#### PS Geologically Realistic Fluvial Point Bar Geocellular Models: Conditioning Algorithms with Outcrop Statistics\*

Andrew L. McCarthy<sup>1</sup>, Lisa Stright<sup>1</sup>, Paul R. Durkin<sup>2</sup>, and Stephen Hubbard<sup>3</sup>

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#### Abstract

Geostatistical reservoir modeling necessitates assumptions that often over-simplify heterogeneity, causing realizations to belie complex geologic reality. Outcrop studies provide robust suites of subseismic-scale (bed- to geobody-scale) statistics that characterize internal geobody architecture (e.g., bed thicknesses and lengths, grain size distributions). However, direct integration of such data into subsurface modeling workflows that capture geological complexity, remains challenging. This study: (1) presents bed-scale statistics from Late Cretaceous Horseshoe Canyon Formation fluvial point bar deposits that outcrop in southeastern Alberta, (2) investigates multiple modeling methodologies to test how different algorithms can integrate such statistics into reservoir modeling workflows, and (3) generates models that retain the geological essence of the outcrop deposits.

Stratigraphic sections (n = 40) record grain size, sedimentary structures, and bedding characteristics, providing the basis for reservoir model facies classification. Differential GPS surveys delineate individual lateral accretion packages (LAPs), capturing the stratigraphic framework for modeling outcrop architecture. Vertical and horizontal facies proportions and transition probabilities are calculated from measured sections, and constrain the probability that a facies is present at specific stratigraphic positions within each LAP. Bed-scale correlations are crucial for robust characterization of outcrop heterogeneity with such statistics. Probability cubes derived from these outcrop statistics guide simulations. Nested Truncated Gaussian Simulation (nTGS) is compared with Plurigaussian Simulation (PGS). nTGS realizations produce geologically-realistic outcomes with a small loss of fidelity to input facies proportions. PGS realizations produce less-geologically-realistic realizations, but better-preserve global facies proportions. Neither reproduces the LAP internal architecture observed in outcrop. Training images derived from outcrop statistics for multiple-point simulation achieve what nTGS and PGS could not, generating models with a better visual match to the outcrop that honors input statistics. This study presents a pathway to directly constrain models to measured outcrop statistics while also reproducing visual outcrop heterogeneity. As such, flow simulations on such models will test the flow-impacts of outcrop-derived architecture rather than purely stochastic heterogeneity.

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<sup>&</sup>lt;sup>1</sup>Geosciences, Colorado State University, Fort Collins, Colorado, United States (andrew.mccarthy@colostate.edu)

<sup>&</sup>lt;sup>2</sup>Geological Sciences, University of Manitoba, Winnipeg, Manitoba, Canada

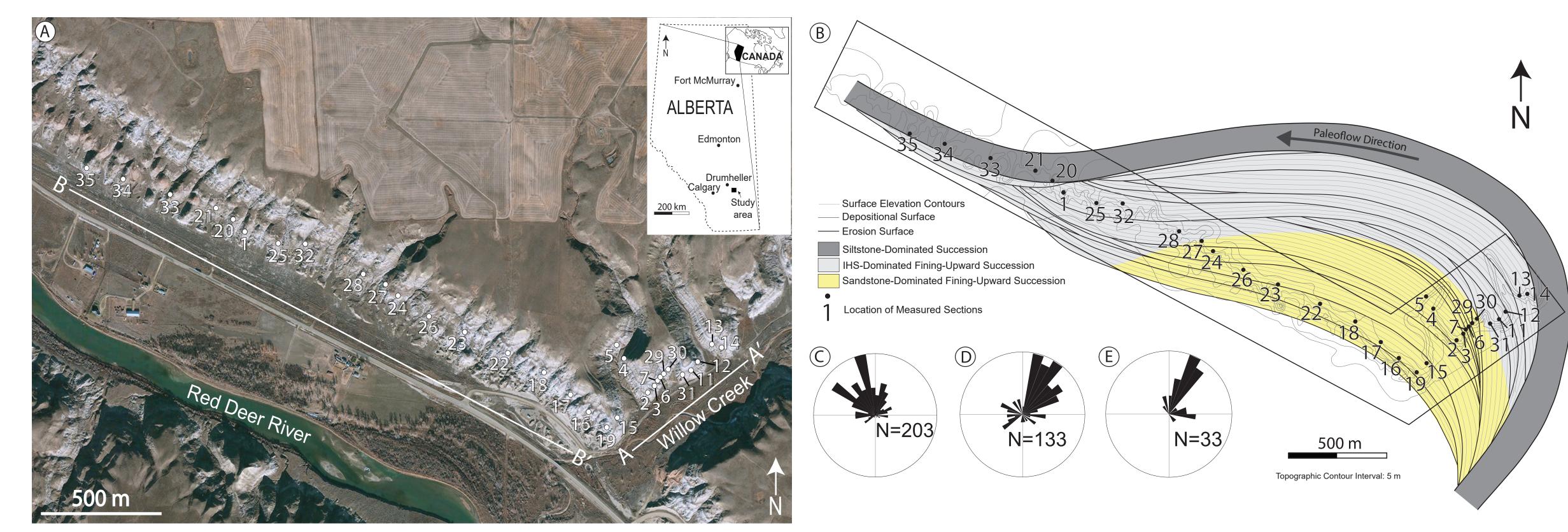
<sup>&</sup>lt;sup>3</sup>Geoscience, University of Calgary, Calgary, Alberta, Canada

#### 1. Objectives

#### 2. Geologic Background

#### Build bed-scale models that:

- 1) Honor bed-scale outcrop statistics
  - Global Proportions and NTG Trends
  - Vertical Facies Proportion Curves
  - Facies Transitions
  - Bed thicknesses and lengths (indirectly)
- 2) Employ readily available, "off the shelf" algorithms:
  - Sequential Indicator (SIS)
  - Co-Sequential Indicator (COSIS)
  - Truncated Gaussian (TGS)
  - Plurigaussian (PGS)
  - Multiple-Point (MPS)
- 3) Reproduce a given geologic conceptual model (visual essence of the outcrop)
- 4) Produce realizations that can test impact of bed-scale detail on inter- and intra- point bar connectivity and flow.



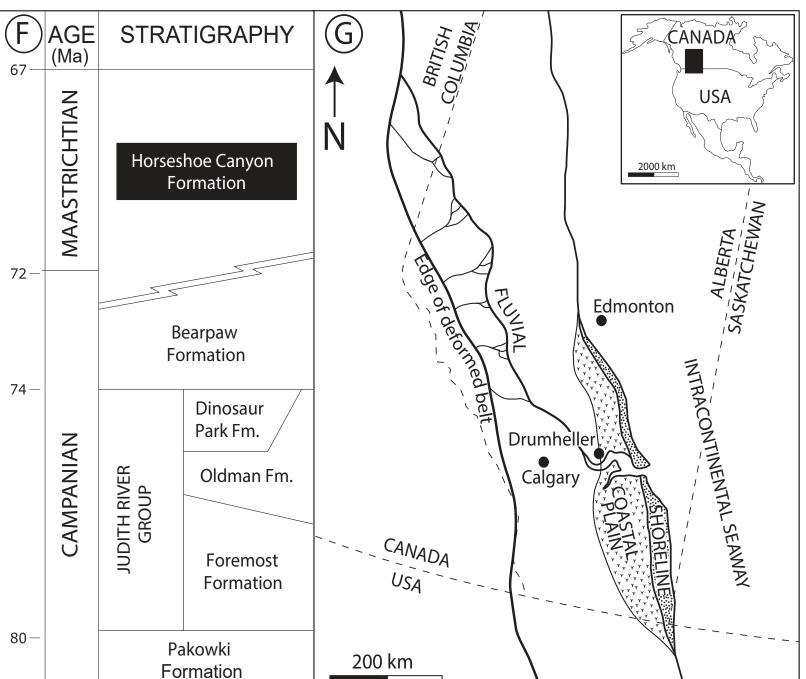


Figure 2.1: A) Satellite image (Google, 2016 - DigitalGlobe) of outcrops in the Red Deer River valley with measured sections locations. Study location shown on inset. B) Map-view interpretation of the point bar and associated abandoned channel deposits. Lateral accretion package migration direction varies through time, and deposits become more fine-grained from upstream to downstream. C) Paleoflow measurements (trough-cross stratification and clast imbrication) D) Depositional surfaces dip direction. E) Erosion surfaces dip direction. F) Stratigraphic Column for Horseshoecanyon Formation. G) Paleogeographic reconstruction of WCSB for Horseshoe Canyon Formation time (Modified from Leckie and Smith, 1992). Inset map shows location in North America. (Modfied from Durkin et al., 2016)

Horseshoe Canyon Formation outcrops exposed at Red Deer river valley in central Alberta comprise a 12-16 m thick fluvial meander belt deposit, which unconformably overlies shorefaces sands, and is capped by a laterally extensive coal (Ainsworth et al., 2015). Sediments shed off a NW-SE orogenic front were transported by rivers east and south until they were deposited at the margin of the Cretaceous Western Interior Seaway as part of Western Canada Sedimentary Basin (WCSB) fill. Outcrops are well-exposed due to "badlands" style topography 12 km southeast of Drumheller, AB. A 3 km NW-SE ("Red Deer River") exposes successions roughly parallel to flow direction, and a 1 km NE-SW transect ("Willow Creek") exposes successions roughly orthogonal to flow direction.

