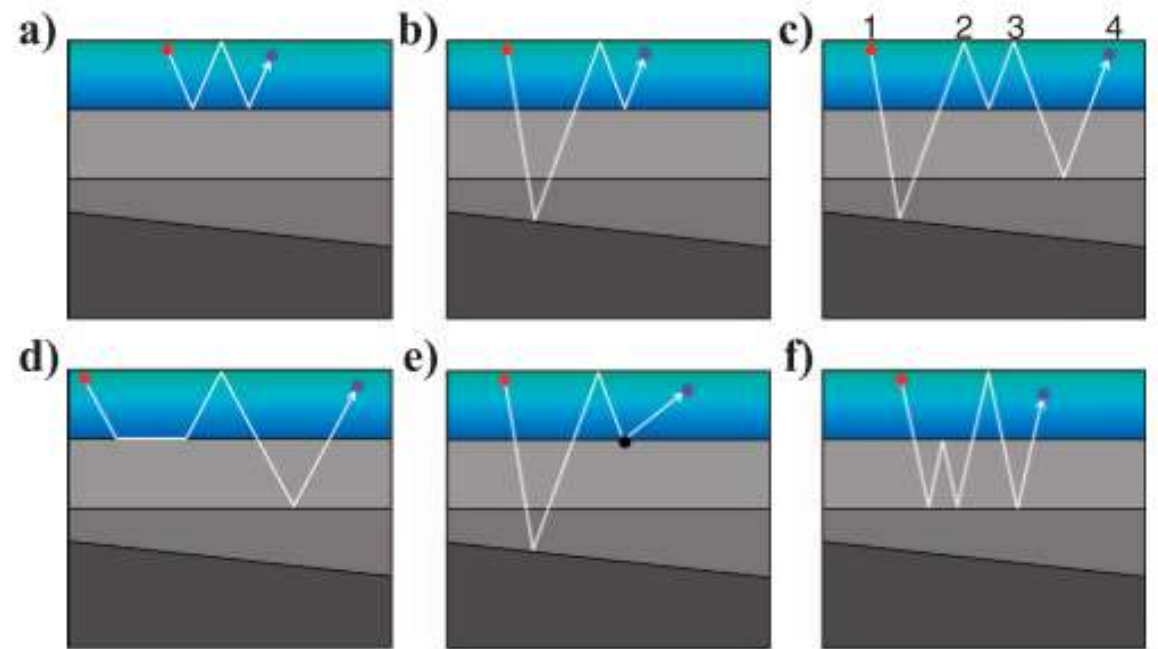
This is the processing flow of current surface seismic data set

\*SRME: surface related multiple elimination



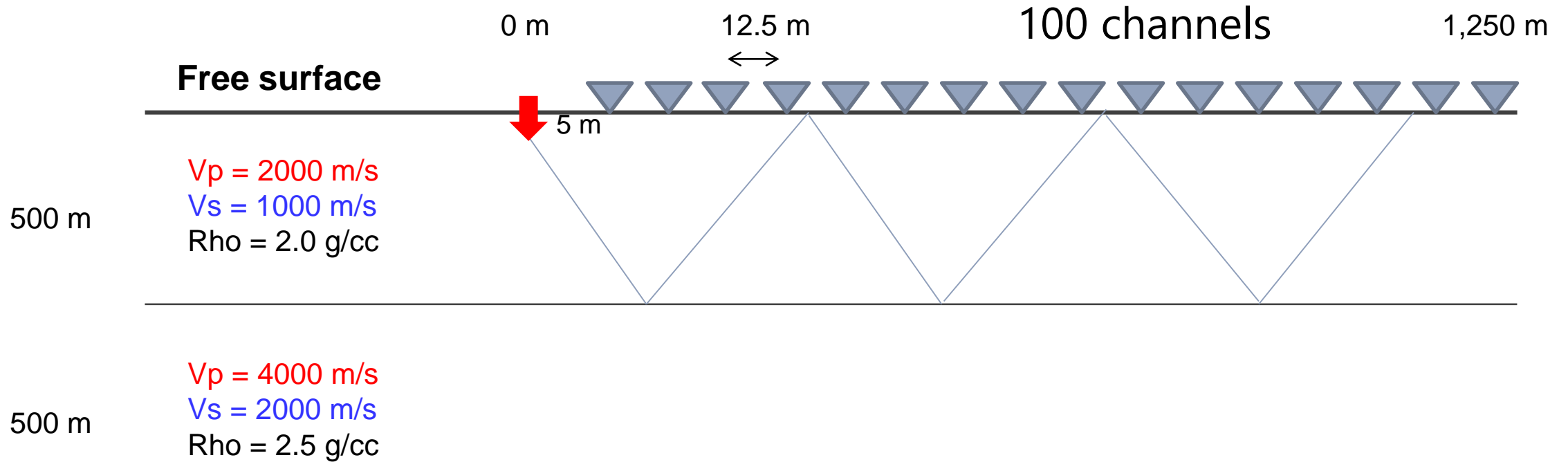
# Surface Related Multiple Elimination (SRME)

