

Leaf Sequencing Algorithms for Segmented Multileaf Collimation

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Abstract. The delivery of intensity modulated radiation therapy (IMRT) with a multileaf collimator (MLC) requires the conversion of a radiation fluence map into a leaf sequence file that controls the movement of the MLC during radiation delivery. It is imperative that the fluence map delivered using the leaf sequence file is as close as possible to the fluence map generated by the dose optimization algorithm, while satisfying hardware constraints of the delivery system. Optimization of the leaf sequencing algorithm has been the subject of several recent investigations. In this work, we present a systematic study of the optimization of leaf sequencing algorithms for segmental multileaf collimator beam delivery and provide rigorous mathematical proofs of optimized leaf sequence settings in terms of monitor unit (MU) efficiency under most common leaf movement constraints that include minimum and maximum leaf separation and leaf interdigitation. Our analytical analysis shows that leaf sequencing based on unidirectional movement of the MLC leaves is as good as bi-directional movement of the MLC leaves.

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1. Introduction

Computer-controlled multileaf collimators (MLC) are extensively used to deliver intensity modulated radiation therapy (IMRT). The treatment planning for IMRT is usually done using the inverse planning method, where a set of optimized fluence maps are generated for a given patient's data and beam configuration. A separate software module is involved to convert the optimized fluence maps into a set of leaf sequence files that control the movement of the MLC during delivery. The purpose of the leaf sequencing algorithm is to produce the desired fluence map once the beam is delivered, taking into consideration any hardware and dosimetric characteristics of the delivery system. Optimization of the leaf sequencing algorithm has been the subject of numerous investigations (Convery and Rosenbloom 1992, Dirks *et al* 1998, Xia and Verhey 1998, Ma *et al* 1998).

IMRT treatment delivery is not very efficient in terms of monitor unit (MU). MU efficiency, which is defined as the ratio of dose delivered at a point in the patient with an IMRT field to the MU delivered for that field. Typical MU efficiencies of IMRT treatment plans are 5 to 10 times lower than open/wedge field-based conventional treatment plans. Therefore, total body dose due to increased leakage radiation reaching the patient in an IMRT treatment is a major concern (Intensity Modulated Radiation Therapy Collaborative Working Group 2001). Low MU efficiency of IMRT delivery negatively impacts the room shielding design because of the increased workload (Intensity Modulated Radiation Therapy Collaborative Working Group 2001, Mutic *et al* 2001). The MU efficiency depends both on the degree of intensity modulation and the algorithm used to convert the intensity pattern into a leaf sequence for IMRT delivery. It is therefore important to design a leaf sequencing algorithm that is optimal for MU efficiency. Other rationale for achieving optimal MU efficiency is to minimize the treatment delivery time and multileaf collimator wear. For dynamic beam delivery where dose rate is usually not modulated, an algorithm that optimizes the MU setting at a given dose rate also optimizes the treatment time.

Dynamic leaf sequencing algorithms with the leaves in motion during radiation delivery have been developed (Convery and Rosenbloom 1992, Spirou and Chui 1994), and later modified (van Santvoort and Heijmen 1996, Dirks *et al* 1998) to eliminate the tongue-and-groove underdosage effects. Similar leaf sequencing algorithms have also been developed for the segmental multileaf collimator (SMLC) delivery method (Xia and Verhey 1998, Ma *et al* 1998, Bortfeld *et al* 1994, Bortfeld *et al* 1994a). Most of these studies did not consider any leaf movement constraints, with the exception of the maximum leaf speed constraint for dynamic delivery. Such leaf sequencing algorithms are applicable for certain types of MLC designs. For other types of MLC designs, notably the Siemens (Siemens Medical Systems, Inc., Iselin, NJ) MLC design (Das *et al* 1998) and Elekta (Elekta Oncology Systems Inc., Norcross, GA) MLC design (Jordan and Williams 1994), other mechanical constraints need to be taken into consideration when designing the leaf settings for both dynamic and SMLC delivery. The minimum

leaf separation constraint, for example, was recently incorporated into the design of leaf sequence (Convery and Webb 1998).

In this work, we present a systematic study of the optimization of leaf sequencing algorithms for the SMLC beam delivery and provide rigorous proofs of optimized leaf sequence settings in terms of MU efficiency under various leaf movement constraints. Practical leaf movement constraints that are considered include the minimum and maximum leaf separation constraints and minimum inter-leaf separation constraint (leaf interdigitation constraint). The question of whether bi-directional leaf movement will increase the MU efficiency when compared with uni-directional leaf movement only is also addressed.

