

CT561: Systems Modelling & Simulation

Lecture 7: Formulating Delays

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<https://github.com/JimDuggan/SDMR>



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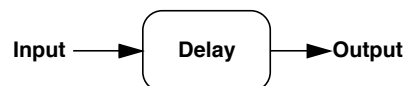
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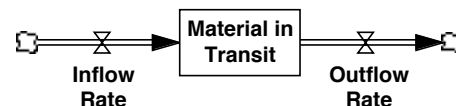
(1) Delays

- “Delays are pervasive.
 - It takes time to **measure and report information**.
 - It takes time to **make decisions**.
 - It takes time for decisions to **affect the state of the system**” (Sterman 2000)
- We need to use delays in many of our models

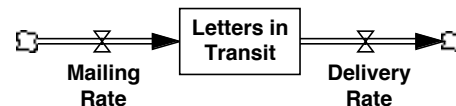
The output of a delay lags behind the input:



General structure of a material delay:



The post office as a delay:



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Example of a delay... incubation period

Open access Original research

BMJ Open Incubation period of COVID-19: a rapid systematic review and meta-analysis of observational research

Conor McAloon¹, Aine Collins², Kevin Hunt³, Ann Barber², Andrew W Byrne⁴, Francis Butler⁵, Miriam Casey⁶, John Griffin⁵, Elizabeth Lane⁶, David McEvoy⁷, Patrick Wall⁷, Martin Green⁸, Luke O'Grady^{1,8}, Simon J More²

Table 2 Percentiles of the pooled lognormal distribution after simulating all possible combinations of mu and sigma within the 95% CIs of the pooled estimates of both parameters

Percentile	Median (days)	Min	Max	Difference (max - min)
2.5th	1.92	1.54	2.38	0.84
5th	2.24	1.83	2.75	0.92
10th	2.69	2.24	3.23	0.99
25th	3.64	3.12	4.25	1.13
50th	5.10	4.53	5.75	1.22
75th	7.15	6.13	8.34	2.21
90th	9.69	8.06	11.60	3.54
95th	11.60	9.49	14.20	4.71
97.5th	13.60	10.9	16.90	6.00

The median days for each percentile are shown along with the minimum and maximum values for that percentile.

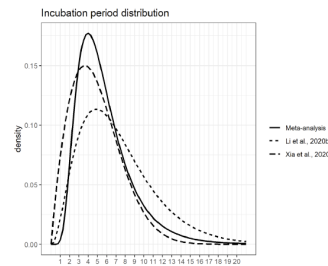


Figure 6 Probability density function of pooled lognormal distribution for incubation period and studies (n=2) not included in the meta-analysis because of the distribution used.



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Delay Distributions

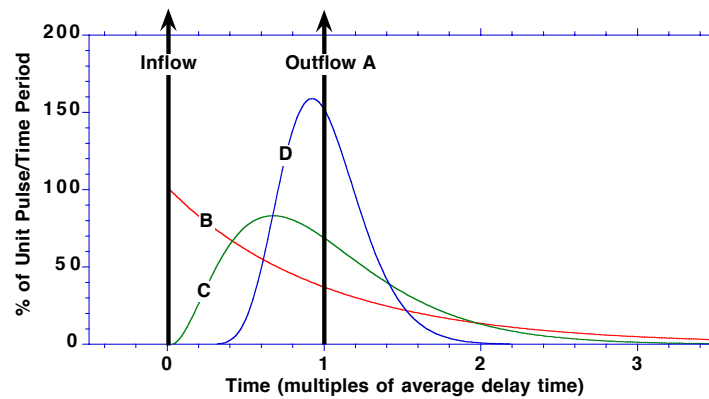


Figure 11-2 Some distributions of the outflow from a delay

The input in all cases is a unit pulse at time zero. Outflow A is a pipeline delay in which all items arrive together exactly 1 delay time after they enter. Outflow distributions B-D exhibit different degrees of variation in processing times for individual items so some arrive before and some after the average delay time. In all cases the average delay time is the same and the areas under each distribution are equal.