- 🔹 Data driven surface-related multiple prediction
- 🔹 Adaptive multiple subtraction



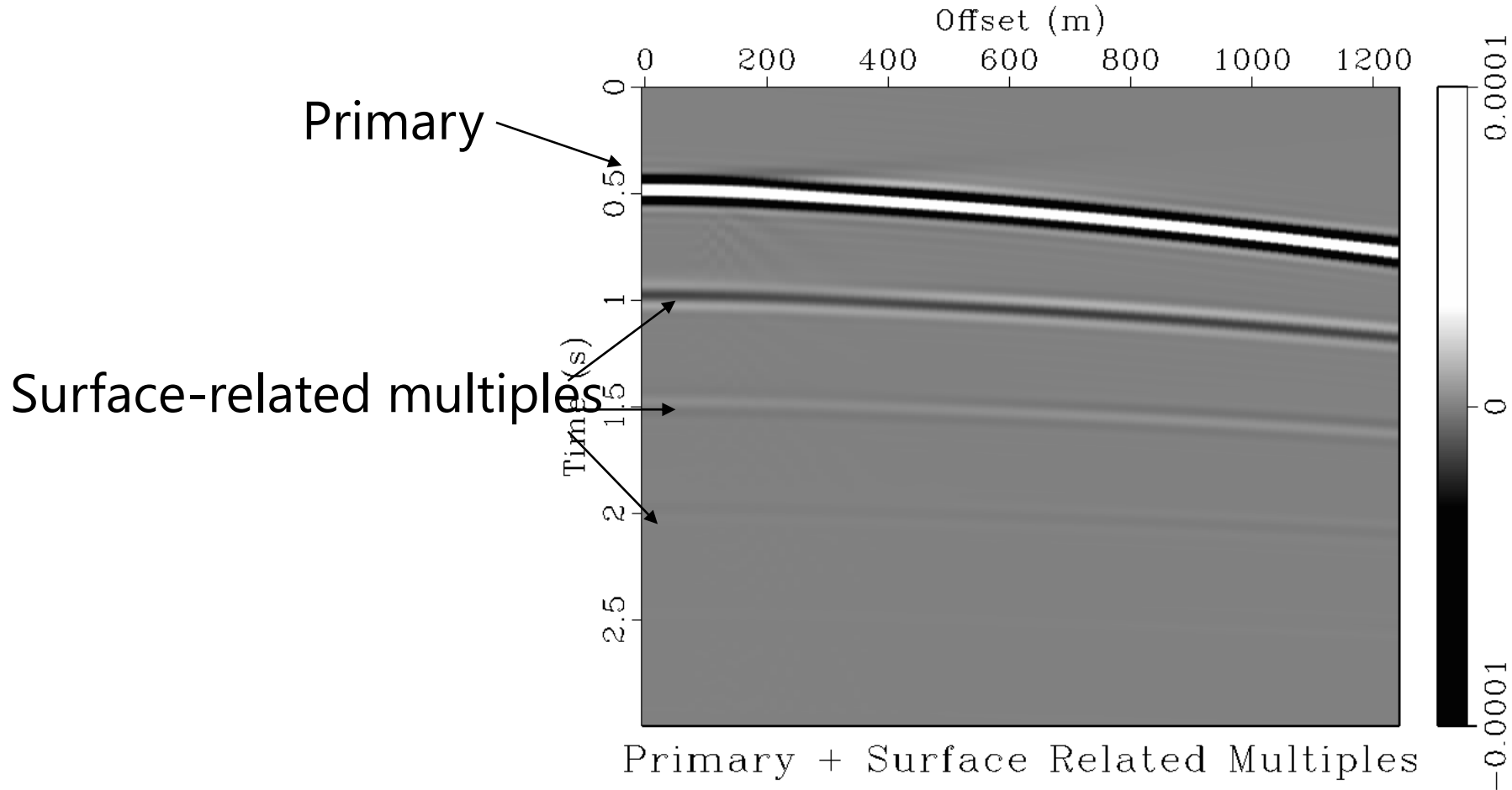
Dragoset et al., 2010