# 3. Stratigraphy and Zone Architecture

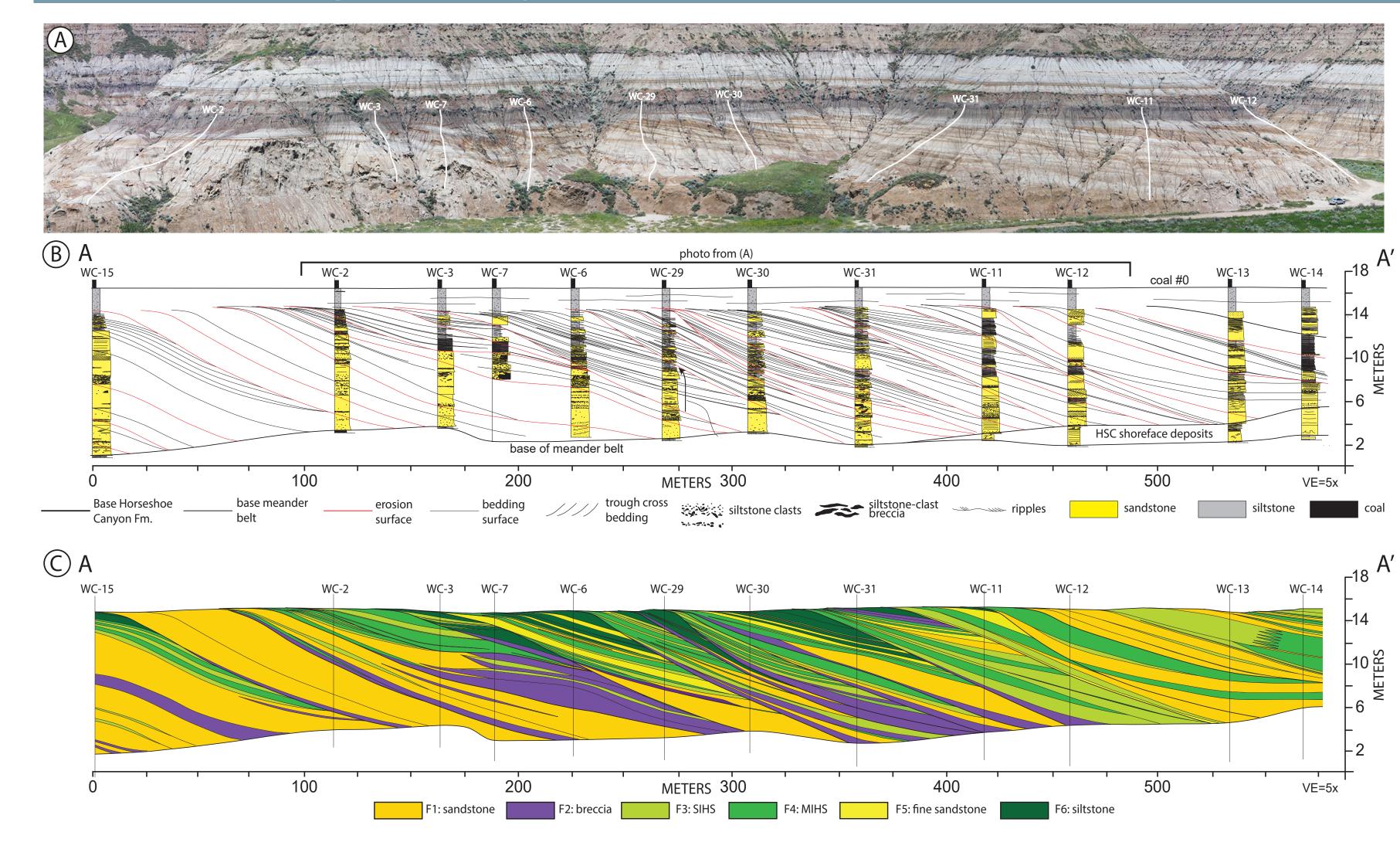
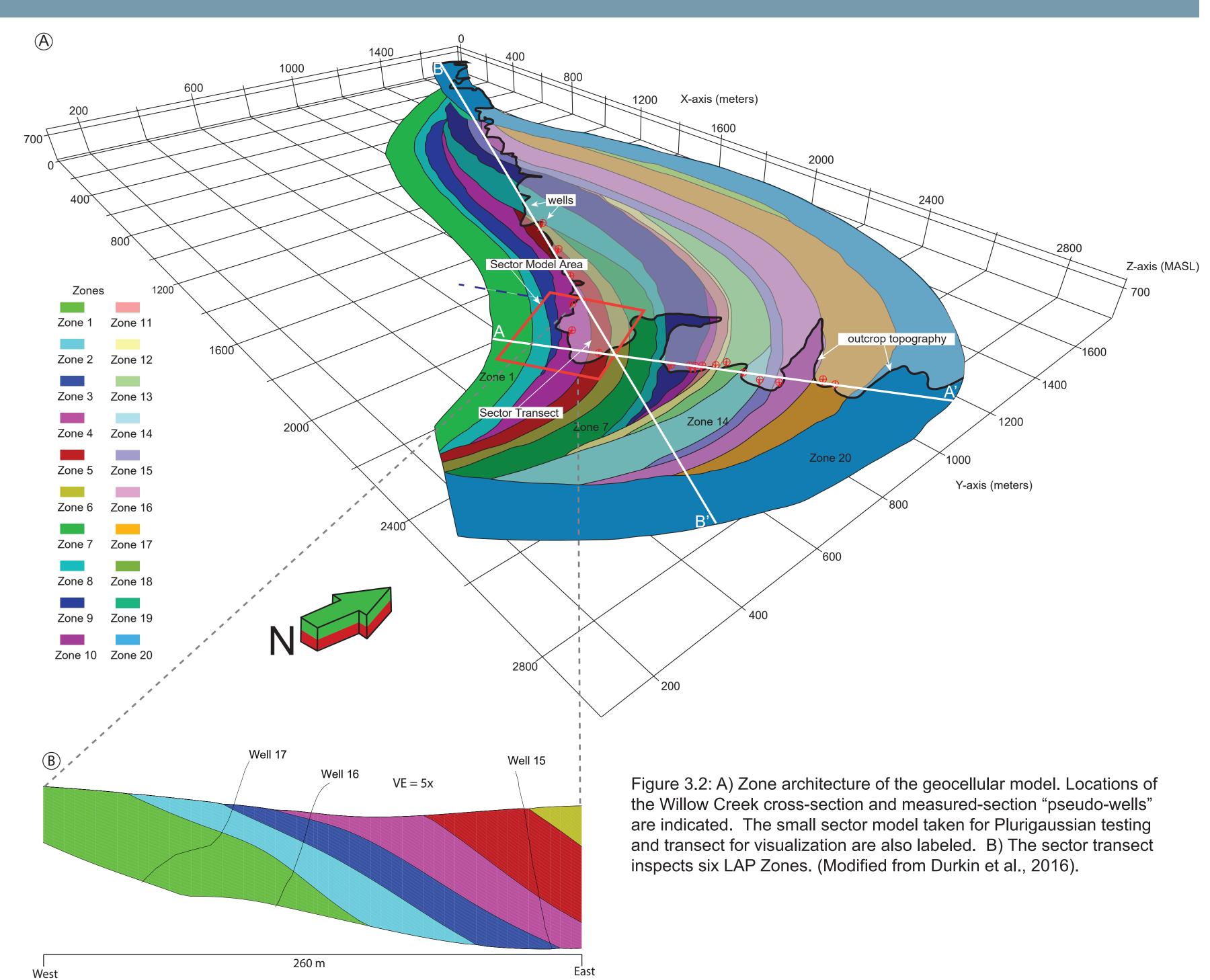


Figure 3.1: A) Willow Creek outcrop photomosaic with indicated section locations. B) Cross sections of all measured sections from Willow Creek oriented in the depositional dip direction. B) Field observations and photomosaic analysis. C) Corresponding facies correlation (Modified from Durkin et al., 2016).

Steeply dipping intra-point bar erosion surfaces that truncate underlying strata characterize the stratigraphic architecture of the deposits. Sigmoidal erosion surfaces bound concordantly-bedded lateral accretion packages (LAP) of consistent dip direction and magnitude. The stratigraphic framework and facies of Durkin et al. (2015) are used as the basis for this study. High-energy facies include sandstone (F1), siltstone-clast brecca (F2), and sandstone with siltstone and organic interbeds (SIHS; F3). Moderate-energy facies include siltstone with sandstone and organic interbeds (MIHS; F4) and very fine to fine-grained sandstone with ripples (F5). Siltstone (F6) records low-energy suspension settling of sediment. Planform reconstructions of the meander bend architecture reveal a complex history of point bar accretion with punctuated rotation events and ultimate channel abandonment.



The constructed 3D geocellular model has a grid cell size of 5 m x 5 m x 0.3 m (x, y, z) to represent fine-scale heterogeneity. Zones were defined by intra-point bar erosion surfaces that demarcate LAPs. Zone layers (parallel to sigmoidal surfaces) are 0.3 m thick so as to capture outcrop detail without compromising computational ability. Measured sections were integrated as hard-data for simulation as "pseudo" wellbores. TGS facies simulations were run on this grid. A sector model was taken out of the original grid to assess other simulation methods. Trends within packages and across zones make this an ideal dataset to test fine-scale facies simulation.

