



System Dynamics & Sustainable Energy

Presented at:
MIT ESD.166J: Sustainable Energy
Nov. 23, 2010

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System Dynamics and Sustainable Energy: Outline

- Introduction to System Dynamics
 - Prof. Jay Forrester
 - System Dynamics in History
- Fundamentals of System Dynamics
 - SD Basics
 - Fundamental SD Models
- SD Models and Energy
 - World Dynamics
 - Electric Utilities
- SD models and Renewables
 - Some Previous Models
 - Simple Diffusion Model Example



Introduction to System Dynamics

- Jay Forrester and the Whirlwind Project
 - 1946-1956: Semi Automatic Ground Environment (SAGE) program and systems engineering
 - coincident-current random-access magnetic computer memory
 - 1956: Becomes Professor at MIT's Sloan School of Management

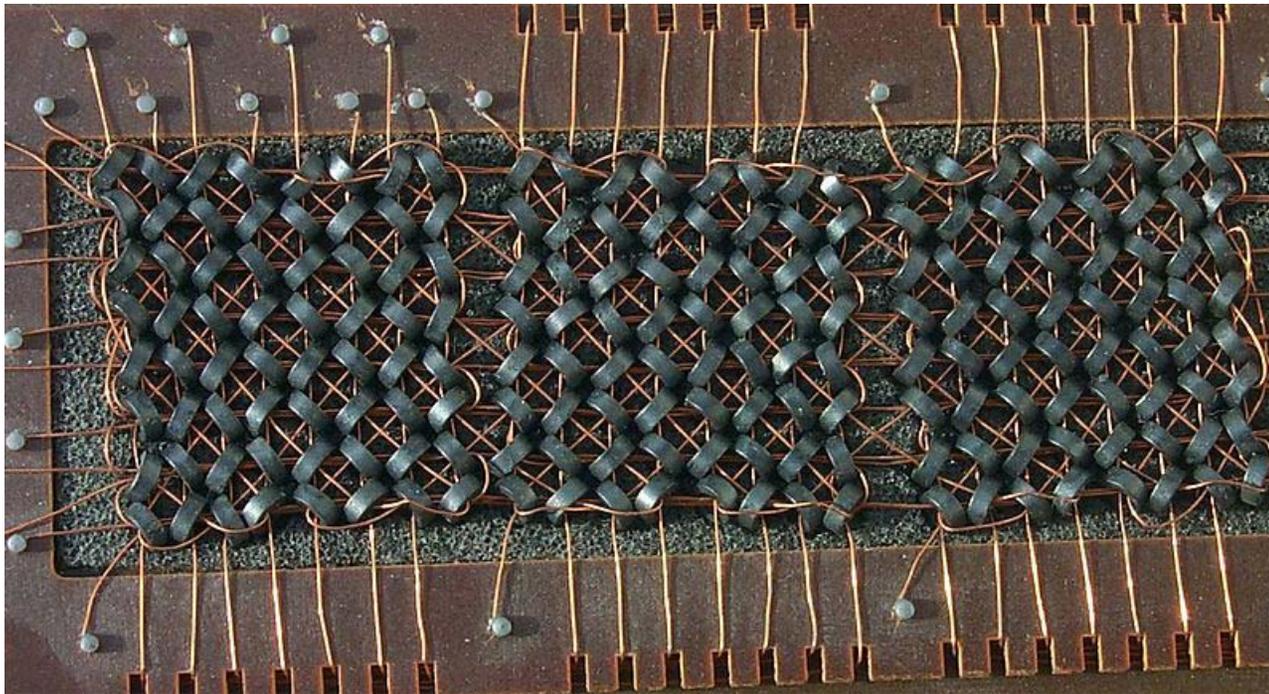


Photo by [Aboh24](#) on Wikimedia Commons.



