




Optimal Greedy Method for Generalized Activity Selection

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Abstract

The generalized activity selection problem is this: given $m \geq 1$ and a set A of intervals representing time spans of activities, we want to select m subsets $\{C_i \subseteq A : i = 1, \dots, m\}$ such that the intervals in each C_i are pairwise disjoint, and $|\bigcup_{i=1}^m C_i|$ is maximized. The well-known activity selection problem corresponds to $m = 1$. We provide an $O(n \log n)$ greedy algorithm. Proving its optimality is more subtle than in the $m = 1$ case.

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1 Introduction

The **activity selection problem** is used in standard text books such as [1, 4] to illustrate the greedy method.² The problem is this: given a set A of intervals, compute a compatible set $C \subset A$ of maximal size. Here, C is **compatible** if the intervals in C are pairwise disjoint. Each interval $I \in A$ represents the time span of an activity. In the following, we assume half-open intervals of the form $I = (s, f]$ or $I = (s(I), f(I)]$ where $s(I)$ and $f(I)$ are the start and finish time of activity I . So the set $\{I, J\}$ is compatible iff $f(I) \leq s(J)$.

The problem is usually attributed to Gavril (1972) who showed that the more general problem of maximal independent set in a chordal graph [3, §3] can be computed in $O(n^3)$ time, given the perfect elimination order³ of G . When specialized to interval graphs, the complexity improves to $O(n \log n)$ [1, §15.1].

In this paper, we consider the following generalization: given $m \geq 1$ and A , compute m compatible sets C_1, \dots, C_m of A such that $|C_1 \cup \dots \cup C_m|$ has maximal size. Note that wlog, we may assume the C_i 's are pairwise disjoint, and allow some C_i 's to be empty. We may call this the **multiroom activity selection problem** because we imagine the activities in C_i to be assigned to the i th room. If m is fixed, we speak of the **m -room activity selection problem**. The original problem of Gavril is the 1-room case. Our main result is a greedy algorithm to compute an optimal solution for this problem. We show that its complexity remains $O(n \log n)$, but its correctness is considerably more subtle than the 1-room case.

Related Problems: Despite its naturalness, our generalization appears to be new. There is a known generalization to the weighted case [5, 1, 4]: suppose we are given a function $W : A \rightarrow \mathbb{R}_{>0}$, and the goal is to compute a compatible set $C \subseteq A$ whose weight

¹ Optional footnote, e.g. to mark corresponding author

² It is also popular in coding websites such as <https://www.geeksforgeeks.org/>.

³ In her original paper, she gave an $O(n^4)$ method to compute the elimination order. Subsequently Rose, Luecker and Tarjan [6] gave an $O(m + n)$ algorithm based on BFS. In this paper, the parameters n, m denotes the number of vertices and edges of a graph G .

39 $W(C) = \sum_{I \in C} W(I)$ is maximum. Unfortunately, this generalization needs a dynamic
 40 programming solution with complexity $\Omega(n^2)$; in contrast to our generalization is still
 41 amenable to a $O(n \log n)$ greedy approach.

42 As noted above, Gavril viewed the activity selection problem as an maximum independent
 43 set problem. More precisely, the set of intervals A defines an interval graph $G(A)$ with A as
 44 vertex set and edges are pairs $\{I, J\}$ of intervals with non-empty intersection. So a compatible
 45 set $C \subseteq A$ is just an independent set of $G(A)$. In this graph setting, Gavril considered the
 46 **minimum coloration problem** [3, §2]. In modern terminology, this is computing the
 47 **chromatic number** $\chi(G)$ of a graph G . She gave an $O(n^2)$ algorithm to compute $\chi(G)$
 48 for a chordal graph G . When G is an interval graph, Kleinberg and Tardos ([4, p. 122], [1,
 49 Ex. 16.1-3, p. 179]) improved it to $O(n \log n)$ solution. The topic of scheduling has many
 50 similarities with activities selection. For instance, in the job-shop scheduling problem we are
 51 given n jobs and m machines (like our intervals and rooms). But our interval is replaced by
 52 a job J_i that is characterized only by its duration $\mu(J_i) > 0$: the algorithm not only assigns
 53 J_i to a machine, but it also has to schedule the starting time $s(J_i)$.

Finally, there is some geometric content inherent in interval graphs, and it will be useful
 to adopt the notion of “stabbing numbers” [2, §10.4, p.227] from computational geometry.
 Consider the following **interval stabbing problem**: *given $m \geq 1$ and A , find a subset*
 $C \subseteq A$ of maximum size and with stabbing number $\leq m$. Here, the **stabbing number** of C
 is defined as

$$\text{stab\#}(C) := \max_{x \in \mathbb{R}} |x \wedge C|$$

54 where $x \wedge C := \{I \in C : x \in I\}$ is the set of intervals of C that are “stabbed” by x . Let
 55 $\text{Opt}(A, m)$ denote the size $|C|$ of the optimal solution.

56 ▶ **Observation 1.** *A set C of intervals can be partitioned into k non-empty compatible sets*
 57 *iff $\text{stab\#}(C) = k$.*

58 This will follow from the correctness of our greedy algorithm below. Therefore, the
 59 interval stabbing problem is equivalent the multiroom activity selection problem.

60 2 Optimal Greedy Algorithm for 2-Room Activity Selection

61 We first give an optimal solution for the two room case ($m = 2$). It will make the transition
 62 of the general case much easier.

63 Here is a brief overview of the algorithm: let the input set A of n intervals be sorted by
 64 their finish times:

$$65 \quad I_1 <_f I_2 <_f \cdots <_f I_n \tag{1}$$

66 where $I <_f J$ iff $f(I) < f(J)$. Note that we assume that the finish times are distinct. This
 67 is without loss of generality since we can break ties arbitrarily. Likewise, assume that each
 68 $s(I_i) \geq 0$. We maintain two lists $\text{Room}[j]$ ($j = 1, 2$) holding compatible sets of intervals. For
 69 interval I_i ($i = 1, \dots, n$), we process I_i by either Accepting or Rejecting it. This is usual
 70 Accept/Reject paradigm of greedy methods. The twist is that, we accept I_i by appending it
 71 to either $\text{Room}[1]$ or $\text{Room}[2]$.