# Geologically Realistic Fluvial Point Bar Geocellular Models: Conditioning Algorithms With Outcrop Statistics



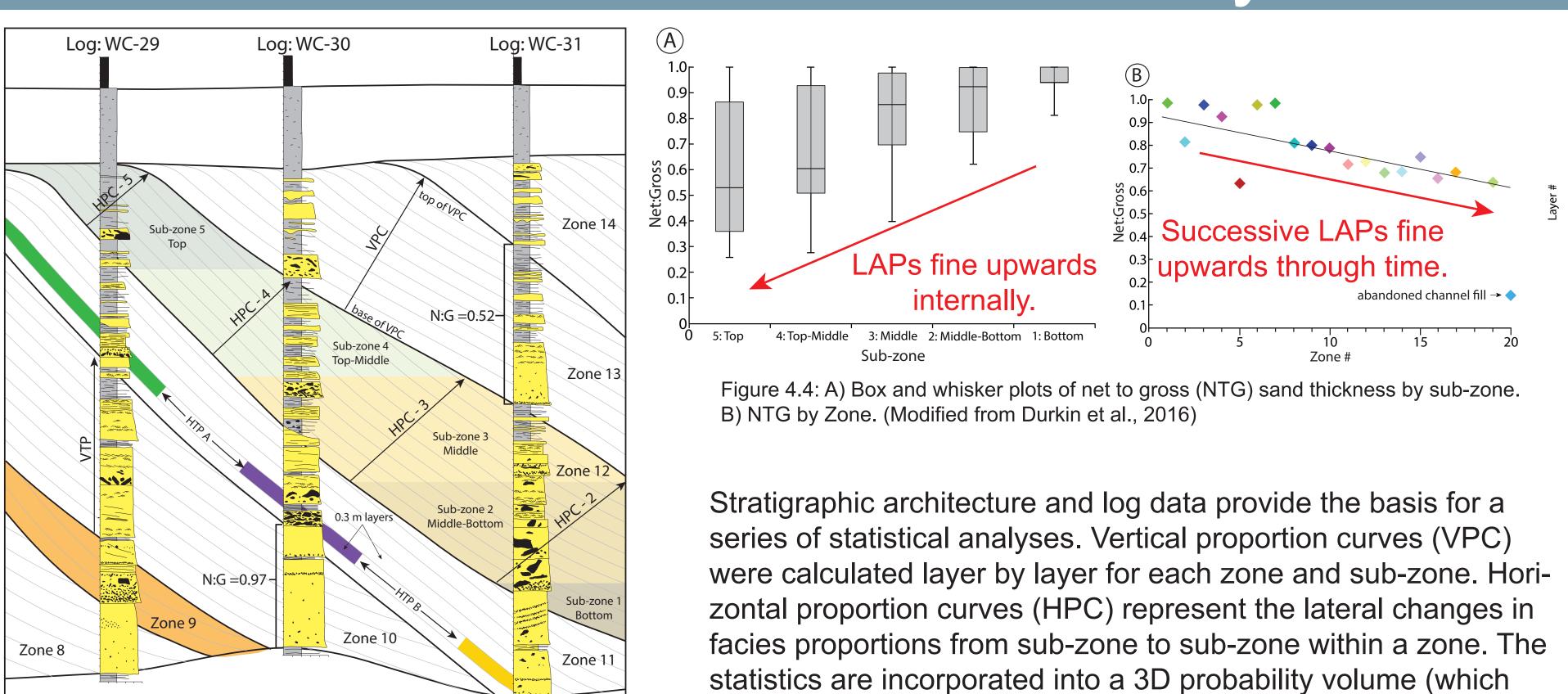
Facies

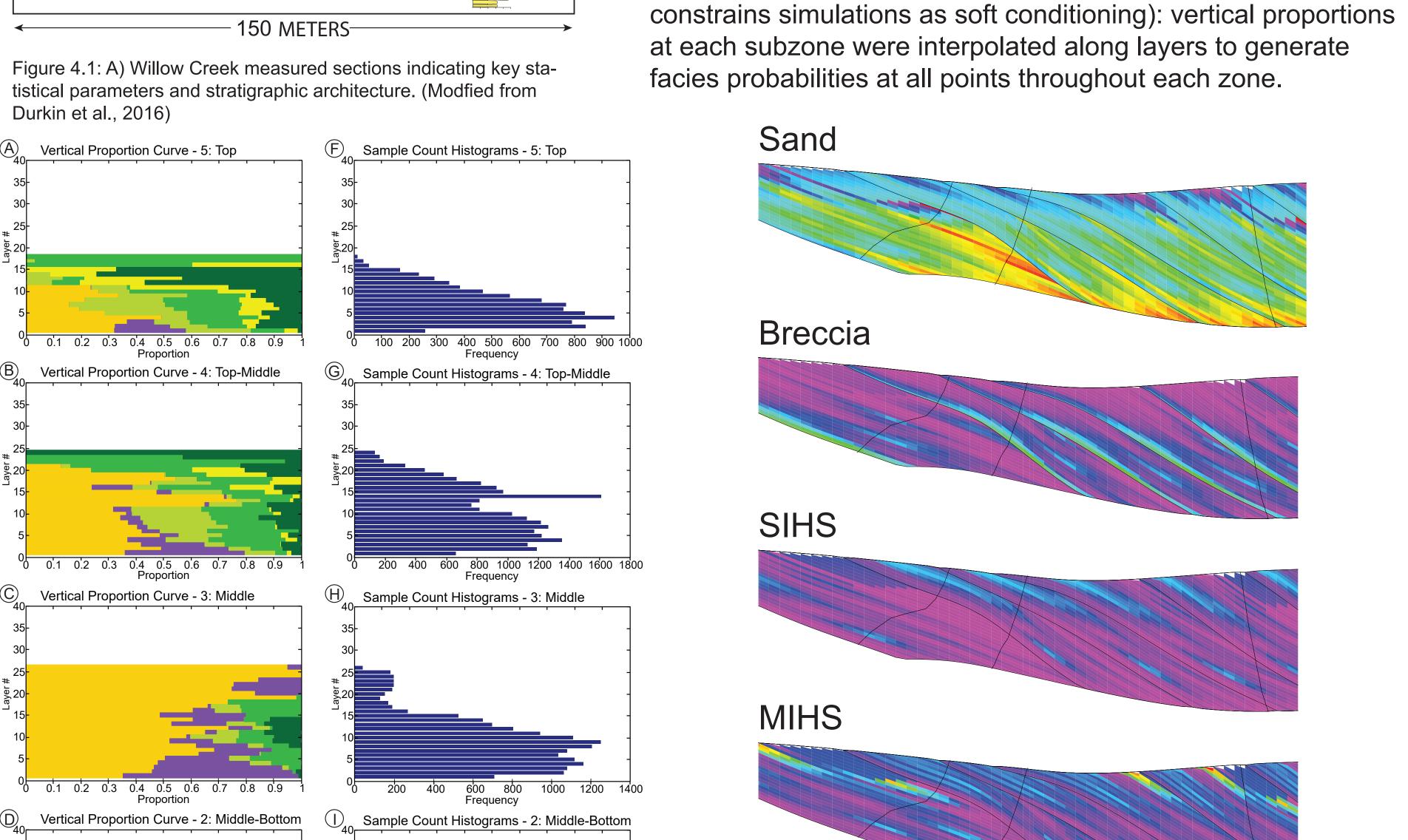


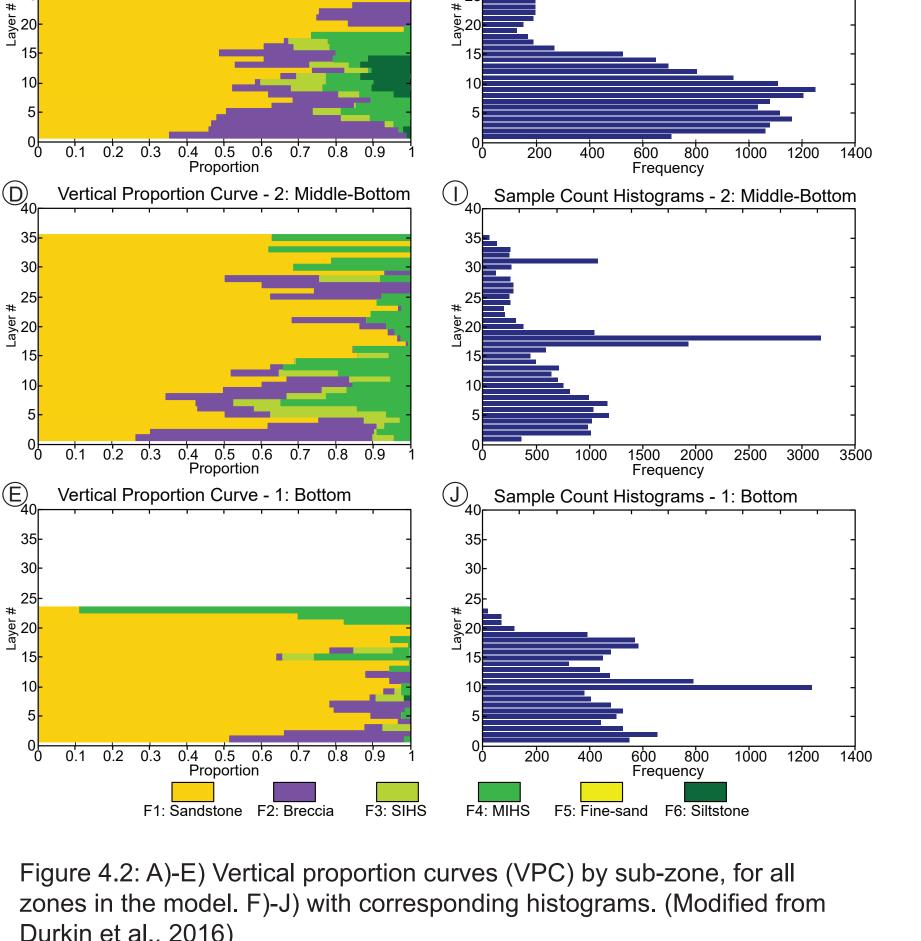
Andrew L. McCarthy¹ (Andrew.McCarthy@colostate.edu) Cell: 626-390-1439 Lisa Stright<sup>1</sup>, Paul R. Durkin<sup>2</sup>, Stephen M. Hubbard<sup>3</sup>

