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# Fractal Dimension: correlate performance to images

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<https://pearl.plymouth.ac.uk/handle/10026.1/21982>

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# **Fractal Dimension: correlate performance to images**

**John Summerscales**

Composites Engineering

MAterials and STructures (MAST) research group



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# Outline of talk

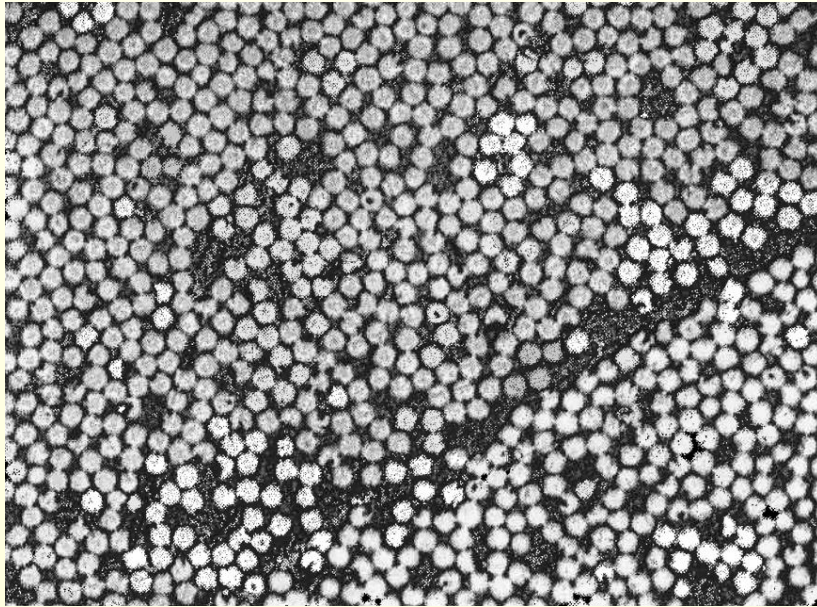
- composites
- fractal dimension (FD)
- characterisation of reinforcement fabrics
- permeability of reinforcement fabrics
- gel-coat surface quality
- resin-rich volumes
- conclusions



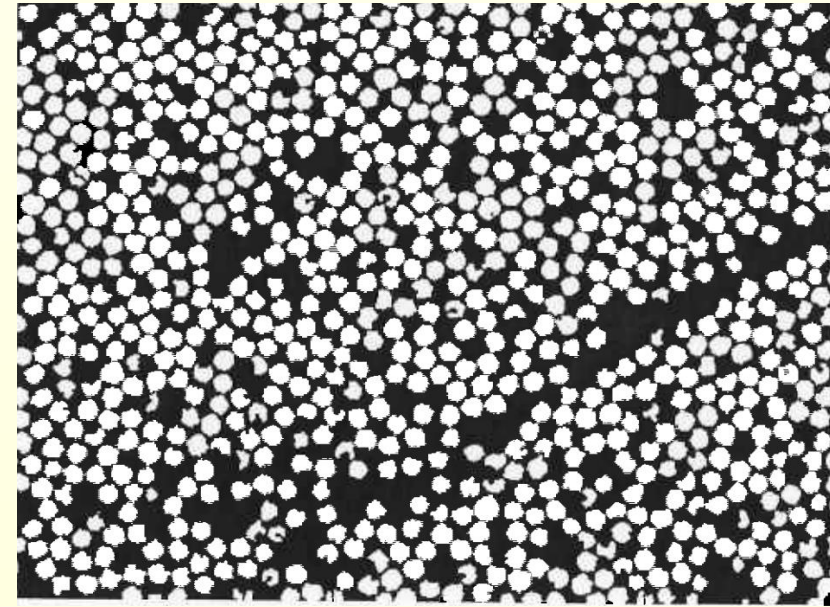
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# Composites

- Fibre (reinforcement) + matrix (polymer) = composite



raw image



segmented binary image

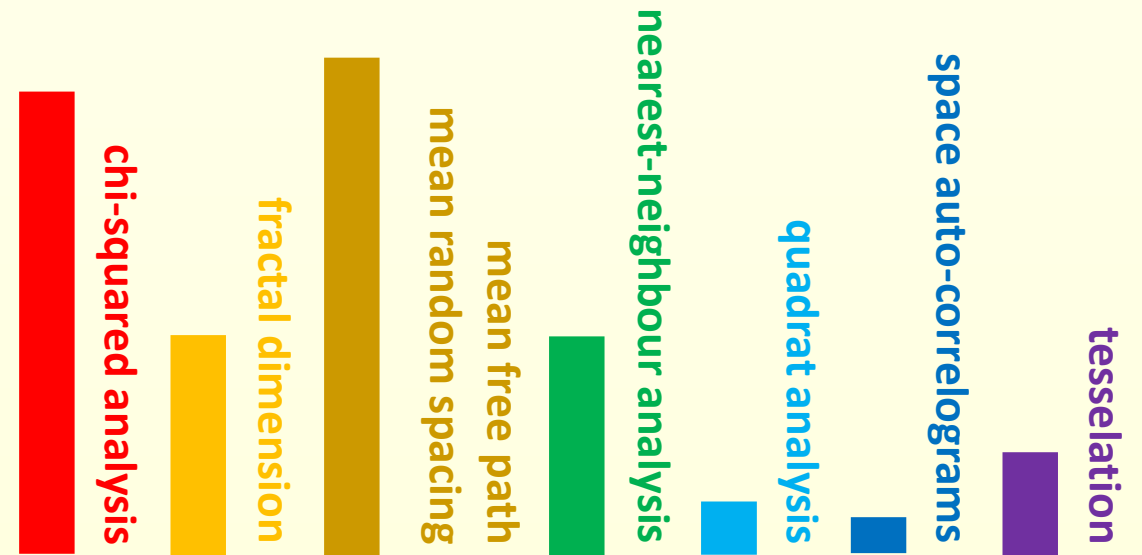
carbon fibres  $\sim 7 \mu\text{m}$  diameter



# Quantifying spatial distribution

• 334k  
quadrat analysis

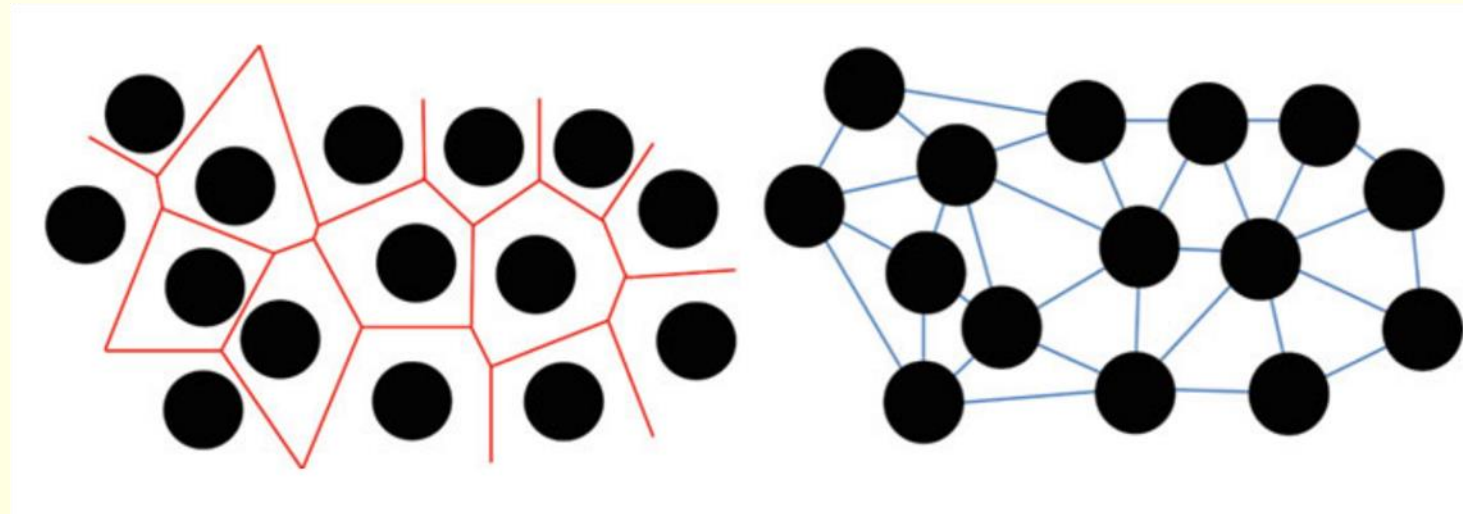
Google	Technique
3040k	chi-squared analysis
1440k	fractal dimension
3280k	mean free path/mean random spacing
1450k	nearest-neighbour analysis
334k	quadrat analysis
22k	space auto-correlograms
67k	tesselation