The critical question is how to process an interval. For this purpose, let $fTime(j)$ be the
 finish time of the last interval placed into $\text{Room}[j]$ ($j = 1, 2$). So $fTime(j)$ is increased (in
 view of (1)) whenever we place a new interval into $\text{Room}[j]$. Introduce a variable $front$ whose
 value is 1 iff $fTime(1) \geq fTime(2)$; otherwise $front = 2$. Also maintain a complementary

variable *back* satisfying the invariant $back = 3 - front$. Call $Room[front]$ and $Room[back]$ the **front** and **back room** respectively. The ordered pair

$$(fTime(back), fTime(front))$$

is called the **state** of the rooms. So if $s = (a, b)$ is a state, then $a \leq b$. The **initial state** is $s_0 := (0, 0)$. It turns out that for all non-initial states, we always have the strict inequality $a < b$. In this case, we prefer to denote the state in a more distinctive way, “ $(a < b)$ ”. Suppose that the current state is $s = (a < b)$. We say $I = (s, f]$ is **applicable** to $s = (a < b)$ if $b < f$. If I is applicable to $s = (a < b)$, then we can apply I to s to transform it to a new state $t = (a' < b')$ defined as follows:

$$(a' < b') := \begin{cases} (a < f) & \text{if } b \leq s & \text{.....Case(I): keep,} \\ (b < f) & \text{if } a \leq s < b & \text{.....Case(II): flip,} \\ (a < b) & \text{if } s < a & \text{.....Case(III): reject.} \end{cases} \quad (2)$$

Write $(a < b) \xrightarrow{I} (a' < b')$ to indicate this transformation. So the sequence (1) induces a sequence of transformations:

$$s_0 \xrightarrow{I_1} s_1 \xrightarrow{I_2} \dots \xrightarrow{I_n} s_n. \quad (3)$$

This sequence is well-defined because each I_i is applicable to the previous state s_{i-1} .

Running Example. Suppose the sorted input are these 6 intervals:

$$Sort(A) = (I_1(0, 3] <_f I_2(1, 4] <_f I_3(4, 6] <_f I_4(2, 7] <_f I_5(6, 8] <_f I_6(4, 9]). \quad (4)$$

This induces the following state transformations:

$$s_0(0, 0) \xrightarrow[\text{keep}]{I_1} s_1(0 < 3) \xrightarrow[\text{flip}]{I_2} s_2(3 < 4) \xrightarrow[\text{keep}]{I_3} s_3(3 < 6) \xrightarrow[\text{rej}]{I_4} s_4(3 < 6) \xrightarrow[\text{keep}]{I_5} s_5(3 < 8) \xrightarrow[\text{flip}]{I_6} s_6(8 < 9). \quad (5)$$

Note that we also indicate the case (keep/flip/reject) of each transformation.

■

We have now completely described our algorithm which is called *Greedy2(A)* here:

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Greedy2( $A$ )  $\rightarrow B$ 
INPUT:  $A$  is a set of  $n$  intervals
OUTPUT: Set  $B \subseteq A$  with stabbing number  $\leq 2$  with maximal cardinality.
Sort the  $n$  intervals of  $A$  as in (1).
Let  $Room[1], Room[2]$  be compatible sets of intervals, initially empty.
Let  $fTime(1) \leftarrow fTime(2) \leftarrow 0$ 
    and  $front \leftarrow 1, back \leftarrow 2$ .
For  $i = 1, \dots, n$ ,
    Case(I) If  $s(I_i) \geq fTime(front)$ ,
         $Room[front].append(I_i)$ 
         $fTime(front) \leftarrow f(I_i)$   $\triangleleft$  keep the value of front
    Case(II) Else if  $(s(I_i) \geq fTime(back))$ ,
         $front \leftrightarrow back$   $\triangleleft$  flip front and back
         $Room[front].append(I_i)$ 
         $fTime(front) \leftarrow f(I_i)$ 
    Case(III) Else  $\triangleleft s(I_i) < fTime(back)$ 
        Reject  $I_i$   $\triangleleft$  i.e., do nothing
Return  $B = Room[1] \cup Room[2]$ 

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Note that Cases (I-II) in the algorithm implement rule (2). Moreover, we identify state s_i ($i = 1, \dots, n$) in (3) as the state at the end of the i th iteration of the for-loop. We also see why Case(I) and Case(II) are called “keep” and “flip” cases. In the running example above, $Greedy2(A)$ returns the set $Room[1] \cup Room[2]$ where

$$Room[1] = (I_1(0, 3], I_6(4, 9]), \quad Room[2] = (I_2(1, 4], I_3(4, 6], I_5(6, 8].)$$

Only one interval $I_4(2, 7]$ is rejected.

The correctness of $Greedy2$ is based on the following theorem:

► **Theorem 2 (Key).**

(a) If $stab\#(A) \leq 2$, then $Greedy2(A) = A$.

(b) If $B \subseteq A$ then $|Greedy2(B)| \leq |Greedy2(A)|$.

► **Corollary 3.** $Greedy2$ is correct,

i.e., if $B = Greedy2(A)$ then $stab\#(B) \leq 2$ and $|B| = Opt(A, 2)$.

Proof of Corollary If $B = Greedy2(A)$ then clearly $stab\#(B) \leq 2$ because B is the union of two compatible subsets of A . This implies that $Opt(A, 2) \geq |B|$. So it remains to prove that $Opt(A, 2) \leq |B|$. By definition of $Opt(A, 2)$, there is a set $B^* \subseteq A$ such that $|B^*| = Opt(A, 2)$ and $stab\#(B^*) \leq 2$. Thus

$$\begin{aligned}
 Opt(A, 2) &= |B^*| && \text{(by choice of } B^*) \\
 &= |Greedy2(B^*)| && \text{(by Theorem 2(a))} \\
 &\leq |Greedy2(A)| && \text{(by Theorem 2(b))} \\
 &= |B| && \text{(by choice of } B).
 \end{aligned}$$

Q.E.D.

Of the two parts in Theorem 2, part(a) is the easier to show:

Proof of Theorem 2(a) Assuming $\text{stab}\#(A) \leq 2$, we must show that $\text{Greedy2}(A) = A$, i.e., no interval of A is rejected. Let $s_i = (a_i < b_i)$ ($i = 1, \dots, n$) be the states in (3). Our result follows from 3 CLAIMS:

CLAIM 0: If $a_i = 0$ then I_i cannot be rejected. Pf: $a_i = 0$ means that $\text{Room}[\text{back}]$ is empty. In this case, the transformation $s_{i-1} \xrightarrow{I_i} s_i$ falls under Case(I) or (II), i.e., I_i is not rejected.