2. Methods

2.1. Discrete Profile

The geometry and coordinate system used in this study are shown in Figure 1. We consider delivery of profiles that are piecewise continuous. Let $I(x)$ be the desired intensity profile. We first discretize the profile so that we obtain the values at sample points $x_0, x_1, x_2, \dots, x_m$. $I(x)$ is assigned the value $I(x_i)$ for $x_i \leq x < x_{i+1}$, for each i . Now, $I(x_i)$ is our desired intensity profile. Figure 2 shows a piecewise continuous function and the corresponding discretized profile. The discretized profile is most efficiently delivered with the SMLC method. However, a SMLC sequence can be transformed to a dynamic leaf sequence by allowing both leaves to start at the same point and close together at the same point, so that they sweep across the same spatial interval. We develop our theory for the SMLC delivery.

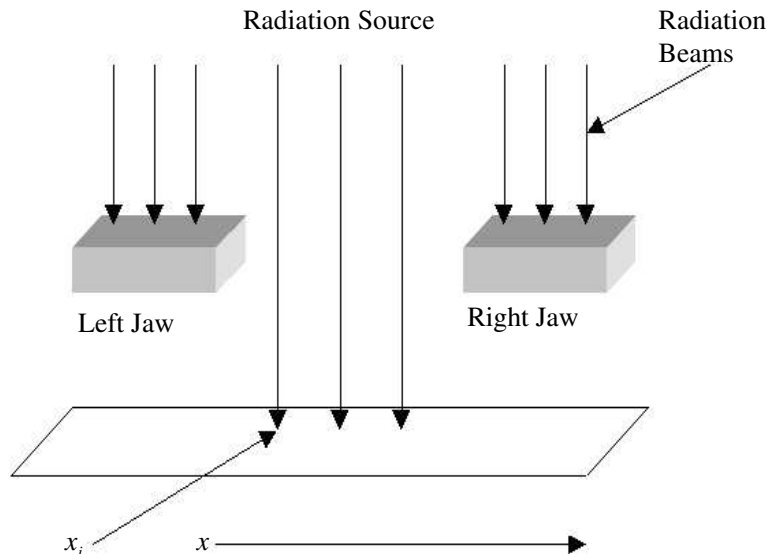


Figure 1. Geometry and coordinate system

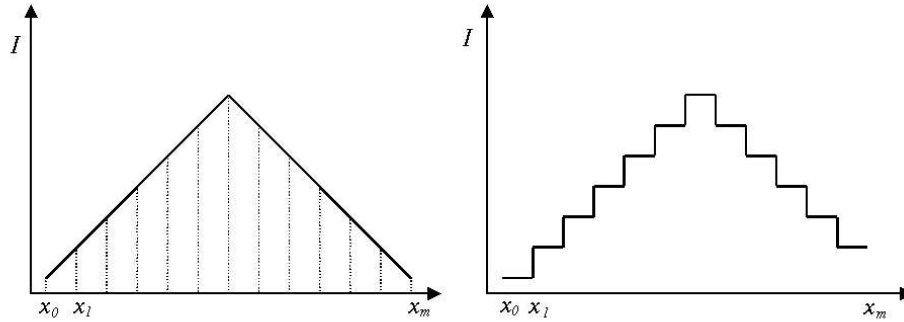


Figure 2. Discretization of profile

2.2. Movement of Jaws

In our analysis we will assume that the beam delivery begins when the pair of jaws is at the left most position. The initial position of the jaws is x_0 . Figure 3 illustrates the leaf trajectory during SMLC delivery. Let $I_l(x_i)$ and $I_r(x_i)$ respectively denote the amount of Monitor Units (MUs) delivered when the left and right jaws leave position x_i . Consider the motion of the left jaw. The left jaw begins at x_0 and remains here until $I_l(x_0)$ MUs have been delivered. At this time the left jaw is moved to x_1 , where it remains until $I_l(x_1)$ MUs have been delivered. The left jaw then moves to x_3 where it remains until $I_l(x_3)$ MUs have been delivered. At this time, the left jaw is moved to x_6 , where it remains until $I_l(x_6)$ MUs have been delivered. The final movement of the left jaw is to x_7 , where it remains until $I_l(x_7) = I_{max}$ MUs have been delivered. At this time the machine is turned off. The total therapy time, $TT(I_l, I_r)$, is the time needed to deliver I_{max} MUs. The right jaw starts at x_2 ; moves to x_4 when $I_r(x_2)$ MUs have been delivered; moves to x_5 when $I_r(x_4)$ MUs have been delivered and so on. Note that the machine is off when a jaw is in motion. We make the following observations:

- (i) All MUs that are delivered along a radiation beam along x_i before the left jaw passes x_i fall on it. Greater the x value, later the jaw passes that position. Therefore $I_l(x_i)$ is a non-decreasing function.
- (ii) All MUs that are delivered along a radiation beam along x_i before the right jaw passes x_i , are blocked by the jaw. Greater the x value, later the jaw passes that position. Therefore $I_r(x_i)$ is also a non-decreasing function.

From these observations we notice that the net amount of MUs delivered at a point is given by $I_l(x_i) - I_r(x_i)$, which must be the same as the desired profile $I(x_i)$.