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(1) First Order Material Delay

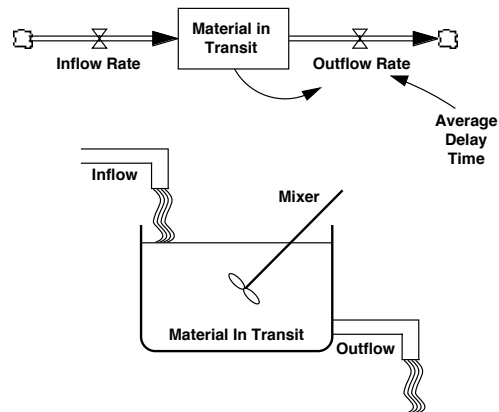


Figure 11-4 First-order material delay: structure

The outflow is proportional to the stock of material in transit. The contents of the stock are perfectly mixed at all times, so all items in the stock have the same probability of exit, independent of their arrival time.



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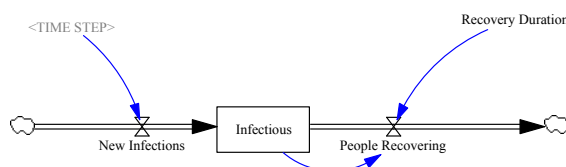
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Example 1: Infectious Disease Recovery Delay



The outflow is proportional to the stock of material in transit. The contents of the stock are perfectly mixed at all times, so all items in the stock have the same probability of exit, independent of their arrival time.

$\text{Infectious} = \text{INTEG}(\text{New Infections} - \text{People Recovering}, 0)$

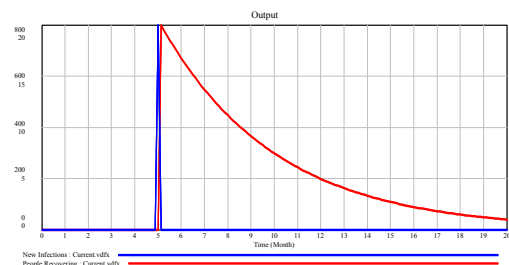
$\text{New Infections} = \text{PULSE}(5, \text{TIME STEP}) * 100 / \text{TIME STEP}$

$\text{People Recovering} = \text{Infectious} / \text{Recovery Duration}$

$\text{Recovery Duration} = 5$

$\text{TIME STEP} = 0.125$

The time step for the simulation.

