# Supplementary data

# Speciation mapping of environmental samples using XANES imaging

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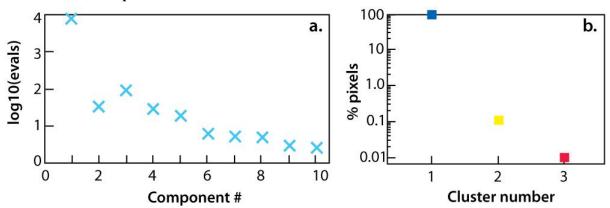
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#### Fresh biosolid sample B3

**Fig. S1.** Results of statistical analysis for sample B3. (a)  $\log_{10}$  eigenvalues determined by PCA. (b) percentage of pixels classified into cluster components. The components were switched manually and re-ordered in terms of their 'interpretability'.

X = 215, y = 109, point #2 Red 76% Cu2S + 24% Cu_HAX = 342, y = 100, point #1 Green 14% Cu2S + 83% CuFe2S3 + 3%X = 122, y = 35, point #3 Blue 7% Cu2S + 25% CuFe2S3 + 67% Cu_HA $\chi^2_{red} = 0.81$ $\chi^2_{red} = 0.81$ $\chi^2_{red} = 0.20$ $\chi^2_{red} = 0.21$ X = 83, y = 63, point #4 Red 67% Cu2S + 33% Cu_HAX = 78, y = 60, point #5 Green 66% CuFe2S3 + 34% Cu_HAX = 482, y = 54, point #6 Blue 21% CuFe2S3 + 79% Cu_HA $\chi^2_{red} = 0.48$ $\chi^2_{red} = 0.48$ $\chi^2_{red} = 2.00$ $\chi^2_{red} = 0.81$ X = 365, y = 81, point #7 Red 100% Cu2SX = 364, y = 76, point #8 Green 14% Cu2S + 76% CuFe2S3 + 10%X = 282, y = 13, point #9 Blue 13% CuFe2S3 + 87% Cu_HA		s of fits for selected murvidual pra	cis shuwii ili rig. 2
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	X = 215, y = 109, point #2 Red	X = 342, y = 100, point #1 Green	X = 122, y = 35, point #3 Blue
$\begin{array}{c c} \chi^2_{red} = 0.81 & \chi^2_{red} = 0.20 & \chi^2_{red} = 0.21 \\ \hline X = 83, y = 63, \text{ point #4 Red} & X = 78, y = 60, \text{ point #5 Green} & X = 482, y = 54, \text{ point #6 Blue} \\ 67\% & \text{Cu}_2\text{S} + 33\% & \text{Cu}_2\text{HA} & 66\% & \text{CuFe}_2\text{S}_3 + 34\% & \text{Cu}_2\text{HA} & 21\% & \text{CuFe}_2\text{S}_3 + 79\% & \text{Cu}_2\text{HA} \\ \chi^2_{red} = 0.48 & \chi^2_{red} = 2.00 & \chi^2_{red} = 0.81 \\ \hline X = 365, y = 81, \text{ point #7 Red} & X = 364, y = 76, \text{ point #8 Green} & X = 282, y = 13, \text{ point #9 Blue} \end{array}$	76% Cu <sub>2</sub> S + 24% Cu_HA	$14\% Cu_2S + 83\% CuFe_2S_3 + 3\%$	$7\% Cu_2S + 25\% CuFe_2S_3 + 67\%$
X = 83, y = 63, point #4 RedX = 78, y = 60, point #5 GreenX = 482, y = 54, point #6 Blue $67\%$ Cu <sub>2</sub> S + 33% Cu_HA $66\%$ CuFe <sub>2</sub> S <sub>3</sub> + 34% Cu_HA $21\%$ CuFe <sub>2</sub> S <sub>3</sub> + 79% Cu_HA $\chi^2_{red} = 0.48$ $\chi^2_{red} = 2.00$ $\chi^2_{red} = 0.81$ X = 365, y = 81, point #7 RedX = 364, y = 76, point #8 GreenX = 282, y = 13, point #9 Blue			
X = 83, y = 63, point #4 RedX = 78, y = 60, point #5 GreenX = 482, y = 54, point #6 Blue $67\%$ Cu <sub>2</sub> S + 33% Cu_HA $66\%$ CuFe <sub>2</sub> S <sub>3</sub> + 34% Cu_HA $21\%$ CuFe <sub>2</sub> S <sub>3</sub> + 79% Cu_HA $\chi^2_{red} = 0.48$ $\chi^2_{red} = 2.00$ $\chi^2_{red} = 0.81$ X = 365, y = 81, point #7 RedX = 364, y = 76, point #8 GreenX = 282, y = 13, point #9 Blue	$\chi^2_{\rm red} = 0.81$	$\chi^2_{\rm red} = 0.20$	$\chi^2_{\rm red} = 0.21$
$\frac{\chi^2_{red} = 0.48}{X = 365, y = 81, point \#7 \text{ Red}} \qquad \qquad \chi^2_{red} = 2.00 \qquad \qquad \chi^2_{red} = 0.81 \qquad \qquad \chi^2_{red} =$	X = 83, y = 63, point #4 Red		X = 482, y = 54, point #6 Blue
X = 365, y = 81, point #7 Red $X = 364, y = 76$ , point #8 Green $X = 282, y = 13$ , point #9 Blue	67% Cu <sub>2</sub> S + 33% Cu_HA	66% CuFe <sub>2</sub> S <sub>3</sub> + 34% Cu_HA	21% CuFe <sub>2</sub> S <sub>3</sub> + 79% Cu_HA
	$\chi^2_{\rm red} = 0.48$	$\chi^2_{\rm red} = 2.00$	$\chi^2_{\rm red} = 0.81$
$100\% Cu_2S    14\% Cu_2S + 76\% CuFe_2S_3 + 10\%   13\% CuFe_2S_3 + 87\% Cu_HA$	X = 365, y = 81, point #7 Red	X = 364, y = 76, point <b>#8</b> Green	X = 282, y = 13, point <b>#9</b> Blue
	100% Cu <sub>2</sub> S	$14\% Cu_2S + 76\% CuFe_2S_3 + 10\%$	13% CuFe <sub>2</sub> S <sub>3</sub> + 87% Cu_HA
Cu_HA			
$\chi^2_{red} = 1.95$ $\chi^2_{red} = 0.77$ $\chi^2_{red} = 0.16$	$\chi^2_{\rm red} = 1.95$	$\chi^2_{\rm red} = 0.77$	$\chi^2_{\rm red} = 0.16$