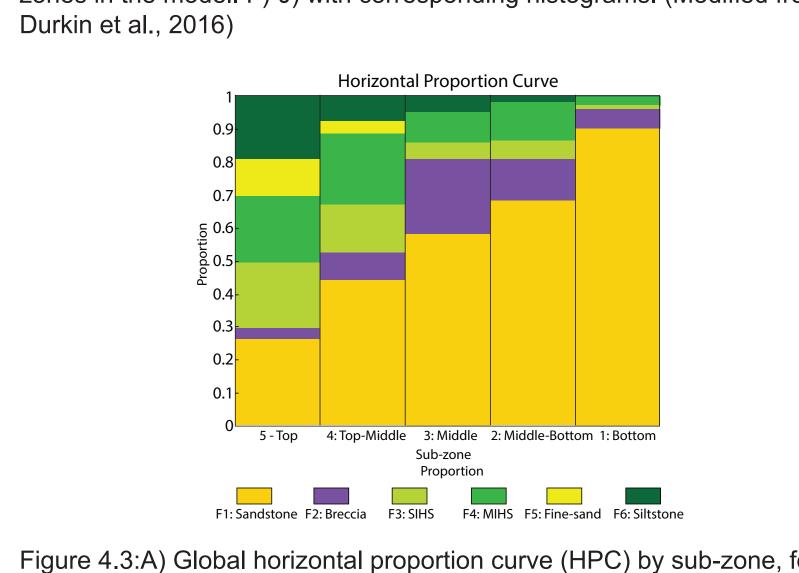
<sup>1</sup>Department of Geosciences, Colorado State University, <sup>2</sup>Department of Geological Sciences, University of Manitoba, <sup>3</sup>Department of Geosciences, University of Calgary

## 4. Statistical Methods & Probability Volume 5. 1-Dimensional Tests









all zones in the geocellular model. (Modified from Durkin et al., 2016)

embedded Markov-chain analysis where the vertical transitions from one facies to another are tallied and divided by the sum total of tallies in order to produce facies transition probabilities. Horizontal transition probabilities (HTP) were calculated using a spatial Markov chain along layers (out to 200 m). These data inform Lithotype Rule (LTR) construction for PGS. Complex transition probabilities are simplified to an LTR, which specifies order of facies transition in models.

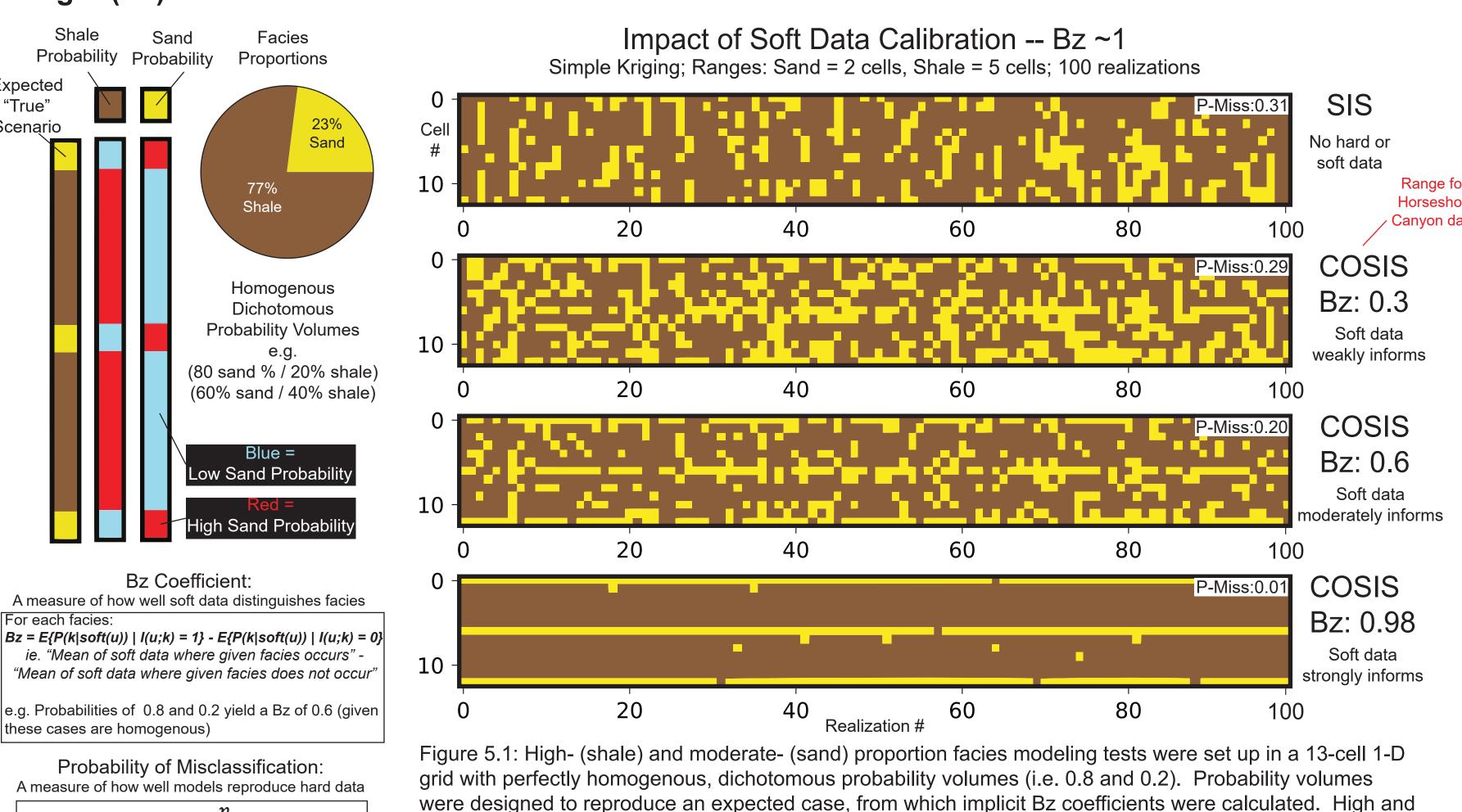
Figure 4.5: Probability Volumes for all facies visualized at sector model transect.

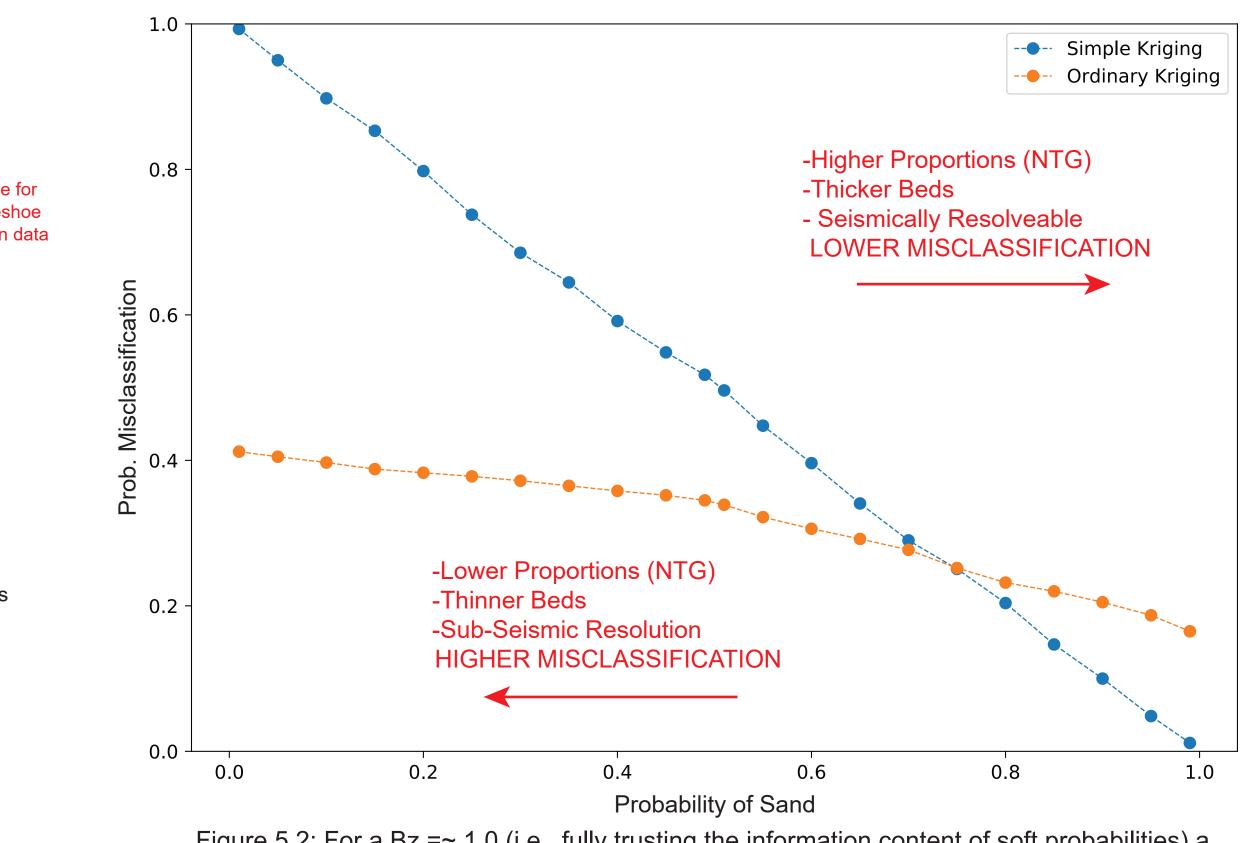
Vertical transition probabilities (VTP) were calculated using an

Fine Sandstone

#### 2 Facies: Sequential Indicator Soft Data Experiment

Simple 1-D, 2 facies test illustrating the impact of 1) soft data probabilities, and 2) how soft data weight (Bz) informs facies distribution.





