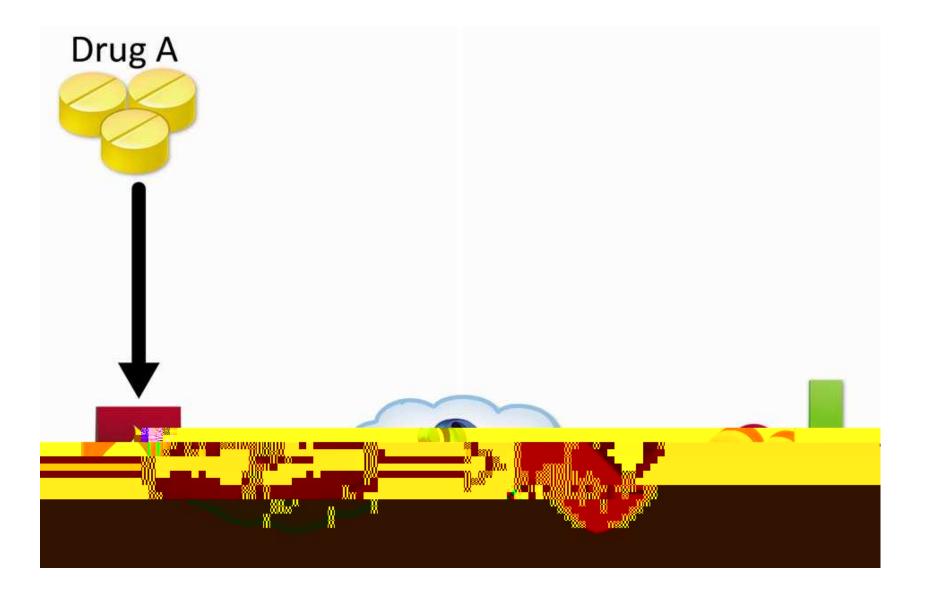


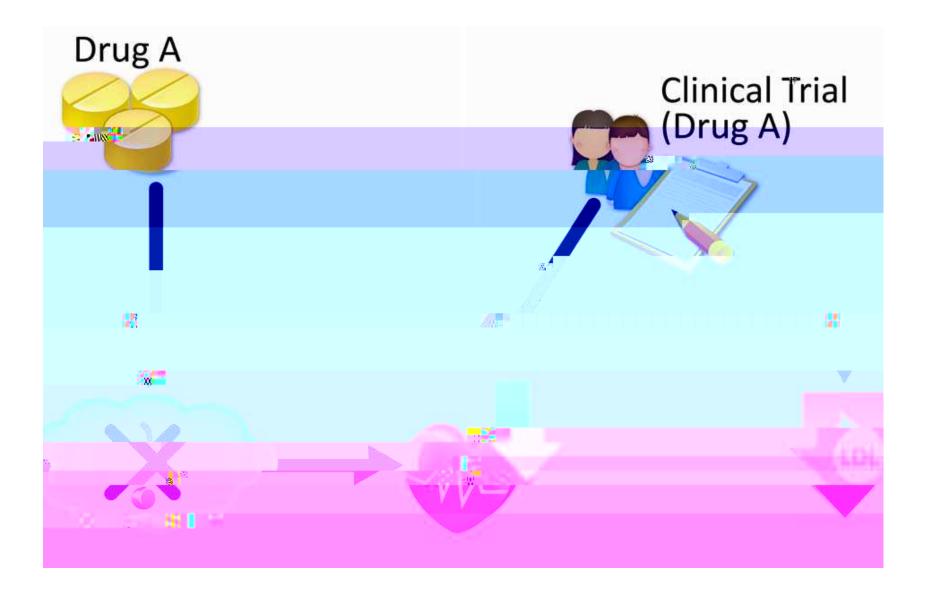
#### A Structural Analysis of Detailing, Pub 2521 21 f 838 300, i, I

#### Motivation

#### **Correlated Learning**



#### **Correlated Learning**



#### **Research Objectives**

- Develop a demand model with correlated learning across brands within a category
- Quantify the extent of correlated learning using data on market shares and quality signals (landmark clinical trials)
  - Quantify the late mover advantages
  - Taking the presence of switching costs into consideration by employing switching rate data

# Sales and Detailing Data

- Quarterly Canadian data for each statin between Q2 1993 and Q4 2004 from IMS Canada
  - Prescription volume, Detailing
- Quarterly data on switching between Q2 1993 and Q4 2004 from Ontario Health Insurance Program (OHIP)
  - ♦ % of statin users who switch from a given statin to another statin (2.10% on average) → Switching costs exist.