Introduction to System Dynamics

- The Early Days of System Dynamics (1956-1969)
 - Consulting with General Electric factory workforce management
 - Digital Equipment Corporation Board Member from 1957: issues of fast growth and collapse with high-technology firms
 - Industrial Dynamics Published in 1961
- Urban Dynamics (1969)
 - In conjunction with Mayor John Collins of Boston (group model building)
 - National attention with many critics
- Limits to Growth and World Dynamics (1971)
 - In conjunction with the Club of Rome
 - International attention with many critics



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Fundamentals of System Dynamics

- Basics of System Dynamics Modeling
 - A system of Differential Equations solved using numerical techniques at a sequence of time-steps with complex feedback relationships between system variables
- Key Components are:
 - Simulation model (not optimization model)
 - Breaks down assumptions related to optimization (rationality of decision-makers, monetized / utilitarian value maximization)
 - Often involves economic, technical AND social phenomena



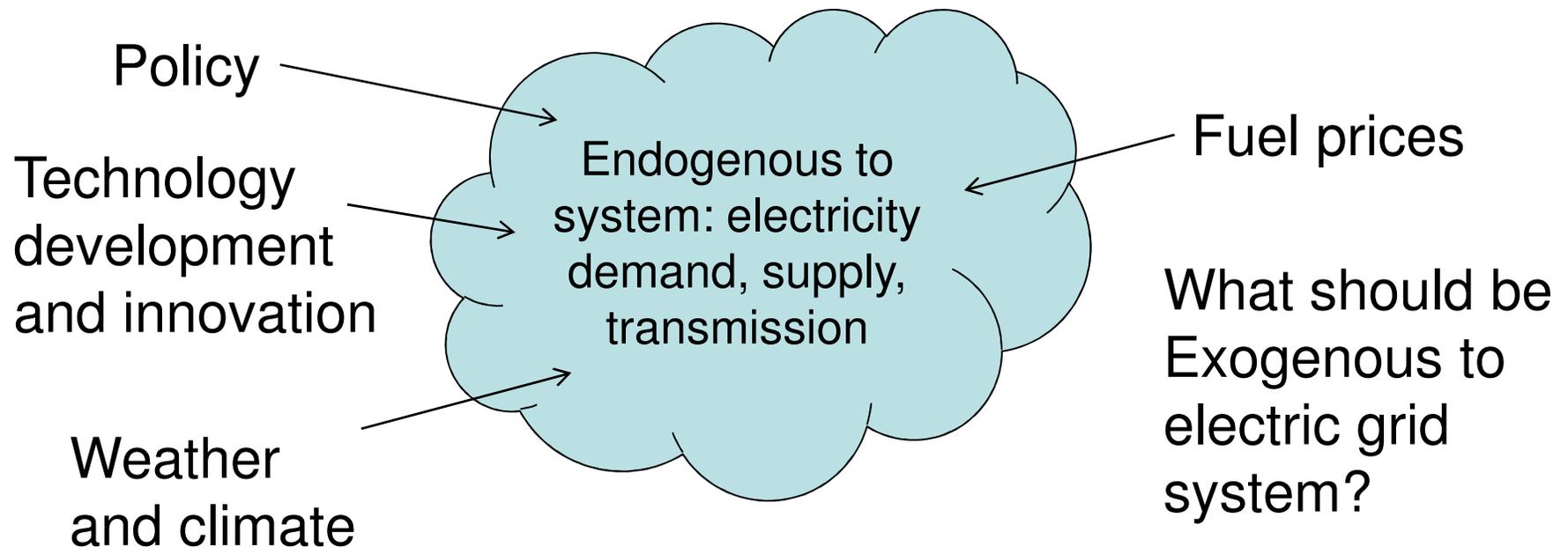
Fundamentals of System Dynamics

- Key Components are:
 - Goal-seeking behavior that drives model decision-making
 - Technical systems behave according to physical characteristics
 - Economic and social systems can behave according to different decision-making frameworks
 - Rational utility maximization
 - Boundedly rational decision-making (with potential delays, lack of information, etc)
 - Heuristics



