Morphological characteristics of diesel emission particles from image analysis of electron microscopy images



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### Objectives

To develop a simple, non-discriminating sampling system for diesel particle emission for EM imaging and analysis

To analyse representative, native particle populations

To study morphological properties of diesel particles from 2D projections of EM images

To develop a method for semi-automatic analysis of size, shape and fractal properties of diesel particle aggregates

To develop a method for semi-automatic analysis of primary particle size distribution in diesel agglomerates

To study particle structures containing volatile matter

#### Sampling system for SEM/TEM specimens



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### Sampling head for electron microscopy sampling



- Target: non-size selective, non-artefact forming sampling system with moderate sampling times
- Sampling time range for thermophoresis 10 120 min with dT 25 37 °C
- Shorter times achievable with more efficient warming up of the diluted emission
- Shorter times achievable with more efficient cooling of the grid holder block (providing drying of the emission due to the dew point problems encountered)
- Sampling time range for pump sampling 5 90 s
- Thermophoretic and pump sampling were compared

### Neat sample density and population for SEM image analysis / Thermophoretic sampling



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#### SEM population sampled with pump (1 - 1.5 m/s)



#### "Best quality" ESEM image for volatiles study





#### Principles of calculation from SEM images

To study populations 400 – 1200 particles from x 2-30 000 magnified images analysed (5 to 20 images).

• Calculated are distributions for aggregate perimeter p, projected area A, equivalent diameter  $D_{eqv}$ , maximum length L and maximum orthogonal width W.

Contour is set by thresholding the image; based on operator judgement of the edge position.

Perimeter is calculated by chain code algorithm.

Perimeter is calculated from the difference of original image and its dilation

- A and D<sub>eqv</sub> are calculated from the number of pixels.
- In automatic analysis the minimum number of pixels for p, L and W analysis is limited to 9-12 pixels corresponding ~  $D_{eqv}$  20 nm. Smallest particles are filtered away.

Manually it is possible to accept particle size down to 1 pixel. VTT ENERGY AND PULP&PAPER Emission Control





Perimeter is computed by chain code algorithm from original image.

Max length L and max width W are calculated from a magnified image; they are orthogonal distances on the original (thresholded) target area



Estimating the Distribution of Particle Dimensions from Electron Microscope Images

#### Principle of perimeter calculation



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#### **Evaluation of perimeter calculation**



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## Histogram calculation from image analysis of SEM agglomerate populations



D	Dg	dlog D	N	dN/dlog Dp		
cut size		log D(y)/D(x)	number			
[nm]	[nm]	constant				
11	12.8	0.135	4	29.7		
15	17.7	0.146	17	116.3		
21	25.1	0.155	33	213.0		
30	35.9	0.156	78	498.9		
43	51.6	0.159	174	1094.9		
62	74.3	0.157	184	1172.0		
89	106.3	0.154	174	1126.8		
127	152.0	0.156	121	774.3		
182	217.5	0.155	68	439.0		
260	305.9	0.141	8	56.6		
360						
	861					

dlog D<sub>p</sub> set constant => real N shown in y –axis

Histograms for N > 400 are calculated for

- Equivalent diameter D<sub>eqv</sub>
- Perimeter *p*
- Area A
- Maximum length L
- Maximum orthogonal width *W*





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## D<sub>eqv</sub> distributions from thermophoretic and pump sampling vs. aerodynamic and mobility sizes



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### Fractal properties from TEM parameters



$$N = k_g \left(\frac{R_g}{a}\right)^{D_f}$$

$$R_g = \left(\frac{2}{L_a}\sqrt{\frac{D_f + 2}{D_f}}\right)^{-1}$$

$$C_{ov} = \frac{A_{ov}}{\min(A_1, A_2)}$$

- Fractal dimension
- Radius of gyration
- Primary particle radius *a*
- Fractal pre-factor  $k_{g}$
- Number of primary particles
- Overlapping coefficient

N

 $C_{ov}$ 



*Wentzel, M. et al.*, Transmission electron microscopical and aerosol dynamical characterization of soot aerosols *Aerosol Science 34(2003)1347-1370*.

Estimating the Distribution of Particle Dimensions from Electron Microscope Images

 $\dot{R}_{g}$ 

#### Principles of calculation fractal properties of an agglomerate

<sup>®</sup> Size and fractal properties are calculated in order: area *A*, max length  $L_{max}$ , max orthogonal width  $W_{max}$ , perimeter *p*, fractal dimension  $D_f$ , radius of gyration  $R_g$ , average radius of primary particles *a*, overlapping coefficient  $C_{ov}$ , and fractal prefactor  $k_g$ .

