# Appendix A1. Formulation

# April 4, 2021

# 0.1 Summary

**Data Preparation** Below is a representation of graduate timeslots to facilitate understanding.

# 0.1.1 Input data:

- *I*: the set of classes.
  - a: the set of double-unit class (i.e. 3 units for graduate and 4 units for undergraduate classes)
  - b: the set of single-unit class (i.e. 1.5 units for graduate and 2 units for undergraduate classes) taken in full semester
  - -c: the set of single-unit class taken in the first half of semester
  - -d: the set of single-unit class taken in the second half of semester
- *J*: the set of classrooms
- T: the set of timeslots. Below are 7 kinds of timeslots:
  - -A: full semester for 1.5/2 hours twice a week
  - -B: full semester for 3/4 hours once a week
  - -C: full semester for 1.5/2 hours once a week
  - D: first half for 1.5/2 hours twice a week
  - -E: second half for 1.5/2 hours twice a week
  - F: first half for 3/4 hours once a week
  - -G: second half for 3/4 hours once a week
- S: the set of days of week, including Monday, Tuesday, Wednesday, Thursday, Friday
- $V_s$ : the set of timeslots on day of week s. eg.  $V_M$  indicates the timeslots on Monday (includ. M and MW).
- K: the set of professors
- $L_k$ : the set of classes that professor k teaches
- M: the set of back-to-back/consecutive timeslots. Timeslots are defined as back-to-back if the interval between two timeslots is less than 30 minutes
- N: the number of total classes to be allocated
- $U_{ij}$ : the space utilization rate for allocating class i to classroom j, calculated by seats offered over capacity
- $z_{ij}$ : whether the seats offered for class i is less than or equal to the capcaity of classroom j
- O: the set of conficting timeslot pairs
- $W_U, W_Q, W_R$ : the weights assigned on U,Q,R respectively (by default, they are 1,1,0.2 respectively)

**Decision variables:** Let  $X_{ijt}$  denote whether class i is allocated to classroom j at timeslot t(binary)  $(i \in I, j \in J, t \in T)$ 

Auxillary Variable: -  $y_{jt}$ : the total number of classes allocated to classroom j at time t (integer) -  $w_{kt}$ : the total number of classes allocated to professor k at time t (integer) - U: the average classroom utilization rate (in %) of the schedule (contineous) - R: the number of professors who are allocated at least one back-to-back class (integer) - Q: the number of professors who have to work more than two days a week (integer) -  $H_{kt_1t_2}$ : whether professor k teaches back to back classes at consecutive timeslots  $(t_1, t_2) \in M$  (binary) -  $r_k$ : whether professor k is allocated at least one back-to-back class (binary) -  $Z_{ks}$ : whether professor k is allocated any class on day of week k (binary) - k0: whether professor k1 has to work more than two days a week (binary)

Unless otherwise noted, every summation of i is over I, of j is over J and of t is over T.

Objective Maximize the schduling score

Maximize 
$$W_U * U - W_Q * Q + W_R * R$$

$$U = \frac{1}{N} \sum_{i,j,t} U_{ij} X_{ijt}$$
 average utilization rate

-  $U_{ij}$ : the space utilization rate for allocating class i to classroom j, calculated by seats offered over capacity - N: the number of total classes to be allocated - R and Q will be defined in constraint 5 and 6

#### Constraint 1

**English description:** Each class eventually only occupies one classroom and one timeslot. More specifically, if it's a double-unit class, then it takes one of the timeslot in A/B. If it's a single-unit class taught throughtout the full semester, then it takes one of the timeslots in C. If it's a single-unit taught in the first half, then it takes one of the timeslots in D/F. If it's a single-unit class taught in the second half, then it takes one of the timeslots in E/G

$$\sum_{t \in A \cup B} X_{ijt} = 1 \quad \text{For every class } i \in I$$
 
$$\sum_{t \in A \cup B} \sum_{j} X_{ijt} = 1 \quad \text{For every double-unit class } i \in a.$$
 
$$\sum_{t \in C} \sum_{j} X_{ijt} = 1 \quad \text{For every single-unit class } i \in b \text{ taught throughtout the full semester.}$$
 
$$\sum_{t \in D \cup F} \sum_{j} X_{ijt} = 1 \quad \text{For every single-unit class } i \in c \text{ taught in the first half.}$$
 
$$\sum_{t \in E \cup G} \sum_{j} X_{ijt} = 1 \quad \text{For every single-unit class } i \in d \text{ taught in the second half .}$$

### Constraint 2

**English description:** Each classroom can not be occupied by more than one class at the same time.

$$\sum_i X_{ijt} \leq 1 \qquad \text{for each room } j, \text{ timeslot } t.$$
 
$$y_{jt_1} + y_{jt_2} \leq 1 \qquad \text{For each classroom } j \text{ and conflicting time slots } (t_1, t_2) \in O.$$
 
$$y_{jt} = \sum_i X_{ijt} \quad \text{For each classroom } j \text{ and time slot } t.$$

•  $y_{jt}$ : the total number of classes allocated to classroom j at time t (integer)

#### Constraint 3

**English description:** Each class can not be allocated to any classrooms that fail to accommodate the number of seats offered by the class.

$$\sum_{t} X_{ijt} \le z_{ij} \quad \text{for each class } i, \text{ classroom } j$$

•  $z_{ij}$ : whether the seats offered for class i is less than or equal to the capcaity of classroom j

#### Constraint 4

**English description:** Each professor can not be allocated to more than one classroom or class at the same time.

#### Breaking down the above:

• Each professor can't be assigned to a certain timeslot in more than one classroom or class

$$\sum_{i \in L_k} \sum_{j \in J} X_{ijt} \leq 1 \quad \text{for each professor } k, \text{ timeslot } t$$

• As the timeslots are designed in a way that thay can overlap. Another constraint is added to make sure the classes taught by a certain professor won't have time conflicts. For example, M/W 8-9:30am first half semester and M 8-11am full semester overlaps. In this case, we say that slot  $t_1$  and  $t_2$  conflicts with each other. The set of conflicting timeslots is O.

$$w_{kt_1} + w_{kt_2} \le 1$$
 For each professor  $k$  and conflicting time slots  $(t_1, t_2) \in O$ .  
 $w_{kt} = \sum_{i \in L_k} \sum_j X_{ijt}$  For each professor  $k$  and time slot  $t$ .