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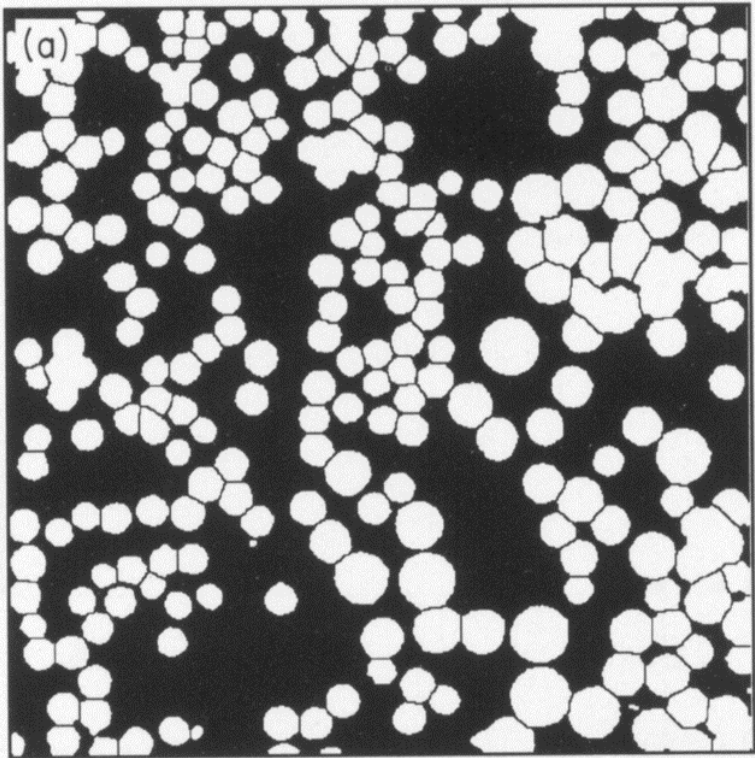
# Tessellation

- covering a plane with congruent polygons
- Voronoi (left) or Dirichlet (right) cells
  - each point in space assigned to the nearest particle

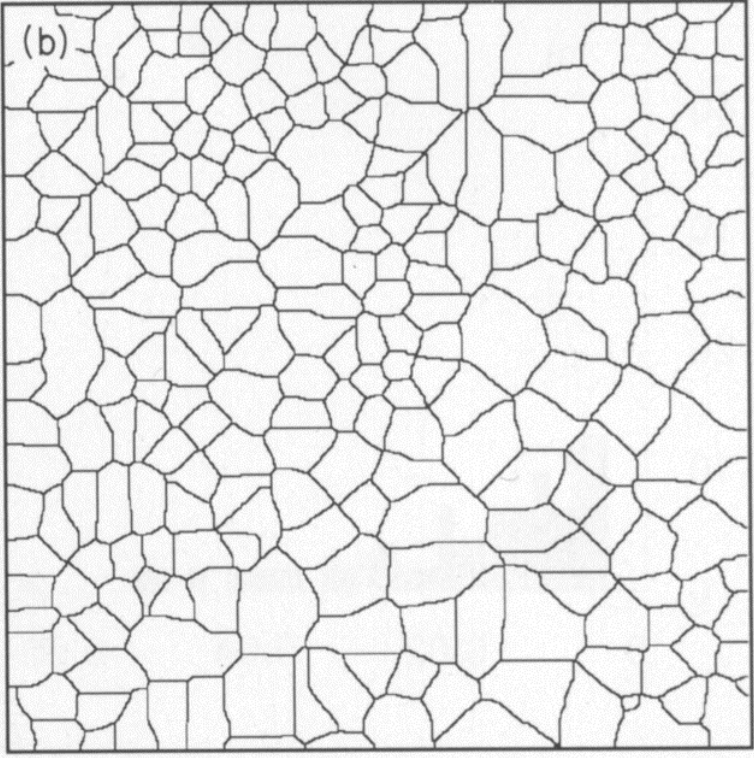




# Voronoi cells



segmented binary image



zones of influence

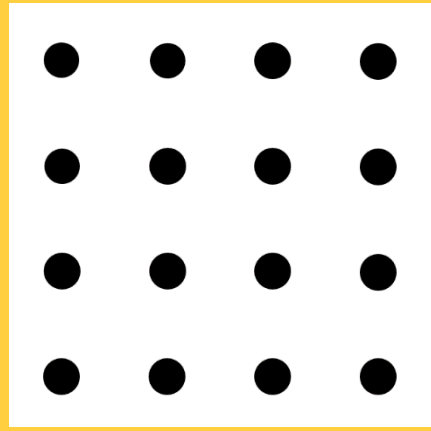


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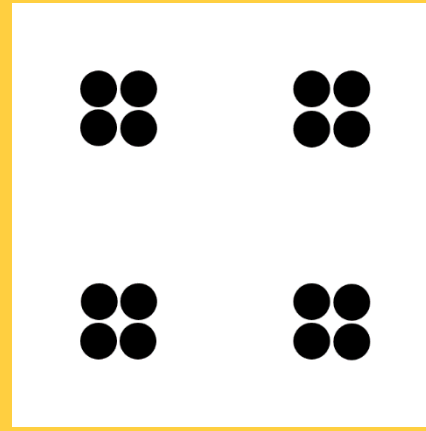
# Indicative images and fractal dimension



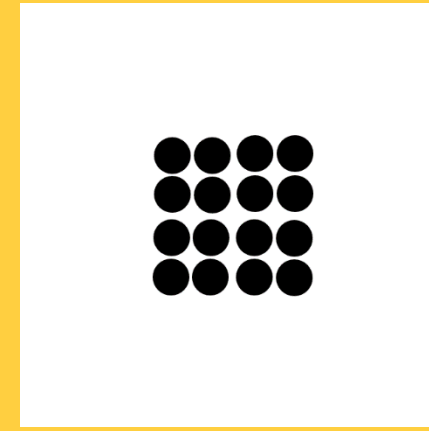
**0.0000** one small black dot



**1.5501**



**1.7363**



**1.8370**



**1.9951** one small white dot

Analysis in **ImageJ** with **FracLac** software

0 = point  
1 = line  
2 = area  
3 = volume

- Image > Type > 8 bit
- Image > Adjust > Threshold
- Process > Binary > Make Binary
- Analyze > Tools > Fractal Box Count
- FD from Richardson plot



