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Subject: Optimal interpolation

Posted by [Randall Skelton](#) on Thu, 29 Aug 2002 11:49:16 GMT

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It is funny that 'optimal interpolation' (aka zero filling) has come up in this group...

My problem is basically is how to rectify the fact that noise becomes correlated when you interpolate. If I have a measured signal (with uncorrelated white noise) of  $i$  points, and interpolate to get  $2*i$  points, then there is a reduction in the apparent noise on the signal. Of course, in the original signal I have a diagonal covariance while in the second the noise is correlated which accounts for the apparent decrease.

In the case of an optimal interpolation scheme, no net information (in the Shannon or Fischer sense) is added by interpolating and the process is reversible. I therefore (perhaps naively) assume that the process of mapping the covariance matrices must also be reversible.

Thinking in the time domain, I can represent zero padding as a matrix multiplication

$$y = \begin{bmatrix} I \\ 0 \end{bmatrix} x \quad \leftrightarrow \quad x = \begin{bmatrix} I & 0 \end{bmatrix} y$$

where  $y$  is the zero-padded signal vector of length  $n$ ,  $x$  is the signal without padding of length  $l$ , and  $I$  is an identity matrix of size  $l$  by  $l$  and  $0$  is a matrix of zeros making the matrix  $\begin{bmatrix} I & 0 \end{bmatrix}$   $l$  by  $n$  in size. Accordingly, the two process are related by the transpose of the zero padding matrix operator.

I am relatively happy with the fact that zero padding in the time domain corresponds to optimal interpolation in the spectral domain. If I let  $s$  represent my spectrum on the interpolated grid (length  $n$ ) and  $z$  be the course spectrum (length  $l$ ) then

$$s = W z \quad \leftrightarrow \quad z = (W^*) s$$

where the interpolation matrix  $W$  is  $n$  by  $l$  and  $(W^*)$  is a  $l$  by  $n$  pseudo inverse of  $W$ . So,  $(W^*) W = I$  and the full spectrum constructed from  $z$  by interpolation will give the same  $z$  back if the interpolation is undone. However, the product  $W (W^*)$  may not give  $I$  ( $n$  by  $n$ ) as  $W$  is of rank  $l < n$  (i.e. it is impossible to take a high frequency spectrum, decrease the sampling, and then transform again to restore the high resolution). In this case, I am only interested in accounting for the full covariance of the former case (i.e. I have a spectrum  $z$ , I interpolate by zero-padding to get  $s$ , and I want to know the covariance matrix for the interpolated result). In this case, the full covariance of the interpolated result

(Ss) should simply be:

$$Ss = W Sz W'$$

where Sz is the covariance of the course spectrum and ' denotes the transpose. However, Sz is only of rank I and is therefore singular?

Clearly I am missing something here... Basically, I zero-pad a time-series measurement (an interferogram) which I assume to have a diagonal (uncorrelated) covariance prior to zero-padding. I want to know what the full covariance after zero padding. Also, what is the best way of constructing W and W\*? I generally always interpolate in the time (Fourier) domain... is there a way of mapping the covariance in spectral space to the time (Fourier) domain?

In re-reading this I am not entirely sure what I have written is clear, but I cannot think of another way to explain it.

Many thanks for the input,  
Randall

On Wed, 28 Aug 2002, Robert Stockwell wrote:

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> Paul van Delst wrote:
>> GB Karas wrote:
>>
>>> sinc interpolation relies on the following interpolating kernel:
>>>
>>> sinc(x)=sin(x)/x
>>
>>
>> Why don't you use FFT's to do the interpolation then? You know, FFT the curve in question,
zerofill
>> (or truncate) the result and FFT back?
>
>
> If you check out a digital signal processing book on upsampling
> or downsampling (or perhaps multirate sampling) you'll see that it
> can be the way to go in some cases.
> (oppenheimer and schaffer frinstance)
>
> Cheers,
> bob
>
>
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