2.3. Optimal Unidirectional Algorithm for one Pair of Leaves

2.3.1. Unidirectional Movement. When the movement of jaws is restricted to only one direction, both the left and right jaws move along positive x direction, from left to right

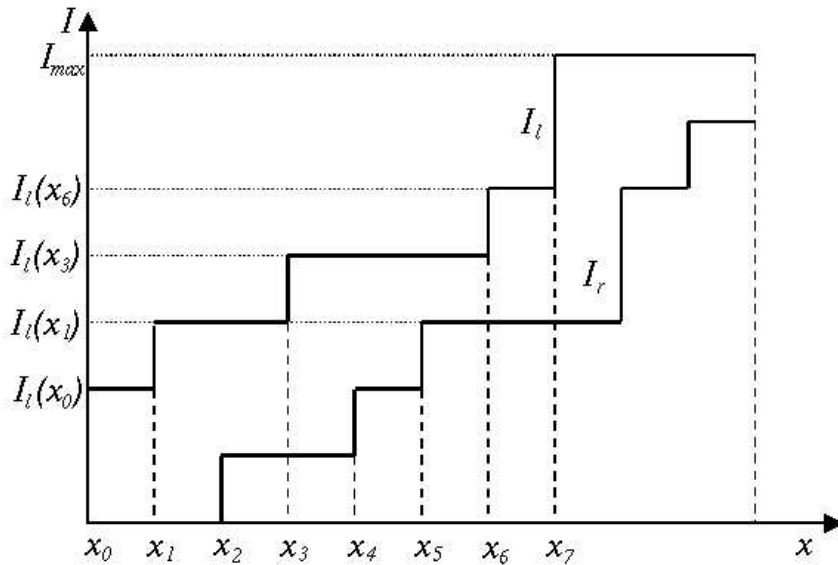


Figure 3. Leaf trajectory during SMLC delivery

(Figure 1). Once the desired intensity profile, $I(x_i)$ is known, our problem becomes that of determining the individual *intensity profiles* to be delivered by the left and right jaws, I_l and I_r such that:

$$I(x_i) = I_l(x_i) - I_r(x_i), 0 \leq i \leq m \quad (1)$$

We refer to (I_l, I_r) as the *treatment plan* (or simply *plan*) for I . Once we obtain the plan, we will be able to determine the movement of both left and right jaws during the therapy. For each i , the left jaw can be allowed to pass x_i when the source has delivered $I_l(x_i)$ MUs. Also, we can allow the right jaw to pass x_i when the source has delivered $I_r(x_i)$ MUs. In this manner we obtain *unidirectional jaw movement profiles* for a plan.

2.3.2. Algorithm. From Equation 1, we see that one way to determine I_l and I_r from the given target profile I is to begin with $I_l(x_0) = I(x_0)$ and $I_r(x_0) = 0$; examine the remaining x_i s from left to right; increase I_l whenever I increases; and increase I_r whenever I decreases. Once I_l and I_r are determined the jaw movement profiles are obtained as explained in the previous section. The resulting algorithm is shown in Figure 4. Figure 5 shows a profile and the corresponding plan obtained using the algorithm.

Ma *et al* (1998) shows that Algorithm SINGLEPAIR obtains plans that are optimal in therapy time. Their proof relies on the results of Boyer and Strait (1997), Spirou and Chui (1994) and Stein *et al* (1994). We provide a much simpler proof below.

Theorem 1 *Algorithm SINGLEPAIR obtains plans that are optimal in therapy time.*

Algorithm SINGLEPAIR

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 $I_l(x_0) = I(x_0)$ 
 $I_r(x_0) = 0$ 
For  $j = 1$  to  $m$  do
  If  $(I(x_j) \geq I(x_{j-1}))$ 
     $I_l(x_j) = I_l(x_{j-1}) + I(x_j) - I(x_{j-1})$ 
     $I_r(x_j) = I_r(x_{j-1})$ 
  Else
     $I_r(x_j) = I_r(x_{j-1}) + I(x_j) - I(x_{j-1})$ 
     $I_l(x_j) = I_l(x_{j-1})$ 
End for

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Figure 4. Obtaining a unidirectional plan

Proof: Let $I(x_i)$ be the desired profile. Let $inc1, inc2, \dots, inc_k$ be the indices of the points at which $I(x_i)$ increases. So $x_{inc1}, x_{inc2}, \dots, x_{inc_k}$ are the points at which $I(x)$ increases (i.e., $I(x_{inci}) > I(x_{inci-1})$). Let $\Delta i = I(x_{inci}) - I(x_{inci-1})$.

