

# Applied Spectral Fractal Dimension

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# Outline



- Introduction
- The fractal dimension
- Measuring fractal dimension (FD)
- Spectral fractal dimension (SFD)
- Algorithm of the SFD
- Practical Application of SFD
- Conclusions

# Introduction



Great expectations in 1980s in connection  
with practical applications of fractals

- simulation of chaotic phenomena  
(earthquake, tornado)
- examination of material (solid-state) structure
- modelling real processes
- computer animation, etc.

What does it mean the fractal?

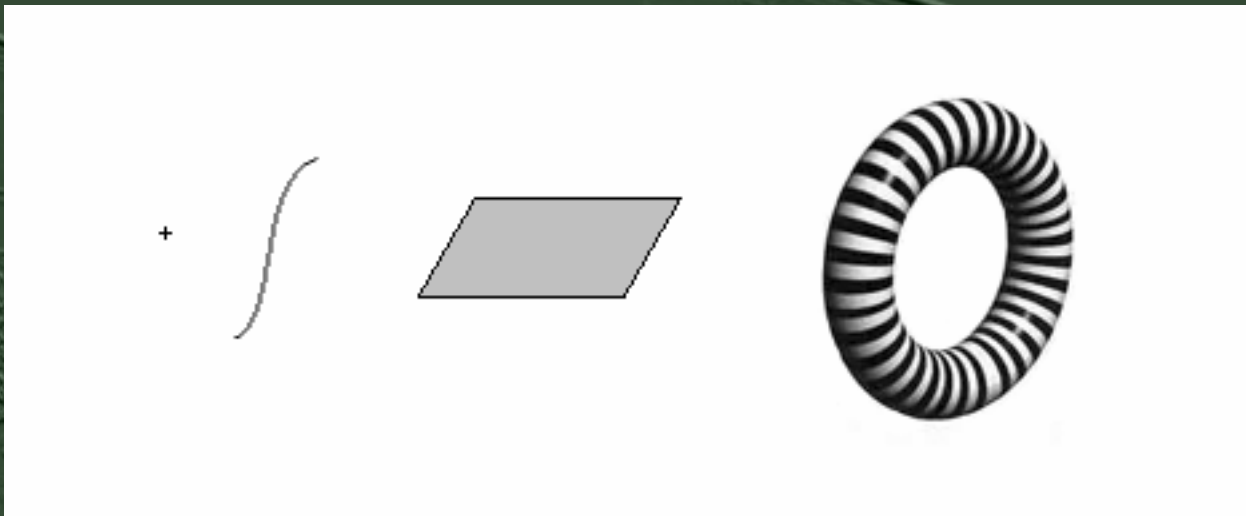
- Self-similar
- Generated
- Natural
- Beautiful
- Simple, etc.

# Classical ideas on dimension



## Well-known:

- 0, 1, 2, 3, ... - integer
- independent
- simple (mathematical description and apply)



# The fractal dimension



## fundamental findings:

1. man-made objects are well defined in Euclidean geometry
2. natural objects can often best be modelled by fractal geometry

## history:

- Niels Fabian Helge von Koch /1904/ - Koch Island /Snowflake or Koch Curves/
- Felix Hausdorff /1919/ - defined a dimension for point-sets /fraction/
- Benoit B. Mandelbrot /1975/ - term fractal was coined
- Benoit B. Mandelbrot /1983/ - Hausdorff-Besicovitch dimension is greater than the topological dimension
- Richard F. Voss /1985/ - popular algorithms for computing

# Theoretical determination of the fractal dimension



Let  $(X, d)$  be a complete metric space. Let  $A \in H(X)$ .  
Let  $N(\varepsilon)$  denote the minimum number of balls  
of radius  $\varepsilon$  needed to cover  $A$ . If

$$FD = \lim_{\varepsilon \rightarrow 0} \left\{ \sup \left\{ \frac{\ln N(\bar{\varepsilon})}{\ln(1/\bar{\varepsilon})} : \bar{\varepsilon} \in (0, \varepsilon) \right\} \right\}$$

exists, then  $FD$  is called the fractal dimension of  $A$ .