### Table S1. Results of fits for selected individual pixels shown in Fig. 2

Table S2. Results of fits for the XANES spectra shown in Fig. 3			
High Cu:Fe ratio (magenta)	Medium Cu:Fe ratio (green)	Low Cu:Fe ratio (grey)	
$60\% \text{ Cu}_2\text{S} + 21\% \text{ CuFe}_2\text{S}_3 + 19\%$	$28\% Cu_2S + 40\% CuFe_2S_3 + 32\%$	$34\% Cu_2S + 12\% CuFe_2S_3 + 53\%$	
CuHA	CuHA	CuHA	
$\chi^2_{\rm red} = 0.29$	$\chi^2_{\rm red} = 0.03$	$\chi^2_{\rm red} = 0.21$	

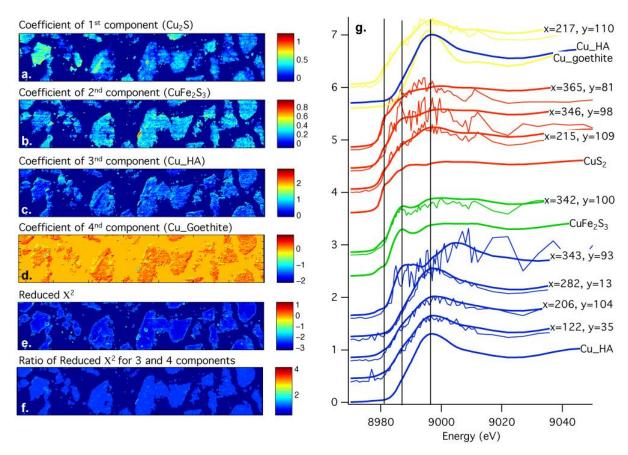


Fig. S2. Analysis of the XANES stack for sample B3 using a linear combination fit, using the dataset smoothed over  $2 \times 2$  pixels. (a) Coefficient of 1st component (Cu<sub>2</sub>S). (b) Coefficient of 2nd component (CuFe<sub>2</sub>S<sub>3</sub>). (c) Coefficient of 3rd component (Cu\_HA). (d) Coefficient of 4th component (Cu\_Goethite). (e) Map of the values of  $\chi^2_{red}$  (log<sub>10</sub> scale). (f) Ratio of  $\chi^2_{red}$  for the models containing 3 and 4 components, respectively. (g) Spectra at selected points.