Suppose that (I_L, I_R) is a plan for $I(x_i)$ (not necessarily that generated by Algorithm SINGLEPAIR). From the unidirectional constraint, it follows that $I_L(x_i)$ and $I_R(x_i)$ are non-decreasing functions of x . Since $I(x_i) = I_L(x_i) - I_R(x_i)$ for all i , we get

$$\begin{aligned} \Delta i &= (I_L(x_{inci}) - I_R(x_{inci})) - (I_L(x_{inci-1}) - I_R(x_{inci-1})) \\ &= (I_L(x_{inci}) - I_L(x_{inci-1})) - (I_R(x_{inci}) - I_R(x_{inci-1})) \\ &\leq I_L(x_{inci}) - I_L(x_{inci-1}). \end{aligned}$$

Summing up Δi , we get

$$\sum_{i=1}^k [I(x_{inci}) - I(x_{inci-1})] \leq \sum_{i=1}^k [I_L(x_{inci}) - I_L(x_{inci-1})] = TT(I_L, I_R).$$

Since the therapy time for the plan (I_l, I_r) generated by Algorithm SINGLEPAIR is $\sum_{i=1}^k [I(x_{inci}) - I(x_{inci-1})]$, it follows that $TT(I_l, I_r)$ is minimum. ■

Corollary 1 Let $I(x_i)$, $0 \leq i \leq m$ be a desired profile. Let $I_l(x_i)$, and $I_r(x_i)$, $0 \leq i \leq m$ be the left and right jaw profiles generated by Algorithm SINGLEPAIR. $I_l(x_i)$ and $I_r(x_i)$, $0 \leq i \leq m$ define optimal therapy time unidirectional left and right jaw profiles for $I(x_i)$, $0 \leq i \leq j$.

Proof: Follows from Theorem 1 ■

In the remainder of this paper, (I_l, I_r) is the optimal treatment plan for the desired profile I .

2.3.3. Properties of The Optimal Treatment Plan. The following observations are made about the optimal treatment plan (I_l, I_r) generated using Algorithm SINGLEPAIR.

Lemma 1 At each x_i at most one of the profiles I_l and I_r changes (increases).

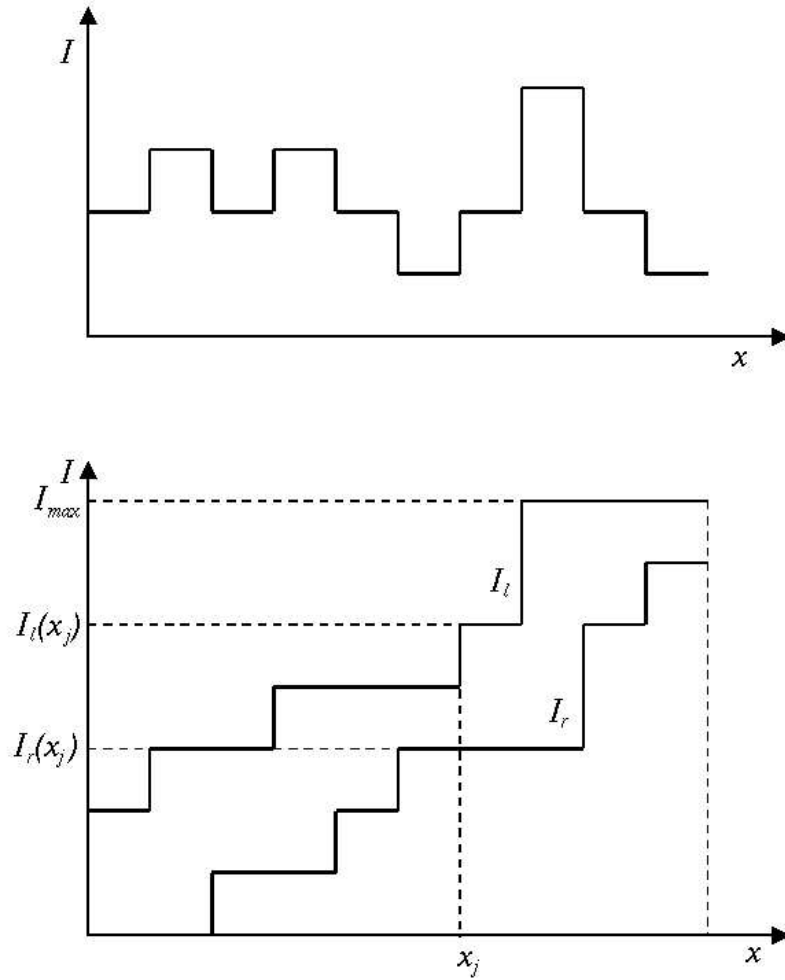


Figure 5. A profile and its plan

Lemma 2 Let (I_L, I_R) be any treatment plan for I .

(a) $\Delta(x_i) = I_L(x_i) - I_l(x_i) = I_R(x_i) - I_r(x_i) \geq 0, 0 \leq i \leq m$.

(b) $\Delta(x_i)$ is a non-decreasing function.