CLAIM 1: If $a_i > 0$ then there are some $j < k \leq i$ such that

$$a_i \in I_j \cap I_k \quad (6)$$

Pf: Note that $b_i = f(I_i)$ and $a_i = f(I_j)$ for some $j < i$. Suppose I_j is in $\text{Room}[1]$ (the other case is similarly argued). That means that at the end of the j th iteration, $\text{front} = 1$. Since I_i must be in $\text{Room}[2]$, there is a smallest k ($j < k \leq i$) such that I_k caused a flip (Case(II)), i.e., $s(I_{k-1}) < a_i < f(I_k)$. Thus $a_i \in I_j \cap I_k$, as CLAIMed.

CLAIM 2: If $a_i > 0$ then $a_{i+1} > 0$ and I_{i+1} is never rejected. Pf: Consider the transition $s_i \xrightarrow{I_{i+1}} s_{i+1}$. This cannot result in Case(III) (the rejection of I_{i+1}) because it would imply that $a_i \in I_{i+1}$, and (combined with CLAIM 1) implies $\text{stab}\#(a_i, A) = 3$, contradicting the assumption $\text{stab}\#(A) \leq 2$. Furthermore $a_{i+1} > 0$ holds because Case(I) implies $a_i = a_{i+1}$ and Case(II) implies $a_{i+1} \in I_i \cap I_{i+1}$. **Q.E.D.**

2.1 Setup for the proof of Theorem 2(b)

Theorem 2(b) clearly follows if we prove that

$$|\text{Greedy2}(A)| \leq |\text{Greedy2}(A^+)| \quad (7)$$

for all A and $A^+ = A \cup \{I^+\}$. To simplify the setting, note that (7) holds if I^+ is rejected by $\text{Greedy2}(A^+)$. Therefore we may assume I^+ is accepted by $\text{Greedy2}(A^+)$. Let

$$\text{Sort}(A^+) = (J_1 <_f J_2 <_f \dots <_f J_{n+1}). \quad (8)$$

Thus I^+ appears in (8) as J_{i^+} for some $1 \leq i^+ \leq n+1$. The sequence (8) induces these state transformations

$$s_0 \xrightarrow{J_1} s_1 \xrightarrow{J_2} \dots \xrightarrow{J_{n+1}} s_{n+1}.$$

We want to compare the state transformations of $\text{Greedy2}(A^+)$ with those of $\text{Greedy2}(A)$. But $\text{Greedy2}(A)$ produces one less state than $\text{Greedy2}(A^+)$. We will make them agree by an artifice: let $A^0 := A \cup \{I^0\}$ where $I^0 := (-1, f(I^+)]$ be an artificial interval that will always be rejected by our algorithm. Therefore the sorted sequence $\text{Sort}(A^0)$ agrees with (8) except that $J_{i^+} = I^+$ is replaced by I^0 . Let $(t_0, t_1, \dots, t_{n+1})$ be the corresponding sequence of states induced by $\text{Sort}(A^0)$. Now we can compare s_i with t_i for $i = 1, \dots, n+1$. Clearly, $s_i = t_i$ for $i < i^+$. But $s_{i^+} \neq t_{i^+}$ since I^+ is accepted and I^0 is rejected. Let $P_i := \begin{bmatrix} s_i \\ t_i \end{bmatrix}$ be the i th **state pair** (or simply **pair**). Also s_i and t_i are the **upper** and **lower states** of P_i . We call P_i an **equality pair** if $s_i = t_i$. So the first inequality pair is P_{i^+} called the **critical pair**. In the rest of our analysis, we consider this sequence of state pairs

$$P_0 \longrightarrow P_1 \longrightarrow \dots \longrightarrow P_n \longrightarrow P_{n+1} \quad (9)$$

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Moreover, for $i \neq i + 1$, we may write

$$P_{i-1} \xrightarrow{J_i} P_i$$

149 since the same I_i is used to transform the upper and lower states of P_{i-1} .

150 **Running Example (contd).** Let $I^+ = (3, 5]$, then $\text{Sort}(A^+)/\text{Sort}(A^0)$ is

$$151 \quad (J_1(0, 3] <_f J_2(1, 4] <_f (I^+/I^0) <_f J_4(4, 6] <_f J_5(2, 7] <_f J_6(6, 8] <_f J_7(4, 9]) \quad (10)$$

152 It induces the transformations of pairs:

$$153 \quad \begin{array}{ccccccc} P_0 & \xrightarrow[kk]{J_1} & P_1 \begin{bmatrix} 0 < 3 \\ 0 < 3 \end{bmatrix} & \xrightarrow[ff]{J_2} & P_2 \begin{bmatrix} 3 < 4 \\ 3 < 4 \end{bmatrix} & \xrightarrow[fr]{I^+/I^0} & P_3 \begin{bmatrix} 4 < 5 \\ 3 < 4 \end{bmatrix} & \xrightarrow[fk]{J_4} & P_4 \begin{bmatrix} 5 < 6 \\ 3 < 6 \end{bmatrix} \\ 154 & & \xrightarrow[rr]{J_5} & P_5 \begin{bmatrix} 5 < 6 \\ 3 < 6 \end{bmatrix} & \xrightarrow[kk]{J_6} & P_6 \begin{bmatrix} 5 < 8 \\ 3 < 8 \end{bmatrix} & \xrightarrow[rf]{J_7} & P_7 \begin{bmatrix} 5 < 8 \\ 8 < 9 \end{bmatrix}. \end{array} \quad (11)$$

155 Since $i^+ = 3$, the critical pair in (11) is $P_3 = \begin{bmatrix} 4 < 5 \\ 3 < 4 \end{bmatrix}$. Note that the subscript $xy \in \{k, f, r\}^2$
156 in the notation

$$157 \quad P_{i-1} \begin{bmatrix} s_{i-1} \\ t_{i-1} \end{bmatrix} \xrightarrow[xy]{J_i} P_i \begin{bmatrix} s_i \\ t_i \end{bmatrix} \quad (12)$$

