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#### The Role of Simulation Modeling in Tobacco Research and Regulation: Yesterday, Today and Tomorrow

Kenneth E. Warner June 7, 2021 CAsToR Symposium, 2021



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### Why modeling?



- To address issues of interest and/or importance that involve complex dynamics (multiple variables, interactions among them, non-linear relationships, etc.)
  - Not easily addressed without modeling
- Often involve future outcomes
  - Can't afford to wait to learn outcome
- Provide input for decision-making on adopting interventions or weighing alternative interventions
  - For businesses, public sector regulators and legislators, etc.



### Why modeling?



Josh Epstein (J Artificial Societies & Social Simulation, 2008):

- We are using a model *whenever* we try to project a future outcome.
  - Usually implicit model, "in our heads," with unspecified assumptions, untested internal consistency, logical consequences unknown, relationship to actual data also unknown
- Therefore, "[t]he choice...is not whether to build models; it's whether to build *explicit* ones."
- With explicit models,
  - Assumptions described in detail
  - Impacts of changes in assumptions clear
  - Results replicable
  - Results data-driven





### Simulation modeling in public health

- Projecting likely course of infectious diseases
- Estimating impacts of control measures over time
- More generally, developing a national plan to be prepared to address future infectious diseases
- Understanding the evolution of a chronic disease epidemic like obesity
- Assessing cost-effectiveness of alternative approaches to reducing health effects of diseases





- Forecast smoking prevalence and health outcomes (for goal setting, etc.)
- Estimate future impacts of interventions, alone or in combination, on smoking prevalence and health outcomes (policies, regulations, media campaigns, increasing availability of cessation treatment, educational interventions)
- Evaluate cost-effectiveness of different interventions
- Identify potential importance of unintended intervention side effects
- Assess past trajectory of smoking and health outcomes if
  - Existing interventions had not occurred
  - Non-adopted interventions had been adopted
- Identify research gaps and establish priorities to improve data for future models





<u>Special relevance</u>: Family Smoking Prevention and Tobacco Control Act of 2009 requires FDA to use a public health standard

- FDA must evaluate population health impact
  - New field of regulatory science
  - Differs from drug standard of individual patient safety and efficacy
- Means that simulation modeling will be an important method for evaluating modified and novel tobacco products





#### Types of models used in tobacco control

- Aggregate (compartmental) models
- Individual (agent-based) models





#### Compartmental models

Main characteristic

• Tracks aggregate quantities describing homogeneous groups (e.g., total number of smokers in the US population)

#### Structure

- Stocks: Aggregate quantities of interest representing homogeneous groups (e.g., number of smokers in the initial year)
- Flows: Rates of transitions among stocks (e.g., smoking initiation and cessation rates)





#### System dynamics models

Specific type of aggregate model characterized by complex, nonlinear interactions and feedback effects



11



#### Agent-based models

Main characteristic

• Track individuals as they interact with their environment and other individuals through social networks

Structure

- Agents: Individuals with unique traits followed throughout the simulation
- Attributes: Individuals' traits (e.g., age, gender, SES, smoking status)
- Rules: Behavior of the agents as they interact with each other and with their environment





# Choice of characteristics of groups or individuals in both types of models

- Depends on purpose of model
- Includes characteristics that affect the link between smoking and health outcomes (e.g., age, gender, race/ethnicity, SES)
- Includes characteristics associated with smoking patterns (e.g., greater difficulty quitting smoking among low SES and menthol smokers)
- Influenced by variation in response to interventions (e.g., low SES are more price-responsive; so are adolescents and young adults)
- May be defined by availability of data (e.g., are there data characterizing differences in racial/ethnic groups' policy responses?)





#### Simulation models used in tobacco control

- Many models.
- Models used by CAsToR investigators
  - SimSmoke and variations (David Levy)
  - Mendez-Warner UM model (David Mendez)
  - CISNET (Ted Holford, Rafael Meza, and others)





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# Forecast smoking prevalence and health outcomes (for goal setting, etc.)

Most basic use of tobacco simulation models.

One important application: Goal setting (e.g., Healthy People goals)

- Why 2010 prevalence goal not attainable (Mendez and Warner, AJPH 2000)
- How to achieve prevalence goals with aggressive tobacco control (Levy et al., AJPM 2010 [2010 goal achieved by 2013]
- Relevance to endgame goals; e.g., Healthy People 2030: reduce smoking prevalence to 5%



Estimate future impacts of interventions on smoking prevalence and health outcomes

- Taxation
- Smoke-free policies
- Ad bans
- Warning labels (including GWLs)
- Media campaigns
- Youth access laws (including T-21)
- Mandated cessation treatment

- Mandated cessation treatment coverage
- Educational programs
- Mandated less hazardous cigarettes
- Combinations of policies and interventions
- Possible future FDA regulations (banning menthol; nicotine reduction)





Evaluate cost-effectiveness of different interventions

- School-based education programs
- Teen smoking cessation program
- Raising the legal age of smoking
- Smoke-free workplaces
- Comparison of C-E of smoking cessation treatment alternatives (NRT, non-nicotine pharmaceuticals, counseling, unassisted quitting)



## Identify potential importance of unintended intervention side effects

Examples:

- Youth-oriented prevention policies for e-cigarettes
- Nicotine-reduction regulation





# Assess past trajectory of smoking and health outcomes

*If...* 

- Existing interventions had not occurred
- Non-adopted interventions had been adopted



Identify research gaps and establish priorities to improve data for future models



- All of above contributions can contribute to this use of models
- Use of sensitivity analysis to determine
  - Unknown parameter values important to an analysis
  - Unknown parameter values not important to the analysis
- Identifies research priorities to address the issue in question





### Simulation modeling for tobacco regulatory science: Going forward *Subject matter*

- Issues of (possible) contemporary relevance to FDA
  - Menthol ban (Le and Mendez; Levy et al.; others)
  - Nicotine reduction (Tengs et al., Prev Med, 2005; Apelberg et al., NEJM, 2018; Levy et al., NTR, 2020; our TCORS project)
  - Other regulations on combusted products (e.g., increase pH; maximum yields of various carcinogens; etc.)
  - *Regulation of flavors in non-combusted products*
  - Permitting or prohibiting the marketing of various alternative products
- Issues relevant to policymaking outside of FDA
  - Effects of heavy taxation of combusted products and low taxation of non-combusted products





### Simulation modeling for tobacco regulatory science: Going forward *Methods*

- Develop standards of good practice for modeling?
  - Questions like: Should there be standards for base-case or status quo assumptions?
- Is there a role for AI?
  - Used in COVID modeling
- Standards for educating other tobacco control researchers about modeling?





#### A final word

[I]n the next phase of tobacco control...models will be a key tool for designing strategies to address groups with high rates of prevalence and to hasten the end of the tobacco epidemic.

Source: Appendix 15.1, Surgeon General's report, 2014







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