

1-- Good morning everybody.

Thank you all and AFES for this opportunity to present this flowchart for reservoir characterization with MICP integration.

A special thank also to my co-author **NADER GERGES** for his enduring support and cooperation in field testing and for raising so many interesting points.

The original paper, can be found in OnePetro, or please contact the authors.

#### Who am I?

My background is geology, and since the very beginning of my career (1975), I have always been fascinated by logs and by what could be done with logs, my first public presentation in 1979 was on electrofacies prediction and mapping.

A few years before I got the early retirement package at the occasion of the Total/Elf merger (1999) I had the opportunity to contribute, mostly with Shin-Ju YE, to the development of algorithmic techniques for Bore Hole Image interpretation and for data clustering and prediction (they are in Geolog/FACIMAGE)....sort of what is now called big data, ML..... we have many fancy names for that now. I became addicted ! And my latest *addiction* is the integration of MICP with all other petrophysical data.



2 -- the main points of the presentations are listed here.

If you have questions, please refer to the slide number. I hope it highly visible in the yellow square

**Objectives :** <u>popularize the integration of MICP to all reservoir</u> characterization projects, <u>as requested in 1950 by ARCHIE</u>

- 1. Save, Share, Display, Process MICP data like any log
- 2. Simplify the extraction of petrophysical parameters from MICP
- 3. Simplify the creation of :
  - ➤ Continuous Profiles of PSD, Rock-type...etc. → mapping and 3D modeling
  - Facies/Rock-Types integrating MICP petrophysical parameters
  - Static & Dynamic Partitioning of Porosity (Saturation, DS.....)

The flowchart must be holistic, fool-proof, easy to learn and practice

**3--** As mentioned by Archie, 70 years ago, the porous network description by MICP informs on rock forming processes, on their stratigraphic evolution and of course on flow properties.

Thus MICP should be integrated in any reservoir characterization projects.

Here, the key objectives of the successive integration steps are listed.

Covering all the questions which are addressed by MICP is but one of the constrains imposed to the design of the flowchart which would have little value if it cannot be widely accepted.

Thus the flowchart must be fool-proof and easy to learn and practice so that the users feel comfortable with it and rewarded by its results.

*Fool proof* means that it relies on *physical laws* and *field proven numerical techniques*.

Next slide please.

3



**4--** NMR T2 distributions displayed on depth track are familiar to all geoscientists and MICP must also be displayed in this way.

So far, displaying, clustering and predicting MICP data was at best impractical because MICP data, which are recorded with a varied number of variable pressure steps, are not presented in a standard format.

Our flowchart solve this problem and present MICP in a standard format, by means of tabulation technique.

Curve fitting methods are not used here, because as you can see on the slide, they are not necessary while their choice is raising many controversies.

Moreover and to the detriment of detail and accuracy, curves fitting methods do not treat all the parts of the PSD (large or small radiuses) in the same way and they can only process the intrusion curves.



**5** -- The flowchart goes from plug scale to log scale in 3 stages.

- 1st stage : formatting and analysis of single plug measurements,
- 2<sup>nd</sup> stage : building a continuous profile of upscaled PSD for all wells.
- 3<sup>rd</sup> stage : (multi-well) analysis of the continuous profile of up-scaled PSD and creation of Pc/saturation curves

Let's detail each step.



6--Here is the diagram of 1st stage.

MICP are presented in a standard format by means of a tabulation technique.

The Conformance correction is "computer aided" and graphically edited by the user.

# The extraction of petrophysical parameters is performed by means of the most fundamental physical models.

The most important result are:

- The detection of the Apex of Thomeer's hyperbola (by 3 methods)
- The quantification of the Porosity contributing to Permeability.
- The quantification of permeability by multiple physical models.



**7--** In stage 2, a continuous profile of up-scaled PSD is created by means of a specific implementation of the field proven "k-NN" algorithm.