# Methods of Computing Fractal Dimensions

• Least Squares Approximation /theoretical/

• Walking-Divider /practical to length/

• Box Counting /most popular/

• Prism Counting /for a one dimensional signals/

• Epsilon-Blanket /to curve/

• Perimeter-Area relationship /to classify diff. types images/

• Fractional Brownian Motion /similar box counting/

• Power Spectrum /digital fractal signals/

• Hybrid Methods /calculate the fractal dim. of 2D using 1D methods/

• Others:

- Correlation Dimension

- Information (Rényi) Dimension

- Lyapunov Dimension

# Computing structural fractal dimension



## Box Counting

- most popular algorithms
- for computing the fractal dimensions of signals and images

$$FD = \frac{\log \frac{L_2}{L_1}}{\log \frac{S_1}{S_2}}$$

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- L1 and L2 measured length on curve,
- S1 and S2 metrics (resolution on image or signals)



# Measuring structural fractal dimension

(FD)

Feature of images /digital images/

- Size – 1024x768 pixels
- Colour depth –  $3 \times 8 = 24$  bits

Segmentation of image

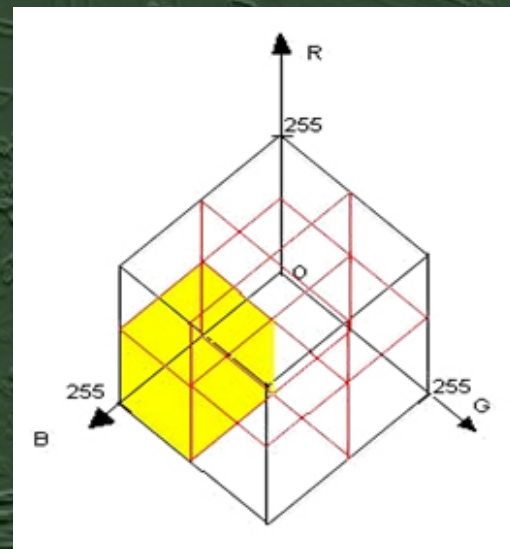
Take four boxes based on original image / halving from the sides/

Which box content valuable pixel(s)

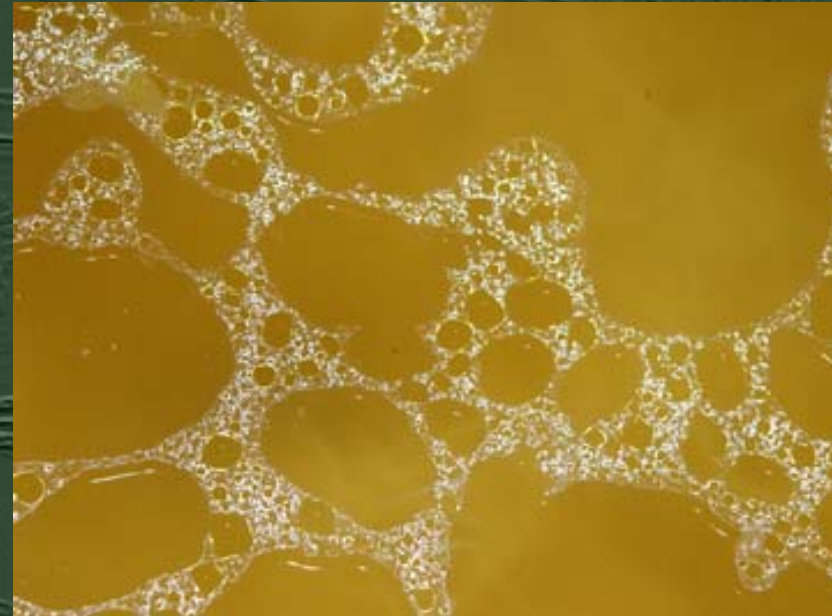
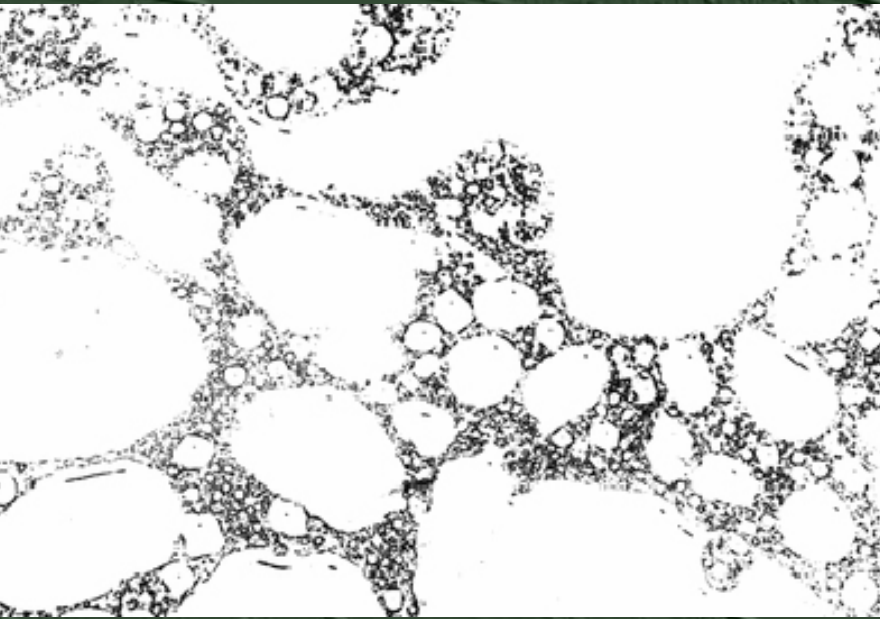
Save the number of valuable boxes