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# FD box counting method

- can be applied to both linear and non-linear fractal images,
- applicable to patterns with or without self-similarity
- cover the image with small boxes
- count the boxes containing feature of interest
- increase box size, and count ... repeat with larger boxes
- plot detected area against box size
- FD is slope of graph



# Progress of talk

- fractal dimension (FD)
- characterisation of reinforcement fabrics (Dominik Piasecki)
- permeability of reinforcement fabrics
- gel-coat surface quality
- resin-rich volumes
- conclusions



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# Carbon fibre fabrics examined in this study

- all fabrics woven by Carr Reinforcements

fabric style	areal weight	warp tows/m	weft tows/m
plain weave	300 g/m <sup>2</sup>	380	380
single tow twill (STT)	320 g/m <sup>2</sup>	380	420
double-tow twill (DTT)	375 g/m <sup>2</sup>	380	380

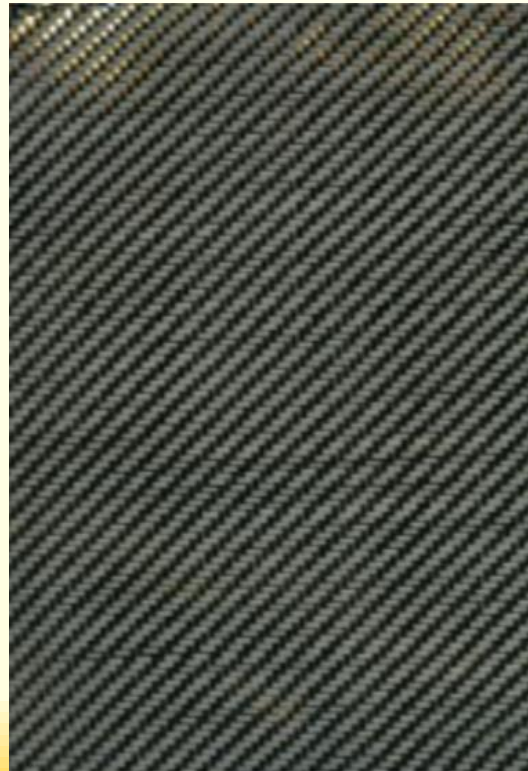


# Carbon fibre fabrics examined in this study

plain weave



single tow twill



double tow twill


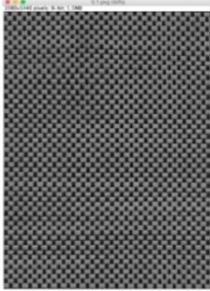
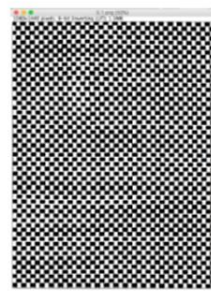
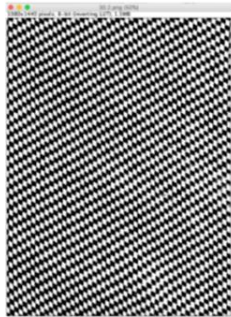




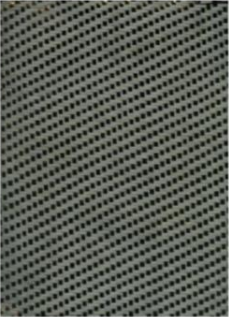
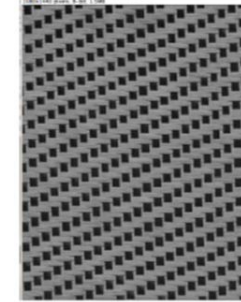
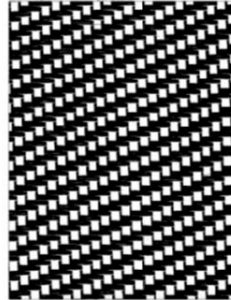
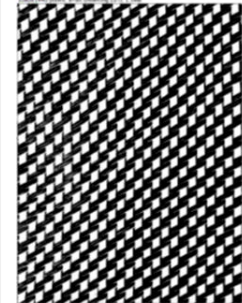


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# Fabric images

- images acquired by high-resolution scanner

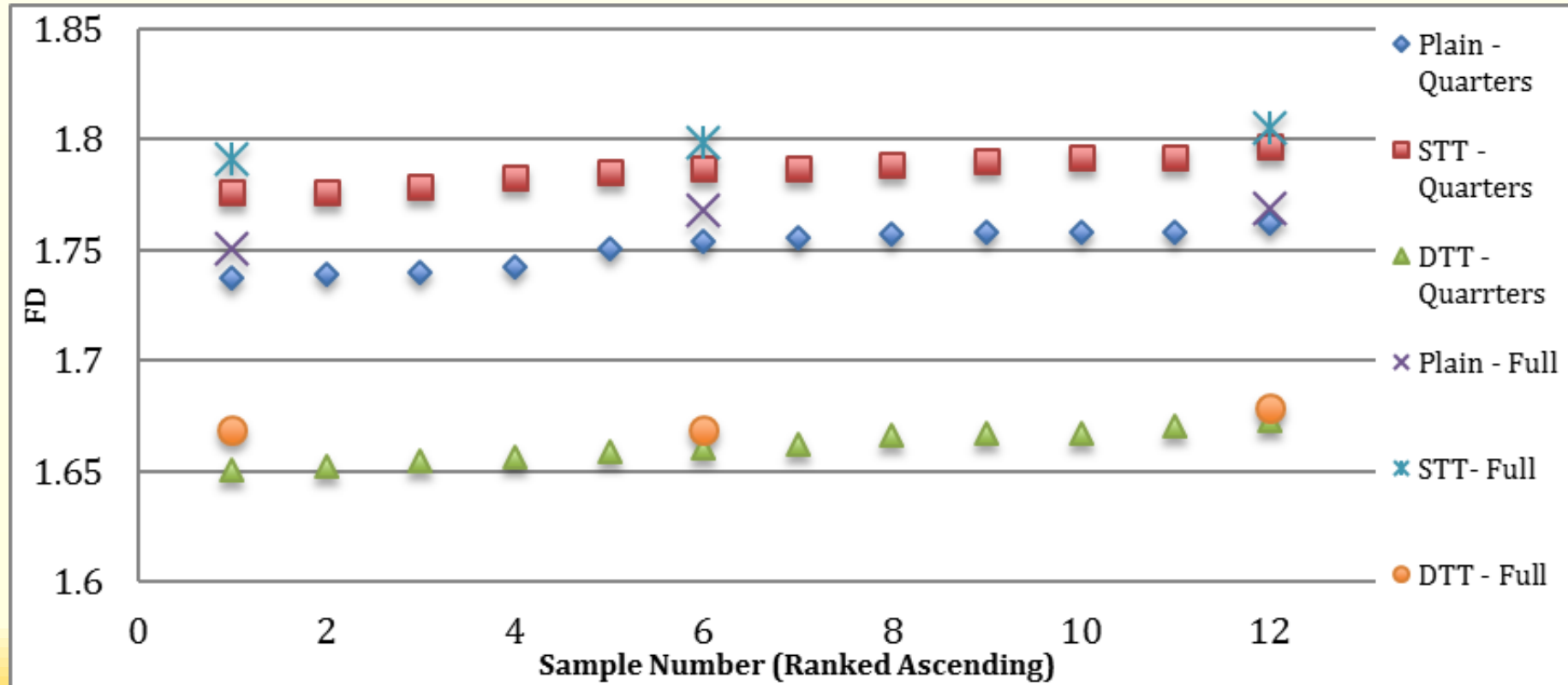
Weave Style	Original full size image	Cut to size and turned into 8 bit grey scale	Binary Images	Sample Images sheared to 30 degrees	FD Values for binary images at 0 degrees of shear
Plain					FD=1.8244
Single Tow Twill					FD=1.7826
Double Tow Twill					FD=1.8662



