# Information Content of EXAFS (I)

Sometimes, we have *beautiful* data. This is the merge of 5 scans on a 50 nm film of GeSb on silica, at the Ge edge and measured in fluorescence at NSLS X23a2.



Here, I show a Fourier tranform window of [3:13] and I suggest a fitting range of [1.7:4.7]. Applying the Nyquist criterion:

$$N_{idp}pproxrac{2\Delta k\Delta R}{\pi}pprox 19$$

This gives us an upper bound of the information content of that portion of the EXAFS spectrum.



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# Information Content of EXAFS (II)

Sometimes, we have less-than-beautiful data. This is the merge of 42 scans on a solution containing 3 mM of Hg bound to a synthetic DNA complex, measured in fluorescence at APS 20BM.



Here, I show a Fourier tranform window of [2:8.8] and I suggest a fitting range of [1:3]. Applying the Nyquist criterion:

$$N_{idp} pprox rac{2\Delta k\Delta R}{\pi} pprox 8$$

This talk discusses strategies for dealing with severely limited information content.



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# What is This Nyquist Criterion?

Given that we apply Fourier analysis to  $\chi(k)$ , we can treat EXAFS as a signal processing problem. If

- The signal is ideally packed and
- The error in the fitting parameters is normally distributed and
- We understand and can enumerate all sources of error and
- We know the theoretical lineshape of our data then

$$N_{idp} pprox rac{2\Delta k\Delta R}{\pi}$$

where, for EXAFS,  $\Delta k$  is the range of Fourier transform and  $\Delta R$  is the range in R over which the fit is evaluated.

#### Unfortunately ...

None of those conditions really get met in EXAFS.  $N_{idp}$  is, at best, an upper bond of the actual information content of the EXAFS signal.



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### **Statistical Parameters: Definitions**

**IFEFFIT** uses a Levenberg-Marquardt non-linear least-squares minimization, a standard  $\chi^2$  fitting metric, and a simple definition of an R-factor:

$$\chi^{2} = \frac{N_{idp}}{\epsilon N_{data}} \sum_{i=min}^{max} \left[ \operatorname{Re} \left( \chi_{d}(r_{i}) - \chi_{t}(r_{i}) \right)^{2} + \operatorname{Im} \left( \chi_{d}(r_{i}) - \chi_{t}(r_{i}) \right)^{2} \right]$$
(1)  
$$\chi^{2}_{\nu} = \frac{\chi^{2}}{\nu}$$
(2)  
$$\nu = N_{idp} - N_{var}$$
(3)

 $\epsilon = \text{measurement uncertainty}$ 

$$\mathcal{R} = \frac{\sum_{i=\min}^{\max} \left[ \operatorname{Re} \left( \chi_d(r_i) - \chi_t(r_i) \right)^2 + \operatorname{Im} \left( \chi_d(r_i) - \chi_t(r_i) \right)^2 \right]}{\sum_{i=\min}^{\max} \left[ \operatorname{Re} \left( \chi_d(r_i) \right)^2 + \operatorname{Im} \left( \chi_d(r_i) \right)^2 \right]}$$
(4)



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# An Obviously Good Fit

Here is a fit to the first two shells of copper metal at 10 K



This is an unambigously good fit:

$\mathcal{R} \ \mathcal{N}_{idp} \  u$	0.0025 16 12
$S_0^2$ $E_0$ $a$ $\Theta_D$	0.95(3) 5.98(36) eV 3.6072(26) Å 505(16) K

Yet  $\chi^2 = 32.03!$ 

#### What's goin' on here?

Why is  $\chi^2$  for an obviously good fit so much larger than 1?



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### **Statistical Parameters: Fit Evaluation**



The determination of measurement uncertainty is, perhaps, a bit hokey in IFEFFIT. It is the average of the signal between 15 Å and 25 Å in the Fourier transform – a range that probably does not include much signal above the noise.

Is that signal between 15 Å and 25 Å in copper metal? Perhaps....

In any case, this method ignores the following:

- Approximations and errors in theory
- Sample inhomogeneity
- Detector nonlinearity
- Gremlins ;-)



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## **Statistical Parameters: Interpretation I**

OK then ... what is the implication of  $\epsilon$  never being evaluated correctly by <code>IFEFFIT</code>?

- $\chi^2_{\nu}$  is always somewhere between big and enormous.
- 2  $\chi^2_{\nu}$  is impossible to interpret for a *single* fit.
- $\chi^2_{\nu}$  can be used to compare different fits. A fit is improved if  $\chi^2_{\nu}$  is significantly smaller.
- Error bars are taken from the diagonal of the covarience matrix. If χ<sup>2</sup><sub>ν</sub> is way too big, the error bars will be way too small. The error bars reported by IFEFFIT have been scaled by √χ<sup>2</sup><sub>ν</sub>.
- Thus the error bars reported by IFEFFIT are of the "correct" size if we assume that the fit is a "good fit".



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### Statistical Parameters: Interpretation II

How do we know if a fit is "good"?

- The current fit is an improvement over the previous fit if  $\chi^2_\nu$  is sufficiently smaller.
- You should be suspicious of a fit for which  $N_{var}$  is close to  $N_{idp}$ , i.e. a fit for which  $\nu$  is small.
- All variable parameters should have values that are physically defensible and error bars that make sense.
- The results should be consistent with other things you know about the sample.
- The R-factor should be small and the fit should closely overplot the data. (That was redundant. (2))



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## **Interpreting Error Bars**

The interpretation of an error bar depends on the meaning of the parameter.

- A fitted  $\sigma^2$  value of, say, 0.00567  $\pm$  0.00654 is troubling. That result means suggests that  $\sigma^2$  is quite ill-determined for that path and not even positive definite. Yikes!
- On the other hand, a fitted  $E_0$  value of, say,  $0.12 \pm 0.34$  is just fine.  $E_0$  can be positive or negative. A fitted value consistent with 0 suggests you chose  $E_0$  wisely back in ATHENA.



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# **Outside Knowledge**

Because the information content of the XAS measurement is so limited, we are forced to incoporate knowledge from other measurements into our data analysis and its interpretation.

- Other XAS measurements for instance, the "chemical transferability" of  $S_0^2$
- Diffraction tells us structure, coordination number, bond lengths, etc.
- Things like NMR, UV/Vis, and IR can tell us about the ligation environment of the absorber
- Common sense:
  - $R_{NN} \ncong 0.5 \text{ Å}, R_{NN} \ncong 4.0 \text{ Å}$ •  $\sigma^2 \measuredangle 0 \text{ Å}^2$
- ... and anything else your (physical || chemical || biological || whatever) intuition tells you



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