# 2-layer Isotropic Acoustic Model



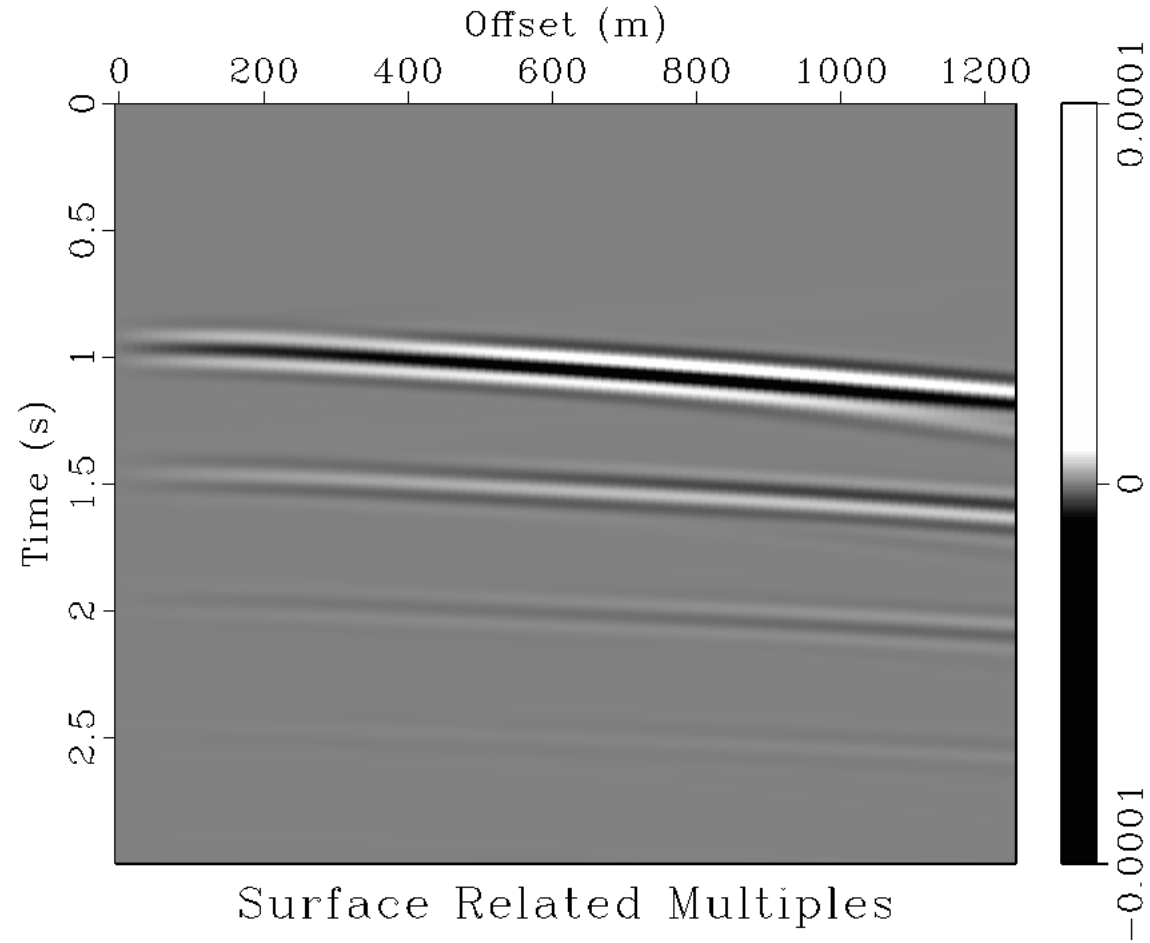
**Parameters:**  
 Vertical source  
 Free surface on  
 Frequency: 20 Hz