Probability of Misclassification as a Function of Kriging Style

and Probability of Sand (Bz ~1)

Figure 5.2: For a Bz =~ 1.0 (i.e., fully trusting the information content of soft probabilities) a decreasing probability of sand is linearly correlated to the probability of misclassification of sand. Conceptually, this relates back to seismic resolvability of thin beds. Whether a given facies is high-proportion or not, if it is not distinct in the soft data, it will be of little aid in guiding modeling. Simple Kriging appears to be a better predictor of facies than Ordinary Kriging when probabilities for a given facies are high (i.e. highly distinct), but is a weaker predictor of facies when probabilities are less distinct.

- Employing soft data with a low Bz (i.e., weak soft data conditioning) produces similar results to unconditioned SIS.
- Probability of Misclassification decreases significantly as a function of Bz, but varies whether simple or ordinary kriging is employed.

percent-cases and one with no hard data.

#### 3 Facies: Characterizing Horseshoe Canyon Data

Testing the probability of misclassification when more than 2 facies are present in lower proportions. The hypothesis is that the ability to accurately predict facies will decrease with increasing number of facies.

Type Case: 3.23 % Hard Data, Bz: 0.3,

Simple Kriging; Ranges: Sand = 2.1m, Breccia = 2.7m, Fine-grained = 2.1m; 100 realizations

Squares Error data was collected by comparing an E-Type for each facies to the probability volume,

and Probability of Misclassification was calculated from the true hard data. Each is a proxy for reali-

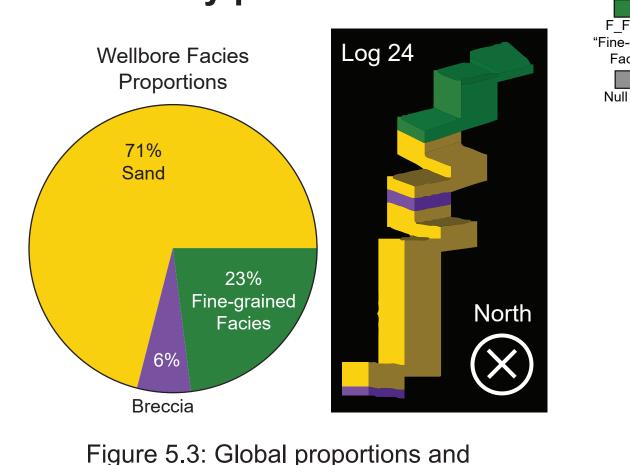
zation fidelity to soft or hard data, respectively.

when soft data weight is high).

rating soft data.

- Probabilities (Fig 4.5) and measured section facies (upscaled to grid) were extracted along log 24 (see Figure 2.1 for location). - Three facies were simulated (sand, breccia, and grouped fine-grained facies) to test the impact of 3
- facies and the "real data" in a simplified 1D test. - COSIS was run with different degrees of hard data conditioning (hard data %) to test the relative impacts of hard and soft data on facies prediction.

c = # of times correct facies simulated

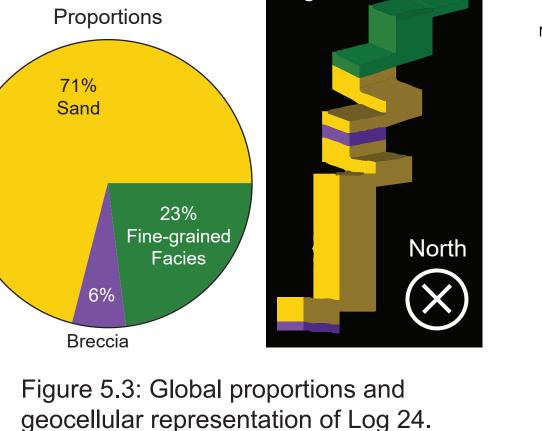


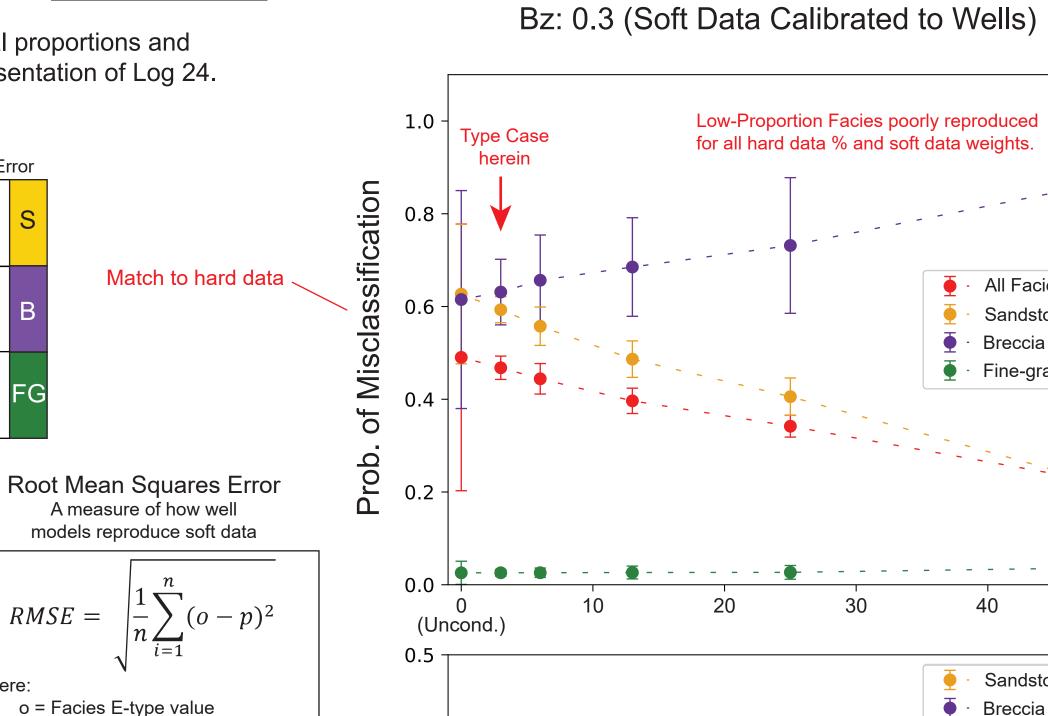
low unconditional Bz scenarios were automated in SGeMS. Probability of misclassification, a measure of

(decoupled for the sake of elucidating the impact of both parameters seperately).

