# grain size – the good, the bad ... and the ugly

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In this talk, we will follow a fictitious rock through an imagined geological cycle:

- sedimentation
- cementation
- grain growth
- dynamic recrystallization
- fragmentation
- healing



... and observe the associated "grain size"

## "grain size" I – sieving



#### "grain size" 2 – strewn samples



### "grain size" 3 – intercept length



#### "grain size" 4 – numerical simulation



- mean/mode of curve fit

#### "grain size" 5 – thin sections



#### "grain size" 6 – particle analyzer



#### "grain size" 7 – multi-scale analysis



fractal dimension for 2 or 3 dimensions  $D_{2d} = D_{3d} - 1$ 

Fractal size distributions should span at least 3 orders of magnitude

# when we talk about grain size ...

#### why look at grain size ?

#### grain size data carries information

sediments, sands, silts

 $\rightarrow$  environment of deposition

statically recrystallized rocks  $\rightarrow$  time and conditions of grain growth

dynamically recrystallized rocks  $\rightarrow$  level of flow stress

crushed rocks, powders → types of fragmentation processes ... etc.

#### the size of a grain – a scalar





thin sections: size = diameter, d, of area

area of circle:  $A = \pi \cdot r^2$ 

 $\Rightarrow$  d = 2 ·  $2\sqrt{(A/\pi)}$ 

d = 2r (lower case)

loose grains, particles: size = diameter, D, of volume

volume of sphere:  $V = 4\pi/3 \cdot R^3$ 

$$\Rightarrow D = 2 \cdot \sqrt{(3V/(4\pi))}$$

D = 2R (upper case)

#### the (in)famous 'mean grain size'

arithmetic mean

geometric mean

harmonic mean

root-mean-square

$$X = I/n \cdot \sum x_i$$

$$G = n\sqrt{\prod x_i}$$

$$H = I / (I/n \cdot \sum I/x_i)$$

$$= n / \sum I/x_i$$

$$RMS = \sqrt{(I/n \cdot \sum x_i^2)}$$

$$\sum = sum$$
$$\prod = product$$
$$i = 1, ... n$$

 $RMS > \overline{X} \ge G \ge H$ 

median

mode

- $= x_{(n+1)/2} \qquad \text{if } n = odd$
- =  $(x_{n/2} + x_{n/2+1}) / \text{ if } n = \text{even}$
- = most frequent value

### why 3D ?!

#### ... that's why !



#### we 'see' 3D, not 2D, modal grain size





number-weighted 2D mean 1.31 2D st.dev. 0.43



volume-weighted 3D mode 1.70 3D st.dev. 0.11



*≠* visual impression



= visual impression

### finding the mode by curve fitting



Normal curve fit

$$\frac{1}{\sqrt{2\pi\sigma^2}} \cdot \exp(-\frac{(\mu-x)^2}{2\sigma^2})$$

Lognormal curve fit

$$\frac{1}{x\sqrt{2\pi\sigma^2}} \cdot \exp(-\frac{(\ln(x)-\mu)^2}{2\sigma^2})$$

Polynomial curve fit

 $m_0 + m_1 x + m_2 x^2 + m_3 x^3 + \dots$ 

in all cases: fit through center of bin !

# "grain size" I sedimentation sieving

#### "grain size" I: beach sand



Great Exhibition Bay, NZ https://www.geological-digressions.com/analysis-of-sediment-grain-size-distributions/

low tide surf zone coastal foredunes





"Grain size": Mean M $\phi$  = ( $\phi_{16}+\phi_{50}+\phi_{84}$ )/3 Sorting  $\sigma\phi$  = ( $\phi_{84}-\phi_{16}$ )/4 + ( $\phi_{95}-\phi_{5}$ )/6.6  $\phi$  equivalent to log(3D diameter)



#### from logarithmic to linear



 $\Sigma$  area of histogram bars = area under curve = constant

#### $\phi$ -values... – double trouble



#### converting the data



#### φ-derived versus converted



#### what have we learned ?

Results from sieving are difficult to interpret (... unless you are a sedimentologist ...)