# Primary with Surface Related Multiples

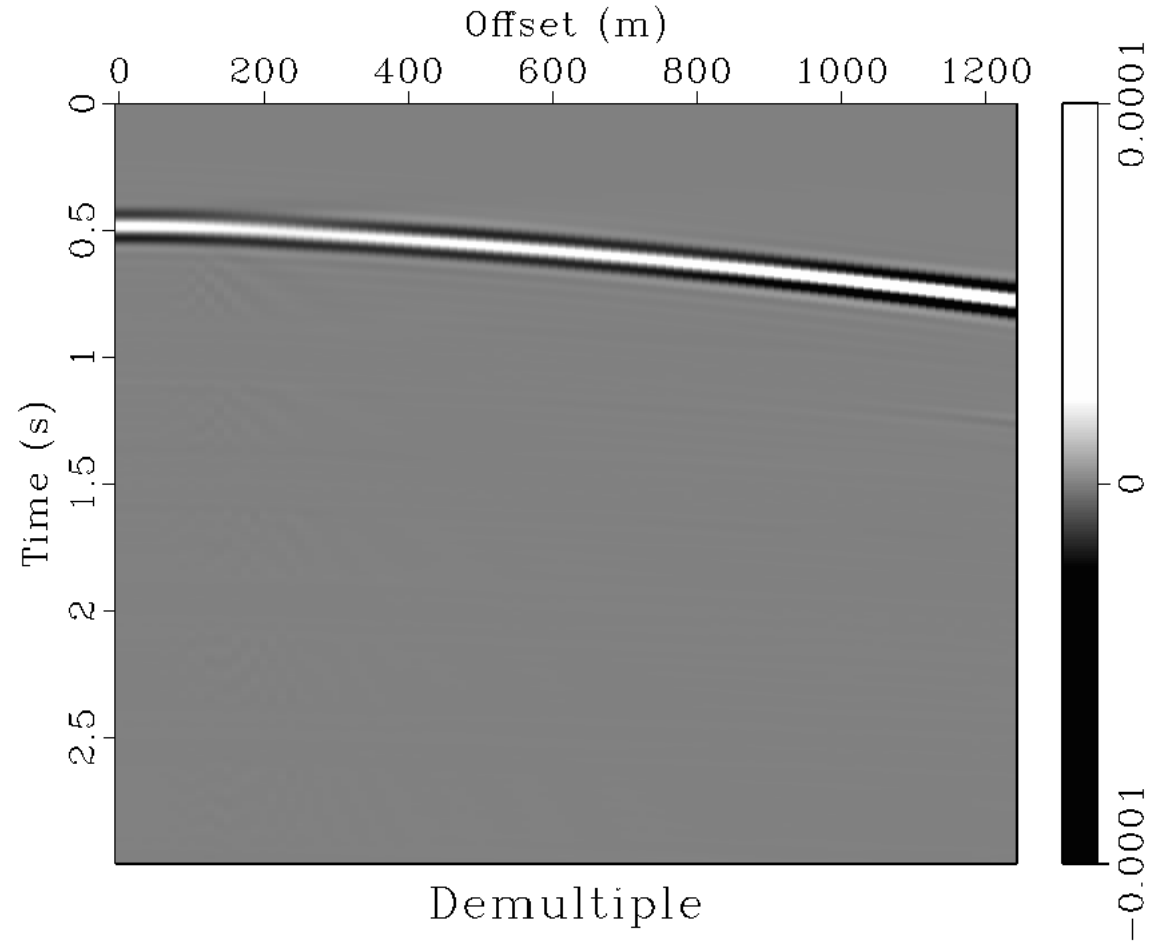




# Surface Related Multiple Prediction



# After Adaptive Subtraction



# Future work

- Zero-offset/walkaway/3D VSP data
  - Better understand the inter-bed multiple and converted waves
  - Understand near surface complexity
- Continue on evaluating demultiple methods used in the industry
  - SRME
  - Inverse scattered series
  - Marchenko equation

# Acknowledgement

Special thank you to Kuwait Oil Company (KOC)





