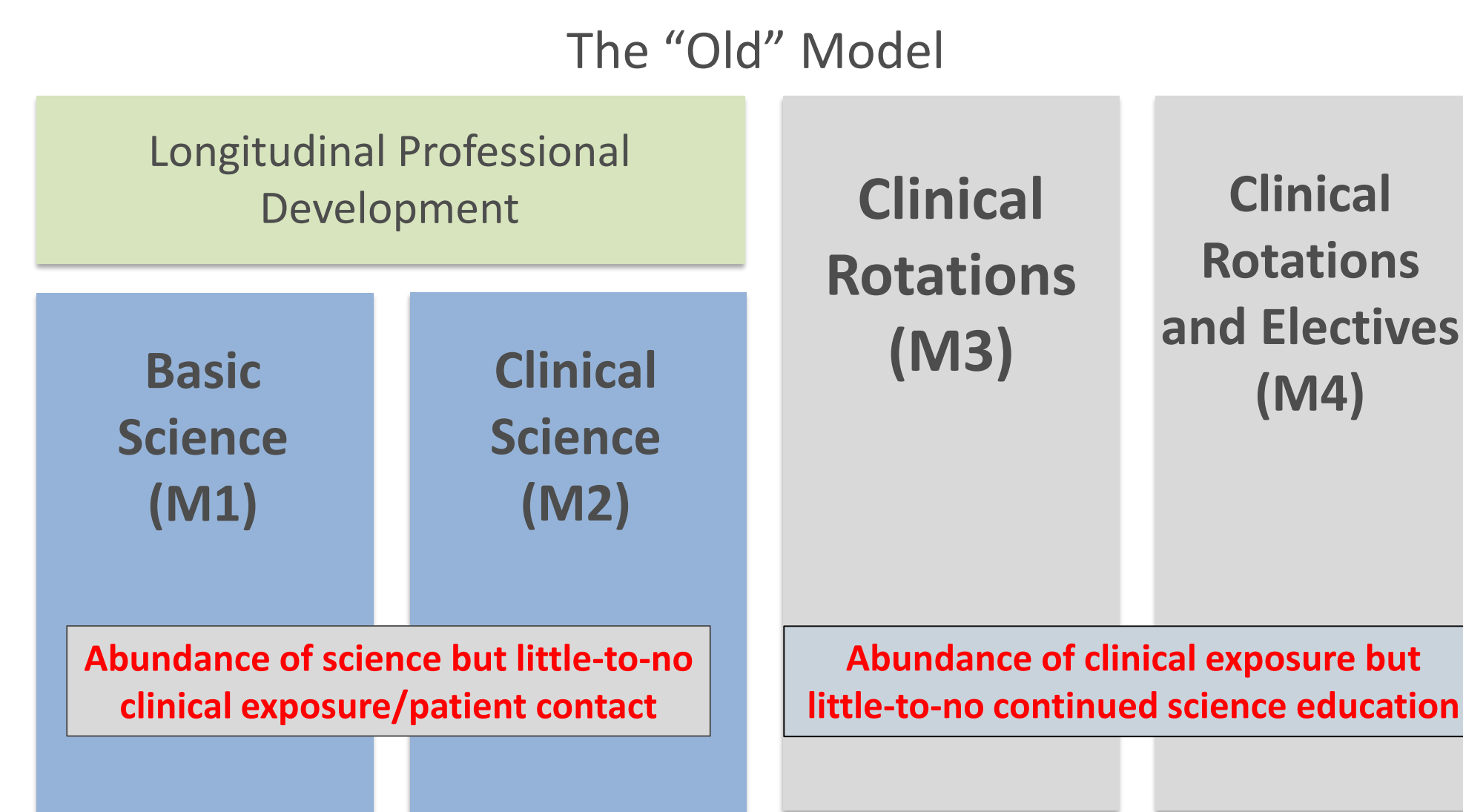


Using OpenSolver for Scheduling Medical Trainees

