

Nonlinear Systems



Motivation for Simulating Nonlinear Systems

- In principle the performance of linear systems can be tackled by analytical means but the study of nonlinear systems by such means is by and large intractable
- Hence, simulation is generally the appropriate tool for most nonlinear systems because simulation of such systems is no more difficult than for linear systems given the model
- **Note that** the transform methods for linear systems cannot strictly be applied since superposition does not hold! The nonlinear system, therefore, generally has to be simulated in the *time domain*



Modelling Considerations

- For nonlinear system models, a number of model-type descriptors are:

1. ***Memoryless models***

2. ***Models with memory***

3. Baseband models

4. Bandpass models

5. Block (input/output) models

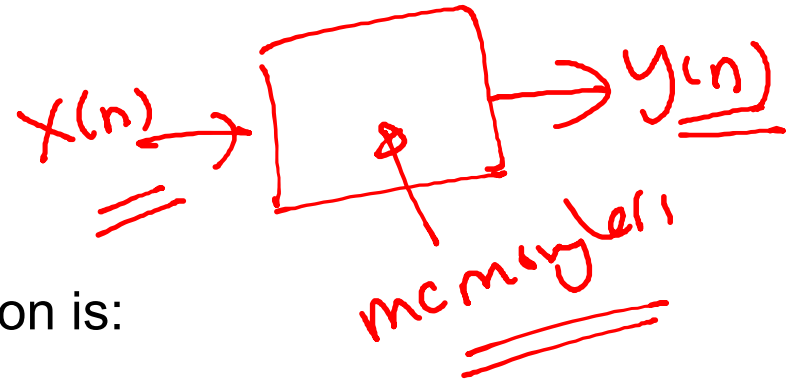
6. Analytical models

7. Nonlinear differential equation models

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Modelling Considerations



- The *most significant* categorical distinction is:
 - Zero-memory nonlinearity (ZMNL)
 - Nonlinearity with memory (NLWM)
- The term “memoryless” implies that the output of a device is a function of the input signal at the present instance only!
- Memoryless models are an idealisation: **No** physical device is truly (input) frequency independent. Rather, as the BW of an input signal increases, we can expect filtering effects to become manifest



Memoryless Nonlinearities

- **Memoryless Baseband Nonlinearities** – This model is characterised by a simple functional relationship of the form

$$\underline{y(t)} = \underline{F}[\underline{x(t)}]$$

- Our definition of a baseband nonlinearity means that $x(t)$ is a baseband signal, meaning that its power (or energy) is spectrally concentrated around zero frequency and this will also be true of $y(t)$

- Certain nonlinearity can be given in analytical form, e.g., a diode

$$\boxed{I} = I_s (e^{\lambda V} - 1)$$

- The exponential can be expanded into a power series which could be truncated after a moderate number of terms with acceptable error

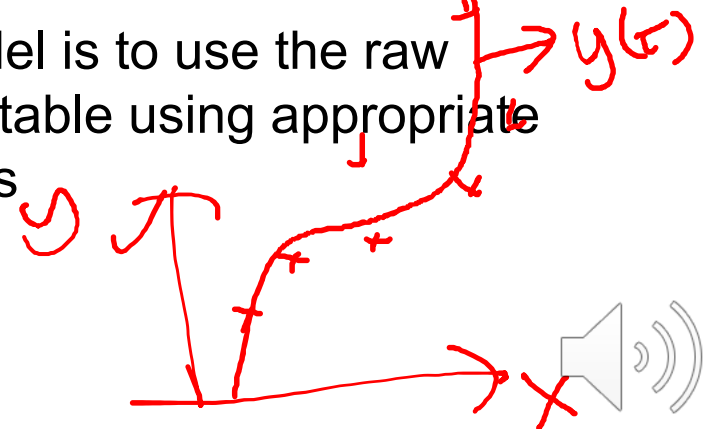


Memoryless Nonlinearities

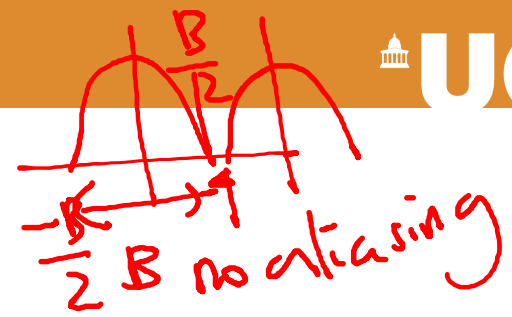
- This suggests that F might also be representable by a power series, or by an orthogonal function expansion, or by a polynomial in x . Thus,

$$y(t) = F[x(t)] \approx \sum_{n=0}^N a_n x^n(t)$$

- The coefficients a_n may be obtained by fitting a polynomial of degree N
- Often, the most efficient and accurate model is to use the raw experimental data themselves in a lookup table using appropriate interpolation between tabulated data points



→ LTI → $f_s \geq 2W$



Memoryless Nonlinearities

$X(f) * X(f) \leftarrow \approx B f_s ?$

□ **Estimating the Sampling Rate for Nonlinear Systems** – Given a nonlinear model, the sampling rate in simulation must be increased

$X(f) *^{n-1} X(f)$

- Suppose that the input $x(t)$ is bandlimited to $\pm B/2$ and assume that the polynomial approximation on the previous slide holds. Then, we have

$x(t) \rightarrow X(f)$

$x^2(t) \Rightarrow$

$X(f) * X(f)$

$$Y(f) = a_0 \delta(f) + \sum_{n=1}^N a_n \left[X(f) *^{n-1} X(f) \right]$$

(n-1)-fold convolution

$x^3(t) = \mathcal{F}\{x^2(t) * X(f)\} = X(f) * X(f) * X(f) \approx \sum a_n \mathcal{F}\{x^n(t)\}$

- Hence, the term $x^n(t)$ has BW nB (i.e., $\pm nB/2$)

$y(t) = \sum_{n=0}^N a_n x^n(t)$

$\mathcal{F}\{x^n(t)\} = X(f) * X(f) * \dots * X(f)$

Memoryless Nonlinearities

$2NB$
 $\frac{2NB}{4}$
 conservative estimate

- As we know, the sampling rate for any bandlimited system has to be at least twice the BW in order not to introduce aliasing distortion
 $\underline{\quad} = \underline{\quad}$
- To avoid aliasing error for a nonlinear system, it would seem that we must have $f_s > 2NB$. However,
 - For many nonlinear systems the coefficients a_n decrease with n
 - The magnitude of the spectrum of $x^n(t)$ is not uniformly distributed over nB . Indeed, as n increases, we generally expect the spectrum of $x^n(t)$ to be increasingly concentrated around zero frequency
- Hence if the sampling rate is less than $2NB$, only the relatively low valued tails of the spectrum are aliased \rightarrow error is small!