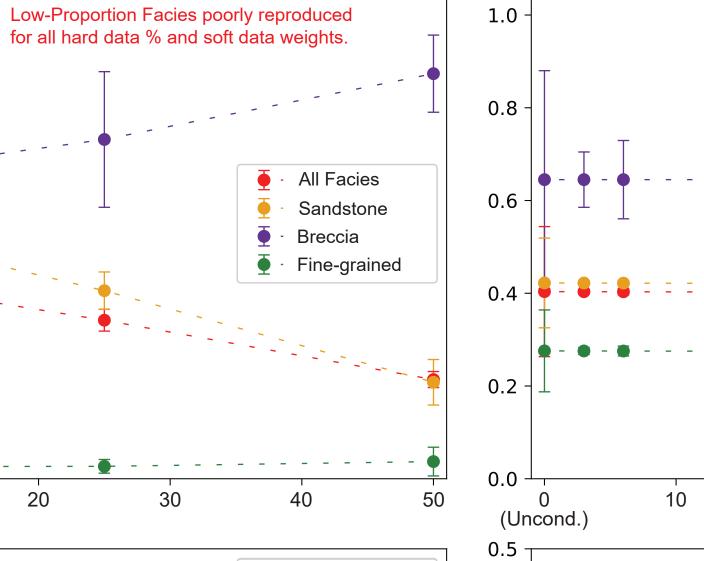
0.0 0.2 0.4 0.6 0.8 1.0

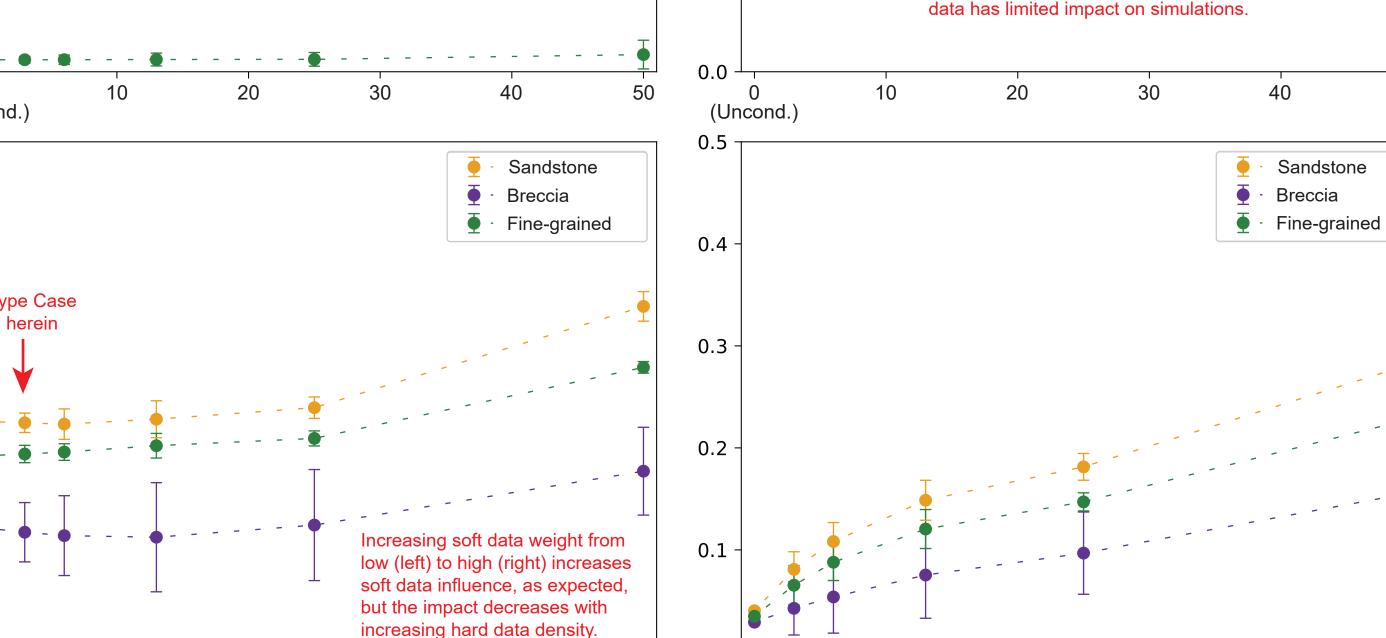
how well realizations reproduce hard data, was used to rank the impact of Bz and ranges of soft probabilities





p = Facies Probability Volume value

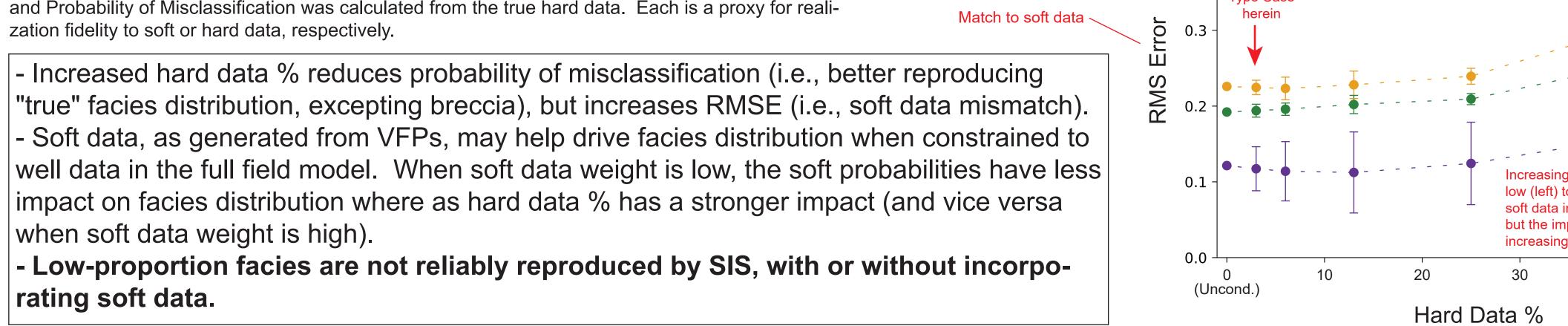




# When soft data weighting is strong, hard data has limited impact on simulations.

Figure 5.4: Hard Data Scenarios extracted from Log 24. 156 hard-data scenarios were tested: 31 at each of 5 different

Hard Data % Impacts on Model Outcomes



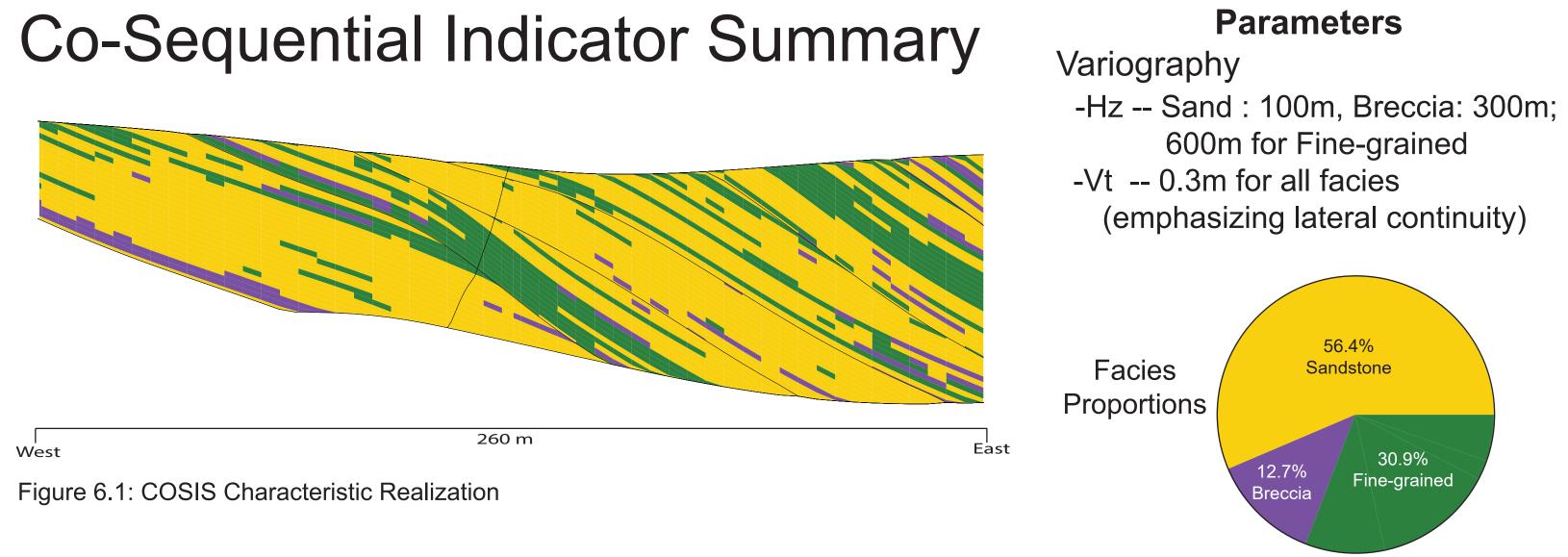
# Hard Data %

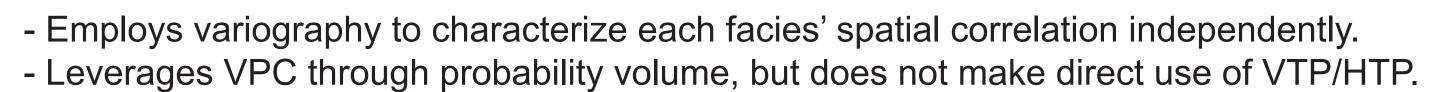
Bz: ~1 (Complete Confidence in Soft Data)