Repeat 2. - 4. paragraphs, than each of side will one pixels

Calculate dimension a form



# Extension of fractal dimension



**FD = 1,99**

**FD = 1,99**

# Spectral fractal dimension (SFD)



Let spectral fractal dimension (SFD) be:

$$SFD = \frac{\log \frac{L_{S2}}{L_{S1}}}{\log \frac{S_{S1}}{S_{S2}}}$$

where  $L_{S1}$  and  $L_{S2}$  are measured spectral length on  $N$ -dimension colour space,  $S_{S1}$  and  $S_{S2}$  are spectral metric (spectral resolution of the image).

# SFD in practice



{1, 3, 4, 6, 32, 60, 79, 126,...} colour space dimension  
r bands where

- N=1 black and white or greyscale image,
- N=3 RGB, YCC, HSB, IHS colour space image,
- N=4 traditional colour printer CMYK space image
- N=6 photo printer CCpMMpYK space image or Landsat ETM satellite image
- N=32 DAIS7915 VIS\_NIR or DAIS7915 SWIP-2 sensors
- N=60 COIS VNIR sensor
- N=79 DAIS7915 all
- N=126 HyMap sensor

## Typical spectral resolution:

- Threshold image - 1 bit
- Greyscale image - 2-16 bits
- Colour image - 8-16 bits/bands