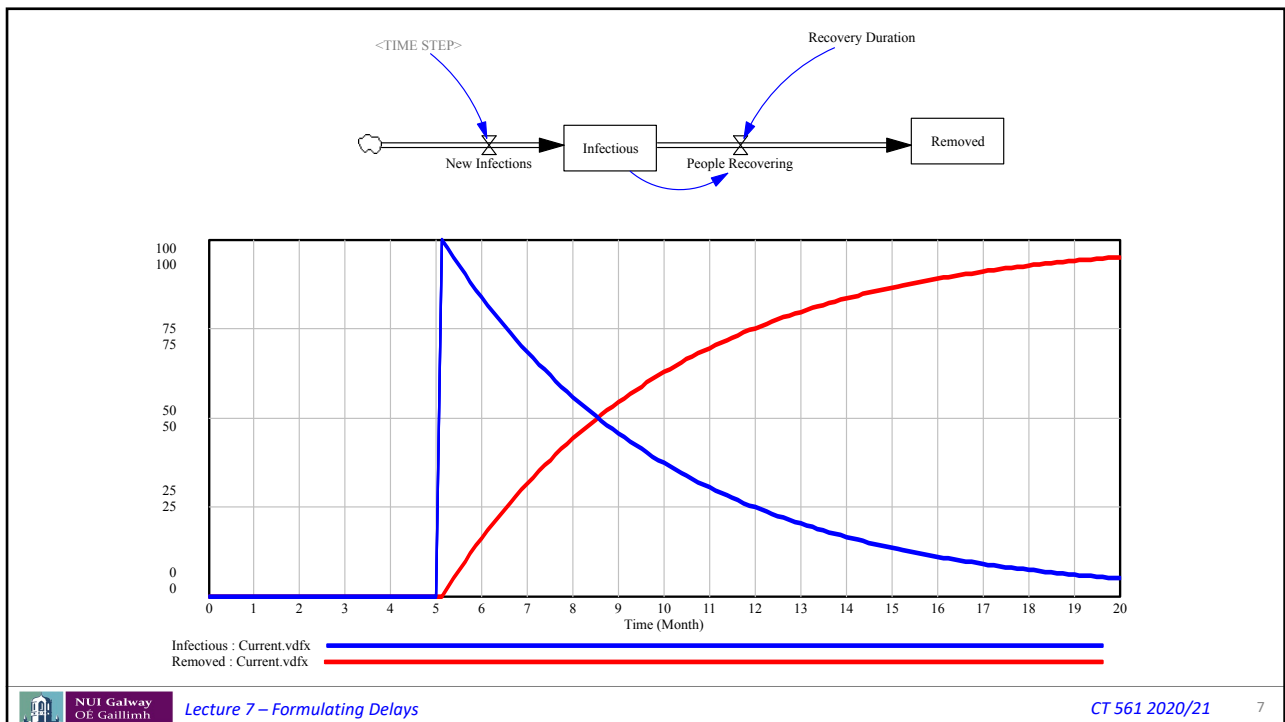


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Challenge 7.1 – First Order Delay

- Draw a stock and flow model of a software engineering team
- Assume there are 100 rookies to start and 0 experienced
- Assume the average delay for progression is 12 months
- Simulate for 36 months, and show the two stocks together
- Discuss the advantages/limitations of the model

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(2) Second Order Material Delay (Sterman 2000)

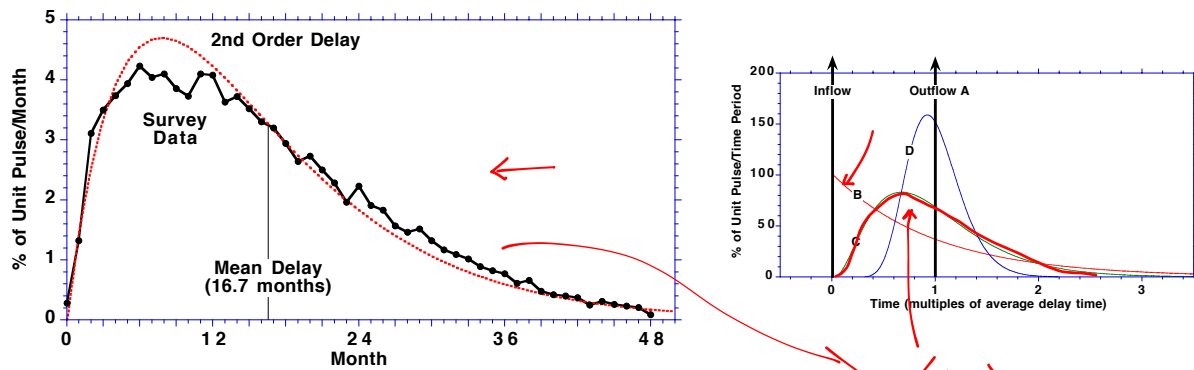


Figure 11-17 The construction lag for capital plant: data vs. model

Data: Distribution of construction completion times for US private nonresidential structures, 1961-1991, as estimated by Montgomery (1995) from US Dept. of Commerce survey data. The mean lag is 16.7 months. **Model:** Second-order material delay with average delay time of 16.7 months.