Proof: (a) Since $I(x_i) = I_L(x_i) - I_R(x_i) = I_l(x_i) - I_r(x_i)$, $I_L(x_i) - I_l(x_i) = I_R(x_i) - I_r(x_i)$. Further, from Corollary 1, it follows that $I_L(x_i) \geq I_l(x_i), 0 \leq i \leq m$. Therefore, $\Delta(x_i) \geq 0, 0 \leq i \leq m$.

(b) We prove this by contradiction. Suppose that $\Delta(x_n) > \Delta(x_{n+1})$ for some $n, 0 \leq n < m$. Consider the following three all encompassing cases.

Case 1: $I_l(x_n) = I_l(x_{n+1})$

Now, $I_L(x_n) = I_l(x_n) + \Delta(x_n) > I_l(x_{n+1}) + \Delta(x_{n+1}) = I_L(x_{n+1})$.

This is not possible because I_L is a non-decreasing function.

Case 2: $I_r(x_n) = I_r(x_{n+1})$

Now, $I_R(x_n) = I_r(x_n) + \Delta(x_n) > I_r(x_{n+1}) + \Delta(x_{n+1}) = I_R(x_{n+1})$.

This contradicts the fact that I_R is a non-decreasing function.

Case 3: $I_l(x_n) \neq I_l(x_{n+1})$ and $I_r(x_n) \neq I_r(x_{n+1})$

From Lemma 1 it follows that this case cannot arise.

Therefore, $\Delta(x_i)$ is a non-decreasing function. ■

Theorem 2 *If the optimal plan (I_l, I_r) violates the minimum separation constraint, then there is no plan for I that does not violate the minimum separation constraint.*

Proof: Suppose that (I_l, I_r) violates the minimum separation constraint. Assume that the first violation occurs when I_1 MUs have been delivered. From the unidirectional movement constraint, it follows that the left jaw has just been positioned at x_j (for some $j, 0 \leq j \leq m$) at this time and that the right jaw is at x_k such that $x_k - x_j$ is less than the permissible minimum separation. Figure 6 illustrates the situation.

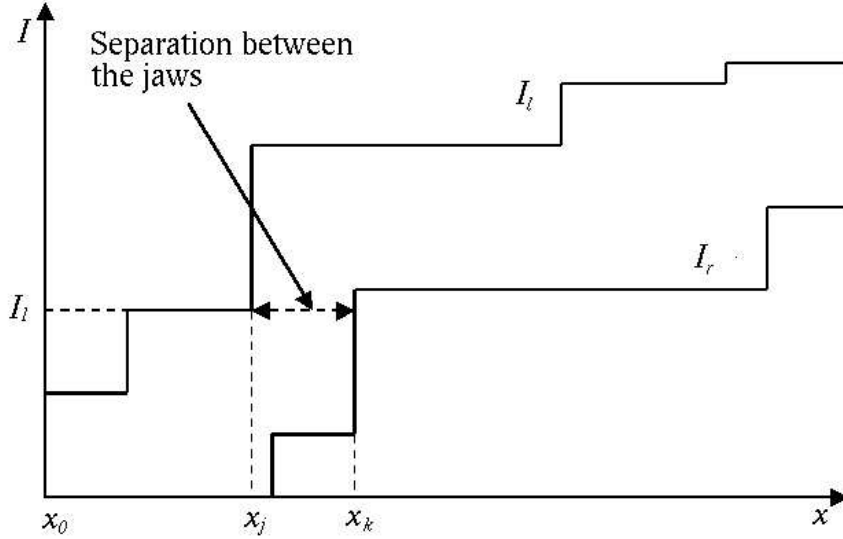


Figure 6. Minimum separation constraint violation

We prove the theorem by contradiction. Let (I_L, I_R) be a plan that does not violate the minimum separation constraint. When $j = 0$, (I_L, I_R) has a violation at the initial positioning x_0 of the left jaw. Since the jaws move in only one direction, the violation is when $I_1 = 0$. When $I_1 = 0$, the left jaw in (I_L, I_R) is also at x_0 (because the left jaw must begin at x_0 in all plans; otherwise $I(x_0) = 0$). For (I_L, I_R) not to have a violation at $I_1 = 0$, the right jaw must begin to the right of x_k , say at some point $p > x_k$ (note that p may not be one of the x_i s). The MUs delivered at x_k by the plan (I_L, I_R) are $I_L(x_k) - I_R(x_k) = I_L(x_k) \geq I_l(x_k)$ (Corollary1). Also, $I_l(x_k) = I(x_k) + I_r(x_k) > I(x_k)$ ($I_r(x_k) > 0$). So (I_L, I_R) delivers more than $I(x_k)$ MUs at x_k and so is not a plan for I . This contradicts the assumption on (I_L, I_R) . Hence, $j \neq 0$.