- $w_{kt}$ : the total number of classes allocated to professor k at time t (integer)
- $L_k$ : the set of classes that professor k teaches

#### Constraint 5

**English description:** Make the number of professors who have to work more than 2 days a week as small as possible.

#### Break it down:

Timeslots like MW 8:00 - 9:30 AM and M 9:30 - 11:00 AM are consecutive, let's say the set of consecutive timeslots  $(t_1, t_2)$  is M.

1. For each professor, we check whether there are consecutive slots occupied by the same professor's class. The middle part of formula is the total number of classes professor k has to teach at two consecutive timeslots  $t_1$  and  $t_2$  plus 1.

For easy reference, let's call this number a\_1. a\_1 takes 3 different values: 1,2,3. - If  $a_1 \in [1,2]$ , i.e. the professor doesn't teach back-to-back classes at consecutive timeslots  $t_1$  and  $t_2$ , then  $H_{kt_1t_2}$  must be 0 to satisfy the LHS. - If  $a_1 = 3$ , i.e. the professor do teach consecutive classes at  $t_1$  and  $t_2$ , then  $H_{kt_1t_2}$  must be 1 to satisfy the RHS.

That is,  $H_{kt_1t_2}$  is a binary auxillary variable indicating whether the professor teaches back-to-back classes at consecutive timeslots  $t_1$  and  $t_2$ . N is the total number of classes to be allocated by the model, which is a sufficiently large upper bound.

$$3H_{kt_1t_2} \leq \sum_{i \in L_k} \sum_j X_{ijt_1} + \sum_{i \in L_k} \sum_j X_{ijt_2} + 1 \leq H_{kt_1t_2}N + 2 \quad \text{for each prof } k \text{ and consecutive time slots } (t_1, t_2) \in M$$

- M: the set of back-to-back/consecutive timeslots. Timeslots are defined as back-to-back if the interval between two timeslots is less than 30 minutes
- N: the number of total classes to be allocated
- $H_{kt_1t_2}$ : whether professor k teaches back to back classes at consecutive timeslots  $(t_1, t_2) \in M$  (binary)
- 2. Then, for each professor k, sum over all consecutive timeslots  $(t_1, t_2) \in M$  to check whether he/she is allocated at least one back-to-back class. Let's say it is represented by a binary auxiliary variable  $r_k$

$$r_k \le \sum_{(t_1, t_2) \in M} H_{kt_1t_2} \le Nr_k$$
 for each prof  $k \in K$ 

- $r_k$ : whether professor k is allocated at least one back-to-back class (binary)
- 3. Sum over all professors to get the total number of professor who are allocated at least one back-to-back class

$$R = \sum_{k \in K} r_k$$

• R: the number of professors who are allocated at least one back-to-back class (integer)

#### Constraint 6

**English description:** Make the number of professors who have to work more than 2 days a week as small as possible.

# Break it down:

1. For each professor k, check whether any class is allocated for him/her on day of week s. Let's say it is represented by a binary auxiliary variable  $Z_{ks}$ .

The middle part of the fomula is the number of courses professor k teaches on day of week s. For easy reference, let's call this number  $a_2$ , if  $a_2 = 0$ , then  $Z_{ks}$  must be 0 to satisfy the LHS. If  $a_2 > 0$ ,

then  $Z_{ks}$  must be 1 to satisfy the RHS. N is the total number of classes to be allocated by the model, which is larger than any possible number of classes a professor would teach on a single day.

$$Z_{ks} \leq \sum_{i \in L_k} \sum_j \sum_{t \in V_s} X_{ijt} \leq Z_{ks} N$$
 for each prof  $k \in K$  and each day of week  $s \in S$ 

- S: the set of days of week, including Monday, Tuesday, Wednesday, Thursday, Friday
- $V_s$ : the set of timeslots on day of week s. eg.  $V_M$  indicates the timeslots on Monday (includ. M and MW).
- $Z_{ks}$ : whether professor k is allocated any class on day of week s (binary)
- N: the number of total classes to be allocated
- 2. Then, for each professor k, check whether he/she has to work more than two days a week. Let's say it is represented by a binary auxillary variable  $q_k$ .

The middle part sums  $Z_{ks}$  over all days of week  $s \in S$  to get how many days professor k has to work per week. For easy reference, let's call this number  $a_3$ . If  $a_3 \in [0, 1, 2]$ , then  $q_k$  must be 0 to satisfy the LHS. If  $a_3 \geq 3$ , then  $q_k$  must be 1 to satisfy the RHS.

$$3q_k \le \sum_{s \in S} Z_{ks} \le Nq_k + 2$$
 for each prof  $k \in K$ 

- $q_k$ : whether professor k has to work more than two days a week (binary)
- 3. Finally, sum over all professors to get the number of professors who have to work more than 2 days a week,Q

$$Q = \sum_{k \in K} q_k$$

• Q: the number of professors who have to work more than two days a week (integer)