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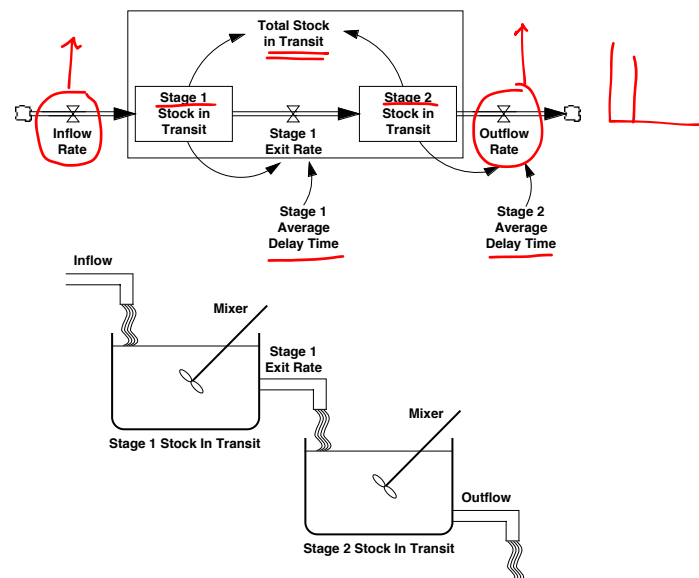
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Figure 11-6
Higher-order
delays are
formed by
cascading first-
order delays
together.

Delay time
“shared” by
outflows



$$\text{Stage 1 Exit Rate} = \text{Stage 1 Stock in Transit} / \text{Stage 1 Average Delay Time}$$

$$\text{Outflow Rate} = \text{Stage 2 Stock in Transit} / \text{Stage 2 Average Delay Time}$$



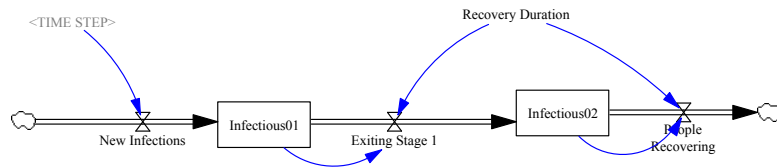
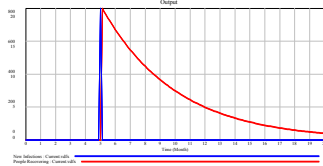
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Example 2: Recovery Delay (2nd Order)



Exiting Stage 1 = Infectious01 / (Recovery Duration / 2)

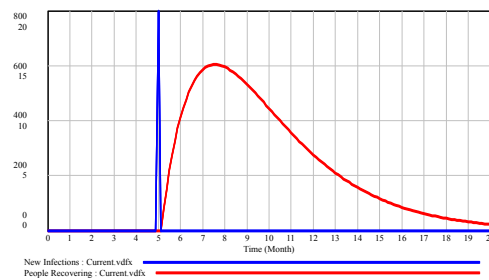
Infectious01 = INTEG(New Infections - Exiting Stage 1 , 0)

Infectious02 = INTEG(Exiting Stage 1 - People Recovering , 0)

New Infections = PULSE (5, TIME STEP) * 100 / TIME STEP

People Recovering = Infectious02 / (Recovery Duration / 2)