To derive a meaningful mean grain size,  $\phi$ -values are best converted to vol% vs. linear size.

Derived  $D_{mean}$  - values depend on standard deviation.

# "grain size" 2 glacial transport strewn samples

### "grain size" 2: glacigenic sediments





"Grain size": mean or mode of <u>3D diameters</u> of

area-equivalent circles of projected areas

- arithmetic mean
- mean/mode of Gaussian curve fit

#### volume weighting



Note:  $D_{projected}$  = diameter of area-equivalent circle of projected area

#### what have we learned ?

Sands and powders are easily analyzed using a scanner.

In this case, the area-equivalent diameters  $d_{equ} = D_{equ}$ represent the diameters of the volume-equivalent spheres  $D_{equ}$ .

No conversion from 2D to 3D is necessary

The conversion from h(D) to vol(D) is trivial:  $vol(D) = h(D) \cdot D^3$ 

# "grain size" 3 cementation intercept method

#### "grain size" 3: cemented sandstone









#### intercept method – limitations



grainsize =  $\frac{\text{length of test line (L)}}{\text{number of transected grains (N)}}$ 

from grain boundaries: L = 23100 µm, N = 221

size of (grains+cement) = L / N = 105  $\mu$ m



for uncemented grains: ??

"Grain size": mean of intercept lengths (= <u>2D size</u>, no distribution)

does not work for grains in matrix

### check against digital image analysis



check (1) diameters (long axis fit ellipse)

grains from intercept 105 µm grains from ellipse fit

110 µm



check (2) ratios long axes of fit ellipse: grains 110 µm (grains+cement) 130 µm (grains+cement) : grains =  $1.22 \neq 1.11$ area% 72.9 vol% grains (grains+cement) 100.0 vol% (grains+cement) : grains =  $1.37 \approx 1.35$ 





#### what have we learned ?

The intercept method is practical and fast – can be done at the microscope – or on un-segmented micrographs, ... but ...

Only mean the arithmetic 2D mean can be calculated.

Cannot be used for grains in matrix.

# "grain size" 4 grain growth 2D experiment

### "grain size" 4: Ostwald ripening

10%

5%

0%

0

20

60

40

80

100



#### grain growth kinetics

Chen LQ, Yang W (1994) Computer-simulation of the domain dynamics of a quenched system with a large number of nonconserved order parameters—the grain-growth kinetics. Phys Rev B 50: 15752--15756 https://www.youtube.com/watch?v=p0rY2r0E\_2k

"Grain size":

- arithmetic mean of <u>2D diameter</u>
- mean/mode of curve fit



in terms of normal distribution:

- $\rightarrow$  increasing <u>mean</u> ( $\mu$ )
- $\rightarrow$  increasing <u>standard</u> <u>deviation</u> ( $\sigma$ )

 $\Rightarrow$  distribution matters

#### 2D simulation





#### should we convert to 3D...?



#### what have we learned ?

In a fully cemented / fully crystallized rock grain growth has to be volume conserving.

Ostwald ripening is a valid model for such a process: starting with a normally distributed grain size, both the mean and the standard deviation increase with time.

"grain size" 5 dynamic recrystalization from 2D to 3D

#### "grain size" 5: sheared quartzite



Heilbronner, R. & Kilian, R. (2017). The grain size(s) of Black Hills Quartzite deformed in the dislocation creep regime. Solid Earth, 8, 1071–1093, 2017, doi.org/10.5194/se-8-1071-2017.



"Grain size":

mean or mode of <u>2D diameters</u> of area-equivalent circles of sectional shapes - arithmetic mean µ

- mean/mode of curve fits

#### 2D versus 3D – mean versus mode





#### detect second maximum



#### what have we learned ?

Converting 2D grain size data to 3D is highly recommended!

Volume weighted 3D histograms should be used – they are free from sectioning artefacts!

Modal 3D grain size identifies the physically most relevant grain size(s).