158 says that the upper transformation $s_{i-1} \rightarrow s_i$ is Case x and lower transformation $t_{i-1} \rightarrow t_i$
159 is Case y . Call xy the **type** of the transition. The type is completely determined by P_{i-1}
160 and P_i . Check: the lower transformations in (11) is basically given by (5). ■

162 **Equivalent Pairs.** For $P = \begin{bmatrix} a \leq b \\ c \leq d \end{bmatrix}$, let $\text{supp}(P) := \{a, b, c, d\}$. E.g., $\text{supp}(\begin{bmatrix} 1 < 4 \\ 0 < 4 \end{bmatrix}) =$
163 $\{0, 1, 4\}$. We say two pairs P and Q are **equivalent** if there is a monotone function
164 $T : \text{supp}(P) \rightarrow \text{supp}(Q)$ such that $Q = T(P) = \begin{bmatrix} T(a) \leq T(b) \\ T(c) \leq T(d) \end{bmatrix}$. Here, T is a **monotone** means
165 $x \leq y$ iff $T(x) \leq T(y)$. It is easy to check that this is an equivalence relation on state pairs,
166 denoted $P \equiv Q$. E.g., $\begin{bmatrix} 1 < 4 \\ 0 < 4 \end{bmatrix} \equiv \begin{bmatrix} 3 < 5 \\ 1 < 5 \end{bmatrix}$ but $\begin{bmatrix} 0 < 3 \\ 0 < 2 \end{bmatrix} \not\equiv \begin{bmatrix} 0 < 2 \\ 0 < 3 \end{bmatrix}$. Call each equivalence class a
167 **class pair**.

168 **Strict Pairs.** A state $s = (a, b)$ is **strict** if $a < b$. Other than the initial state $(0, 0)$,
169 subsequent states must be strict. A pair $P = \begin{bmatrix} s \\ t \end{bmatrix}$ is **strict** if both s and t are strict. It is easy
170 to verify that for all $i \geq 2$, $P_i = \begin{bmatrix} s_i \\ t_i \end{bmatrix}$ is strict. We largely focus on strict pairs; henceforth
171 the unqualified “pair” will mean “strict pair”.

172 Our rule (2) for transforming states easily implies:

173 **► Lemma 4.** We have $|\text{supp}(P_i)| < 4$ for all P_i in the sequence (9).

174 E.g., $P = \begin{bmatrix} 1 < 3 \\ 2 < 4 \end{bmatrix}$ cannot occur in (9). In view of this lemma, we see that every strict pair is
175 equivalent to one of these 7 **canonical pairs** with support in $\{1, 2, 3\}$:

$$176 \quad \boxed{\begin{array}{llll} [A] = \begin{bmatrix} 1 < 3 \\ 1 < 2 \end{bmatrix} & [B] = \begin{bmatrix} 2 < 3 \\ 1 < 2 \end{bmatrix} & [C] = \begin{bmatrix} 2 < 3 \\ 1 < 3 \end{bmatrix} & [D] = \begin{bmatrix} 1 < 2 \\ 1 < 3 \end{bmatrix} \\ [E] = \begin{bmatrix} 1 < 2 \\ 1 < 2 \end{bmatrix} & [F] = \begin{bmatrix} 1 < 3 \\ 2 < 3 \end{bmatrix} & [G] = \begin{bmatrix} 1 < 2 \\ 2 < 3 \end{bmatrix} & \end{array}} \quad (13)$$

177 Let $V_2 = \{[A], [B], [C], [D], [E], [F], [G]\}$ be the set of canonical pairs from (13). We
178 interchangeably view $\alpha \in V_2$ as a pair as well as an equivalence class. Thus write both $P \equiv \alpha$
179 and $P \in \alpha$.

180 **► Observation 5.**

- 181 (a) There are exactly 7 class pairs, and they may be identified with the elements of V_2 .
 182 (b) The critical pair P_{i+} in (9) is equivalent to either $[A]$ or $[B]$.

Transition graph G_2 : Let $G_2 = (V_2, E_2)$ be the digraph whose edges are defined as follows: $(\alpha \rightarrow \beta) \in E_2$ iff there exist state pairs $P \equiv \alpha$ and $Q \equiv \beta$ and type $\tau \in \{k, f, r\}^2 \setminus \{rr\}$ such that $P \xrightarrow[\tau]{I} Q$ for some I . We also write $\alpha \xrightarrow[\tau]{} \beta$ in this case, and say⁴ that τ is **applicable** to α . E.g. we see that $\tau = kk$ is applicable to every $\alpha \in V_2$ because $P \xrightarrow[kk]{I} Q$ if $s(I) > a$ for all $a \in \text{supp}(P)$. The requirement that $\tau \neq rr$ means that I is accepted by either upper or lower state of P . If $\alpha \xrightarrow[\tau_i]{} \beta_i$ for $i = 1, 2, \dots$, we can write

$$\alpha \xrightarrow[\tau_1/\tau_2/\dots]{} \beta_1/\beta_2/\dots$$

E.g., We see that there exactly two types, kk and ff , that are applicable to $[E]$; moreover

$$[E] \xrightarrow[kk/ff]{} [E]/[E].$$

- 183 The following lemma shows that for $\alpha \neq [E]$, there are exactly 3 types that are applicable to
 184 α . It is proved by simple enumeration:

185 **► Lemma 6.**

186 *The complete list of types applicable to each $\alpha \in V_2$ are enumerated as follows:*

- 187 (a) $[A] \xrightarrow[kk/fk/ff]{} [E]/[C]/[C]$
 188 (b) $[B] \xrightarrow[kk/fk/rf]{} [C]/[C]/[D]$
 189 (c) $[C] \xrightarrow[kk/ff/rf]{} [C]/[E]/[G]$
 190 (d) $[D] \xrightarrow[kk/kf/ff]{} [E]/[F]/[F]$
 191 (e) $[E] \xrightarrow[kk/ff]{} [E]/[E]$
 192 (f) $[F] \xrightarrow[kk/ff/rf]{} [F]/[E]/[B]$
 193 (g) $[G] \xrightarrow[kk/kf/rf]{} [F]/[F]/[A]$

194 *These edges completely determine the graph G_2 as shown in Figure 1.*

Structure of G_2 : Node $[E]$ is the only sink. The elementary cycles of G_2 consist of 3 self-loops at the vertices $[C], [E], [F]$, and 3 non-trivial cycles