Recovery Duration = 5

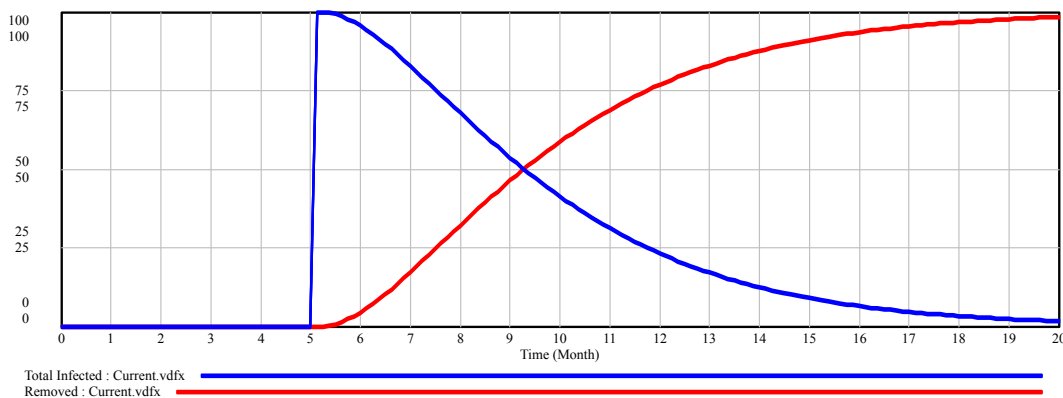
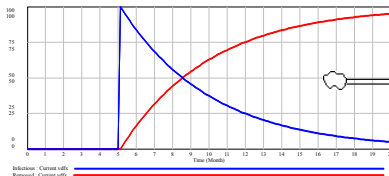
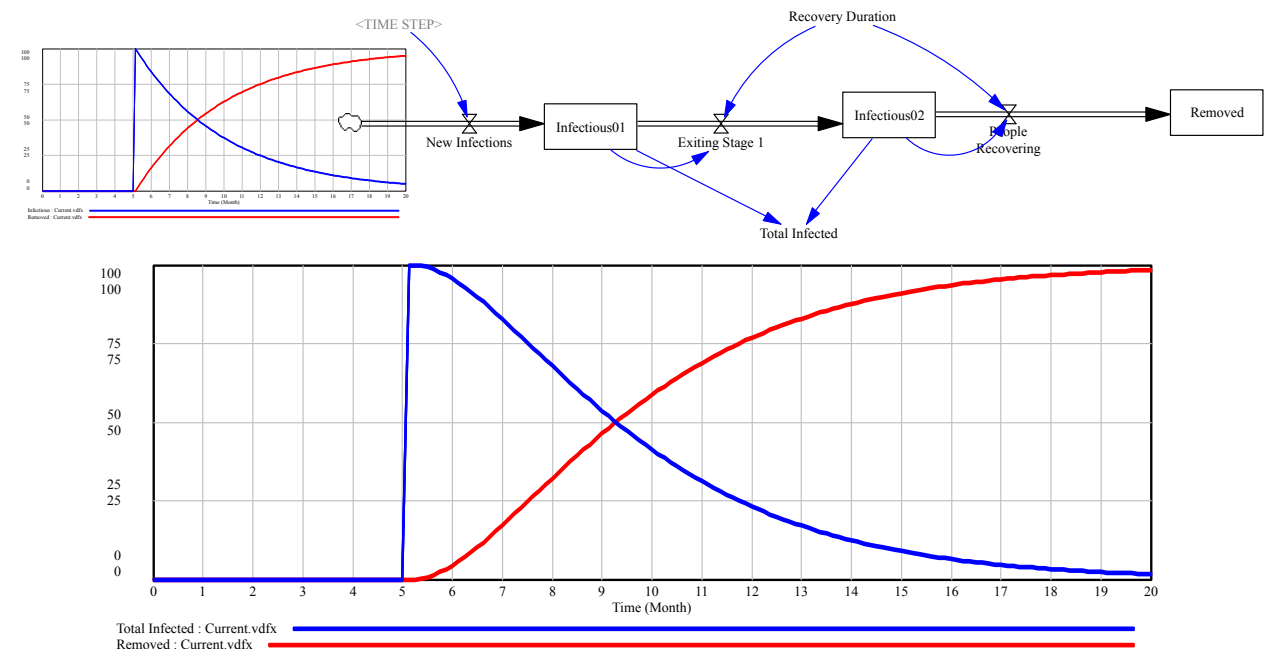


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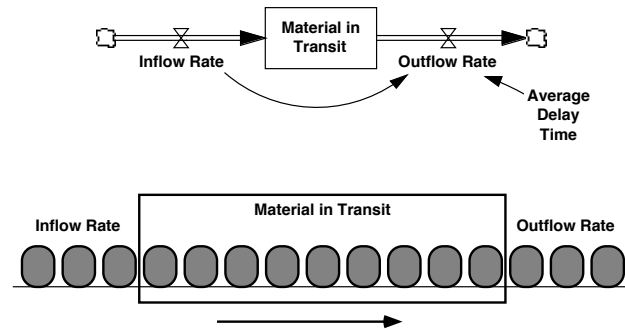
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(3) Pipeline Delay

Figure 11-3 Pipeline delay: structure

In a pipeline delay individual items exit the delay in the same order and after exactly the same time, like widgets moving down an assembly line at a constant speed.