Fundamentals of System Dynamics

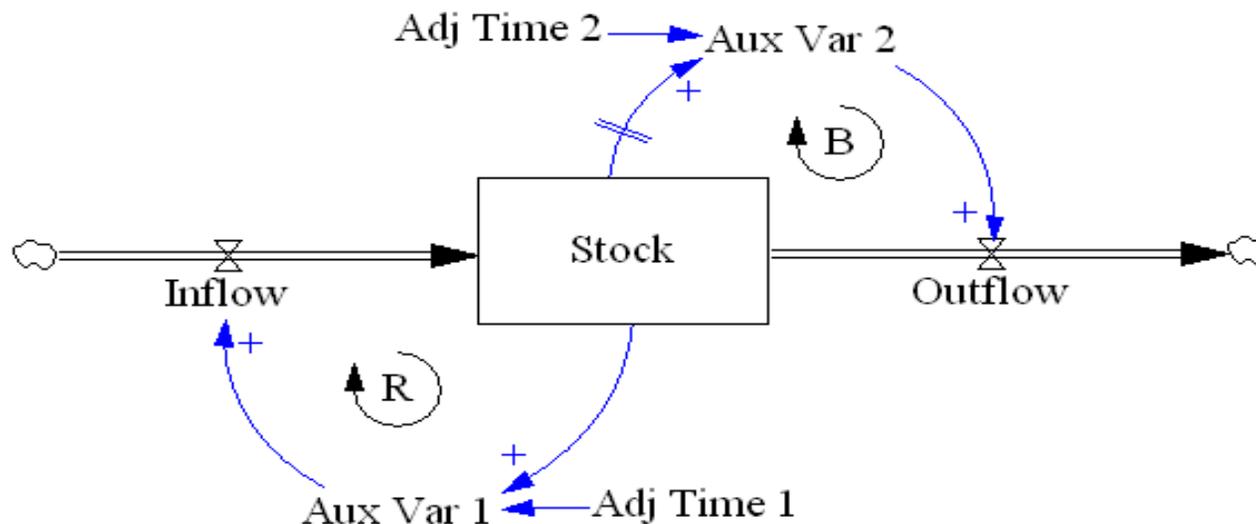
- Key Components are:
 - Closed System Boundary:
 - Must capture variables relevant to system behavior and structure
 - Can be as quite broad (always a challenge with this type of model)
 - Flexibility in deciding what is endogenous (inside system boundary) and what is exogenous (outside system boundary)





Fundamentals of System Dynamics

- Key Components are:
 - Variable separation into stocks (accumulation over time) and flows (auxiliary variables)
 - Feedback and delays: relationships between variables are non-linear and involve both physical and informational delay processes
 - Negative Feedback Loops (Balancing)
 - Positive Feedback Loops (Reinforcing)





Fundamentals of System Dynamics

- Some Fundamental SD Models
 - System Archetypes from Peter Senge, author of The 5th Discipline: Systems Thinking: <http://www.systems-thinking.org>

Reinforcing Loop

Fixes that Fail

Diagrams removed due to copyright restrictions.
Please see Bellinger, Gene. "[Archetypes: Interaction Structures of the Universe](#)." Mental Model Musings, 2004.