# "grain size" 6 powder particle analyzer

### "grain size" 6: crushed quartz

![](_page_43_Picture_1.jpeg)

Range from 0.2  $\mu$ m up to 300  $\mu$ m Mean length is about 65  $\mu$ m and Mode between 90 and 95  $\mu$ m.

"Grain size": mean or mode of <u>log (3D size</u>) (e.g., long axes of particles) - arithmetic mean

- mean/mode of curve fits

![](_page_43_Figure_5.jpeg)

Richter, B., 2017, The brittle-to-viscous transition in experimentally deformed quartz gouge. Dissertation, Basel University. https://edoc.unibas.ch/57805/

#### to get the mean grain size ...

![](_page_44_Figure_1.jpeg)

#### ... proceed like this:

I.Clean original data: Plot = vol% vs. log(D)

2. Convert to linear D: d = 10<sup>log(d)</sup> Plot = vol% vs. D(µm)

![](_page_44_Figure_5.jpeg)

![](_page_44_Figure_6.jpeg)

3.Correct for bin width: vol<sub>corr</sub> = vol / bin width<sup>\*</sup>)

\*) if  $\Delta \log(d) = \text{constant}$  $\Rightarrow \Delta d \neq \text{constant}$ 

#### $\dots \neq$ the mean of log histograms !

![](_page_45_Figure_1.jpeg)

![](_page_45_Figure_2.jpeg)

evaluated from linear data  $\Rightarrow D_{mean} = 17.5 \mu m$ 

depends on upper and lower bound, only true for (-0.5  $\leq \log(D) \leq 2.3$ ) i.e., for (3 $\mu$ m  $\leq D \leq 200\mu$ m) !!!

evaluated from log data mean value of log(D) = 1.69  $\Rightarrow$  D<sub>mean</sub> = 10<sup>1.69</sup> = 49µm  $\checkmark$ modal value of log(D) = 1.95  $\Rightarrow$  D<sub>mean</sub> = 10<sup>1.95</sup> = 90µm

> Range from 0.2 µm up to 300 µm Mean length is about 65 µm and Mode between 90 and 95 µm.

Richter, B., 2017, The brittle-to-viscous transition in experimentally deformed quartz gouge. Dissertation, Basel University. https://edoc.unibas.ch/57805/

#### intermezzo: fractal size distributions

F

С

Ri

Ni

![](_page_46_Figure_1.jpeg)

number of fragments created number of fragments being fragmented f = C/F fragmentation fraction size (diameter) of fragment number of cracked fragments

Fractal dimension

![](_page_46_Picture_4.jpeg)

published example:

The number N of fragments with cube root of volume greater than r is given as a function of r for broken coal (Bennett, 1936), broken granite from a 61 kt underground nuclear detonation (Schoutens, 1979), and impact ejecta due to a  $2.6 \,\mathrm{km \, s^{-1}}$ polycarbonate projectile impacting on basalt (Fujiwara et al., 1977). The best-fit fractal distribution from (2.6) is shown for each data set.

![](_page_46_Figure_7.jpeg)

Example:

 $= 8 R_1 = R_0/2 N_1 = 6$ C = 6  $R_2 = R_0/4$   $N_2 = 36$ f = 6 / 8

$$D = \frac{\log (N_2/N_1)}{\log (R_1/R_2)} = \frac{\log (6)}{\log (2)} = 2.585$$

#### maximum value for D = 3.00 - why?

map views of cube:

![](_page_47_Figure_2.jpeg)

The fractal distribution  $N_i(R_i)$  is characterised by a constant ratio  $D = \frac{\log (N_{i+1}/N_i)}{\log (R_i/R_{i+1})}$   $(0 \le D \le 3.00)$ 

 $N_{i+1}/N_1$  = frequency ratio of smaller to larger grain size  $R_i/R_{i+1}$  = size ratio of larger to smaller grain size

At the maximum vale of D = 3.0, the 2-dimensional fracture surface (grain boundary surface) is completely room-filling, and thus itself a 3-d volume. A higher value than D = 3 cannot be attained by this process of fragmentation

#### more from the fractal world

![](_page_48_Figure_1.jpeg)

fractal dimension

(number of 3D grains)