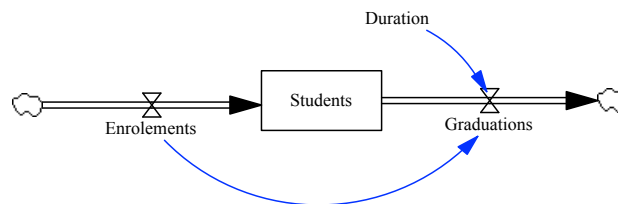


$$\text{Material in Transit}(t) = \text{INTEGRAL}(\text{Inflow}(t) - \text{Outflow}(t), \text{Material in Transit}(0))$$

$$\text{Outflow}(t) = \text{Inflow}(t - \text{Average Delay Time})$$



Student Example – Step Input



Duration = 4

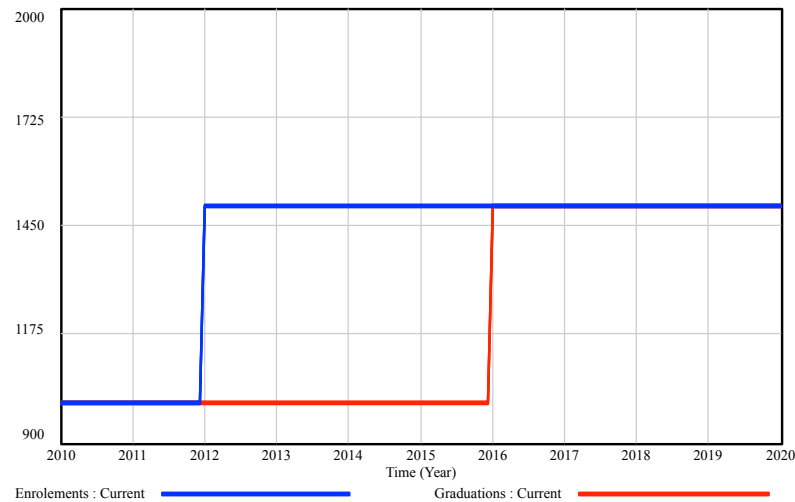
Enrolments = 1000 + step (500, 2012)

Graduations = DELAY FIXED (Enrolments ,Duration , 1000)

Students = INTEG(Enrolments - Graduations , 4000)



Pipeline Delay Response



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Challenge 7.2 – Second Order Delay

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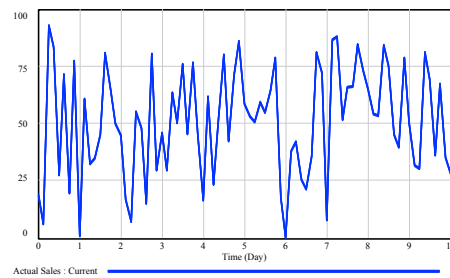
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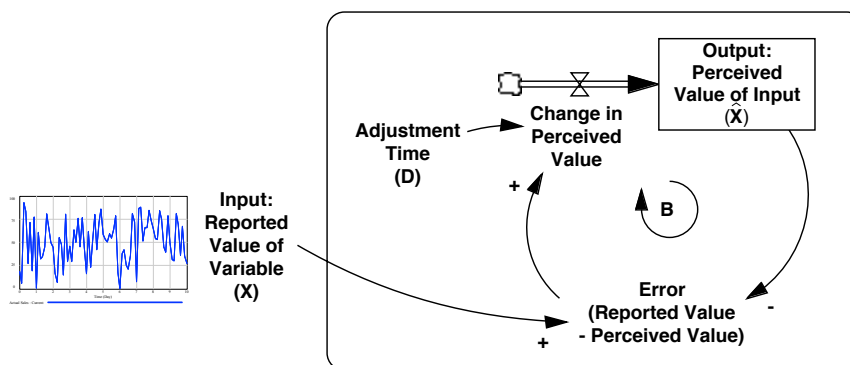
Information Delay (Smoothing)