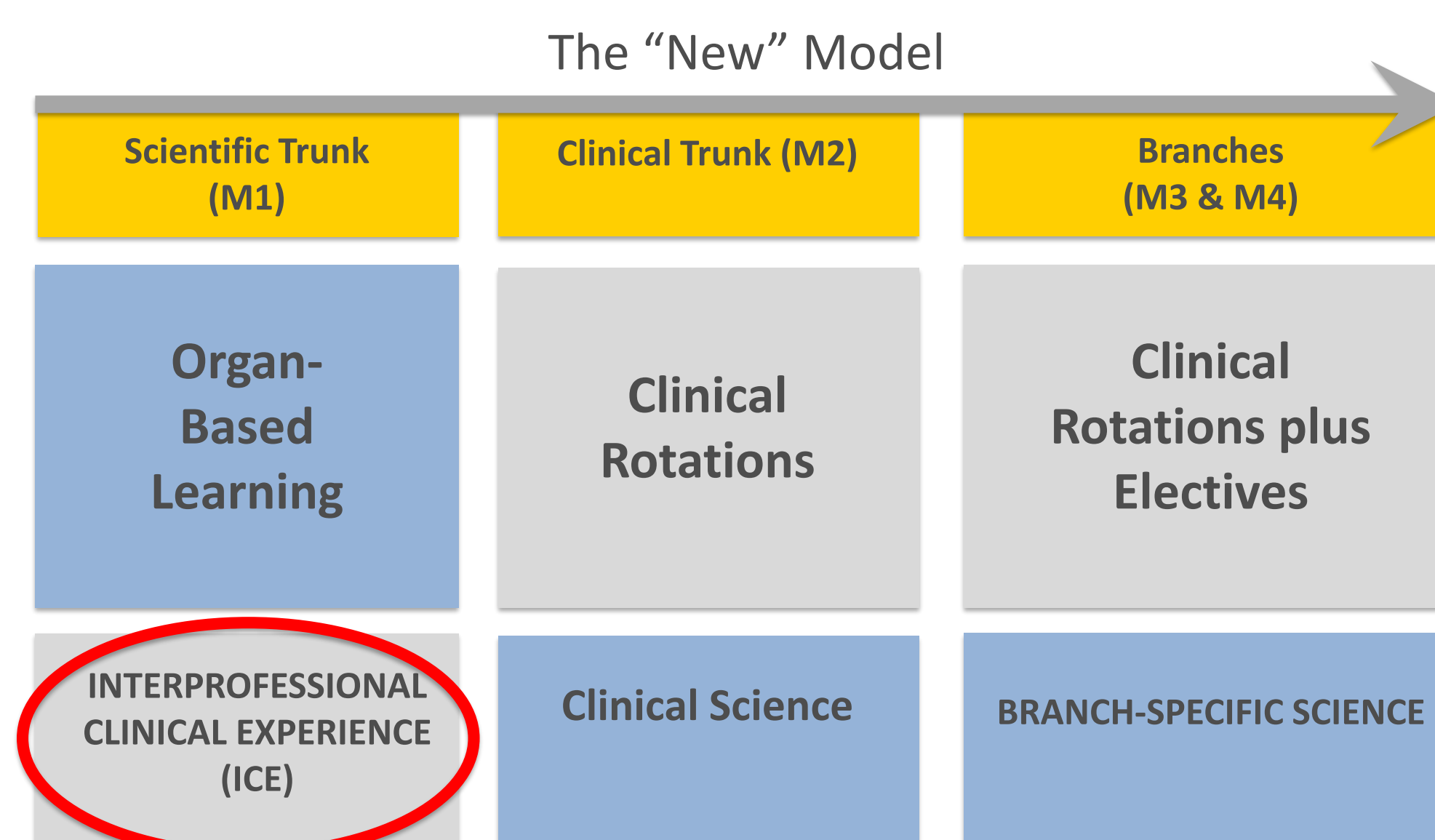
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Background