D<sub>3d</sub>

![](_page_48_Figure_2.jpeg)

![](_page_48_Figure_3.jpeg)

fractal dimension

(number of 2D sections)

![](_page_48_Figure_4.jpeg)

![](_page_48_Figure_5.jpeg)

volume fraction

(volume % of 3D grains)

 $(0 \le D_{3d} \le 3)$  $D_{2d} = D_{3d} - 1$  $E = 3 - D_{3d}$ 

- number of fragments Ν
- V volume of fragments
- R 3D diameter of fragments
  - 2D section diamater

r

## $D_{2d}$ , $D_{3d}$ , E from N/R or log(N)/log(R)

![](_page_49_Figure_1.jpeg)

#### beware: fractal ≠ modal distribution

![](_page_50_Figure_1.jpeg)

![](_page_50_Figure_2.jpeg)

characteristics:

- fractal dimension D
  - = grain size ratio
- unbounded:
- no minimum, no maximum
- no mean or mode

characteristics:

- moment of central tendency
  - = most significant grain size
- mean or mode of distribution
- bounded:
- total (area under curve) = 100%

#### ... returning to the talk

![](_page_51_Figure_1.jpeg)

D<sub>3d</sub> = 3.18

(I μm < D < 100 μm)

D<sub>3d</sub> = 1.88

(D < 2 µm)

#### what was said in the talk:

- you should correct analyzer vol% to account for increasing bin width with size: vol<sub>corr</sub> = vol% / bin width
- after calculating N% from vol<sub>corr</sub>, N% was plotted versus  $D(\mu m)$  and the powerlaw fit yielded  $D_{3d} > 3.0$

![](_page_51_Figure_5.jpeg)

![](_page_51_Figure_6.jpeg)

how this was explained in the talk:
the processes of hammering and pestling do not correspond to fractal fragmentation

#### unfortunately, that was rubbish !!

#### ...doing it right

![](_page_52_Figure_1.jpeg)

![](_page_52_Figure_2.jpeg)

![](_page_52_Figure_3.jpeg)

#### Therefore

- Clean original data: Plot = vol% vs. log(d)
- 2. Convert to linear bin size:  $d = 10^{\log(d)}$ Plot = vol% vs. d(µm)

3. Correct put bin width: volcorr = vol / bin width \*)

#### 3. Directly convert vol% $\rightarrow$ N% no% = vol% / d<sup>3</sup> Plot = N% vs. d(µm)

- Plot N% vs. d(μm) on log-log
   Fit power-law to full data
- 5. Fit power-law to cropped  $(1 \mu m \le d \le 100 \mu m)$

#### what does D<sub>3d</sub> mean ?

The crystal fragments are broken into small pieces with a hammer and screened with a 100-µm sieve.

The coarser fraction is **repeatedly pestled** and sieved until the overall grain size is less than 100  $\mu$ m.

Bettina Richter (2017) PhD thesis, Basel University

![](_page_53_Picture_4.jpeg)

![](_page_53_Picture_5.jpeg)

![](_page_53_Figure_6.jpeg)

• the processes of hammering and pestling generate grain size distributions with  $D_{3d} < 3.00$ i.e., compatible with fractal fragmentation processes

•  $D_{3d} = 2.24$ 

(fragmentation fraction  $\approx$  5/8) for grains >  $1\,\mu\text{m}$ 

 D<sub>3d</sub> = 1.11 (fragmentation fraction ≈ 2/8) for grains < 2µm (below grinding limit)

![](_page_53_Figure_11.jpeg)

#### what have we learned ?

Data from particle analyzers are particularly prone to misinterpretation.

The mean of a fractal distribution is quite meaningless.

Rather, convert analyzer data to linear histograms of volume density versus linear size...

... and check on a log-log plot of N.vs.size: if the slope, D, of the powerlaw fit is a straight line, and if  $(0 \le -D \le 3)$ , the distribution may be due to fractal fragmentation.