Suppose that $j > 0$. Now, $I_l(x_j) > I_l(x_{j-1})$. Also, $I_L(x_j) = I_l(x_j) + \Delta(x_j)$ and $I_L(x_{j-1}) = I_l(x_{j-1}) + \Delta(x_{j-1})$. Since $\Delta(x_j) \geq \Delta(x_{j-1})$ (Lemma 2(b)), $I_L(x_j) > I_L(x_{j-1})$. Therefore, the left jaw is positioned at x_j at some time during the on cycle of the plan (I_L, I_R) . Let the amount of MUs delivered when the left jaw arrives at x_j in I_L be I_2 . Let the right jaw be at $x = p$ at this time. Note that p may not be one of the x_i s. If $p > x_k$, then $I_R(x_k) \leq I_2$. Also, from Lemma 2 we have $I_L(x_k) = I_l(x_k) + \Delta(x_k) \geq I_l(x_k) + \Delta(x_{j-1}) = I_l(x_k) + I_2 - I_1 > I_l(x_k) + I_2 - I_r(x_k) = I(x_k) + I_2$. Therefore, $I_L(x_k) - I_R(x_k) > I(x_k)$. This contradicts $I_L(x_k) - I_R(x_k) = I(x_k)$ (since (I_L, I_R) is a plan for I). Therefore, j cannot be > 0 either. So, there is no plan (I_L, I_R) that does not violate the minimum separation constraint. ■

The separation between the jaws is determined by the difference in x values of the jaws when the source has delivered a certain amount of MUs. The minimum separation of the jaws is the minimum separation between the two profiles. We call this minimum separation S_{ud-min} . When the optimal plan obtained using Algorithm SINGLEPAIR is delivered, the minimum separation is $S_{ud-min(opt)}$.

Corollary 2 Let $S_{ud-min(opt)}$ be the minimum jaw separation in the plan (I_l, I_r) . Let S_{ud-min} be the minimum jaw separation in any (not necessarily optimal) given unidirectional plan. $S_{ud-min} \leq S_{ud-min(opt)}$.

2.4. Bi-directional Movement

In this section we study beam delivery when bi-directional movement of jaws is permitted. We explore whether relaxing the unidirectional movement constraint helps improve the efficiency of treatment plan.

2.4.1. Properties of Bi-directional Movement. For a given jaw (left or right) movement profile we classify any x -coordinate as follows. Draw a vertical line at x . If the line cuts the jaw profile exactly once we will call x a *unidirectional point* of that jaw profile. If the line cuts the profile more than once, x is a *bi-directional point* of that profile. A jaw movement profile that has at least one bi-directional point is a *bi-directional profile*. All profiles that are not bi-directional are *unidirectional profiles*. Any profile can be partitioned into segments such that each segment is a unidirectional profile. When the number of such partitions is minimal, each partition is called a *stage* of the original profile. Thus unidirectional profiles consist of exactly one stage while bi-directional profiles always have more than one stage.

In Figure 7, the jaw movement profile, B_l , shows the position of the left jaw as a function of the amount of MUs delivered by the source. The jaw starts from the left edge and moves in both directions during the therapy. Clearly, B_l is bi-directional. The movement profile of this jaw consists of stages S_1, S_2 and S_3 . In stages S_1 and S_3 the jaw moves from left to right while in stage S_2 the jaw moves from right to left. x_j is a bi-directional point of B_l . The amount of MUs delivered at x_j is $L_1 + L_2$. In stage

S_1 , when L_1 amount of MUs have been delivered, the jaw passes x_j . Now, no MU is delivered at x_j till the jaw passes over x_j in S_2 . Further, L_2 MUs are delivered to x_j in stages S_2 and S_3 . Thus we have $I_l(x_j) = L_1 + L_2$. Here, $L_1 = I_1, L_2 = I_3 - I_2$. x_k is a unidirectional point of B_l . The MUs delivered at x_k are $L_3 = I_4$. Note that the intensity profile I_l is different from the jaw movement profile B_l , unlike in the unidirectional case.