Why use k-NN ? No other method offer all its advantages, listed here : it is simple, unbiased and flexible and <u>it can handle array logs as predictors and as</u> <u>predictand</u>.

The specific k-NN implementation we use here is discussed further below. It ensures the Highest possible Resolution and a full Traceability of the results. Thus, the QC of the results is easy and effective.



8-- In the 3rd stage :

The Upscaled PSD are processed with the same procedures used for plugs to extract Apex, POROZ, Perm....

The Upscaled Pc/Saturation profiles are generated by summing up all the elements of the upscaled PSD.

All petrophysical data (logs & core) deemed of interest are integrated with the continuous profile of MICP by means of MRGC clustering, *(not discussed here)* 

Porosity is partitioned statically and dynamically. This is detailed below.

The evaluation of sealing potential was discussed in a previous publication. It is not discussed here



**9** -- To accept a new flowchart on a sizable project you need a successful test of its concepts and effectiveness.

So we must demonstrate :

- 1. the Effectiveness of the tabulation method
- 2. The validity and explainability, in terms of petrophysics, of the results extracted from MICP



**10** -- The picking of the apex of Thomeer's hyperbola is a good test of the effectiveness of the Tabulation technique.

Indeed, the radius at the apex can be picked using the 3 trial solutions, published independently by Pittmann, Katz & Thompson, Wells & Amaefule.

it can be shown that they are strictly identical, however, they use the data in 3 different formats.

Thus they are a good test because the same results must be obtained whatever the format, which is easy to verify by graphic superimposition on depth track or on X-plots.

Here, the 3 rightmost depth tracks, show a perfect superimposition of the results, whatever the scale of the variable.

### Thus, the effectiveness of the tabulation method is exemplified.

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Details can be found in our IPTC paper

- Pittmann: the variable is the ratio "Saturation/Pc" plotted on a saturation scale and the Apex ("PSTS\_APEX") is the maximum of the variable.
- Wells & Amaefule : the variable is SQRT(Pc/saturation) plotted on a saturation scale, the apex ("WNA\_APEX") is its minimum.

• Katz & Thomson : the variable is the product "R\* saturation" {i.e. :"Saturation/Pc"} plotted on a radius scale. The apex ("L\_EMAX\_APEX") is its maximum".

Refer to Schechter for mathematics in the background of the Trial solutions



11 -- the 3 physical permeability models implemented in this flowchart are based on experiments.

If as expected they provide consistent results, then we must conclude that :

- 1. <u>Their implementation is sound.</u>
- 2. The models can be unified
- 3. The results produced by the flowchart can be safely interpreted in the light of previous experiments
- 4. The models are further supported by new sets of measurements

*A word of caution*. In the Purcell experiment, a non-wetting phase is injected, while the Kozeny model considers a wetting phase.

Here it is admitted that for the Kozeny model to be applied to MICP, the surface of the mercury is not the surface of the pore system until it is fully saturated.



**12--** In our workflow, the Purcell model is implemented in an incremental mode to show how each class of Pore Throat Radius contributes to the permeability (3<sup>rd</sup> track from right).

Such an implementation makes it possible to compare the Swanson's interpretation of the Pc/sat curve in the light of the Purcell's permeability model.

In the 2 rightmost tracks, the PSD & the Apex of Thomeer's hyperbola are superimposed over the cumulative contribution to the permeability of the porosity element (PSD bin), *The superimposition shows that the apex of the Thomeer's hyperbola is the point at which the Permeability becomes significant.* 

Thus, the experiments carried by Swanson (and later by Katz & Thomson) using injection and resistivity measurements to survey the connectivity of the porous network are consistent with the Purcell model.