# Computing SFD



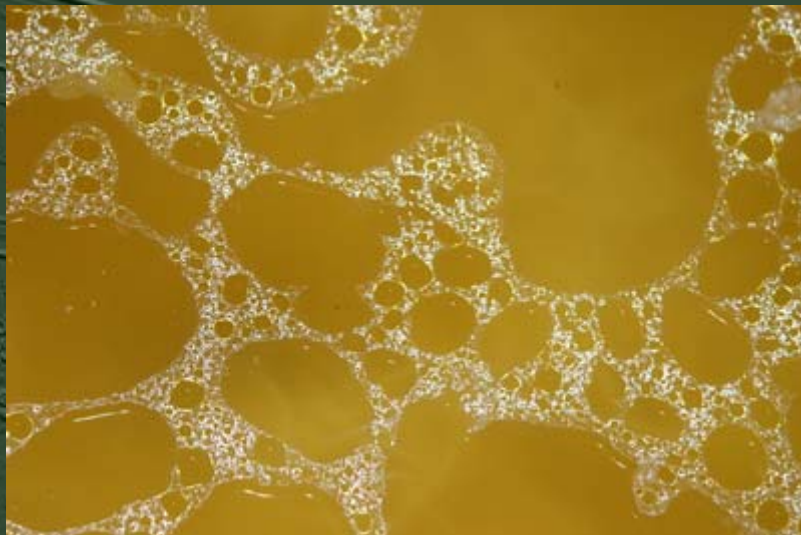
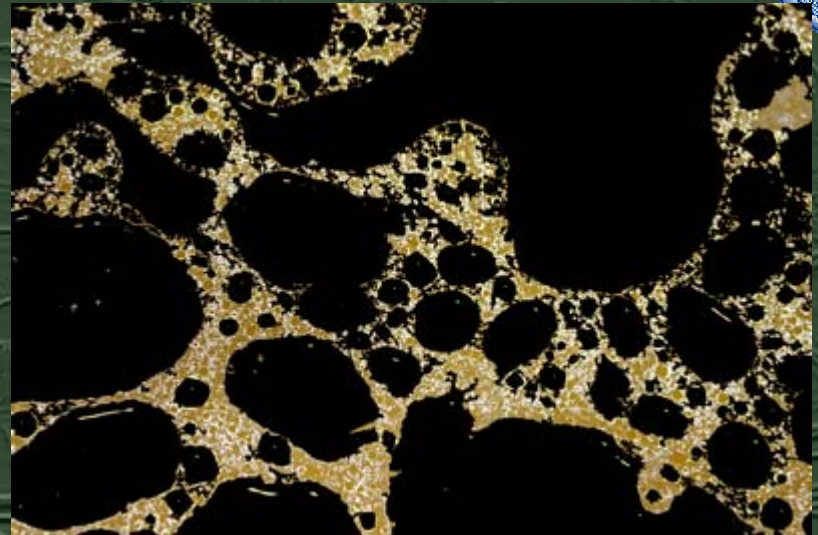
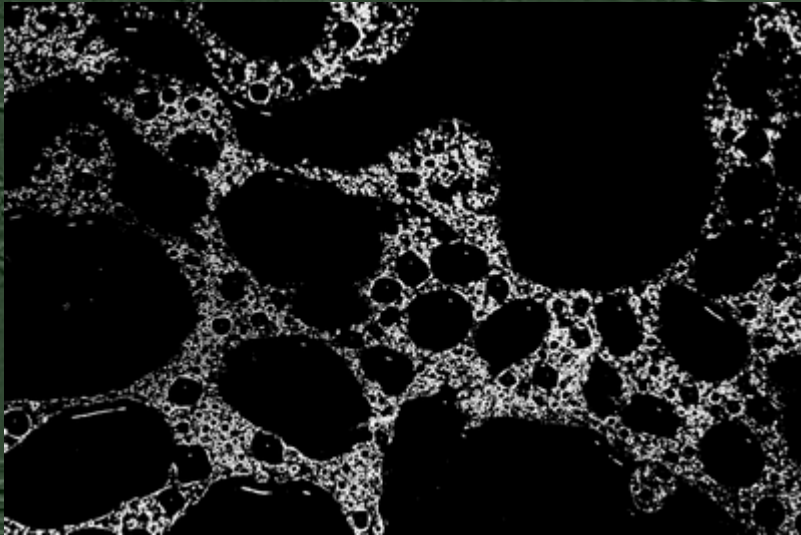
$$SFD_{measured} = \frac{n \times \sum_{j=1}^{n-1} \frac{\log(BM_j)}{\log(BT_j)}}{n-1}$$

ere

$BM_j$  - number of spectral boxes containing valuable pixels in case of  $j$ -

$BT_j$  – total number of possible spectral boxes in case of  $j$ -bits

# Comparison FD and SFD



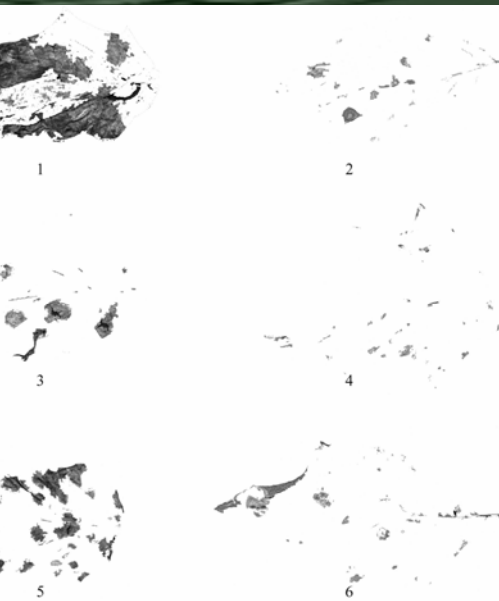
$FD = 1,99$ $SFD = 1,14$	$FD = 1,99$ $SFD = 2,49$
$FD = 1,99$ $SFD = 2,51$	