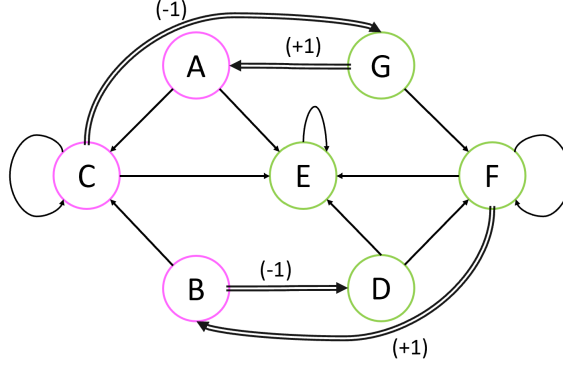
$$\langle [A] \rightarrow [C] \rightarrow [G] \rangle, \quad \langle [B] \rightarrow [D] \rightarrow [F] \rangle, \quad \langle [B] \rightarrow [C] \rightarrow [G] \rightarrow [F] \rangle.$$

195 Define $\Delta : V_2 \rightarrow \{1, 0, -1\}$ where

$$196 \quad \Delta(\alpha) = \begin{cases} 1 & \text{if } \alpha \in \{[A], [B], [C]\} & \dots(\text{positive class}) \\ 0 & \text{if } \alpha \in \{[D], [F], [G]\} & \dots(\text{neutral class}) \\ \frac{1}{2} & \text{else.} & \dots(\text{ambiguous class}) \end{cases} \quad (14)$$

197 Thus, the classes in V_2 are classified as positive, neutral or ambiguous by Δ . We also call a
 198 pair P positive, neutral or ambiguous if its equivalence class is positive, neutral or ambiguous.
 199 We will next see how this classification is used.

⁴ Unlike $P \rightarrow Q$ having a unique type, $\alpha \rightarrow \beta$ may have more than one type.



■ **Figure 1** Transition graph G_2 : Edges have $-1/0/+1$ weights: they have weight 0 unless noted otherwise.

Proof of Theorem 2(b)

Consider the sequence (9) of pairs, and let

$$\alpha_0 \longrightarrow \alpha_1 \longrightarrow \cdots \longrightarrow \alpha_{n+1} \quad (15)$$

be the corresponding sequence of classes where $P_i \equiv \alpha_i$. Let $U(i)$ (resp., $L(i)$) be the total number of intervals accepted by the upper (resp., lower) states of P_0, P_1, \dots, P_i . Let $\delta(i) := U(i) - L(i)$. Clearly, $\delta(i) = 0$ for all $i < i^*$ and $\delta(i^+) = 1$.

■ CLAIM 1: For $i > i^+$, if $P_{i-1} \xrightarrow{xy} P_i$ then

$$\delta(i) - \delta(i-1) = W(P \xrightarrow{xy} P_i) := \begin{cases} -1 & \text{if } x = r, \\ +1 & \text{if } y = r, \\ 0 & \text{else.} \end{cases} \quad (16)$$

Pf: We verify one of these 3 cases: $x = r$ implies that $U(i) = U(i-1)$. But it also implies that $y \neq r$, and hence $L(i) = L(i-1) + 1$. So

$$\delta(i) = U(i) - L(i) = U(i-1) - (L(i-1) + 1) = \delta(i-1) - 1.$$

The other two cases are similar. This establishes CLAIM 1.

■ As defined, $\delta(i)$ depends on the pairs P_j for all $j = 0, \dots, i$. We next show that $\delta(i)$ depends only on the equivalence class of P_i alone (although $\delta(i)$ can be 0 or 1 if P_i is ambiguous).

■ CLAIM 2: The formula for $W(P \rightarrow Q)$ in (16) is a function of the underlying classes, i.e.,

$$W(P \rightarrow Q) = \Delta(\beta) - \Delta(\alpha) \quad (17)$$

where $P \equiv \alpha$ and $Q \equiv \beta$, and Q is not ambiguous. Pf: Suppose $W(P \rightarrow Q) = -1$. From Lemma 6(b,c), we see the two possibilities: $(\alpha, \beta) = ([B], [D])$, or $(\alpha, \beta) = ([C], [G])$. Since $\Delta([B]) = \Delta([C]) = 1$ and $\Delta([D]) = \Delta([G]) = 0$, we verify (17).

Suppose $W(P \rightarrow Q) = +1$. Again Lemma 6(f,g) shows the two possibilities: $(\alpha, \beta) = ([F], [B])$, or $(\alpha, \beta) = ([G], [A])$. We may again verify (17).

Finally, if $W(P \rightarrow Q) = 0$, we see that $\Delta(\alpha) = \Delta(\beta)$ in the remaining edges, verifying (17).

222 ■ CLAIM 3: $\delta(i^+) = \Delta(\alpha_{i^+}) = 1$.

223 Pf: By our setup, $\delta(i^+) = 1$. By Observation 5, P_{i^+} is equivalent to $[A]$ or $[B]$ and
 224 $\Delta([A]) = \Delta([B]) = 1$.

225 ■ CLAIM 4: For $i \geq i^+$,

$$226 \quad \delta(i) \begin{cases} = \Delta(\alpha_i) & \text{if } \alpha_i \neq [E], \\ \in \{0, 1\} & \text{if } \alpha_i = [E]. \end{cases} \quad (18)$$

227 **Pf:** We prove this by induction on i . The basis $i = i^+$ is shown in CLAIM 3. If $\alpha_i \neq [E]$
 228 then:

$$\begin{aligned} 229 \quad \delta(i) &= \delta(i-1) + W(P_{i-1} \rightarrow P_i) && \text{(CLAIM 1)} \\ 230 \quad &= \Delta(\alpha_{i-1}) + W(P_{i-1} \rightarrow P_i) && \text{(induction hypothesis)} \\ 231 \quad &= \Delta(\alpha_{i-1}) + (\Delta(\alpha_i) - \Delta(\alpha_{i-1})) && \text{(CLAIM 2)} \\ 232 \quad &= \Delta(\alpha_i). \end{aligned}$$

233 Suppose $\alpha_i = [E]$. Since $[E]$ is a sink and $\alpha_{i^+} \neq [E]$, there is a last time j such
 234 that $j < i$ and $\alpha_j \neq [E]$. We had proved by induction that $\delta(j) = \Delta(\alpha_j)$. So it
 235 remains to show that for all $k > j$, $\delta(k) = \delta(j)$. Looking at Lemma 6(a,c,d,f), we
 236 see verify ‘ that $W(P_j \rightarrow P_{j+1}) = 0$ for any transition from a non-ambiguous class
 237 into the ambiguous class. This means that $\delta(j+1) = \delta(j)$. Next, we also see that
 238 $W(P \rightarrow Q) = 0$ for transitions between two ambiguous pairs (by Lemma 6(e)). This
 239 proves that $\delta(i) = \delta(i-1) + W(P_{i-1} \rightarrow P_i) = \delta(i-1)$. Repeating this, we see that
 240 $\delta(i) = \delta(j)$. Our CLAIM follows since $\Delta(\alpha_j) \in \{0, 1\}$.