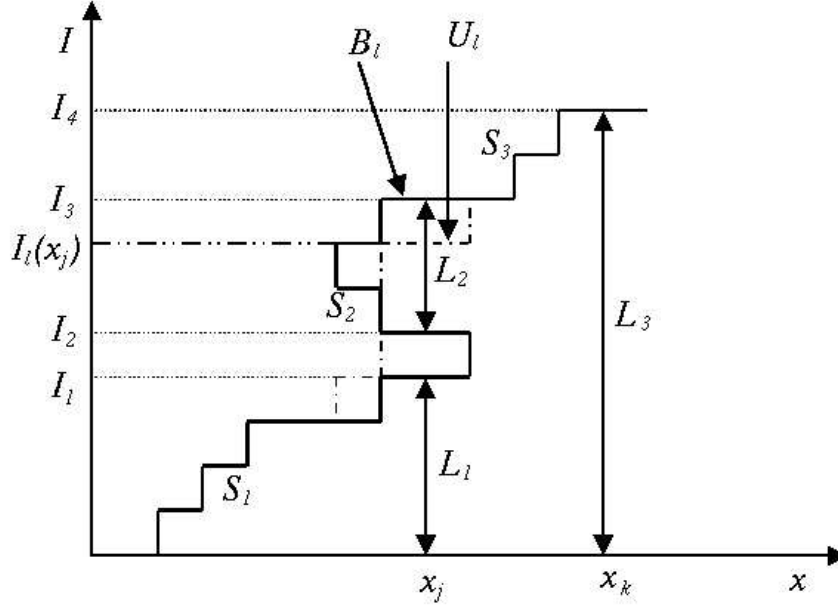


Figure 7. Bi-directional movement

Lemma 3 Let (I_l, I_r) be a plan delivered by the bi-directional jaw movement profile pair (B_l, B_r) (i.e., B_l and B_r are, respectively, the left and right jaw movement profiles)

- (a) I_l is non-decreasing.
- (b) I_r is non-decreasing.

Proof: (a) Whenever a point $x_i, 0 \leq i \leq m$, is blocked by the the left jaw, the points x_0, x_1, \dots, x_{i-1} are also blocked. It follows that $I_l(x_i) \geq I_l(x_j), 0 \leq j \leq i \leq m$.

(b) The proof is similar to (a) ■

From Lemma 3 we note that a bi-directional jaw movement profile B delivers a non-decreasing intensity profile. This non-decreasing intensity profile can also be delivered using a unidirectional jaw movement profile (Section 2.3.1). We will call this profile the *unidirectional jaw movement profile that corresponds to the bi-directional profile B* and we will denote it by U to emphasize that it is unidirectional. Thus every bi-directional jaw movement profile has a corresponding unidirectional jaw profile that delivers the same amount of MUs at each x_i as does the bi-directional profile.

Theorem 3 *The unidirectional treatment plan constructed by Algorithm SINGLEPAIR is optimal in therapy time even when bi-directional jaw movement is permitted.*

Proof: Let B_L and B_R be bidirectional jaw movement profiles that deliver a desired intensity profile I . Let I_L and I_R , respectively, be the intensity profiles for B_L and B_R . From Lemma 3, we know that I_L and I_R are non-decreasing. Also, $I_L(x_i) - I_R(x_i) = I(x_i)$, $1 \leq i \leq m$. From the proof of Theorem 1, it follows that the therapy time for the unidirectional plan (I_L, I_R) generated by Algorithm SINGLEPAIR is no more than that of (I_L, I_R) . ■

2.4.2. Incorporating Minimum Separation Constraint. Let U_l and U_r be unidirectional jaw movement profiles that deliver the desired profile $I(x_i)$. Let B_l and B_r be a set of bi-directional left and right jaw profiles such that U_l and U_r correspond to B_l and B_r respectively, i.e., (B_l, B_r) delivers the same plan as (U_l, U_r) . We call the minimum separation of jaws in this bi-directional plan (B_l, B_r) S_{bd-min} .

Theorem 4 $S_{bd-min} \leq S_{ud-min}$ for a bi-directional jaw movement profile pair and its corresponding unidirectional profile.

Proof: Suppose that the minimum separation S_{ud-min} occurs when I_{ms} MUs are delivered. At this time, the left jaw arrives at x_j and the right jaw is positioned at x_k . Let B'_l and U'_l respectively, be the profiles obtained when B_l and U_l are shifted right by S_{ud-min} . Since U'_l is U_l shifted right by S_{ud-min} and since the distance between U_l and U_r is S_{ud-min} when I_{ms} MUs have been delivered, U'_l and U_r touch when I_{ms} units have been delivered. Therefore, the total MUs delivered by (U'_l, U_r) at x_k is zero. So the total MUs delivered by (B'_l, B_r) at x_k is also zero (recall that U'_l and U_r , respectively, are corresponding profiles for B'_l and B_r). This isn't possible if B_r is always to the right of B'_l (for example, in the situation of Figure 8, the MUs delivered by (B'_l, B_r) at x_k are $(L_1 + L_2) - (L'_1 + L'_2 + L'_3) > 0$). Therefore B'_l and B_r must touch (or cross) at least once. So $S_{bd-min} \leq S_{ud-min}$. ■

Theorem 5 *If the optimal unidirectional plan (I_l, I_r) violates the minimum separation constraint, then there is no bi-directional movement plan that does not violate the minimum separation constraint.*

Proof: Let B_l and B_r be bi-directional jaw movements that deliver the required profile. Let the minimum separation between the jaws be S_{bd-min} . Let the corresponding unidirectional jaw movements be U_l and U_r and let S_{ud-min} be the minimum separation between U_l and U_r . Also, let S_{min} be the minimum allowable separation between the jaws. From Corollary 2 and Theorem 4, we get $S_{bd-min} \leq S_{ud-min} \leq S_{ud-min(opt)} < S_{min}$. ■