• Breccia

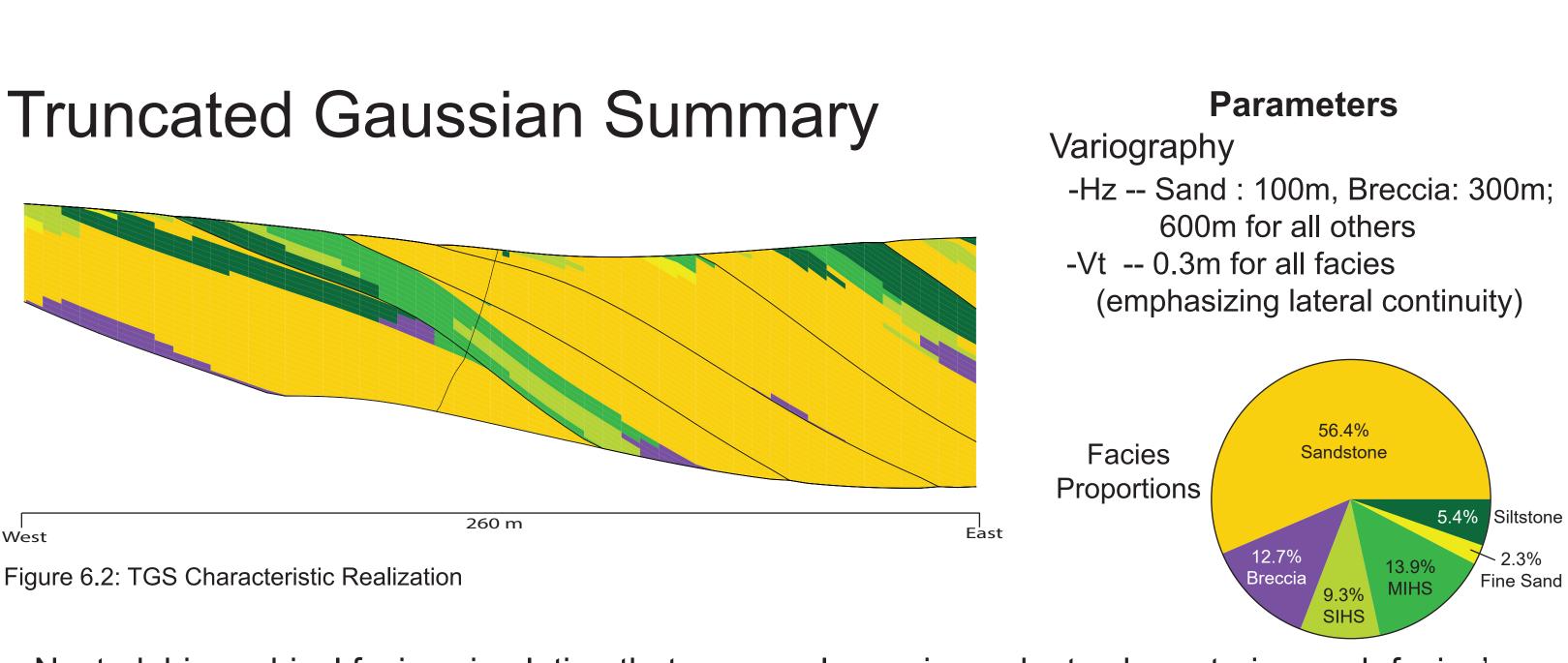
# 6. Results & Problems: TGS & PGS

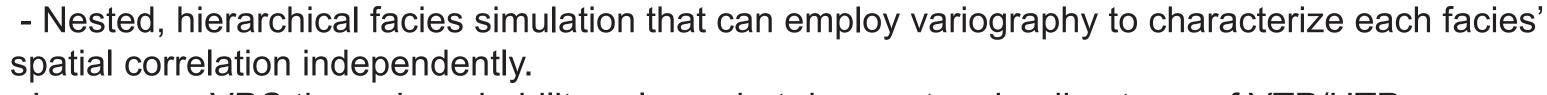
Variogram-based methods were tested for their ability to reproduce facies architecture at the bed-scale. Utilizing a small sector model allows rapid testing of multiple para-





- Honors input variography and proportions (NOTE: this is a 3-facies case).
- Reproduces some outrop essence, but bedding is intermittent.





- Leverages VPC through probability volume, but does not make direct use of VTP/HTP.
- Honors input variography and proportions.
- Reproduces some outrop essence: Breccias are associated with LAP bases and lower-energy facies increase up-section. Smooth transitions between facies packages.
- -This realization incorporates minor smoothing.



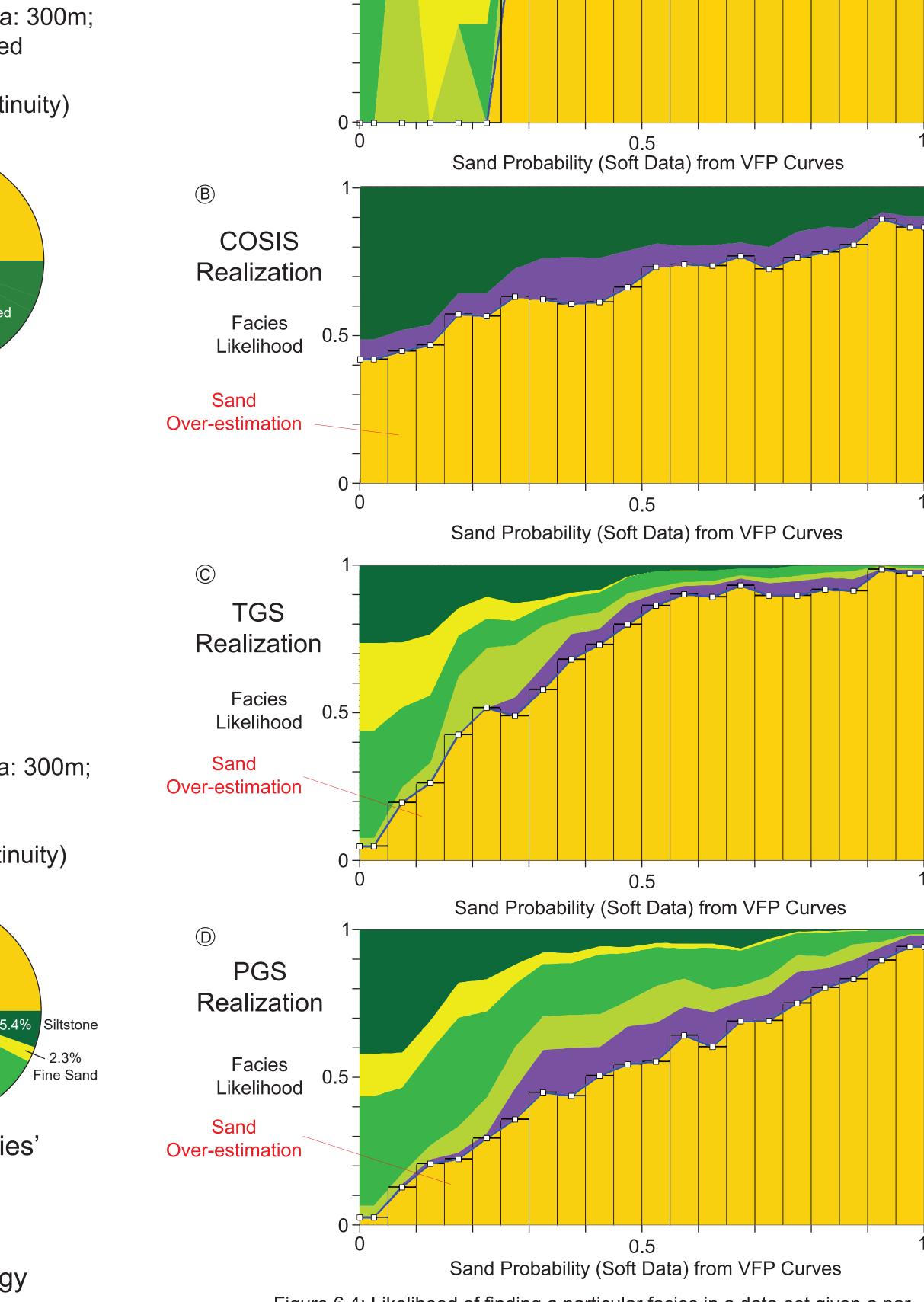


Figure 6.4: Likelihood of finding a particular facies in a data-set given a particular soft data (i.e. VFP) sandstone probability for A) Wells Data, B) COSIS, C) TGS, and D) PGS realizations. COSIS, TGS, and PGS over-populate sandstone at locales with low sandstone probabilities as compared to well data.

- Sand is over-populated in realizations where

probabilities in Fig 6.4 A represent tops of point

fine-grained facies. Fig. 5.4 B to D show that all

The implication is that you are creating more

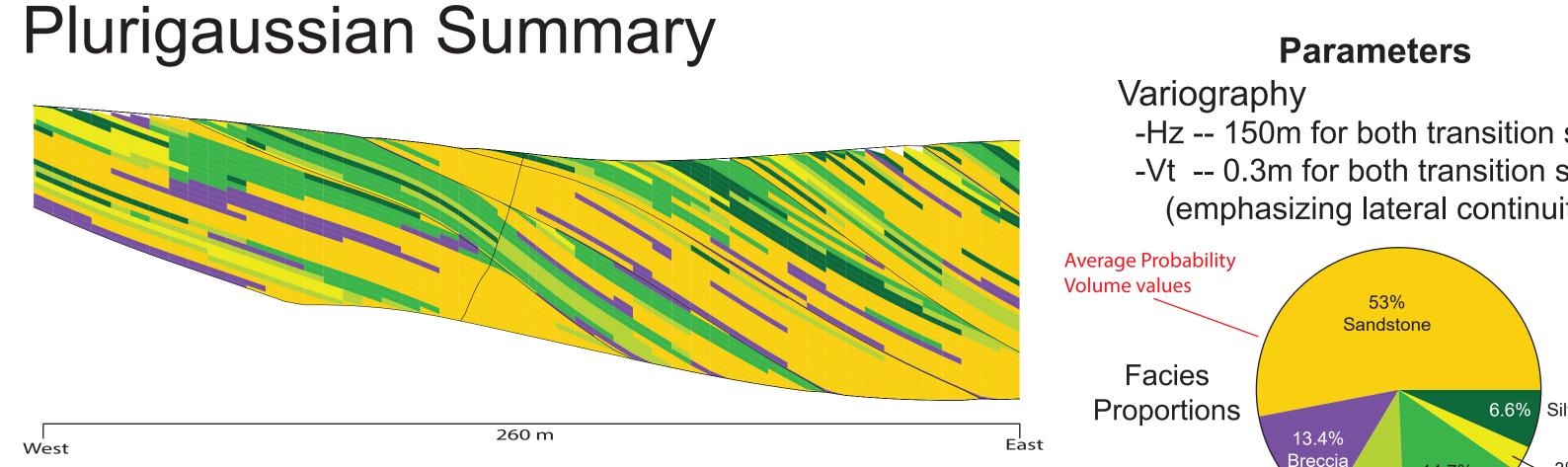
sand probabilities are low (compare graphs