241 To conclude our proof, CLAIM 4 implies that $\delta(n+1) \in \{0, 1\}$. But $\delta(n+1) = |\text{Greedy2}(A^+)| -$
 242 $|\text{Greedy2}(A^0)|$. Thus $|\text{Greedy2}(A^+)| \geq |\text{Greedy2}(A^0)|$, proving Theorem 2(b).

243 3 General Case

244 We now consider the general case of $m \geq 2$ rooms. Although many concepts introduced for
 245 $m = 2$ remain intact, we need to generalize some.

246 Our algorithm now maintains m rooms, and the i th interval I_i is again rejected or else
 247 it is accepted into one of the m rooms. The i th room is associated with $fTime(i)$, which
 248 equals $f(I)$ where I was last put into the room. We have an array $front[1..m]$ where
 249 $front[i] \in \{1, \dots, m\}$ are used to maintain this invariant:

$$250 \quad fTime[front[1]] \leq fTime[front[2]] \leq \dots \leq fTime[front[m]]. \quad (19)$$

251 These inequalities are strict unless both values are 0.

252 **States.** We now define a **state** to be $\mathbf{s} = (a_1 < a_2 < \dots < a_k)$ with $1 \leq k \leq m$ with
 253 $\text{supp}(\mathbf{s}) = \{a_1, \dots, a_k\}$. The initial state is (0) where $k = 1$ and $a_1 = 0$; but thereafter,
 254 $a_1 > 0$. Note that our notion of states departs slightly from the $m = 2$ case. The
 255 **rank** of \mathbf{s} is k , corresponding to the number of non-empty rooms so far. We map the
 256 sequence $\mathbf{f} = (f_1 \leq f_2 \leq \dots \leq f_m)$ of (19) into a state by removing any $f_i = 0$. E.g.,
 257 $\mathbf{f} = (0, 0, 2, 5, 6) \mapsto \mathbf{s} = (2, 5, 6)$. The rule (2) for transforming states will now explicitly allow
 258 for the increase in rank: if interval I is **applicable** to $\mathbf{s} = (a_1 < \dots < a_k)$ (i.e., $f(I) > a_k$),
 259 then its application to \mathbf{s} results in a new state $\mathbf{t} = (b_1 < \dots < b_\ell)$ defined as follows: let
 260 $i^* := \arg\max_{i=0}^k \{a_i : a_i \leq s(I)\}$ (where $a_0 = 0$).

$$261 \quad \mathbf{t} = \begin{cases} (a_1 < \dots < \widehat{a_{i^*}} < \dots < a_k < f(I)) & \text{if } i^* \geq 1, & \dots \text{ Case}(i^*) \\ (a_1 < \dots < \dots < a_k < f(I)) & \text{if } i^* = 0 \text{ and } k < m, & \dots \text{ Case}(0) \\ \mathbf{s} & \text{if } i^* = 0 \text{ and } k = m, & \dots \text{ Case}(-1) \end{cases} \quad (20)$$

where the notation $\widehat{a_{i^*}}$ in $\text{Case}(i^*)$ means that a_{i^*} is omitted from the sequence. As usual, we write $\mathbf{s} \xrightarrow{I} \mathbf{t}$. E.g., let $m = 4$. Then $\mathbf{s} = (1, 3, 5) \xrightarrow{(0,7]} \mathbf{t} = (1, 3, 5, 7)$ with $i^* = 0$. Also $\mathbf{s} = (1, 3, 5) \xrightarrow{(4,7]} \mathbf{t} = (1, 5, 7)$ with $i^* = 2$. The **type** of the transition $\mathbf{s} \xrightarrow{I} \mathbf{t}$ in (20) is **reject** (*rej*) in $\text{Case}(-1)$, **accept** (*acc*) in $\text{Case}(i \geq 1)$ and **extend** (*ext*) in $\text{Case}(0)$. Thus, the rank of \mathbf{s} is incremented iff the type is *ext*. Also \mathbf{s} accepts I means that some $a \in \mathbf{s}$ is **displaced** by $f(I)$. Write $\mathbf{s} \xrightarrow{\tau} \mathbf{t}$ when the type is $\tau \in \{\text{acc}, \text{ext}, \text{rej}\}$.

► **Lemma 7.** *Let $\mathbf{s} = (a_1 < \dots < a_k)$ be a state. If $R \subseteq A$ is the current set of intervals accepted into in the k rooms, then $\text{stab}\#(a_i, R) = k - i + 1$.*

The proof is similar to CLAIM 1 in the proof of Theorem 2(a). Indeed, the m -room generalization of Theorem 2(a) follows from this.

Pairs. Again we consider the sequence of state pairs in (9) corresponding to $\text{Sort}(A^+)$ and $\text{Sort}(A^0)$. Let $P = \begin{bmatrix} \mathbf{s} \\ \mathbf{t} \end{bmatrix} = \begin{bmatrix} a_1 < a_2 < \dots < a_k \\ b_1 < b_2 < \dots < b_\ell \end{bmatrix}$ be such a pair. Let $\text{supp}(P) = \text{supp}(\mathbf{s}) \cup \text{supp}(\mathbf{t})$ and $\text{rank}(P) = \max\{\text{rank}(\mathbf{s}), \text{rank}(\mathbf{t})\}$. Two states \mathbf{s}, \mathbf{t} are **equivalent** if there exist a monotone map $T : \text{supp}(\mathbf{s}) \rightarrow \text{supp}(\mathbf{t})$ such that $T(\mathbf{s}) = \mathbf{t}$. Two pairs P, Q are **equivalent** if there is a monotone map $T : \text{supp}(P) \rightarrow \text{supp}(Q)$ such that $T(P) = Q$. Say P is **canonical** if $\text{supp}(P) = \{1, 2, \dots, k\}$ where $k = \text{rank}(P)$. Clearly, every pair is equivalent to a unique canonical pair.

