# Quantitative Characterization of Cellular Irregularities in Extruded Polystyrene Foam Using Digital Image Processing and Analysis 

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Motivation and Background
Image Analysis
Correlation of Human Rating with Image Analysis
Conclusions and Path Forward

## Motivation and Background



- Flow - induced cell size irregularities in extruded foam structure $\rightarrow$ foam pattern
- Overall pattern strength
" Magnitude of difference between "small" and "large" cells
" Sharpness of boundaries between small-cell and large-cell domains
» Cell size consistency within domains
- Overall pattern shape due to extent of correlated sizes
- Historic human panel rating is inconsistent.
- Ubiquitous foam patterns + difficulty to quantify $\rightarrow$ need for robust analytical method


## Image Analysis - Method



Grayscale Background correct

- Ridge isolation: Remove Outliers... "bright" and "dark"
- Find Ridges (Variance, Brightest, Darkest)
- Pattern-based feature acceptance/rejection
- Quantitative pattern assessment
- Line and Chevron count
- Summed line length
- Contrast-weighted line length (Ridge Factor)



## Variance Filter

Find Ridges (Variance example)


## Image Analysis - Detail of Keep/Reject Results



Quantitative Foam Pattern Analysis - Heeschen/Woodcraft - ImageJ 2015

## Image Analysis - Several Examples



Quantitative Foam Pattern Analysis - Heeschen/Woodcraft - ImageJ 2015

## Correlation of Human Rating with Image Analysis

- Criteria (broad descriptions)
- Panelists ranked same images as image analysis algorithm
- Lowest rating (1) = least pattern features (lines, chevrons)
- Highest rating (10) = most pattern features
- Averaged survey data compared to image analysis measures
- Reasonable statistical correlation between human perception and image analysis data $\rightarrow$ model is useful!

```
Survey data
(9 panelists)
```



$\mathrm{P}<.0001$ RMSE $=1.0418$

## Key ImageJ functions, plugins, etc.

- Remove Outliers... (built-in)
- Bring locally-bright (dark) pixels in line with bulk in region
- Consolidate ridge (valley)
- Variance... (built-in) to find "slopes" between ridges and valleys.
- Find_Ridges (plugin by Bob Dougherty, OptiNav, Inc., )
- Isolate gray-level ridges
- Applied to "bright", "dark" and variance images
- BinaryConnectivity to isolate nodes/trunks/branches in skeleton (from Gabriel Landini's Morphology Package:
- ROI Manager (built-in) to manage feature boundaries


## Classifying Feature Outlines

- Get XY coordinates of isolated-line skeletons (no nodes)
- Find and assign ends, then eliminate the "other half" of the outline
- "Line" vs "Chevron" from net curvature
- Pointing direction (must point to center of pattern)
- Lines (slope/intercept passes through center)
- Chevron (use triangle to assess pointing direction)
» Base = two ends
» Vertex = point along curve at maximum distance from base
" "Orientation" is line from mid-point of base to vertex


## Conclusions and Path Forward

- Current image analysis method generates reasonable agreement with panel results
- Opportunities:
- Auto-center analysis region (special case for radial pattern)
- Better filtering for "crossing" ridges
- Adaptive recognition of chevrons


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## End Of Talk