Balancing Loop

Drifting Goals

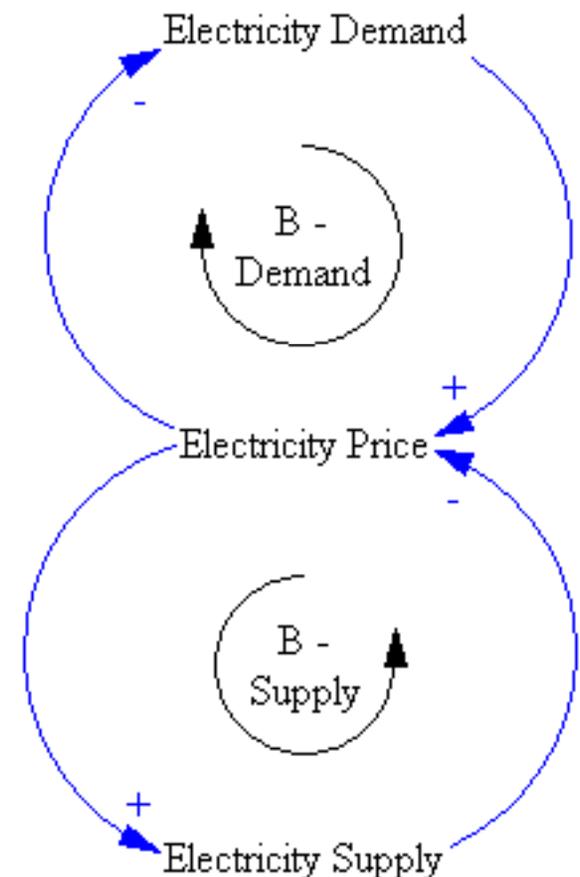
Limits to Success





Fundamentals of System Dynamics

- Basic system dynamic model of the electricity sector
 - Causal-loop diagram (high level representation of the key variables of interest and their causal relationships)
 - What are the key basic variables of interest?
 - What are the direction of relationships?
 - Are the directly or inversely related?
 - Are there any delays in the system?
 - Intermediate variables of interest?





Fundamentals of System Dynamics

- A more complex SD Model Archetypes:
 - Diffusion and Innovation (the Bass diffusion model)
 - Who are the potential adopters of a given product (think consumer products such as iphones)?
 - What influences them to adopt a product?

Diagram removed due to copyright restrictions. Please see any system dynamics diagram of diffusion innovation, such as http://commons.wikimedia.org/wiki/File:Adoption_SFD.gif.

Above: Sterman (2000) Business Dynamics



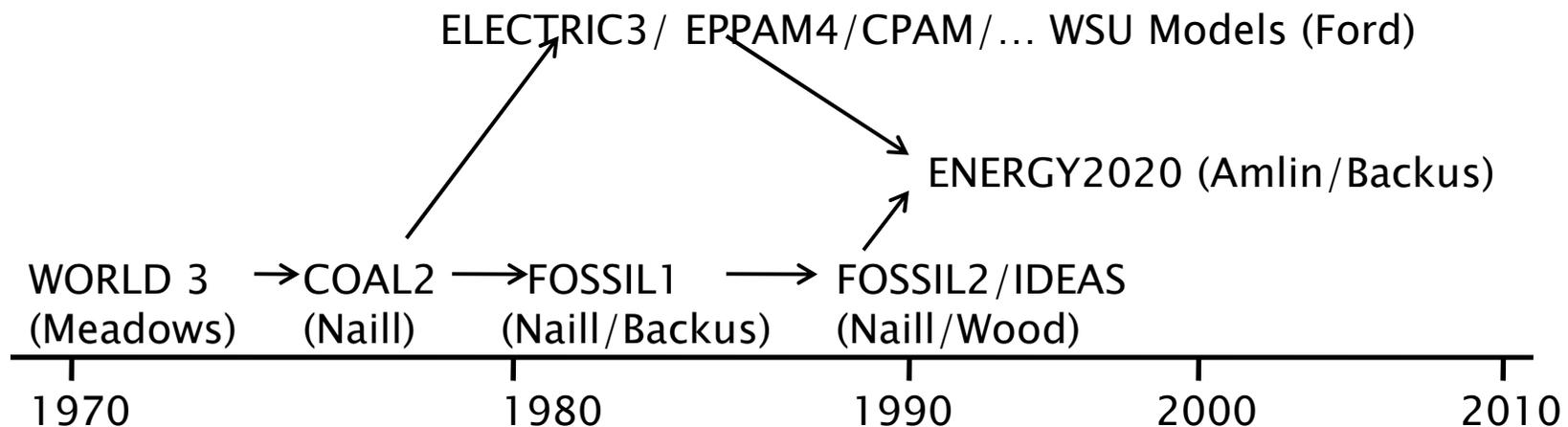
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SD Models and Energy