Superclasses: In order to achieve a general analysis, we cannot naively generalize Lemma 6 because we would be analyzing transition graphs with $\Omega(m^2)$ nodes. Instead, define the following set of **superclasses**:

$$V_m := \{[A_1], [B_1], [A_0], [B_0], [E]\}. \quad (21)$$

Each superclass is a sets of pairs of rank $\leq m$:

- $[A_1]$ is the set of all pairs $\begin{bmatrix} \mathbf{s} \\ \mathbf{t} \end{bmatrix}$ such that $(\exists a)[\text{supp}(\mathbf{s}) = \text{supp}(\mathbf{t}) \cup \{a\}]$.
- $[B_1]$ is the set of all pairs $\begin{bmatrix} \mathbf{s} \\ \mathbf{t} \end{bmatrix}$ such that $(\exists a < b)[\text{supp}(\mathbf{s}) \cup \{b\} = \text{supp}(\mathbf{t}) \cup \{a\}]$.
- $[A_0]$ is the set of all pairs $\begin{bmatrix} \mathbf{s} \\ \mathbf{t} \end{bmatrix}$ such that $(\exists b)[\text{supp}(\mathbf{s}) \cup \{b\} = \text{supp}(\mathbf{t})]$.
- $[B_0]$ is the set of all pairs $\begin{bmatrix} \mathbf{s} \\ \mathbf{t} \end{bmatrix}$ such that $(\exists a > b)[\text{supp}(\mathbf{s}) \cup \{b\} = \text{supp}(\mathbf{t}) \cup \{a\}]$.
- $[E]$ is set of all equality pairs.

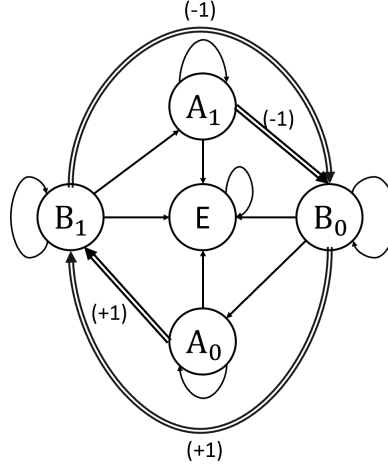
The superclasses are no longer equivalence classes. E.g., $\begin{bmatrix} 2 < 3 < 4 \\ 1 < 3 < 4 \end{bmatrix} \neq \begin{bmatrix} 1 < 3 < 4 \\ 1 < 2 < 4 \end{bmatrix}$ but both pairs belong to $[B_1]$.

► **Observation 8.**

- (a) Each superclass $\alpha \in V_m$ is a union of equivalence classes of pairs.
- (b) The critical pair P_{i^+} in (9) belongs to either $[A_1]$ or $[B_1]$.

The transition graph $G_m = (V_m, E_m)$: We have an edge $(\alpha \rightarrow \beta) \in E_m$ iff there exist pairs $P \in \alpha, Q \in \beta$ and interval I such that $P \xrightarrow{I} Q$. This graph is shown in Figure 2. Furthermore, if $P \xrightarrow{xy} Q$ (for some $xy \in \{a, e, r\}^2 = \{\text{acc}, \text{ext}, \text{rej}\}^2$) then we write $\alpha \xrightarrow{xy} \beta$ and say⁵ xy is **applicable** to α . For example, the type *rr* is always applicable to any superclass. We call *rr* the **trivial type** because always it represents self-loops: $\alpha \xrightarrow{rr} \alpha$. The following theorem enumerates all non-trivial types applicable to each $\alpha \in V_m$.

⁵ But β may not be uniquely determined by α and xy . E.g., Theorem 9(II) shows that $[B_1] \xrightarrow{aa} [E] \text{ or } [B_1]$.



■ **Figure 2** Transition Graph G_m

► **Theorem 9.**

The complete list of non-trivial types applicable to each $\alpha \in V_n$ is enumerated as follows:

- (I) $[A_1] \xrightarrow{aa/ae/ee/\textcolor{red}{re}} [A_1]/[E]/[A_1]/[B_0]$
- (II) $[B_1] \xrightarrow{aa/\textcolor{red}{ra}/ee/ea} [E] \text{ or } [B_1]/[B_0]/[B_1]/[A_1]$
- (III) $[A_0] \xrightarrow{aa/ea/ee/\textcolor{red}{er}} [A_0]/[E]/[A_0]/[B_1]$
- (IV) $[B_0] \xrightarrow{aa/\textcolor{red}{ar}/ee/ae} [B_0] \text{ or } [E]/[B_1]/[B_0]/[A_0]$
- (V) $[E] \xrightarrow{aa/ee} [E]/[E]$

Proof. See appendix.

Q.E.D.

We summarize our main result as follows:

► **Theorem 10 (Main Result).** The multiroom activity selection problem can be optimally solved by our greedy algorithm as defined by (20). This algorithm can be implemented in $O(n \log n)$.

Proof. The correctness of the greedy algorithm follows from the above generalization of Theorem 2. The main issue is the complexity claim. If m is fixed, this is no issue. But in the generalized problem, m is part of the input ($m \leq n$). Above, we said that we maintain the invariant (19) using an array $front[1..m]$. Then it $O(m)$ to update this array for each interval I_i , or a total of $\Omega(mn)$ time. This is not acceptable if $m = \Omega(\log n)$. Our solution is fairly standard: suppose only k rooms are currently in use ($k \leq m$). Use any balanced binary tree T (e.g., an AVL tree) to store the pairs $\{(fTime[1], 1), \dots, (fTime[k], k)\}$, sorted by the first component $fTime[i]$ of each pair. Given interval I , we use T to find the node $(fTime[j], j)$ ($j = 1, \dots, k$) such that $fTime[j]$ is the largest value satisfying $fTime[j] \leq s(I)$. If such a j exists, we can delete node containing $(fTime[j], j)$ and insert the pair $(f(I), j)$. We can update $fTime[j] \leftarrow f(I)$. Suppose j does not exist: there are two possibilities: if $k = m$, we will reject I and there is nothing to do. Otherwise, we extend the current state by inserting the pair $(f(I), k+1)$ into T , update $fTime[k+1] \leftarrow f(I)$. Thus we can implement the

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328 transformation (20) in $O(\log m) = O(\log n)$ time.