- Separates the signal from the noise
- Used mainly to model expectations (usually of flows)
 - Model of decision maker's expectation (what value might a variable take on?)
 - Similar to a forecast (exponential smoothing)



Actual Sales= RANDOM NORMAL(0, 100 , 50, 30 , 1)

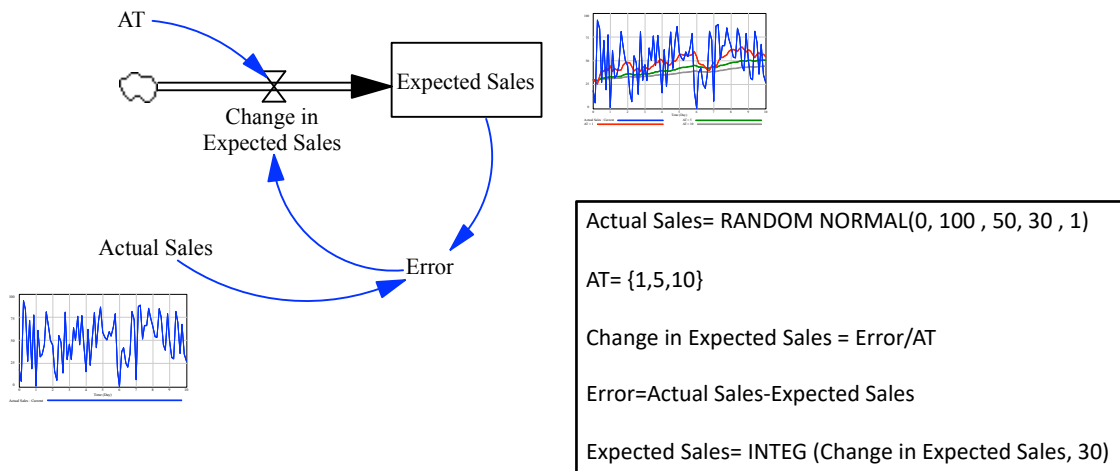
Information Delay - Structure



$$\hat{X} = \text{INTEGRAL}(\text{Change in Perceived Value}, \hat{X}(0))$$

$$\text{Change in Perceived Value} = \text{Error}/D = (X - \hat{X})/D$$

The Stock and Flow Model



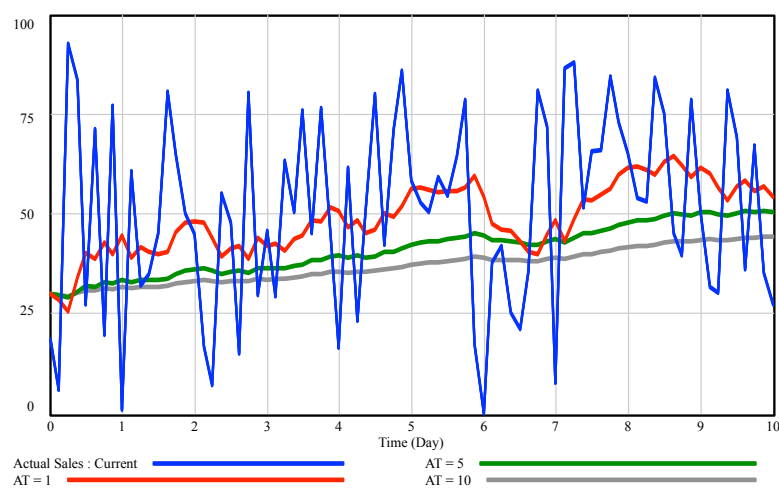
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Impact of Adjustment Times



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Challenge 7.3

- For the Student model, add a new variable:
 - Expected Enrollments
- See how this behaves for a step increase in enrollments