Table 55. Results	of his for sciected murvidual pix	cis shown in 11g. 52
X = 215, $y = 109$ , point#2 yellow	X = 343, y = 93, point#1 Blue	X = 122, y = 35, point#3 Blue
$52\% Cu_2S + 28\% CuFe_2S_3 + 20\%$	54% CuFe <sub>2</sub> S <sub>3</sub> + 174% Cu_HA -	9% Cu <sub>2</sub> S + 22% CuFe <sub>2</sub> S <sub>3</sub> + 75%
Cu_goethite	129% Cu_goethite	Cu_HA – 7% Cu_goethite
$\chi^2_{\rm red} = 0.77$	$\chi^2_{\rm red} = 4.00$	$\chi^2_{\rm red} = 0.21$
X = 217, $y = 110$ , point # yellow	X = 346, $y = 98$ , point# Yellow	X = 342, $y = 100$ , point # Blue
$50\% Cu_2S + 21\% CuFe_2S_3 + 30\%$	52% Cu <sub>2</sub> S + $43%$ CuFe <sub>2</sub> S <sub>3</sub> + $5%$	$15\% \text{ Cu}_2\text{S} + 79\% \text{ CuFe}_2\text{S}_3 + 5\%$
Cu_goethite	Cu_goethite	Cu_goethite
$\chi^2_{\rm red} = 0.62$	$\chi^2_{\rm red} = 3.40$	$\chi^2_{\rm red} = 0.27$
X = 365, y = 81, point # Red	X = 206, y = 104, point # Blue	X = 282, y = 13, point # Blue
94% $Cu_2S$ + 6% $Cu_goethite$	$14\% Cu_2S + 24\% CuFe_2S_3 + 82\%$	3% Cu <sub>2</sub> S + $4%$ CuFe <sub>2</sub> S <sub>3</sub> + 110%
	Cu_HA – 20% Cu_goethite	Cu_HA – 17% Cu_goethite
$\chi^2_{\rm red} = 1.96$	$\chi^2_{\rm red} = 0.19$	$\chi^2_{red} = 0.15$

Table S3.	<b>Results of fits fo</b>	or selected individual	pixels shown in	Fig. S2

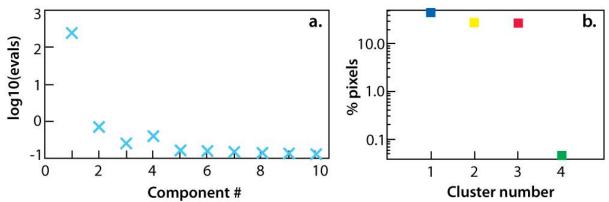
### Comparing 3 v. 4 components for B3

A further fit was conducted using four rather than three components, by including Cu<sup>II</sup> sorbed on goethite as the fourth component (Figs 1k, S2). The Kelly et al.<sup>[1]</sup> test was used to distinguish whether the two models were statistically significantly different

$$\frac{\chi^2_{red,1}}{\chi^2_{red,2}} - 1 \ge 2\sqrt{\frac{2}{v}}$$

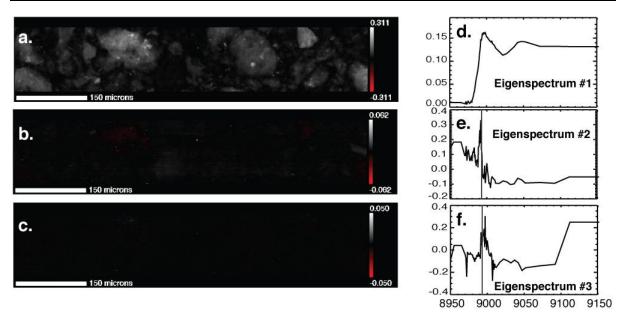
where v is the degrees of freedom. For XANES data, v may be defined as the number of data points (80 in this instance, see HORAE package<sup>[2]</sup>) minus the number of variables used to fit the spectrum.

The sum of the matrix of  $\chi^2_{red}$  for 3 components (C3) = 208, and for 4 components (C4) = 198, and C3/C4 ~1.07, which is not greater or equal to  $1+2\times\sqrt{(2/80)}$  ~1.3, implying that overall there is no statistically significant benefit in introducing a fourth component. Similarly, when the matrix of  $\chi^2_{red}$  (3 components) was divided by the matrix of  $\chi^2_{red}$  (4 components), most of the values were around one (Fig. S2f).