- The U.S. physician training process is shifting
- Changes have included development of a new Medical College Admission Test (MCAT) and modifications to medical school curricula nationwide
- New curricula replace the traditional 2+2 format with continued science education and clinical exposure throughout medical school



Adapted from <http://curriculum.med.umich.edu/faqs>



Adapted from <https://medicine.umich.edu/medschool/education/md-program/curriculum/diagrams>

- The University of Michigan Medical School recently began implementing a new curriculum with the above goals in mind
- Changes included the creation of an Interprofessional Clinical Experience (ICE), designed to provide first year medical students (M1's) with longitudinal exposure to the clinical environment

Problem Statement

- ICE is designed to expose students to a variety of clinical environments, but raises a number of scheduling issues
- Schedules must assign approximately 170 M1's to clinics in which they shadow healthcare professionals subject to numerous rules

Winter Session Model

Sets

- S set of students
- C set of clinics
- C_o subset group of Outpatient-Based clinics
- C_H subset group of Hospital-Based clinics
- C_p subset group of on-site clinics
- C_D subset group of off-site clinics
- C_R subset group of off-site clinics that require cars for every student

Decision Variables

- x_{sc} 1 if student s is assigned to clinic c

$$\forall s \in S, c \in C$$

Constraints

- Student Coverage Requirements**
Every student s must be assigned to exactly one clinic c

$$\sum_{c \in C} x_{sc} = 1, \quad \forall s \in S$$

- Clinic Capacity Requirements**
The number of students assigned to clinic c must be at least 1 if open and not exceed clinic capacity u_c

$$l_c \leq \sum_{s \in S} x_{sc} \leq u_c, \quad \forall c \in C$$

- Student Car Requirements**
Only those students s with a car are allowed to be assigned to a clinic c that requires a car.

$$x_{sc} \leq z_s, \quad \forall s \in S, c \in C_R$$

- Student Carpooling Requirements**
Students without a car may be assigned to off-site clinics, but for every student s without a car, there must be one student s with a car, such that the net number of drivers at a given clinic is greater than or equal to 0.

$$\sum_{s \in S} j_s x_{sc} \geq 0, \quad \forall c \in C$$

- Prior (and similar) Clinic Assignment Prohibitions**
Students cannot be assigned to the same clinic as they were assigned for fall semester or a clinic that is similar to their fall clinic assignment.

$$x_{sc} + p_{sc} \leq 1, \quad \forall s \in S, c \in C$$

- Medical Spanish Location Restriction**
A student s taking Medical Spanish cannot be assigned to an off-site clinic c .

$$x_{sc} + m_s \leq 1, \quad \forall s \in S, c \in C_D$$

Objective Function: Minimize

$$\begin{aligned} \text{Most Preferred Assignments} & \left\{ -3 \sum_{s \in S} \sum_{c \in C} a_{sc} x_{sc} - \sum_{s \in S} \sum_{c \in C} t_{sc} x_{sc} \right\} \text{ Correct Type Assignments} \\ \text{Second Most Preferred Assignments} & \left\{ -2 \sum_{s \in S} \sum_{c \in C} b_{sc} x_{sc} + 2 \sum_{s \in S} \sum_{c \in C} f_{sc} x_{sc} \right\} \text{ Least Preferred Assignments} \\ \text{Third Most Preferred Assignments} & \left\{ -\sum_{s \in S} \sum_{c \in C} d_{sc} x_{sc} + \sum_{s \in S} \sum_{c \in C} g_{sc} x_{sc} \right\} \text{ Second Least Preferred Assignments} \end{aligned}$$