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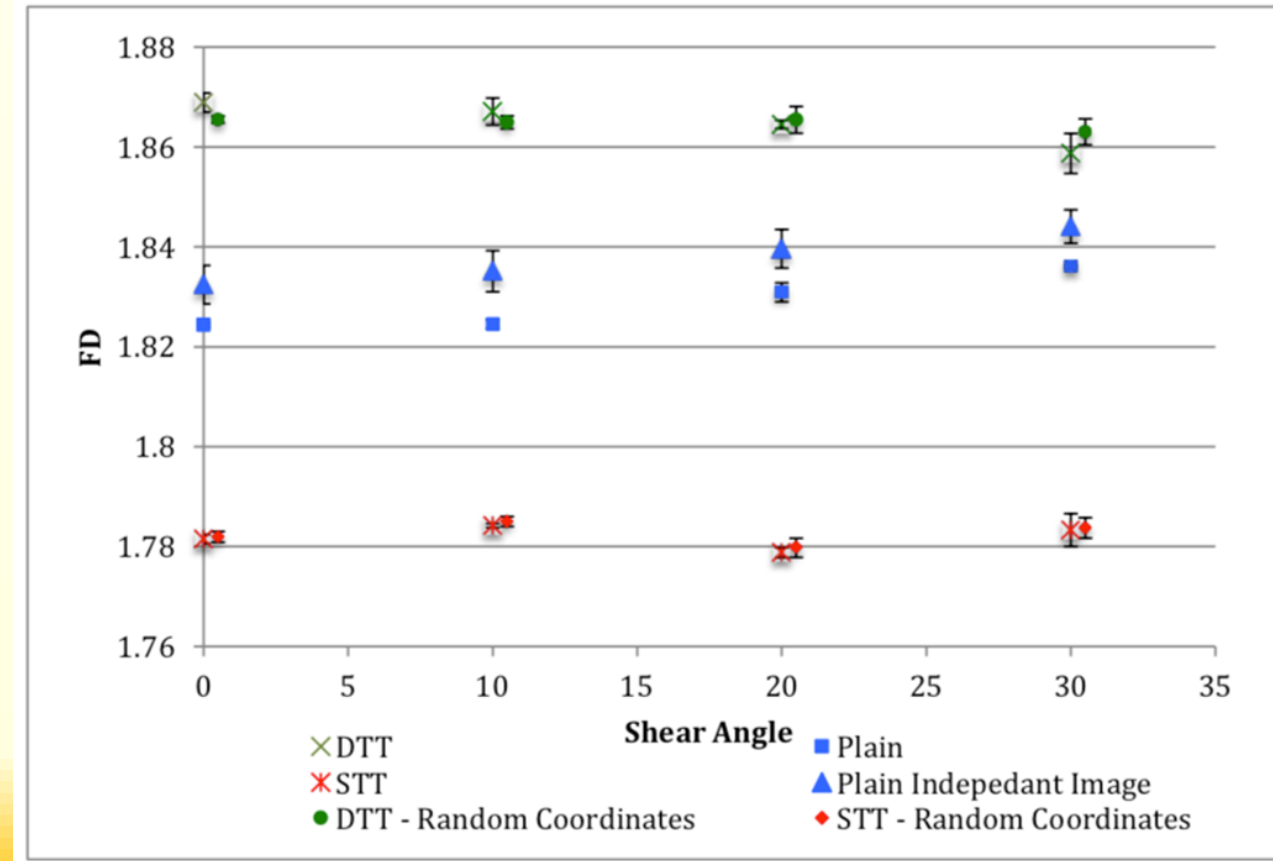


