## Simulink and Integration - Motivation

- Simulation is used extensively in engineering analysis and design
- Simulations always produce results trust but verify...
- Very fast way to gain insight into how your dynamic system responds to different situations (inputs and ics)
- Simulation of a dynamic system is the numerical solution of its DEQ model so it's important to know something about how they work - numerical integration

# Simulink Model $\dot{x} = Ax + Bu \\ y = Cx + Du$ Input $\dot{y} = Cx + Du$ Output

1

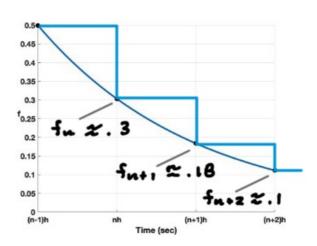
#### Skills

- Terminology:
  - a. Integration method and order
  - b. Step size
  - Difference equation
  - d. Euler, trapezoidal and RK integration methods
- 2. Given a state space model
  - Create a simulink simulation, with suitably chosen step size and integration method, and do some analysis with it
  - b. Numerically solve it for any input and initial condition

## **Assumptions and Notation**

- 1. The simulation will update at a fixed time interval denoted h. Everything in it is sampled at this rate
- 2. The sample number will be denoted *n* yes, we also use this for the order of a dynamic system. Sorry about that...
- 3. With these two concepts we can discretize continuous functions, for example,  $u(t) = \sin 3t$  will only exist at n = 0, 1, ... or

4. More generally, the sampled values of the function f(t) are



#### **End Game**

Given some dynamic system DEQ model, we will pick a **numerical integration method**, then solve the DEQ model numerically - that is, we'll simulate it.

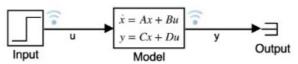
For example, the DEQ

$$\dot{x}(t) = -4x(t) + u(t), x(0) = x_0$$

can be solved (simulated) by the difference equation

$$x_{n+1} = (1-4h)x_n + hu_n$$
 Let  $u(t) = \sin(t)$ ,  $h = .1$ ,  $1-4h = .6$ ,  $x_0 = 1$   
 $x_1 = .6x_0 + .1 \sin(0) = .6$   
 $x_2 = .6x_1 + .1 \sin(.1) = .36 + .1 \sin(.1) = .37$   
 $x_3 = .6x_2 + .1 \sin(.2) = .24$ 

and in Simulink



# Introduction to Numerical Integration and Euler's Method

Consider the first order, linear DEQ model of a dynamic system

$$\dot{x} = f(t)$$

Let's solve it by integrating both sides.

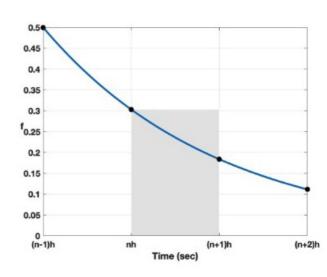
$$\int_{0}^{(n+1)h} \frac{dx}{dt} dt = \int_{0}^{(n+1)h} f(t) dt$$

$$= \int_{0}^{(n+1)h} \frac{dx}{dt} dt \approx \int_{0}^{(n+1)h} f(t) dt$$

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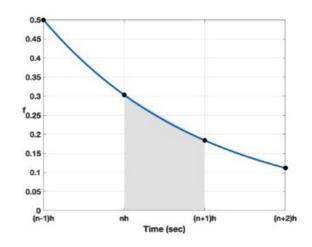
**Euler**: One f evaluation and errors are proportional to h.





#### **Some Other Methods**

**Trapezoidal**: Two f(x) evaluations (2nd order method), errors are proportional to  $h^2$ .



**Runge-Kutta:** Many flavors, 2nd order, 3rd order, 4th order, etc. In Simulink ode2, ode3, ode4, ... Errors are proportional to  $h^2$ ,  $h^3$ ,  $h^4$  etc.

# **Extend To Any Dynamic System**

- Replace the scalar  $\dot{x} = f(t)$  with the system of equations  $\dot{\mathbf{x}} = \mathbf{f}(\mathbf{x}, \mathbf{u}, t)$
- · For example, Euler integration becomes

$$\mathbf{x}_{n+1} = \mathbf{x}_n + h \, \mathbf{f_n}(\mathbf{x}_n, \mathbf{u}_n, nh)$$

 While there are many other considerations, stability for one, you'll need to find a balance between the number of function evaluations and the time step to achieve the accuracy you need.

7

## Time Step Selection - Linear Systems

$$\dot{\mathbf{x}} = \mathbf{f}(\mathbf{x}, \mathbf{u}) = A \mathbf{x} + B \mathbf{u}$$

- You need the integration method to be "faster" than the characteristic response of the dynamic system
- 2. Find the magnitudes of the eigenvalues of A works for complex eigenvalues too
- >> abs(eig(A))
- 3. Pick out the largest one as  $\lambda_{max}$
- 4. Set your time step such that  $h\lambda_{max} \leq 0.001$ . This will give painfully small values of h for Euler a first order integration method. You can increase h, roughly, by factors of 2 for each increase in integration method order as long as  $h\lambda_{max} < .1$ .
- 5. Always test your selection by decreasing h by a factor of 10, rerun, and make sure the results are very small. Small depends on the application, but differences that are less than  $1 \times 10^{-6}$  is often sufficient.

# Example 1 - Time Step and Integration Method Selection

Given the state space model below, calculate a suitable integration time step for both Euler and RK-4. Create a Simulink model and compare step responses for both integration methods.

$$A = \begin{bmatrix} 0 & \mathbf{I} & \mathbf{0} & 0 \\ -20 & -3 & 1 & 1 \\ 0 & 0 & -7 & 0 \\ 0 & 0 & 0 & -2 \end{bmatrix}, \quad B = \begin{bmatrix} 0 \\ 0 \\ 1 \\ 0 \end{bmatrix}, \quad C = \begin{bmatrix} 1 & 0 & 0 & 0 \end{bmatrix}, \quad D = 0$$

Amax 3 7

Euler: h= .001/7 2.00014 sec

RK-4: h = ,00014 (8) 2,001 This can be incr. a bit ...

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Given a system of linear DEQs you can (with more practice...)

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- b. Pick a suitable integration method and step size
- c. Explore its simulated step response

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