Parameters

- l_c 1 if clinic c is open
- u_c upper bound capacity for clinic c
- z_s 1 if student s has a car
- j_s 1 if student s has a car, -1 otherwise
- p_{sc} 1 if student s cannot be assigned to clinic c due to prior clinic assignment
- t_{sc} 1 if student s needs an assignment to clinic type c
- m_s 1 if student s is taking Medical Spanish
- a_{sc} 1 if student s prefers clinic c with the highest preference
- b_{sc} 1 if student s prefers clinic c with the second highest preference
- d_{sc} 1 if student s prefers clinic c with the third highest preference
- f_{sc} 1 if clinic c is the least preferred clinic by student s
- g_{sc} 1 if clinic c is the second least preferred clinic by student s

Solution Approach

- We formulated a linear programming model and implemented in a Microsoft Excel workbook, using the OpenSolver add-in

Sample Inputs

Last	First	Doctoring Group	Vehicle?	Clinics	Emergency Medicine	Hospitalist A	Hospitalist B	PM&R - Inpatient	EAA, Med/Peds
Doe	John	A-Fitzbutler: 1.1	No	Tuesday 1 (Fitzbutler)	6	8	0	6	3
Gupta	Sandeep	A-Fitzbutler: 2.1	Yes	Tuesday 2 (Salk)	6	8	0	6	3
Johnson	David	A-Fitzbutler: 3.1	Yes	Thursday 1 (Hamilton)	6	0	8	6	3
Lee	Michael	A-Fitzbutler: 1.1	No	Thursday 2 (Sanford)	6	0	8	6	3
Smith	Carson	A-Fitzbutler: 4.1	Yes	Onsite Location?	Yes	Yes	Yes	Yes	Yes
Waidley	Victoria	A-Fitzbutler: 4.2	Yes						

Sample Output

Name	Subgroup	Emergency Medicine	Hospitalist A	Hospitalist B	PM&R - Inpatient	EAA, Med/Peds
Doe, John	A-Fitzbutler: 1.1	0	0	1	0	0
Gupta, Sandeep	A-Fitzbutler: 2.1	0	0	0	0	1
Johnson, David	A-Fitzbutler: 3.1	0	0	0	1	0
Lee, Michael	A-Fitzbutler: 1.1	0	0	0	1	0
Smith, Carson	A-Fitzbutler: 4.1	0	0	1	0	0
Waidley, Victoria	A-Fitzbutler: 4.2	0	0	1	0	0

Sample Final Schedule

House A - Fitzbutler	Subgroup	Site Fall	September 1 Rotation 1	September 15 Rotation 2	October 13 Rotation 3	October 27 Rotation 4
Doe, John	A-Fitzbutler: 1.1	Hospitalist B	PT/OT, UH	Phys, UH South	Pharm, Mott	Neonatal NP
Gupta, Sandeep	A-Fitzbutler: 2.1	EAA, Med/Peds	Pharmacist	Nurse	Physician	Medical Asst
Johnson, David	A-Fitzbutler: 3.1	PM&R-Inpatient	Physician	Nurse	Rec Therapy	Social Work
Lee, Michael	A-Fitzbutler: 1.1	PM&R-Inpatient	Nurse	OT	Social Work	Rec Therapy
Smith, Carson	A-Fitzbutler: 4.1	Hospitalist B	Phys, UH South	Pharm, Mott	Neonatal NP	Resp Therapy
Waidley, Victoria	A-Fitzbutler: 4.2	Hospitalist B	Nursing, 12 West	PT/OT, UH	Phys, UH South	Pharm, Mott

Impact/Results

- Generated full schedules rapidly (solve time < 15 seconds)
- Collaborated with program directors to fine-tune assignments
- Applied tool to schedule four semesters to date
- Output number of rule violations, and where these violations are occurring, for directors' review
- Reduced program administrator burden
- Improved medical student satisfaction by incorporating preferences
- Derived high impact from mathematically simple, straight-forward modeling with undergraduate-led project team
- Fostered long-term collaboration with the medical school

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