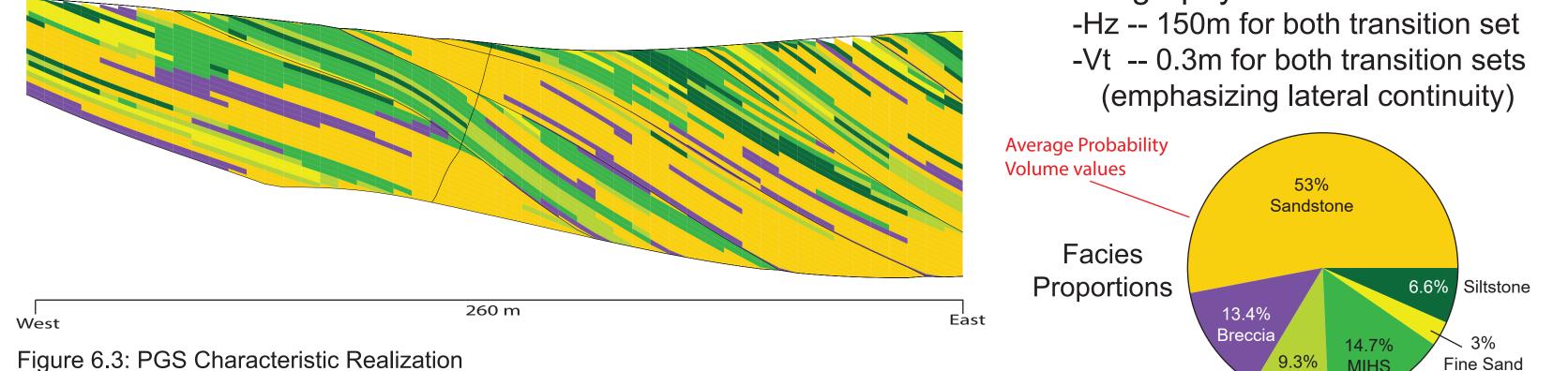
bars, which are filled predominantly by

from models to well data above). Low sand

methods are populating sands in these low

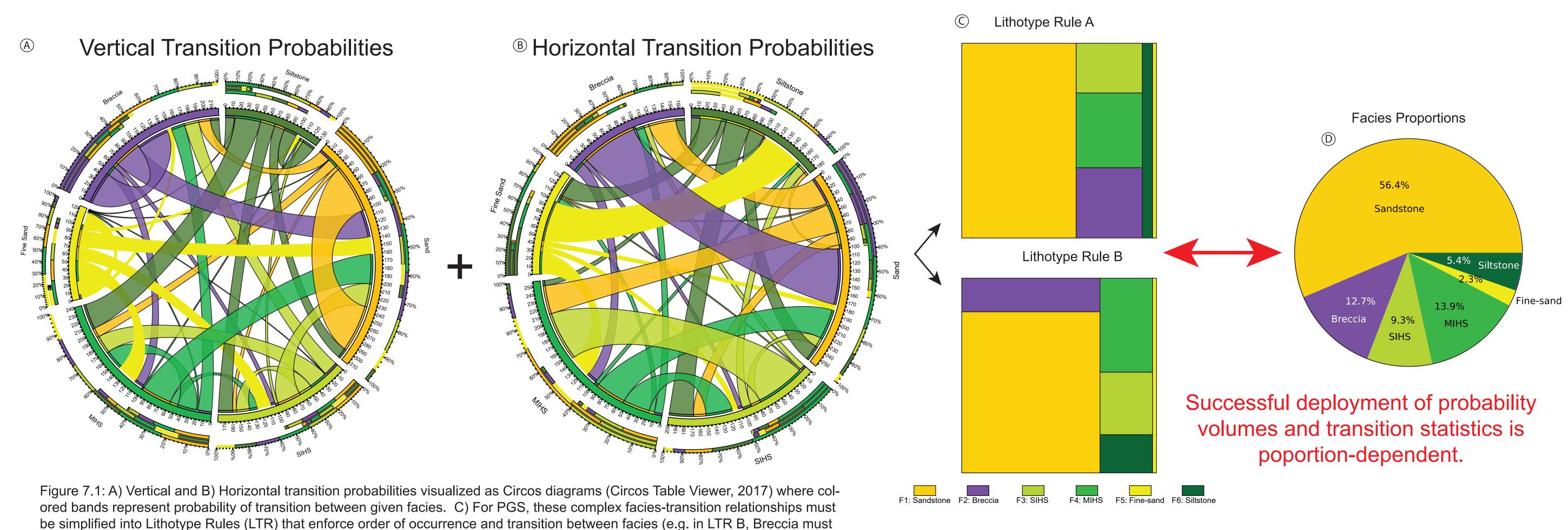
probability zones where they should not be.





- Limited to two variograms per transition set to characterize all facies transition behavior and spatial correlation. - Leverages VPC through probability volume, and approximates VTP/HTP through simplified LTR scheme.
- Honors input variography and proportions.
- Lower-quality reproduction of outcrop essence: facies length-scales and transitions are too variable and chaotic, leading to disorderly realizations.
- flow across point bar tops and decreasing flow across bottoms.

### 7. Problems with Variogram-based Modeling



- Variogram-based modeling sometimes under-represents low-proportion facies.
- PGS and nested, heierarchical TGS adequately reproduce low-proportion facies in realizations.
- Low-proportion facies are baffles and barriers to flow that are important to represent correctly.
- PGS and TGS do not appear to adequately reproduce architecture of low-proportion facies. While we hypothesized that transition statistics could enforce architectural outcomes, Lithotype Rules over-simplify transition probabilities when facies are numerous, and/or given facies are low-proportion, resulting in sub-obtimal realizations.

# 8. Training Image-Based Modeling

lie adjacent to Sand or MIHS). These LTR examples are symbolic of the mean probability of each facies' probability volume and D)

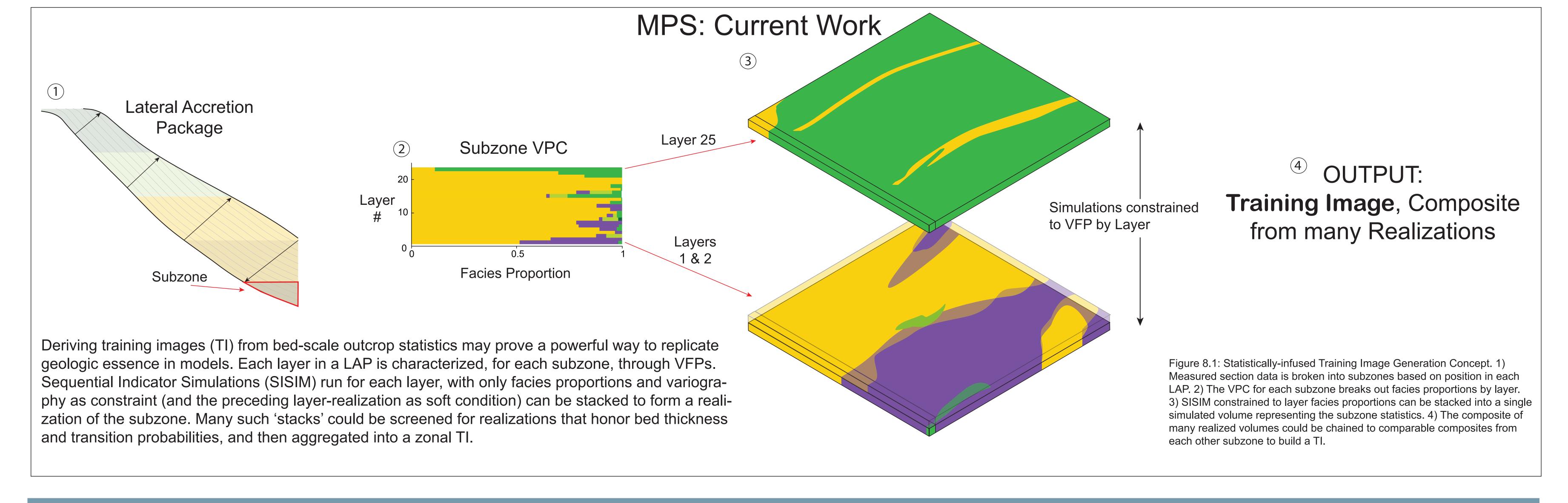
Given the limits of variogram-based modeling, pattern-based modeling may hold the key to bed-scale architecture reproduction through training images development via outcrop statistics.

#### **Candidates Include:**

- Deterministic training images derived from outcrop photopans (see Figure 3.1).
- Widely deployed MPS algorithm. - SNESIM

correspondingly the true measured facies proportions.

- FILTERSIM FILTERSIM can utilize conventional categorical training images, but because FLITERSIM can utilize continuous training images, there is space to experiment with the probability volumes directly.



#### 9. Conclusions

- -COSIS, even with strong soft conditioning, may have difficulty reproducing proportions of facies where the target-proportion is low.
- TGS and PGS reproduce facies proportions correctly, but do not appear to reproduce architecture adequately.
- Pattern-based modeling algorithms will be explored as an option to reproduce bed-scale facies architecture.

#### 10. Acknowledgements 11. References

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