As a corollary, Permeability is not controlled by Total Porosity



**13** -- the consistency between the Purcell and the Swanson models makes it possible to partition the porosity in two parts:

- "POROZ", which is comprised of radiuses larger than the apex of hyperbola. It contributes significantly to the permeability and can be accessed by Primary depletion.
- "Quiet POROSITY" or "PORO\_ATS", with radiuses smaller than the Apex of hyperbola. Its contribution to permeability is insignificant. (ATS is the acronym of Apex Trial Solution)



**14** -- the histogram of the ratio of "Purcell" permeability modeled for POROZ and for Quiet Porosity (PORO\_ATS) is another way to visualize how insignificant is the contribution of QUIET\_POROSITY to permeability, despite it may account for up to 80% of PHIT, as shown by the color code (POROZ/PHIT).

Thus, if POROZ is the main contributor to Perm, then it can be stated that *PHI/K plots are misleading* 



- **15** -- Detailed image to recap:
  - 1. the convergence between Swanson and Purcell models.
  - 2. <u>Apex position and POROZ (green area) are unrelated to PSD shape (and modes) and PHI<sub>T</sub></u>
  - 3. POROZ controls permeability hence **PHIT/K plots are misleading**



**16** – On the 2 rightmost tracks it can be seen that <u>the ratio POROZ/PHIT decreases with</u> <u>increasing width and complexity of PSD</u>.

The consequences are important:

- 1. the validity of any "local" statistical relationship between PHIT (hence Saturation\*) and Permeability is highly questionable in a depth interval where the ratio POROZ/PHIT varies significantly.
- 2. for any Flow Zone Indicator, POROZ should be used instead of PHIT.

Let's examine Flow Zone Indicator with the Kozeny-Carman Equation

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\* It should be reminded, at all time, that a Hc column is primarily controlled by ENTRAPMENT & dysmigration, Pore Throat radius, not permeability, is secondary control.



**17** -- The histogram displays the ratio of the radiuses observed at "entry" and at the "Apex".

The Narrowness of the range of ratio explains

- 1. The Carman restriction imposed to the Kozeny permeability model
- 2. the success of the Swanson Permeability model (which is not so sensitive to errors in picking Entry/conformance).



18 -- The Kozeny & the Purcell equations are both based on Darcy & Poiseuille laws Thus, they should produce the same permeability value if the correct parameters are used in each model.

Kozeny considers that the permeability is created by a group of similar parallel channels. Their volume is the Porosity and their "mean Average radius" is easy to compute using the permeability measurement, by Darcy law, or using the PSD from MICP.

CAVEAT: as specified by CARMAN, the Kozeny equation implies that POROSITY is "<u>effective in terms of permeability</u>" and for this conditions to be met "<u>the Pores must</u> <u>be reasonably even in size</u>".

As discussed above, the Purcell model shows that, if the PSDs exhibit complex shapes, then the Carman condition is not met by TOTAL POROSITY.

Thus, the next question is: does POROZ, and its corresponding  $R_{mh}$ , truly honors the Kozeny Equation ? This is likely because the range of radii in Poroz is limited.

Here, we used the X-Plotting technique designed by Amaefule to test <u>the varied</u> <u>combination of Porosity, Permeability and R<sub>mh</sub> values</u> and answer this twofold

question :

- Which "porosity"
- Which R<sub>mh</sub>

Are consistent with the permeability measured by application of the DARCY law (which is used to calibrate the Purcell model) ?

Amaefule has demonstrated that if a straight line appears on the X-Plot, then the test is positive, that is to say:

- 1. the Porosity is effective in terms of permeability and its  $R_{mh}$  is correct.
- 2. the consistency between POISEUILLE, DARCY, KOZENY, PURCELL, SWANSON is obvious,
- 3. The implementation of the models is correct.
- 4. the FZI method is valid
- 5. Finally, we must admit all the consequences about the use we make of TOTAL POROSITY.

The X-plot shows that POROZ pass the test.



### 19 -- This slide shows the application of the *Amaefule X-Plotting technique to*

- RCA Porosity (PHI<sub>T</sub>) and RCA Permeability (left),
- POROZ with RCA permeability (Center)
- POROZ and *Purcell* Permeability (right).