# FD from separate images



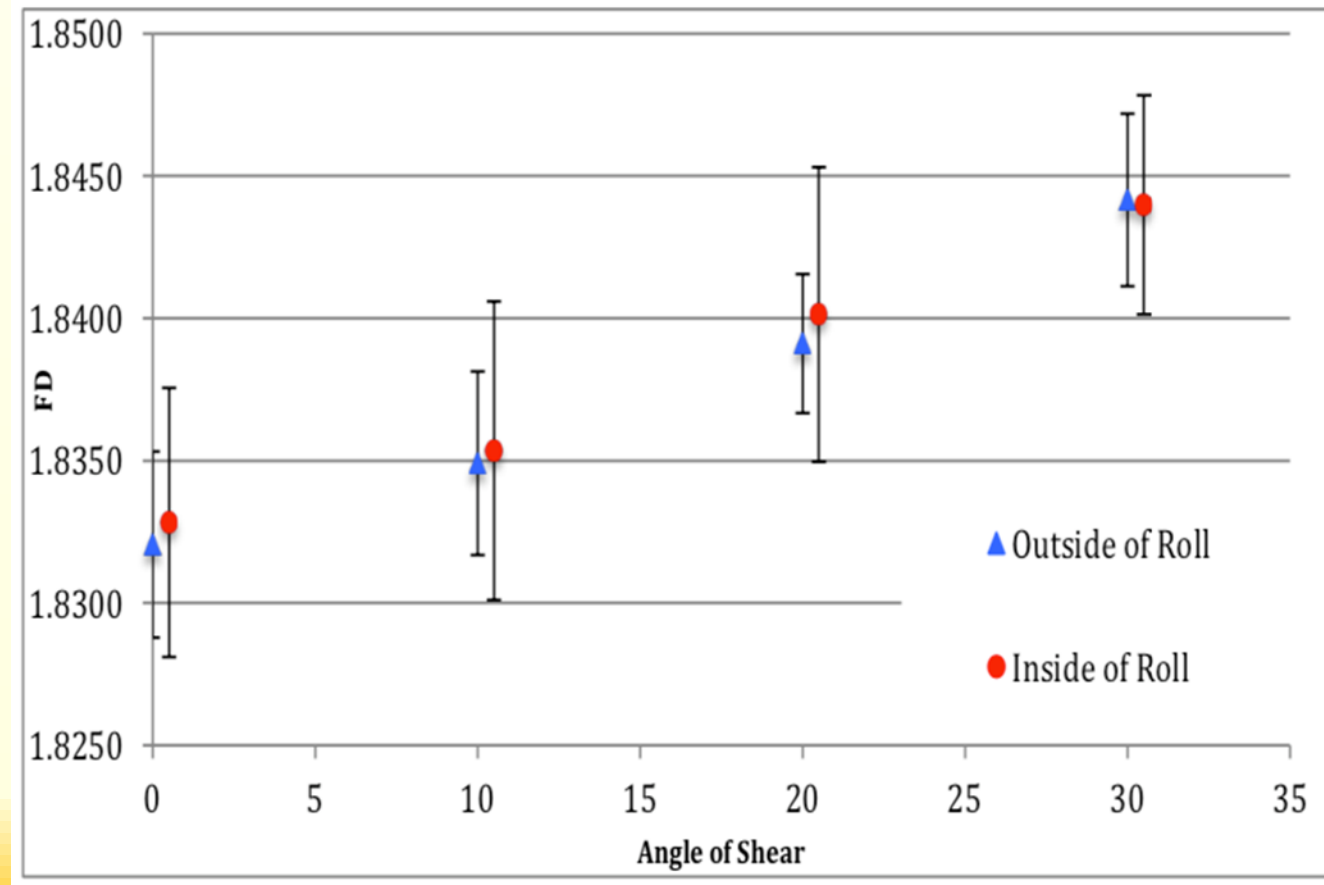
# FD vs fabric shear angle

- double tow twill
- plain weave
- single tow twill



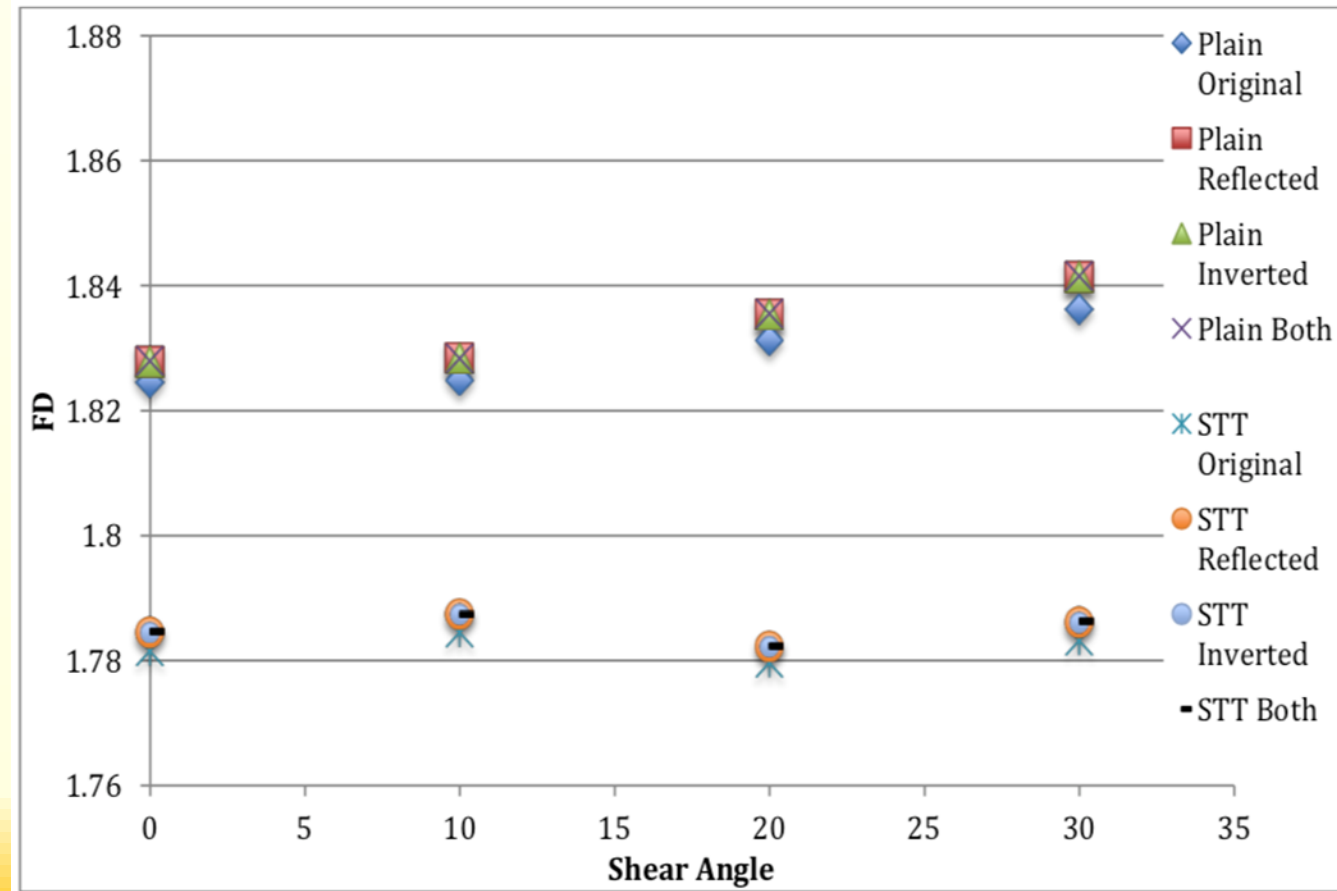
# Plain weave fabric curvature

- inside of roll
- outside of roll
- FD increasing with shear angle  
**not** seen for twill fabrics



# Digital inversion/reflection of images

- FD consistent regardless of image orientation



# Characterisation conclusions

- Different fabrics have distinct FD values
- Fractal dimension
  - remains distinct after shearing to 30°
  - independent of inside/outside of roll
  - independent of reflection/inversion of images
- potential for implementation in manufacturing quality systems



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# Progress of talk

- fractal dimension (FD)
- characterisation of reinforcement fabrics
- permeability of reinforcement fabrics (Neil Pearce)
- gel-coat surface quality
- resin-rich volumes
- conclusions



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# Liquid Composite Moulding (LCM)

- dry fibres preformed on mould tool
- liquid resin flows through porespace
- chemistry, and heat, causes liquid to solidify
  
- Resin Transfer Moulding (RTM)
  - two solid mould tools
- Resin Infusion under Flexible Tooling (RIFT)
  - one solid mould tool and one flexible membrane



# Darcy's law ..and.. Carman-Kozeny-Blake

- Darcy  $Q = K.A.\Delta P / \mu.L$
- Kozeny-Carman  $Q = \epsilon.A.m^2.\Delta P / k.\mu.L$
- Blake defined hydraulic radius, m:

the volume in which fluid actually flows

$\epsilon V$  (where  $V = AL$ ) divided by the wetted surface area ( $S$ )

- until fibres touch, increase in surface area linear with  $V_f$
- $V_f$  is substituted for  $S$

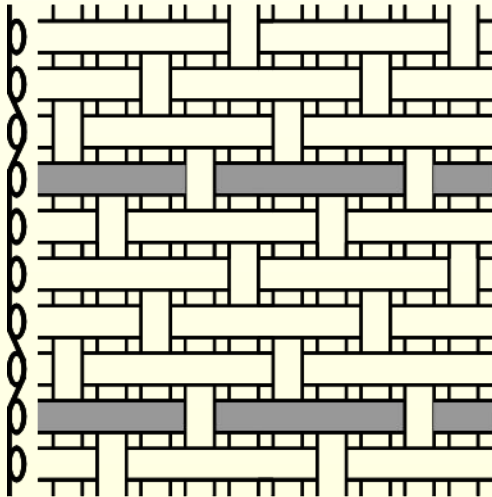
$$\therefore K \propto (1-V_f)^3/V_f^2 \quad \text{or} \quad \epsilon^3/(1-\epsilon^2)$$

A	= CSA normal to flow direction	(m <sup>2</sup> )
K	= permeability	(m <sup>2</sup> )
k	= Kozeny constant	
L	= length of porous bed	(m)
m	= hydraulic radius	(m)
Q	= volumetric flow	(m <sup>3</sup> /s)
S	= wetted surface area	(m <sup>2</sup> )
V	= volume	(m <sup>3</sup> )
$V_f$	= fibre volume fraction	
$\Delta P$	= pressure drop	(Pa)
$\epsilon$	= porosity ( $1-V_f$ )	
$\mu$	= fluid viscosity	(Pa.s)

