



## Group delay and phase delay

When filtering a signal through a linear time-invariant (LTI) system, the resulting signal experience a frequency dependent delay, the so-called group delay, that cause the signal to be delayed in time as compared to the input signal.

Consider a signal,  $x_t$ , filtered through the LTI filter  $h_t$ , such that

$$y_t = \int_{-\infty}^{\infty} h_{\tau}x_{t-\tau}d\tau$$

Then, if the input signal is a sinusoidal, i.e.,

$$x_t = a_t \cos(\omega t + \theta)$$

with some slowly time-varying envelope,  $\boldsymbol{a}_t$ , the output signal may be well approximated as

$$y_t \approx |H(\omega)|a_{t-\tau_g}\cos(\omega(t-\tau_\phi)+\theta)$$

where  $H(\omega)$  is the Fourier-transform of the filter, and  $\tau_g$  and  $\tau_\phi$  are the group delay and the phase delay, respectively.

This means that the phase (of the sinusoid) is delayed by  $\tau_{\phi}$ , whereas the envelope of the siganl is delayed by  $\tau_{g}$ . In general, these delays will be frequency dependent, meaning that different frequencies will experience different delays.



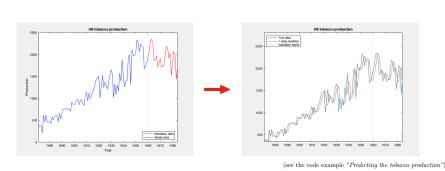




## Group delay and phase delay

When predicting a signal, one typically implements the prediction using a linear filter, initiating the filter from the start of the modeling data, and then compare the result to the validation data, in order to form a k-step prediction for the entire validation data.

As a result, the group and phase delays have the effect that the predicted signal (may) appear to be "shifted" as compared to your validation data.



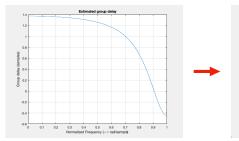


## Group delay and phase delay

As the delays will be frequency dependent, these will generally vary over the signal. In Matlab, one can compute the resulting delay using the command grpdelay, showing how the delay varies over frequency.

If the phase is well behaved (this is not always the case), the signal will appear shifted with approximately the average delay (in this example this is 1).

When forming a linear prediction, this is the best we can achieve, and the resulting prediction should not be shifted to compensate for this. However, it may be helpful visually to do so when comparing the prediction with the validation data.





(see the code example "Predicting the tobacco production")