- Pixels are calibrated to nanometers
- Min and max particle sizes are defined by the operator
- Particle number N calculation is based on A, a and Cov
- N calculation is hence sensitive to choice of average particle radius a
- $C_{ov}$  calculation takes into account the calculated particle size distribution in an agglomerate
- D<sub>f</sub> calculation is based on contour and made by box counting method
- Calculation of  $R_g$ ,  $C_{ov}$  and  $k_g$  are made using formulas of /Mandelbrot 1982, Wentzel et al. 2003/.

 $,A_{2})$ 

$$k_g \left(\frac{R_g}{a}\right)^{D_f} \qquad \qquad R_g = \left(\frac{2}{L_a}\sqrt{\frac{D_f + 2}{D_f}}\right)^{-1} \qquad \qquad C_{ov} = \frac{A_{ov}}{\min(A_1)}$$

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N =

#### Calculation of fractal properties from TEM image - 1



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#### Calculation of fractal properties from TEM images - 2





 $C_{ov} = 0.1848$   $D_{f} = 1.6089$   $R_{g} = 192 \text{ (nm)}$  a = 13.0263 (nm) N = 140 (kpl)  $K_{g} = 1.8407$   $L_{a} = 576.0877 \text{ (nm)}$  p = 2752.836 (nm)W = 321.6107 (nm)

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### Calculation of fractal dimension D<sub>f</sub>

#### Result is sensitive to the choice of "average" primary particle diameter a.



Box-counting algorithm y = kx + C

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## Morphological parameters calculated for two sets of diesel agglomerates from low load point

min	max	Sample: thermophoresis 21 agglomerates	min	max	Sample: pump 11 agglomerates
0.153	0.305	C <sub>ov</sub>	0.128	0.275	C <sub>ov</sub>
1.547	1.773	D <sub>f</sub> (box counting)	1.527	1.715	D <sub>f</sub> (box counting)
26.7	115.4	R <sub>g</sub> (nm)	56.2	192.3	R <sub>g</sub> (nm)
8.1	17.4	a (nm)	10.1	19.5	a (nm)
8	61	N (#)	12	140	N (#)
1.189	2.208	k <sub>g</sub>	1.134	2.148	k <sub>g</sub>
78	345	L <sub>max</sub> (nm)	168	576	L <sub>max</sub> (nm)
46	194	W <sub>max</sub> (nm)	71	322	W <sub>max</sub> (nm)
284	1503	p (nm)	517	2753	p (nm)

18 kW (10 % load, ), 2000 1/min, 87 Nm, ox cat (thermodenuder, RH0, Dr 30, raised T for th /ambient T for pump)

Principles of defining primary particle size and calculation of radius *a* size distribution

Contour is determined by thresholding the image; based on operator judgement of the agglomerate edge position

Primary particle definition is based on a) contour correlation only, or

Primary particle definition is based on b) correlation between gradient image and fitted primary spheres within operator predefined min – max size range, or

Primary particles may be defined 100 % manually from the TEM image, using either intensity or gradient image

# Primary particle size distributions from two sets of diesel agglomerates by automatic primary particle sizing of the program



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#### What is attained, what is not

- Both sampling principles, thermophoresis and suction seem satisfactory in the sense of representativeness of diesel particle emission.
- Matlab 7 + IMP R14 based semi-automatic image analysis method for distributions of diesel agglomerate dimensions A,  $D_{eqv}$ , p, L and W from 2D projected images was generated.
- Matlab 7 + IMP R14 based semi-automatic image analysis method for fractal properties of diesel agglomerates from 2D projected images was generated.
- Method for determination of primary particle size distribution in diesel agglomerates was developed (manual ready, automatic not ready).
- Trapping mechanisms on carbon coated TEM grids of the sampler are not well analysed.
- Increasing of dT in thermophoretic sampler would be advantageous for sampling times.
- Target for imaging specimens containing volatile matter with environmental electron microscopy ESEM did not work out.
- Optimisation and "standardisation" of EM image quality and its treatment (filtering, thresholding, edge position, grid type, magnification) would be advantageous.
- Calculation of fractal dimension is based on average size of primary particles not size distribution.
- Algorithm for automatically defining primary particle sizes in an agglomerate is not ready; manual definition works.
- Calibration of the method with particles of known size should be made.

#### **Program is available for further development** (after translation into English...)

### **Project organisation**

The three year project 2003 – 05 was realised by **VTT Processes, Emission Control**:

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