# Landmark Clinical Trials

- It is very di cult for physicians to learn about drugs' e cacy in heart disease risks from patient's feedback.
- Collect 12 landmark clinical trials reporting the e cacy of statins in reducing heart disease risks between 1993 and 2004.
- The number of patients consists of 2,000 to 10,000 and the follow-up period ranges from 2 to 6 years.

E.

#### **Decision Process of Existing Patient**

# E cacies of Statins

- **q**<sup>c</sup><sub>i</sub> denotes the true e cacy in lowering cholesterol levels of drug **j**
- The e cacy in lowering cholesterol levels is known to physicians
- A meta-analysis provides such information
- **q**<sup>h</sup> denotes the true e cacy in reducing heart disease risks of drug **j** 
  - The e cacy in reducing heart disease is uncertain to physicians
  - Physicians learn about this e cacy from landmark clinical trials

#### Learning about Heart Disease Risks

Introduction Data Model Results Conclusion

Let q<sub>j</sub><sup>h</sup> be<sup>h</sup> the true e cacy in reducing heart diheh4.13-1..94.1-1..9(h4.13-1..9

#### **Initial Prior Beliefs**



**Quality Signal** Introduction Data Model Results Conclusion

Let j be the true mean level of the e ciency ratio for drug **j**. A noisy but unbiased observable signal from clinical trial I for drug **j** is

where  $_{\rm I} \sim N(0, ^{2}/N_{\rm I})$  and  $N_{\rm I}$  denotes the number of patients who participate in landmark clinical trial I.

#### **Updating Process for Drug 2**

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Assume that a physician learns about clinical trial I for drug 1 at time t.

# **Informative Detailing and Publicity**

# Types of Physicians

- If there are  $n_t$  clinical trials up to time t, theoretically there will be  $2^{n_t}$  types of physicians at time t. ( $n_t = \int_{i=1}^{J} n_{jt}$ )
- To simplify the model, I assume that if a physician learns about a clinical trial for drug **j** at time t, she will learn about all the published clinical trials for drug **j** prior to time t.
- Then, the number of physician types reduces to  $(n_{1t} + 1) \cdot (n_{2t} + 1) \cdots (n_{Jt} + 1)$  under this assumption where  $n_{jt}$ denotes the number of clinical trials for drug j up to time t.

# **Utility Function**

Introduction Data Model Results Conclusion

Let patient i's utility of consuming statin j at time t be

$$U_{ij\,t}=\phantom{-}\cdot q^h_j+b_j\phantom{-}+\phantom{-}_{ij\,t},$$

where  $q_j^h$  denotes drug j's e cacy in reducing heart disease risks;  $b_j$  captures time-invariant brand specific preference.

Physician k's expected utility of prescribing drug j to patient i at time t becomes

 $\mathsf{E}[\mathsf{U}_{ij\,t}^{\,k}|\mathsf{I}^{\,k}(t)] = - \cdot \, \mathsf{E}[\mathsf{q}_{j}^{\,h}|\mathsf{I}^{\,k}(t)] + \ _{d} \cdot \mathsf{STK}\_detail_{j\,t} + \mathsf{b}_{j} + \ _{ij\,t},$ 

where  $STK_detail_{jt}$  is a persuasive detailing goodwill stock for drug j at time t.

#### Identification

Introduction Data Model Results Conclusion

#### Correlated Learning

- Sales changes after a clinical trial is released identify correlated learning parameters.
- Informative Detailing
  - Variations in sales and detailing before and after each clinical trial release identify the informative e ects.

# Result Tables(1)

#### Results

- The estimate of the correlated learning parameter (<sub>0</sub>) is 0.658, which suggests a partial information spill-over.
- The estimates of both persuasive  $(_d)$  and informative  $(_d)$  detailing parameters are positive and significant.
- The information carryover rate of physicians (<sub>p</sub>) is 0.89 per quarter.
- Publicity in reducing heart disease risks ( <sub>rh</sub>) has a significant impact on updating physicians about clinical trial information.
- Only aggregate detailing stock (<sup>s</sup><sub>d</sub>) matters in adoption stage.

E.

#### **Expt 2: No Correlated Learning**

#### Expt 3: No Switching Cost

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