# "grain size" 7 friction & healing fractal dimension

#### "grain size" 7: brittle fault rocks

![](_page_56_Figure_1.jpeg)

... but fractal size distributions should span at least 3 orders of magnitude

#### comparing grain size distributions

![](_page_57_Figure_1.jpeg)

#### typical data ranges

![](_page_58_Figure_1.jpeg)

#### the 'universal' fractal dimension

![](_page_59_Figure_1.jpeg)

![](_page_59_Picture_2.jpeg)

Keulen, N., Heilbronner, R., Stünitz, H., Boullier, A.-M., Ito, H. (2007). Grain size distributions of fault rocks: a comparison between experimentally and naturally deformed granitoids, Journal of Structural Geology, 29, 1282-1300, doi:10.1016/j.jsg.2007.04.003. intermediate

![](_page_59_Figure_5.jpeg)

 $D_{3d} \text{ cracked} = \sim 2.5$   $D_{3d} \text{ gouge} = 3.0 - 3.2 \text{ !!}$  $D_{<\text{grinding limit}} = 1.8 - 2.0$ 

![](_page_59_Figure_7.jpeg)

#### $D_{3d}$ gouge $\neq$ f(displacement)

d = 24m

20m

**40**m

![](_page_60_Figure_4.jpeg)

high velocity friction experiments (rotary shear apparatus)

![](_page_60_Figure_6.jpeg)

Stünitz, H., Keulen, N., Hirose, T., Heilbronner, R. (2010). Grain size distribution and microstructures of experimentally sheared granitoid gouge at coseismic slip rates – criteria to distinguish seismic and aseismic faults? J. Structural Geology, 32, 59-69, doi:10.1016/j.jsg.2009.08.002

#### experimental and natural fault rocks

experimentally produced fault rock  $\longleftarrow$  naturally produced fault rock

![](_page_61_Picture_2.jpeg)

![](_page_61_Figure_3.jpeg)

Keulen, N., Heilbronner, R., Stünitz, H., Boullier, A.-M., Ito, H. (2007). Grain size distributions of fault rocks: a comparison between experimentally and naturally deformed granitoids, Journal of Structural Geology, 29, 1282-1300, doi:10.1016/j.jsg.2007.04.003.

![](_page_61_Figure_5.jpeg)

#### rupture – faulting – healing

#### deformation and healing experiments

![](_page_62_Figure_2.jpeg)

![](_page_62_Figure_3.jpeg)

#### Nojima Fault

#### natural fault rocks

![](_page_63_Figure_2.jpeg)

experimental and natural fault gouge. Journal of Geophysical Research-Solid Earth 113.

#### what have we learned ?

The fractal dimension of freshly fragmented rocks seems to be a 'universal':  $D_{3d} = 2.58$ .

Mature gouge is 'supra-fractal' with a saturation values of  $D_{3d} > 3.00$ , indicating the contribution of nonfractal processes (spalling, abrasion), and is independent of the amount of displacement.

Healing of monomineralic fault rocks (gouge) yields  $D_{3d} = 2.58$ ; healing is very fast (on the order of years); for polymineralic rocks  $D_{3d}$  remains >3.

#### in summary ...

we have considered ...

I. what  $\varphi$ -values mean in the physical (linear) world 2. the usefulness of a flatbed scanner 3. the fast and easy intercept method 4. if  $d_{mean}$  from 2D simulations can be extrapolated to 3D 5. how to convert  $d_{mean}$  from 2D sections to  $D_{mean}$  in 3D 6. how to derive fractal dimensions from particle analyzers 7. that fractal grain size distributions have no mean

#### ... and we found that ...

for any given distribution of grains ...

the arithmetic mean of h(d<sub>equ</sub>)
# mean of h(D<sub>equ</sub>)
# mode of vol%(D<sub>equ</sub>)
# Mφ
# mean of vol%(log(D<sub>equ</sub>))
# ... etc.

see data from: image analysis scanner striþstar sieving þarticle analyzer

⇒ ask yourself: which "grain size" you need to know

# grain size – 3D, 2D... and fractal

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![](_page_67_Picture_3.jpeg)