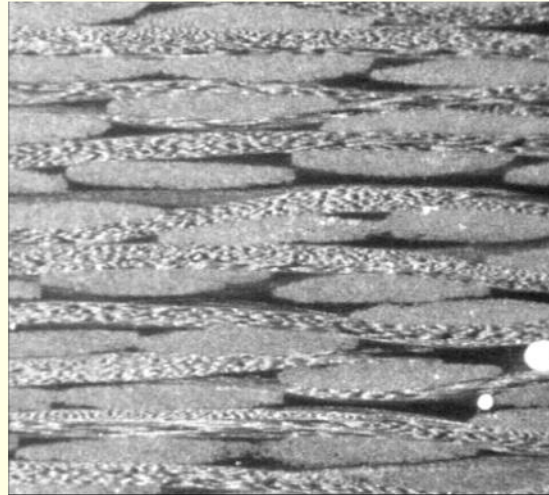


# Satin weave

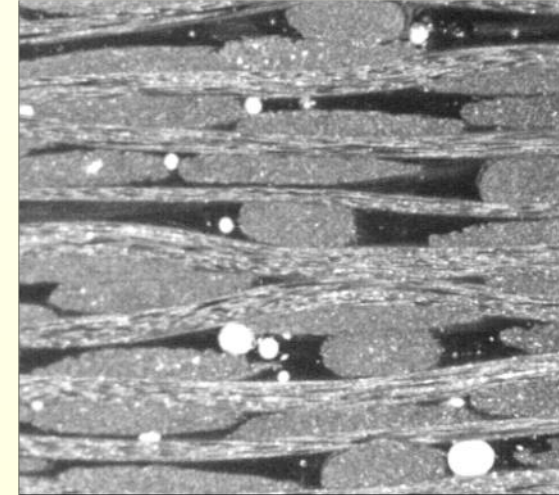
schematic



standard fabric



Injectex



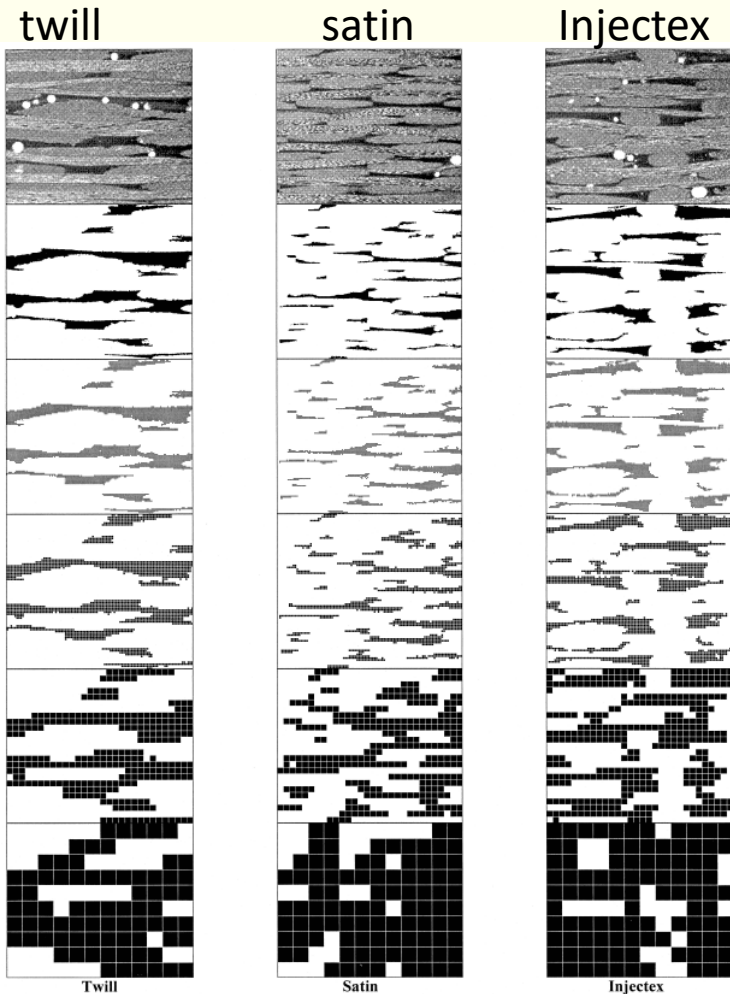
carbon fibre  $\sim 7 \mu\text{m}$  diameter  
 $\sim 10,000$  fibres/square mm  
with clustered distribution

$\sim 3 \text{ mm}$



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# Pearce PhD ~ permeability and strength vs FD