The Kozeny equation is honored only by POROZ and its corresponding R<sub>mh</sub>.

<u>Thus POROZ is consistently identify as the porosity efficient in terms of permeability by</u> <u>the Swanson, Katz and Thompson, Purcell and Kozeny models implemented here.</u>

<u>As Darcy and Poiseuille laws are honored, the soundness of the concepts and processes at the core of this flowchart is exemplified.</u>



- 20 -- The 3 X-Plot show Perm (Y axis ) versus (Apex Radius)<sup>2</sup>
  - The Pore Throat Radius @ the Apex (L\_EMAX == Thomeer's == Swanson ) is the primary control of permeability
  - POROZ and PSD shape complexity are secondary controls : for the same value of **Radius** @ the Apex the permeability is greater in monomodal PSD

Apex radius appears to be a better control of permeability than Entry radius.



21 -- No need to comment any further !



**22** -- The k-NN and MRGC-CFSOM techniques have been around for 2 decades and may be familiar to many of you.

Static and Dynamic partitioning of Porosity are new techniques intended to better visualize and quantify the porous network and its behavior.



### 23 ---- The first steps of the creation of a continuous profile of PSD are illustrated here.

Why create a continuous upscaled PSD profile ?

Because, to characterize reservoirs & define flow units, we need continuous profiles of up-scaled

- **Pc/Sat curve.** (Pc/sat curves are obtained by reversing the Purcell method by which PSD are created. )
- POROZ
- Purcell or Swanson Perm
- True FZI.

All this can be obtained from a continuous profile of PSD.

The k-NN method is mostly used in its k-Means form, here we use the "true" k-NN method : the "k" Nearest neighbors are retrieved individually.

Further, our implementation optimizes the value of k for each depth increment by means of conditions set on the values of the predictors.

The rightmost array track displays the distance in the "data space" between the k predicted values. Distance is a QC index.

- Here the conventional logs (GR, NPHI RHOB, Dt, Pef displayed on 2nd & 3rd tracks) are used as predictors, for sake of simplicity. However it is a better practice to predict and upscale RCA Porosity, Permeability and Grain Density, aka "PKG", and use them as predictors. This method offers offer the invaluable advantage of solving log normalization issues, or more exactly their QC. It also offers the invaluable advantage to retrieve PSD from a PSD-PKG data base by searching it with the available RCA "PKG".
- The predictand : MICP plug measurements are on the leftmost array track.
- The "1<sup>st</sup> NN" prediction of PSD is shown on the 2<sup>nd</sup> Array track. It is split into its components POROZ (green) and PORO\_ATS (orange). The color background (from dark blue to red) of those tracks is coding for Nano, Micro, Meso, Macro and Mega porosity.
- The next 5 array tracks shows the prediction for k= 1 to k = 5 respectively. They can be averaged. Most importantly it is possible to algorithmically select the value of k so that the averaged prediction is based only on similar values of all predictors.



**24** – Let's discuss Clustering and logtyping. Logtype is a substitute to X-plot which are not appropriate for Array data.



**25** ---- The principle of the logtype technique is best explained with 2 logs only (**left part slide**) so that its links with X-Plot can be visualized.

## The Logtype technique relies on the <u>purely data-driven MRGC-CFSOM clustering</u>, <u>available in Geolog/Facimage ™.</u>

The data points are optimally clustered by MRGC-CFSOM and the kernels of the clusters are optimally ordered, along the minimal path going trough them in the N-Dimensional data space.

Here, the clusters and their ordering are visualized by the colors on the X-Plot of **central part of slide**.

The path through the kernels is the Non-Linear Principal Axis of the data set. **The NLPCA**. All the data points can be projected on the NLPCA.