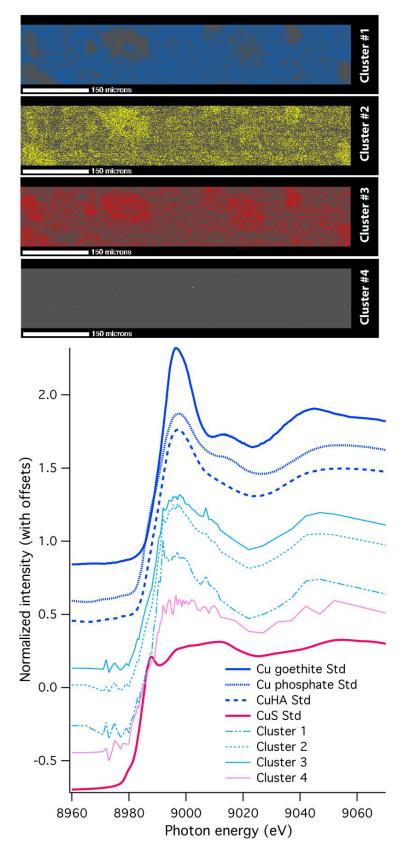


Aged biosolid sample B6

**Fig. S3.** Results of statistical analysis for sample B6. (a)  $\log_{10}$  eigenvalues determined by PCA. (b) percentage of pixels classified into cluster components. The components were switched manually and re-ordered in terms of their 'interpretability'.



**Fig. S4.** Results of the 'model-free' analysis of the Cu K-edge XANES stack for sample B6. (a–c) Eigenimages and (d–f) corresponding eigenspectra.



**Fig. S5.** Distribution and spectra of the four clusters. The spectra are compared to standards. Note that the signal quality does not allow to distinguish the  $Cu^{II}$  phosphate from  $Cu^{II}$  sorbed onto humic acid.

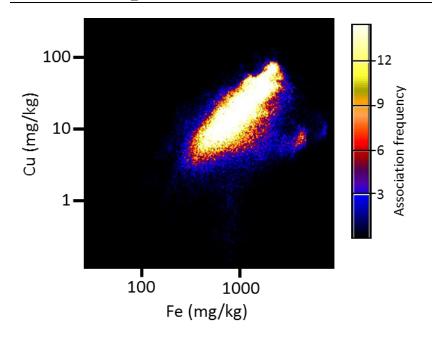


Fig. S6. Association plot showing the relationship between Cu and Fe concentrations for all data point collected in the elemental map of sample B6 (at 9152 eV).

Table S4. Results of fits for selected individual pixels shown in Fig. 4		
X = 30, y = 25, point <b>#1</b> Red	X = 284, y = 1, point <b>#4</b> Green	X = 216, y = 14, point <b>#7</b> Blue
94% Cu_HA + 6% CuS	84% CuS + 18% Cu_goethite	32% Cu_HA + 20% CuS + 48%
$\chi^2_{\rm red} = 0.32$	$\chi^2_{\rm red} = 5.84$	Cu_goethite
		$\chi^2_{\rm red} = 0.60$
X = 235, y = 110, point <b>#2</b> Red	X = 486, y = 110, point <b>#5</b> Green	X = 242, y = 126, point <b>#8</b> Blue
85% Cu_HA + 15% CuS	45% Cu_HA + 55% CuS	50% Cu_HA + 25% CuS + 25%
$\chi^2_{\rm red} = 0.27$	$\chi^2_{\rm red} = 0.42$	Cu_goethite
		$\chi^2_{\rm red} = 0.51$
X = 737, y = 25, point <b>#3</b> Red	X = 548, y = 35, point <b>#6</b> Green	X = 506, y = 61, point #9 Blue
86% Cu_HA + 14% CuS	4% Cu_HA + 89% CuS + 7%	34% Cu_HA + 39% CuS + 37%
$\chi^2_{\rm red} = 0.24$	Cu_goethite	Cu_goethite
	$\chi^2_{\rm red} = 0.52$	$\chi^2_{\rm red} = 0.39$

# References

S. Kelly, D. Hesterberg, B. Ravel, Analysis of soils and minerals using X-ray absorption spectroscopy, [1] in Methods of Soil Analysis, Part 5. Mineralogical Methods 2008, Chapt. 14, pp. 387-463 (Soil Sciences Society of America: Madison, WI).

B. Ravel, M. Newville, ATHENA, ARTEMIS, HEPHAESTUS: data analysis for X-ray absorption [2] spectroscopy using IFEFFIT. J. Synchrotron Radiat. 2005, 12, 537-541. doi:10.1107/S0909049505012719