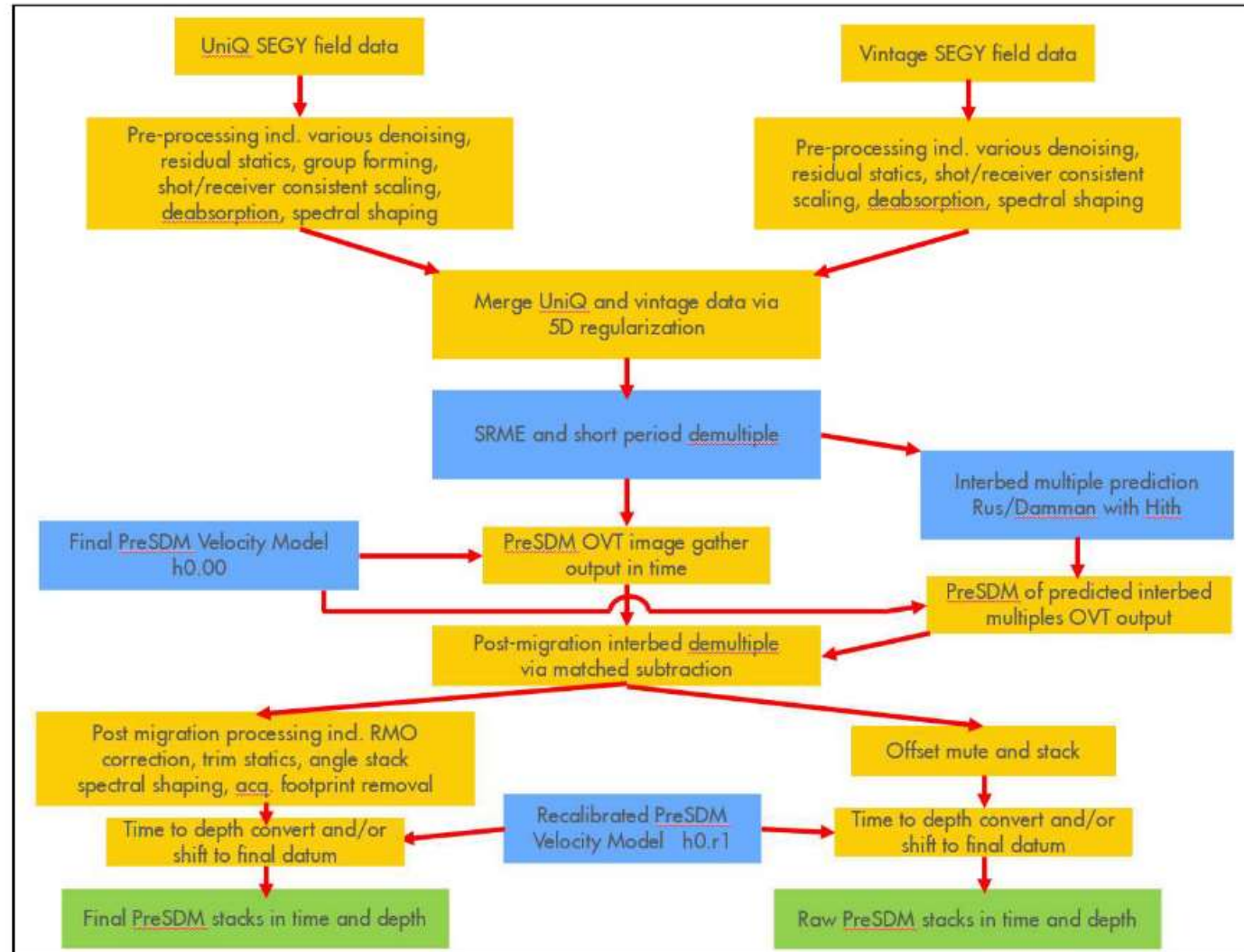
# Acknowledgement

Thank you RCP industry sponsors



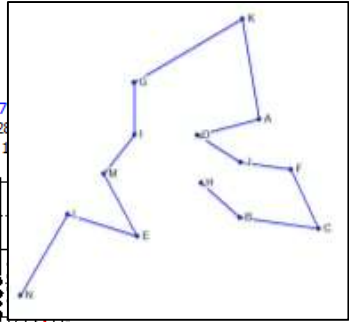
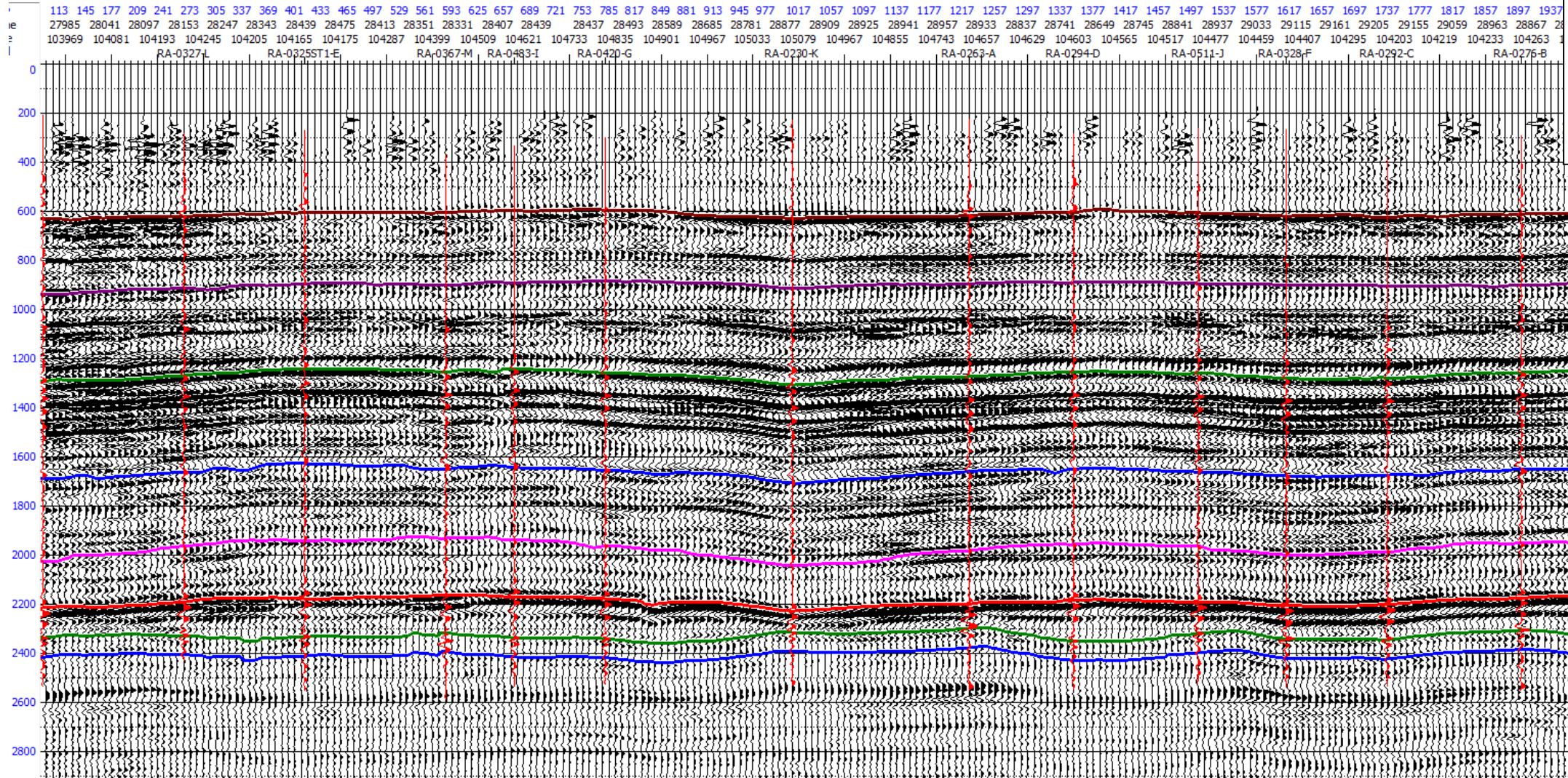
# Questions ?

# Seismic data processing flow





# Synthetic traces in an arbitrary line



**Rus**  
**Tayarat**  
**Mishrif**  
**Zubair**  
**Minagish**  
**Hith**  
**MMR**