#### The NLPCA can be stretched on a straight line which can be used as

- 1. the Z Axis of a "*depth*" display → the Logtype (right part of the slide)
- 2. The X or Y axis of any X-Plot such as RHOB or GR ... etc  $\rightarrow$  Integration

All the log values characteristics of the projection of each points on the NLPCA, including their real depth and well name, can be plotted in separate tracks of the Logtype.

As exemplified here It is also possible to project only the kernels with the distribution of all the points belonging to the same cluster.



**26** --- Let's apply the technique to the MICP array log : 240 bins (logs)  $\leftarrow \rightarrow$  240 dimensions.

It is a multi-well data set of about 1000 samples, but for the sake of clarity only 15% of data are displayed on the logtype.

The MRGC-CFSOM algorithm is applied to the array log "cumulated contribution of PSD bins to Permeability" (shown in the leftmost array track), thus the clusters are sensitive to those Pore Throats which contribute to POROZ & Permeability ( $\rightarrow$  FLOW).

The cluster model selected for the logtype, comprises 48 facies, to show enough details.

The rightmost track of the logtype displays the PSD, split into its 2 components "QUIET POROSITY" (orange) and "POROZ" (green) with the Apex position superimposed (black dots). (the "not so smooth" style of the curve is partly due to under-sampling).

Look at the color patterns on the 2 FZI Plots:

- upper plot with POROZ
- lower plot with PHIT

In the upper FZI plot, (POROZ is X axis / Purcell Permeability is Y axis) the colors fit the FZI functions and create a pattern much sharper than that of the lower plot.

Thus the fact that the "Facies" of the <u>"cumulated contribution of PSD bins to</u> <u>Permeability"</u> honor the physical models prove the efficiency and usefulness of MRGC-CFSOM to sort the MICP data (240 Dimensions/logs) in a naturally organized (sequence stratigraphy) and physically meaningful way. Indeed, in the data domain of the parameter honoring Darcy and Kozeny equation, the data points, form a natural data structure and it is here clearly evidenced by MRGC-CFSOM.

The color code can be used for any X-plot as a  $3^{rd}$  dimension  $- \rightarrow$  Integration.



**27** ---- Phi-Typing or Static partitioning of Porosity is meant to help the comparison between PSD and the descriptions of thin sections in terms of types of porosity.

Here Phi-Typing is performed on the PSD of the log-type and displayed in the 2 central framed tracks Porosity (scale 0 to .35; cumulative curves).

It quantifies, the porosity of each class of pore throat size (from Nano to Mega), for

- POROZ (green background)
- QUIET POROSITY (orange background),

It is a common practice to value the facies with largest pore throat.

Here the Phi-Typing illustrates the counterintuitive fact that the highest values of POROZ, are found in facies whose largest pore throat belongs to the Meso class and which are also monomodal.

The values of the true FZI are shown on the rightmost track. (the spiky style of the curve is partly due to under-sampling of the logtype).



**28** --- Phi-Typing performed on a real well.

it is interesting to note that, Macro porosity is dominant in the interval (circled) showing the largest POROZ value.

# However it must be noted that, in this interval the <u>PSD exhibit a rather narrow</u> <u>monomodal shape</u>.

Thus, this observation does not contradict the conclusion drawn from the Phi-Typing of the logtype.



# 29 ---- The application of the Lab/Field conversion allows to rescale the PSD as a function of the Delta Pc for any FWL and fluid.

Thus the Pore Throat Radius corresponding to a given Delta Pc (and FWL position) can be used to partition the PSD and derive Hc <u>Saturation</u>.

However we know that the Porosity elements contribute to flow as a function of their radius.