Q.E.D.

329

330 4 Conclusion

331 This paper introduced a novel generalization of the activity selection problem, and gave
332 a relatively simple optimal greedy algorithm with an interesting proof. Our multi-room
333 scenario opens up many possibilities for generalization. Which of these generalizations
334 remains subquadratic in complexity? For instance, suppose the m rooms come in 2 sizes (big
335 and small) and some activities can only be assigned to big rooms. Is there still an optimal
336 greedy algorithm?

A

 Appendix: Full Proof of Theorem 9 and References

Theorem 9

The complete list of non-trivial types applicable to each $\alpha \in V_n$ is enumerated as follows:

- (I) $[A_1] \xrightarrow{aa/ae/ee/re} [A_1]/[E]/[A_1]/[B_0]$
- (II) $[B_1] \xrightarrow{aa/ra/ee/ea} [E] \text{or} [B_1]/[B_0]/[B_1]/[A_1]$
- (III) $[A_0] \xrightarrow{aa/ea/ee/er} [A_0]/[E]/[A_0]/[B_1]$
- (IV) $[B_0] \xrightarrow{aa/ar/ee/ae} [B_0] \text{or} [E]/[B_1]/[B_0]/[A_0]$
- (V) $[E] \xrightarrow{aa/ee} [E]/[E]$

Proof. Case (V) is immediate. Due to the symmetry between A_1 and A_0 , and between B_1 and B_0 , we only need to prove Cases (I) and (II). Cases (III) and (IV) may be derived by 3 simultaneous exchanges $A_1 \leftrightarrow A_0$, $B_1 \leftrightarrow B_0$, and $xy \leftrightarrow yx$. to any transition $\alpha \xrightarrow{xy} \beta$.

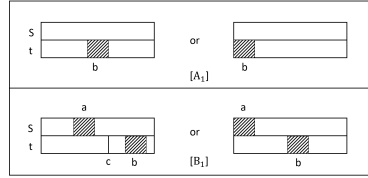


Figure 3 Canonical pairs for $[A_1]$ and $[B_1]$: two variants of each are shown.

Case (I) Refer to Figure 3(top) illustrating a canonical pair $P = [\frac{s}{t}] \in [A_1]$. Let $s = (a_1 < \dots < a_k)$, $t = (b_1 < \dots < b_{k-1})$ and $b = \text{supp}(s) \setminus \text{supp}(t)$. The figure distinguishes two possibilities: $b = a_1$ or $b > a_1$. Consider the transition $P \xrightarrow{I} Q$ for some applicable interval I .

We consider 3 cases, depending on whether s accepts, extends to accept or rejects I :

- (I.1) If this interval is accepted by state s , then t cannot reject I . So t can accept I , or it can extend to accept I . (i) If t accept I , then we see that Q belongs to $[A_1]$. (ii) If t extends to accept I , this implies $b_1 > b = a_1$, and $a_1 < s(I) < b_1$. Moreover, $a_1 \in s$ is displaced by $f(I)$, and t adds $f(I)$. If $Q = [\frac{s'}{t'}]$, this means that $s' = t'$ i.e. Q belongs to $[E]$. Thus we have shown

$$[A_1] \xrightarrow{aa/ae} [A_1]/[E].$$

- (I.2) If s extends to accept the interval, then t must extend to accept I . So both s and t simply add the element $f(I)$. Then Q belongs to $[A_1]$. This proves that

$$[A_1] \xrightarrow{ee} [A_1].$$

- (I.3) If s rejects I , then t must extend to accept I . After adding $f(I)$ to t , the resulting pair satisfies $\text{supp}(s) \cup f(I) = \text{supp}(t) \cup b$. Since $b < f(I)$, Q belongs to $[B_0]$. This proves that

$$[A_1] \xrightarrow{re} [B_0].$$

Case (II) Refer to Figure 3(bottom) illustrating a canonical pair $P = [\begin{smallmatrix} s \\ t \end{smallmatrix}] \in [B_1]$. By definition of $[B_1]$, we may assume that $s = (a_1 < \dots < a_k)$, $t = (b_1 < \dots < b_k)$ and $\text{supp}(s) \cup \{b\} = \text{supp}(t) \cup \{a\}$ for some $a < b$. Also, there is a unique $c \in \text{supp}(t)$ that precedes b . The figure distinguishes two possibilities: $a = b_1$ or $a > b_1$. Assume I is applicable to P , i.e., $f(I) > a_k$. Consider 3 possibilities: s accepts I , or rejects I , or extends to accepts I .

(II.1) If I is accepted by s , then it must also be accepted by t . But, what is the superclass of Q where $P \xrightarrow[aa]{I} Q$? This turns out to be non-unique.

Let $d \in \text{supp}(s)$ be displaced when s accepts I . Similarly, let $d' \in \text{supp}(t)$ be displaced when t accepts I . If $d \neq b$ then $d' = d$, and we see that Q still belongs to $[B_1]$. If $d = b$, then we see that $d' = c$. Now, there are two possibilities: either $a < c$ in which case $Q \in [B_1]$, or $a = c$ in which case $Q \in [E]$. This proves our claim that

$$[B_1] \xrightarrow[aa]{} [E] \text{or} [B_1].$$

(II.2) If s rejects I , then t must also reject I unless $a = b_1$. If $a = b_1$, t may accept I but it may not extend t to accept I . Accepting I implies that b_1 is displaced by $f(I)$ in Q . Then Q belongs to $[B_0]$. This proves that

$$[B_1] \xrightarrow[ra]{} [B_0].$$

(II.3) If s extends to accept I , then t cannot reject I . So t can also extend to accept I , or it can accept I : (i) If t extends to accept I , then we see that Q belongs to $[B_1]$. (ii) If t accepts I , this implies $b_1 = a$. Moreover, b_1 is displaced by $f(I)$ in t . If $Q = [\begin{smallmatrix} s' \\ t' \end{smallmatrix}]$, this means that $\text{supp}(t') = \text{supp}(t') \cup \{b\}$, i.e., $Q \in [A_1]$. Thus we have shown

$$[B_1] \xrightarrow[ee/ea]{} [B_1]/[A_1].$$

Q.E.D.

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