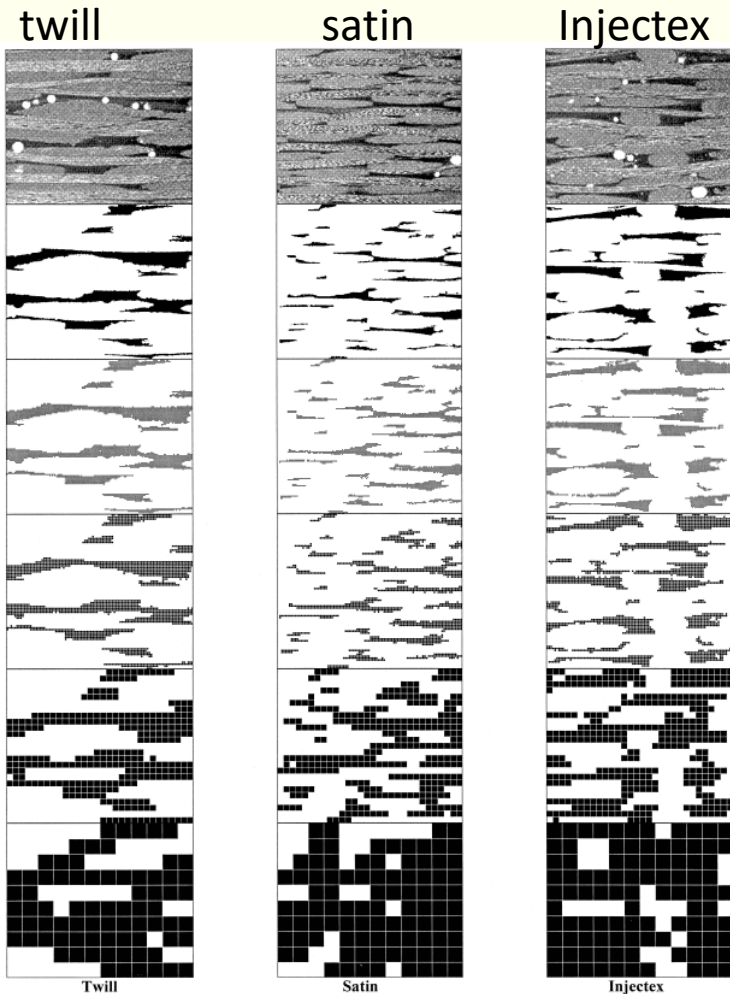
comparison of three Brochier fabrics



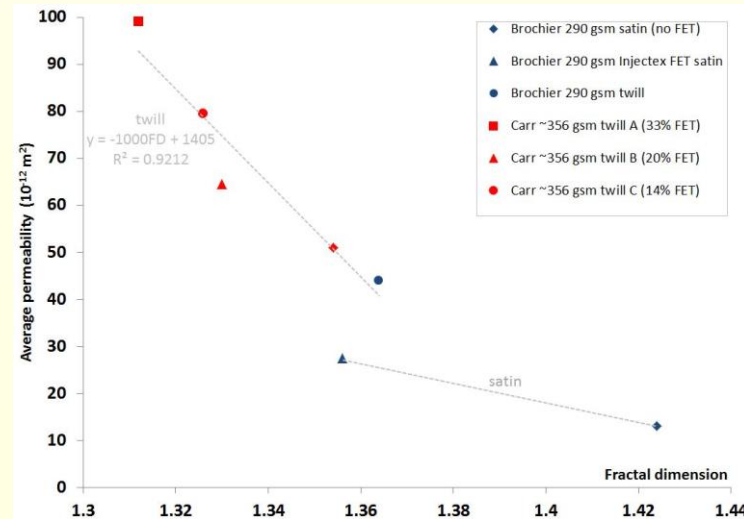
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# Pearce PhD ~ permeability and strength vs FD

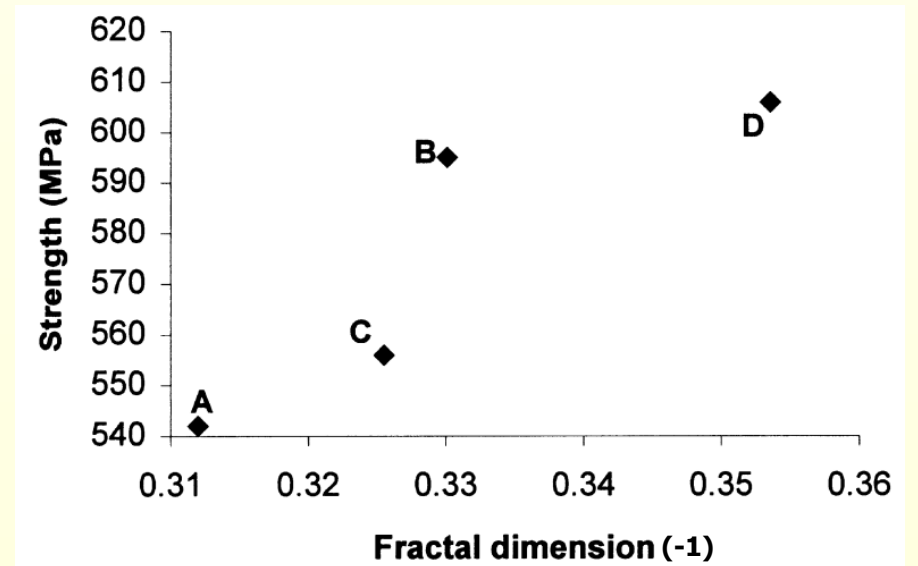


permeability



FET twill strength

A 33% FET, B 20% FET,  
C 14% FET, D 0% FET



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# Progress of talk

- fractal dimension (FD)
- characterisation of reinforcement fabrics
- permeability of reinforcement fabrics
- gel-coat surface quality (Quentin Labrosse)
- resin-rich volumes
- conclusions



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# Gel Coat

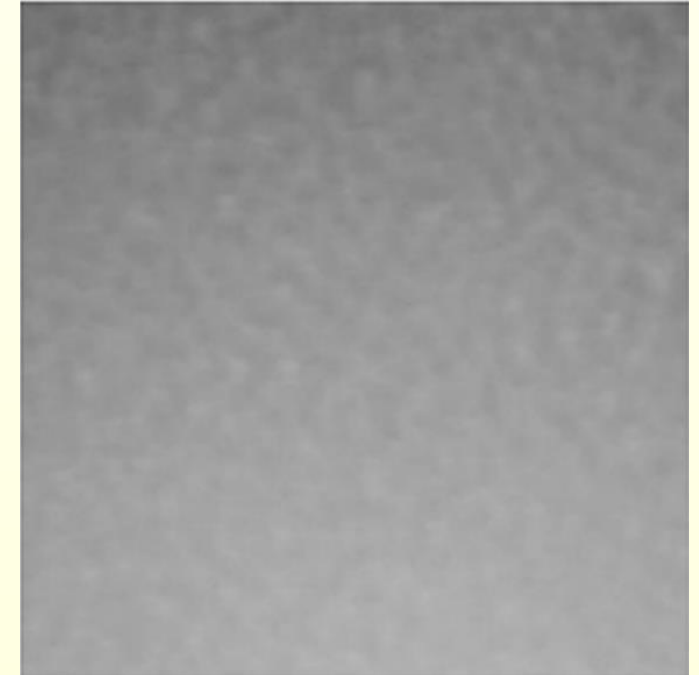
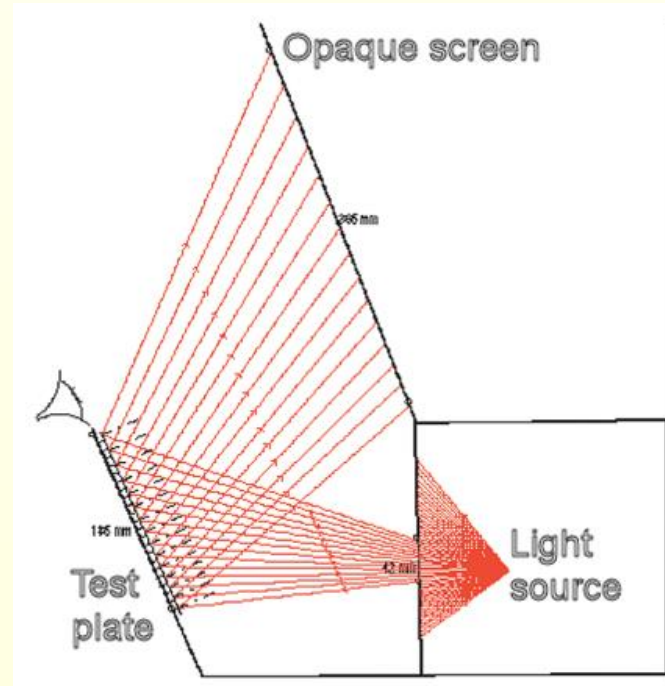
- cosmetic surface on a composite moulding
- high-quality needed for customer satisfaction
- measured by BYK Wave Scan Dual ~£25k
- measured by Image J freeware and digital camera <£1k



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# InGeCt in-mould gel coating ~ surface finish vs FD