- Series of System Dynamic Models in Energy
 - Early 1970s: development of FOSSIL1/FOSSIL2 displaces use of “Project Independence Evaluation System” PIES
 - 1978 ~ 1995, FOSSIL2/IDEAS (Integrated Dynamic Energy Analysis Simulation) used widely for energy policy evaluation
 - Mid-1990s, Energy Information Administration introduces National Energy Modeling System to replace FOSSIL2 model
 - Energy2020 developed to integrate FOSSIL2 with utility-specific EPPAM SD Model





SD Models and Energy

- Energy2020 Basic Model Structure
 - Sectors: energy-supply, energy-demand, pollution-accounting
 - Scenario testing with thousands of policy levers
 - Includes both fossil-fuel and renewable energy sources
 - Includes industry, electricity, transportation and other energy uses
 - Detailed historical data used to calibrate model

Diagrams removed due to copyright restrictions.

Please see Fig. 1.1, 3.6 in "[Modeling of Greenhouse Gas Reduction Measures to Support the Implementation of the California Global Warming Solutions Act \(AB32\): ENERGY 2020 Model Inputs and Assumptions.](#)" Systematic Solutions, Inc., February 1, 2010.



Review of Some Models on Wind and Diffusion

- Electric sector model for capacity expansion
 - Looks at shifting electricity demand profile and generation asset mix over time
 - Includes different time-scales of interest (hours, days, months and years)
 - Includes endogenous demand elasticity, technology learning and economies of scale

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Please see Fig. 15.8 in Vogstad, Klaus-Ole. "[A System Dynamics Analysis of the Nordic Electricity Market: The Transition from Fossil Fuelled Toward a Renewable Supply within a Liberalised Electricity Market.](#)" Doctoral thesis, Norwegian University of Science and Technology, December 2004.



Review of Some Models on Wind and Diffusion

- Few System Dynamics Models focused on Diffusion and Incorporation of Renewables into Electricity Sector
- Combine capacity expansion framework with diffusion framework for new technology (i.e. Dyner 2006)
 - Adds influence of different exogenous policy mechanisms
 - Some attempt at estimating R&D spending influence on costs
 - Scope trade-off: detailed model of specific technology versus large interactions across system variables

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Please see Fig. 3 in Dyner, Isaac, and Monica Marcela Zuluaga.

"SD for Addressing the Diffusion of Wind Power in Latin America: The Colombian Case." 24th International Conference of the System Dynamics Society, July 23-27, 2006.



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SD Models and Renewables

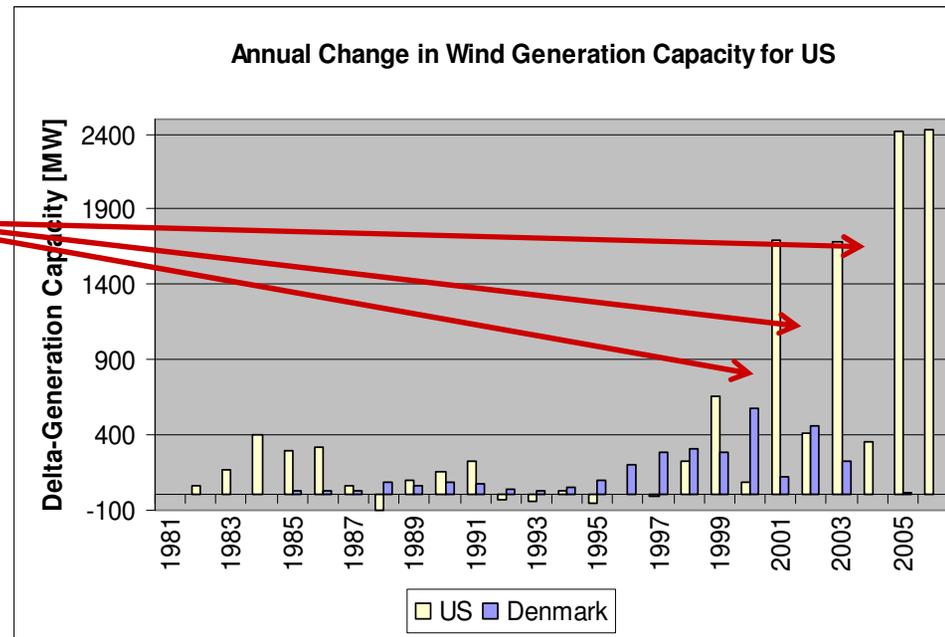
- Why diffusion framework?
 - Adoption of new technologies: wind energy, solar power, distributed generation, electric vehicles, storage
- What caveats?
 - Complex interaction with larger technical system
- Potential solutions?
 - Combine with optimization based models such as economic-based capacity expansion models (two interconnected models)
 - Bring technical complexities into a diffusion model for the technology (try to capture system interaction within system dynamics space)



