DYNAMIC INTERVENTIONS: OPPORTUNITIES AND CHALLENGES

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A lot of what I am presenting is drawn from work of

- Danny Almirall (Michigan)
- Susan Murphy (Michigan)
- Inbal (Billie) Nahum-Shani (Michigan)
- Daniel Rivera (Arizona State)



What is a dynamic intervention?

- Idea:
 - —Tailoring variable is measured on each individual periodically
 - Treatment may be adjusted (increased, decreased, or switched) depending on value
- These go by a lot of different names
 - —Time-varying adaptive interventions
 - Dynamic treatment regimes
 - —Stepped care
 - —Just-in-time adaptive interventions (JITAI's)
 - -Others



Anatomy of a dynamic intervention

1. Decision points

Times at which treatment options should be considered based on patient information

2. Tailoring variable:

Patient information used to make treatment decisions

3. Intervention options

Type/dose of treatment

4. Decision rule

Links tailoring variables to intervention options. A dynamic intervention includes multiple decision rules.

5. Outcomes

Proximal and distal



Approaches to development and evaluation of dynamic interventions

- Classical approach
 - Identify intervention components, assemble treatment package, then evaluate in an RCT
- Multiphase optimization strategy (MOST)
 - Identify intervention components, empirically optimize intervention, assemble optimized treatment package, then evaluate in an RCT



Optimizing dynamic interventions, approach 1

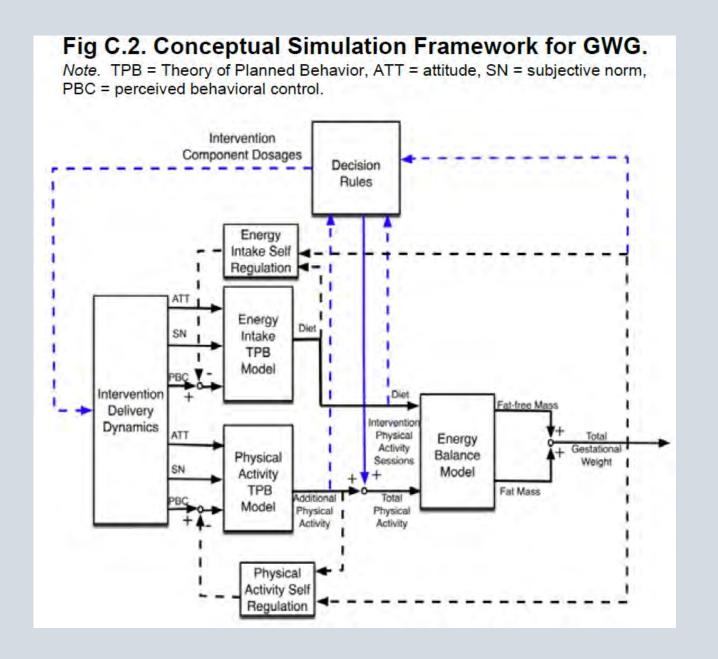
- Sequential Multiple Assignment Randomized Trial (SMART)
- Pioneered by Susan Murphy, Daniel Almirall, Inbal (Billie) Nahum-Shani
- For dynamic interventions with a limited number of decision points
- Variation on the factorial experiment



Optimized dynamic interventions, approach 2

- Based on control engineering
- **BIG DATA**

- Pioneered by Daniel Rivera
- For dynamic interventions with many decision points
- View the underlying behavior as a dynamical system
- Collect ILD, experiment, do system ID, build a controller
- Example: development of dynamic intervention to help pregnant women regulate gestational weight gain (recently funded by NHLBI; Danielle Downs (PSU), PI)





Optimized dynamic interventions, approach 3

- Comes from computer science
- Pioneered by Susan Murphy and Inbal (Billie) Nahum-Shani
- Just-in-time adaptive interventions (JITAI's)
- Collect very ILD using a smart phone or similar
- Use machine learning principles to develop ("learn") decision rules for each individual

BIG DATA



Challenges

- A lot of methodological work is needed in all three of these areas
- Encouragement for intervention scientists to
 - —Take an optimization perspective
 - —Collaborate on research with a methodological focus