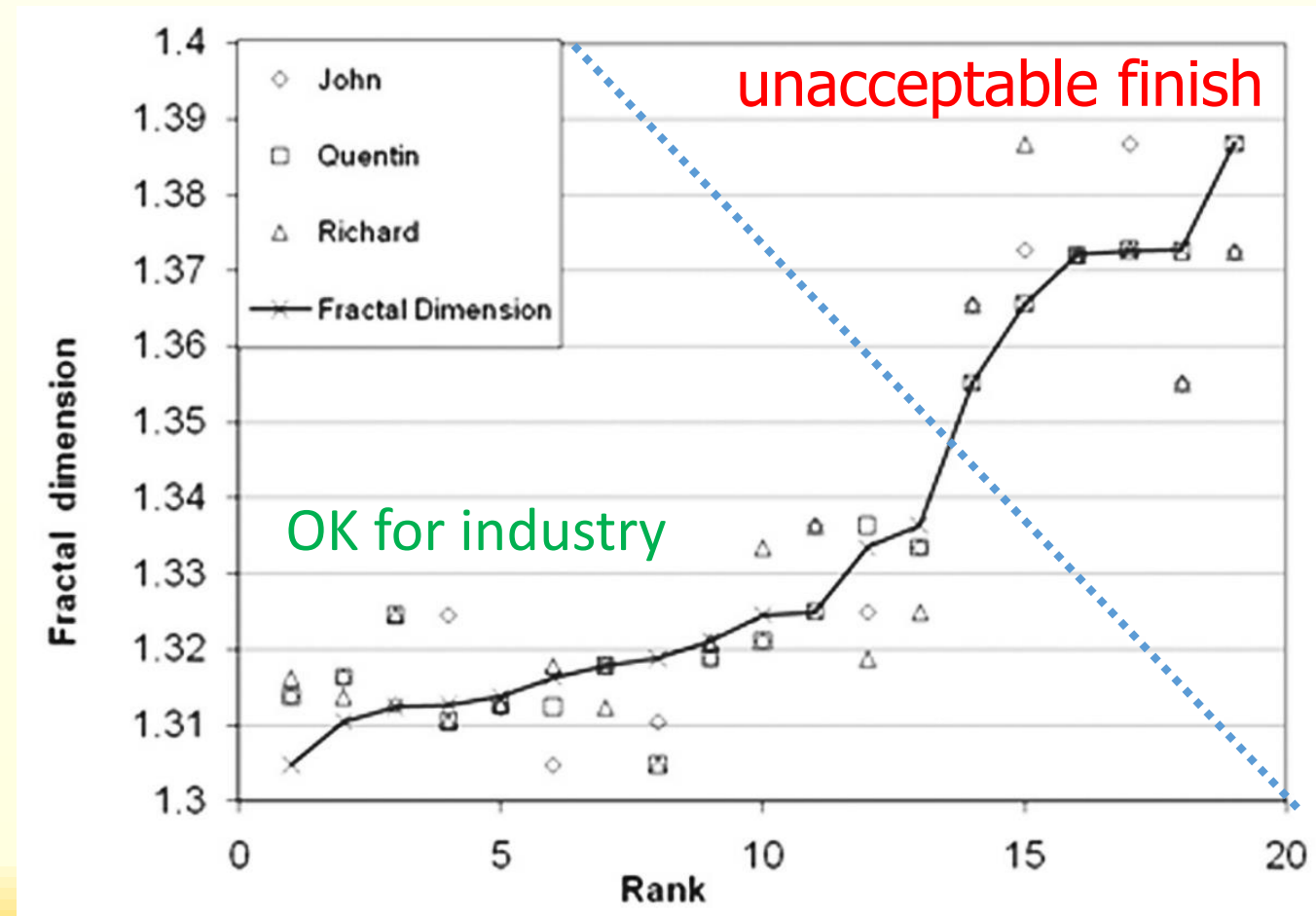
- FD of reflection from plate surface under controlled lighting
- 19 plates ranked by 3 staff in Plymouth
- 2 professional composites engineers (automotive/marine) rated the plates



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# InGeCt in-mould gel coating ~ surface finish vs FD

- 2 professional composites engineers (automotive/marine) confirmed that the finish on the latter six would be **unacceptable** to the industry.





# Progress of talk

- fractal dimension (FD)
- characterisation of reinforcement fabrics
- permeability of reinforcement fabrics
- gel-coat surface quality
- resin-rich volumes (Amjed Mahmood)
- conclusions



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# Mahmood PhD

- clustered fibres create resin-rich volumes
- static and fatigue properties in four-point bend correlated to fibre distribution characterised by FD
- ultimate flexural strength (UFS) of composite clearly dependent on the fibre distribution.

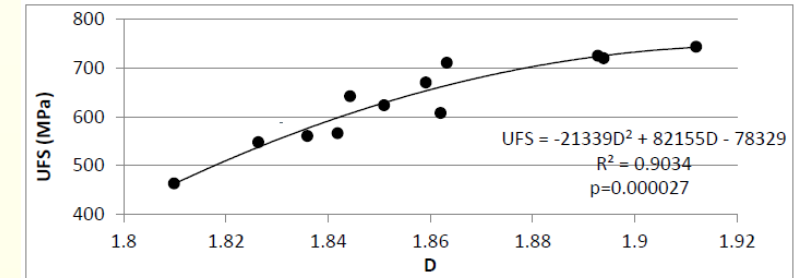


Figure 2: Ultimate flexural strength (UFS) versus fractal dimension D.

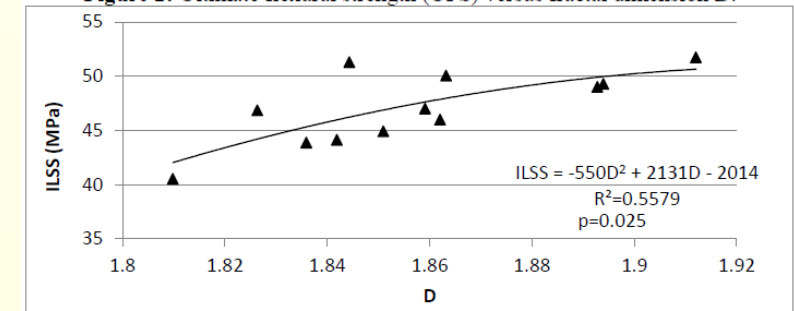


Figure 3: Interlaminar shear strength (ILSS) versus fractal dimension D.

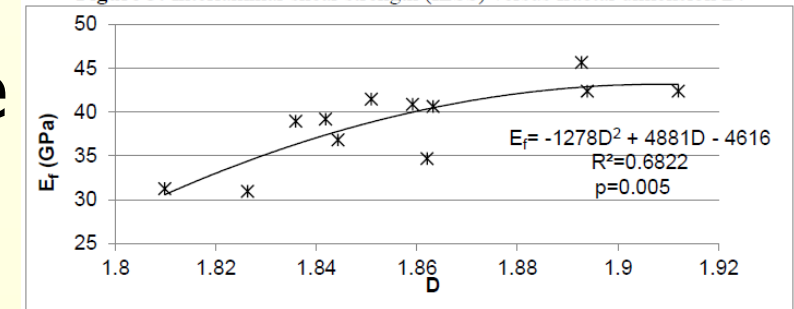


Figure 4: Flexural modulus of elasticity ( $E_f$ ) versus fractal dimension D.



# Conclusions

- Clustered fibres
  - increase permeability, and processability
  - decrease strength
- Fractal dimension quantifies images as single real number
- FD can be applied across many systems

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# Key publications

- **Piasecki** reinforcement fabrics

- 1 Dominik Piasecki and JS, SAMPE Europe Conference 2018

- **Pearce** PhD ~ correlation to permeability and strength

- 2 NRL Pearce et al, Composites Part A, 1998, 29A, 829-837.

- 3 J Summerscales et al, J. Microscopy, 2001, 201, 153-162

- **InGeCt** in-mould gel coating ~ correlation to surface finish

- 4 Q Labrosse et al, Insight, 2011, 53, 16-20.

- **Mahmood** PhD ~ static and fatigue flexure

- 5 AS Mahmood, IOP Conference Series:

Materials Science and Engineering, 2018, 388 (conference 1), 012013.



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# This presentation on PEARL

- QR code to be added after upload!



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