# FD and SFD on Psychovisual Comparison of Image Compressing Methods under Laboratory Circumstances

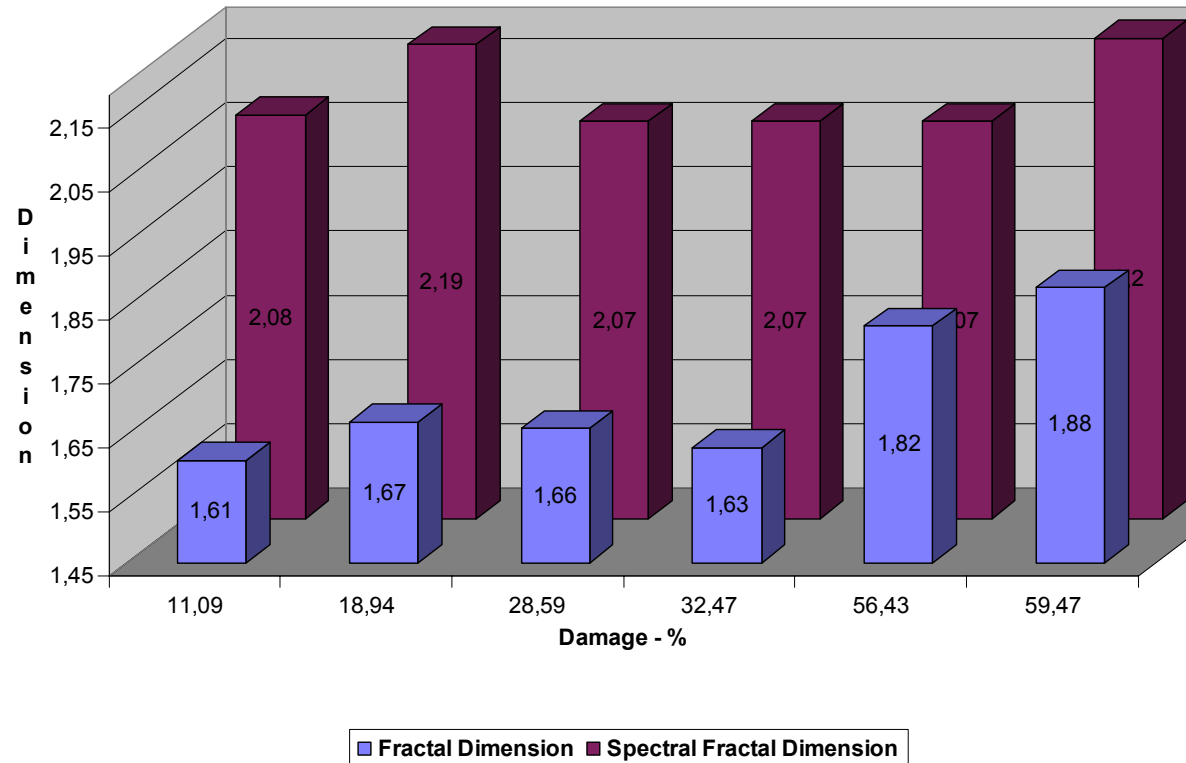


<b>SFD = 2,31</b>	<b>SFD = 2,68</b>
<b>SFD = 2,56</b>	

# Damage of leaf

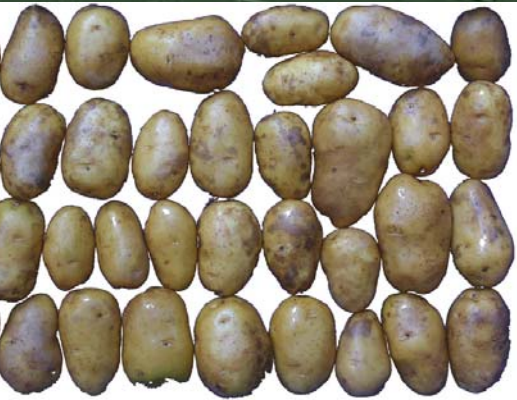


Comparison of FD and SFD on Damaged Leaf





# SFD to Image Classification



agata

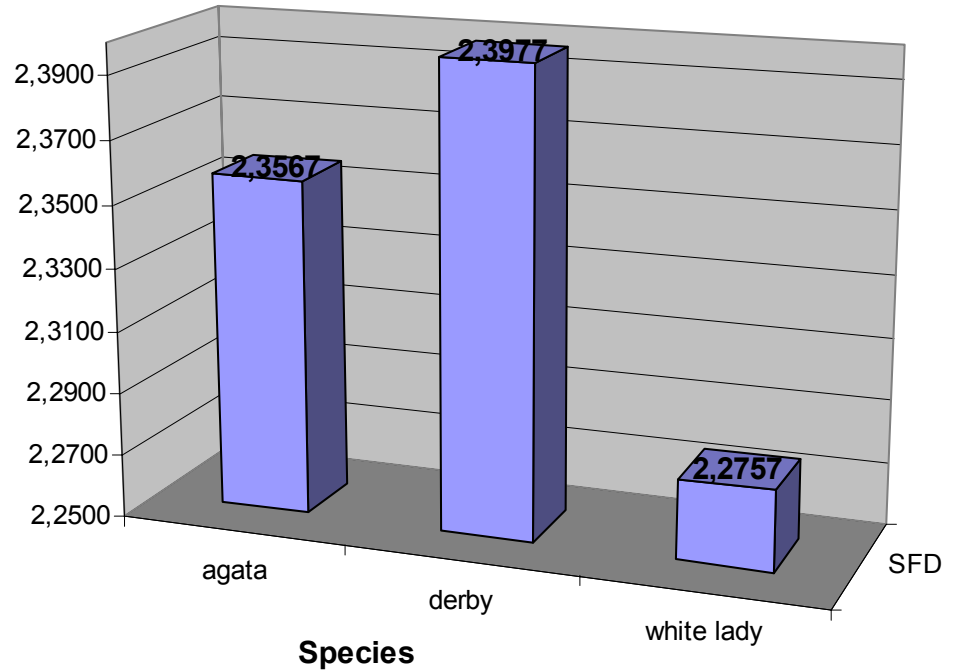


derby



white lady

Classification by SFD /potato/

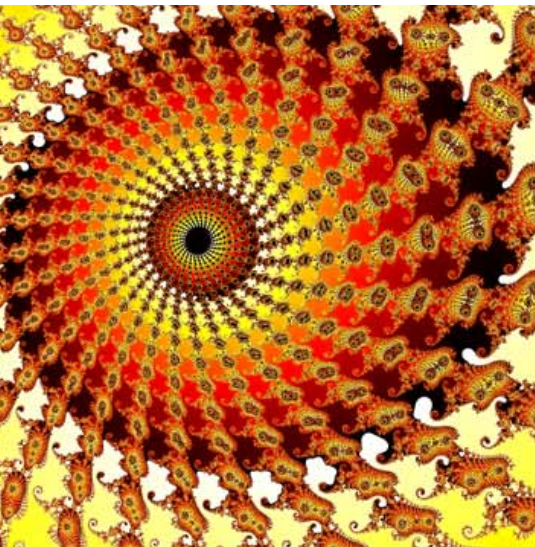


	agata	derby	white lady
■ SFD	2,3567	2,3977	2,2757

# SFD on Fractals



SFD=1,4633



14-0b



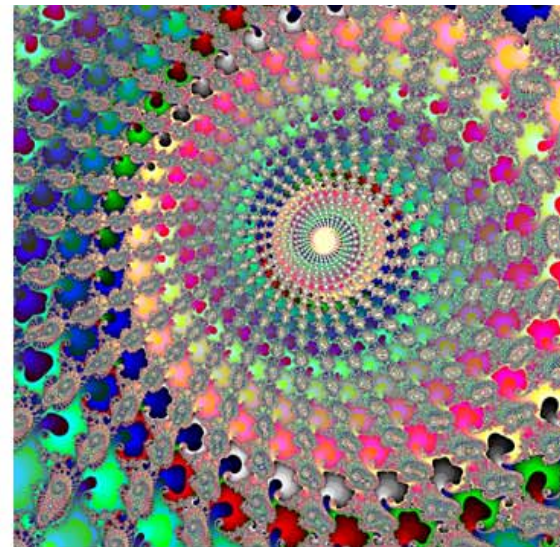
SFD=1,6860



14-0sp



SFD=2,0963



14-0sy

**Mandelbrot set: Re: -0,74745 ... -0,74637, Im: 0,10671 ... 0,10779**

# Conclusions



Useful information on structure as well as shades  
SFD can perfectly be used to characterize (multi-,  
hyper spectral) images

SFD and FD are significant parameters in the  
classification

SFD can be an important and easily measurable  
parameter of natural processes

The applied SFD method give practically applicable  
results in case of optional number of dimension

**More info:** [www.georgikon.hu/digkep/sfd/index.htm](http://www.georgikon.hu/digkep/sfd/index.htm)