Revisiting wind energy

- Historically inconsistent US federal policy for wind energy
 - Periodic expiration of Production Tax Credit (PTC) in 1999, 2001, and 2003 cause collapse in industry growth
 - Financial crisis in 2009 diminish viability of PTC causing shift of emphasis by AWEA towards national renewable electricity standard (RES)

PTC Expirations

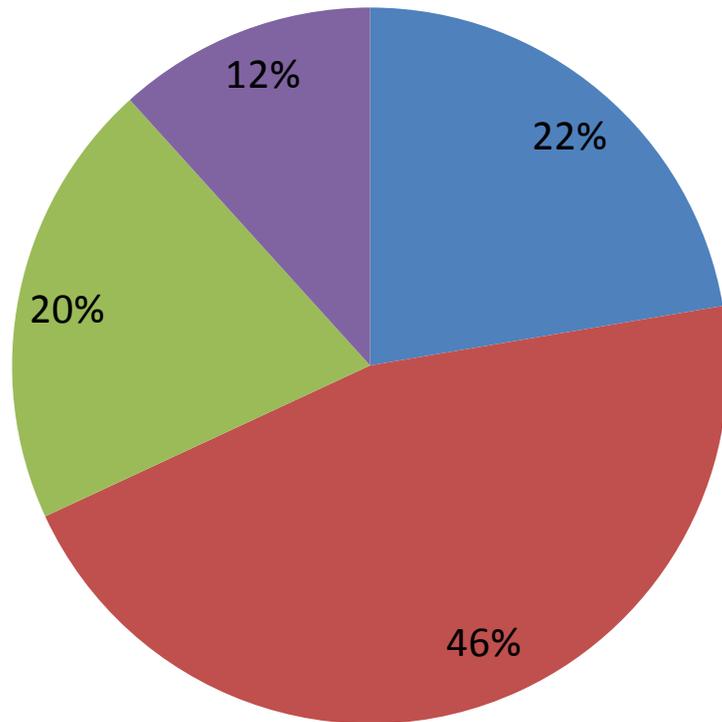


¹Wiser, R and Bolinger, M. (2008). *Annual Report on US Wind Power: Installation, Cost, and Performance Trends*. US Department of Energy – Energy Efficiency and Renewable Energy [USDOE – EERE].



Revisiting wind energy: policy support for wind

Main Policy Categories In Place for Promotion of Wind Energy



- Feed-In Tariffs (+ Added Incentives) - Predominantly Europe
- Standard / Quota (+ Penalties / Incentives / Certificates) - Some use US and Europe
- Standalone Incentives (Tax Credits, Subsidies, Grants, Premiums) - Predominantly US
- Feed-In Tariffs and Quota (+ Added Incentives) - Predominantly Eastern Europe

Cases
Germany, Spain, Portugal, Denmark
Colorado, Illinois
California, Idaho

Data sources: IEA 1997, GWEC 2008, DSIRE 2009, AWEA 2009.





What's With Wind

Thanks!
Q&A

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<http://ocw.mit.edu>

22.081J / 2.650J / 10.291J / 1.818J / 2.65J / 10.391J / 11.371J / 22.811J / ESD.166J
Introduction to Sustainable Energy
Fall 2010

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