Thus, in addition to Saturation, by using the Purcell equation, we can easily quantify the contribution to flow of each porosity element **of a PSD for varied FWL hypothesis.** 



#### 30 ---- Let's consider drainage conditions

- **1.** Delta Pc is controlled by Hydrocarbon buoyancy at the time of entrapment (or at any stage of primary depletion natural or provoked).
- 2. Saturation is controlled by the combined (entrapment & current Delta Pc) & the shape of PSD, thus *saturation can be loosely related to permeability*
- 3. The flow by primary depletion is controlled by permeability which in turn is controlled by R<sub>(Apex)</sub> (and the shape of PSD)
  - a) QUIET POROSITY is the volume of encroached fluids.
  - b) <u>POROZ</u> is the Maximum volume which can be transferred by Primary Depletion. (visualized by the diagonal band limited by R<sub>(Apex)</sub> and R<sub>(Entry)</sub>

Here, to illustrate the principle of the dynamic partitioning of the Porosity by conditions set on Delta Pc & R<sub>(Apex)</sub>, we impose a constant Delta Pc @ Entrapment, and a constant arbitrary Delta Pc at depletion (arbitrary stage of primary depletion, natural or provoked) to the PSD ordered in the logtype.

As a result: 5 partitions are defined and visualized in the complex data domain PSD vs

<u>**Delta Pc.**</u> (each one is characterized by its volume and perm). <u>The quantification of their volume is shown in next slide.</u>

- 1. Encroached Water (deep blue) in PORO\_ATS
- 2. Encroached Hc (deep greep) in PORO\_ATS
- 3. Water movable by depletion (light blue) in POROZ
- 4. Initial volume of Hc in "primary depleted zone" (medium green) in POROZ
- 5. Hc available for depletion (bright green) in POROZ

Encroached + depletable Water can be measured by DS.



**31** --- Let's run Dynamic partitioning simulations on the logtype with multiple hypothesis on FWL, to illustrate how PSD shape impacts the fluid flow. The scale for the 3 rightmost tracks is V/V from -0,05 to 0,35 and the curves are cumulated.

The 3 simulations displayed here (rightmost tracks) illustrate the not so intuitive fact that *the volume which can be moved by Primary depletion (bright green color) is greater in monomodal PSD than in complex multimodal PSD exhibiting greater permeability values.* 

*Further it is likely that, due to hysteresis, the efficiency of primary depletion is smaller in complex multimodal PSD than in monomodal PSD.* 

# To summarize



- 1. <u>Tabulation is a sound method</u> for Integration & valuation of the MICP heritage
- 2. The soundness of the processes embedded in the flowchart is proven by the <u>Unified</u> <u>permeability models</u>: Swanson, Purcell, Kozeny-Carman [Darcy, Poiseuille]
- 3. <u>PHI<sub>T</sub>/K regressions & plots are invalid</u>, "POROZ" (defined from MICP) must be used
- 4. <u>MICP valuation is simplified</u> by pattern identification techniques :
  - Continuous profiles of PSD curves by Data Driven techniques (k-NN & MRGC-CFSOM)
    - PSD & POROZ can be substituted to PHI<sub>T</sub>
      - sequence analysis is applicable to PSD profiles
  - New dedicated techniques
    - Static Phi-Typing ← → link to classic petrographic analysis
    - Dynamic partitioning of Porosity ← → substitute of Saturation modeling + integration of DS measurements

**32** – Now, let's have a dream : **imagine what could be achieved by means of a** "Worldwide" MICP data base also comprised of "PKG" RCA measurements.

Searching this WW Data Base by k-NN method and using the RCA data just collected in any well not part of the WW Data Base, you would get the best possible estimation of its PSD and Pc/Sat curves .....it is that simple !

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PERSPECTIVE & FUTURE WORK !

What could be visualized & UNDERSTOOD by the integration of Extrusion curves ? Of course It is also possible to manage simultaneously Intrusion & Extrusion , just use Clustering and Logtype technique !

PSD shape impact Permeability, thus very likely it also impacts Rel Perm: why not have a look at Rel Perm?



**33** --- an image is worth 1000 words, I hope you find this one easy to remember.