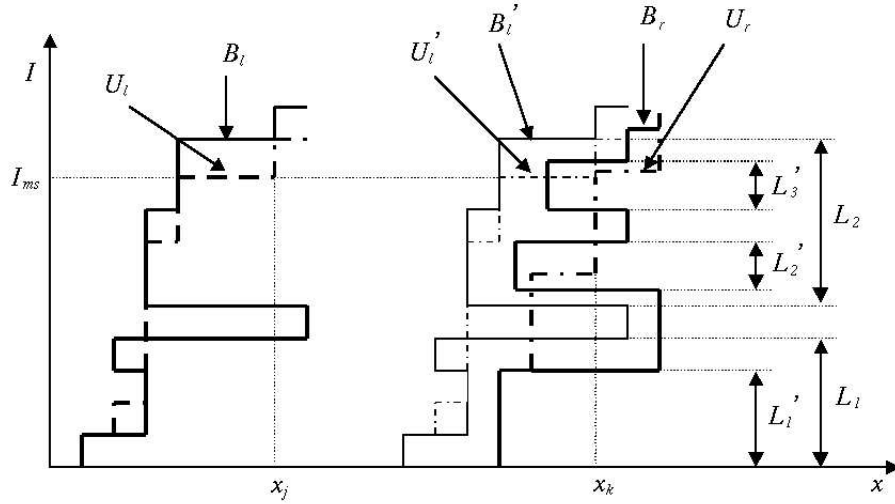


Figure 8. Bi-directional movement under minimum separation constraint

2.4.3. Incorporating Maximum Separation Constraint. Let U_l and U_r be unidirectional jaw movement profiles that deliver the desired profile I . Let S_{ud-max} be the maximum jaw separation using the profiles U_l and U_r and let $S_{ud-max(opt)}$ be the maximum jaw separation for the plan (I_l, I_r) . Let B_l and B_r be a set of bi-directional left and right jaw profiles such that U_l and U_r correspond to B_l and B_r , respectively. Let S_{bd-max} be the maximum separation between the jaws when these bi-directional movement profiles are used.

Theorem 6 $S_{bd-max} \geq S_{ud-max}$ for every bi-directional jaw movement profile and its corresponding unidirectional movement profile.

Proof: Suppose that the maximum separation S_{ud-max} occurs when I_{ms} MUs are delivered. At this time, the left jaw is positioned at x_j and the right jaw arrives at x_k . Let B'_l and U'_l respectively, be the profiles obtained when B_l and U_l are shifted right by S_{ud-max} . Since U'_l is U_l shifted right by S_{ud-max} and since the distance between U_l and U_r is S_{ud-max} when I_{ms} MUs have been delivered, U'_l and U_r touch when I_{ms} units have been delivered. Therefore, the total MUs delivered by (U_r, U'_l) at x_k is zero. So the total MUs delivered by (B_r, B'_l) at x_k is also zero (recall that U'_l and U_r , respectively, are corresponding profiles for B'_l and B_r). This isn't possible if B_r is always to the left of B'_l (for example, in the situation of Figure 9, the MUs delivered by (B_r, B'_l) at x_k are $(L'_1 + L'_2 + L'_3) - (L_1 + L_2) > 0$). Therefore B'_l and B_r must touch (or cross) at least once. So $S_{bd-max} \geq S_{ud-max}$. ■

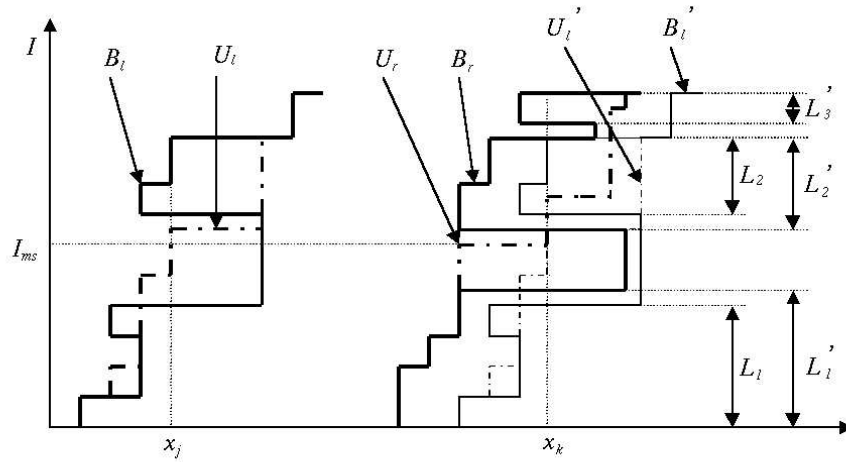


Figure 9. Bi-directional movement under maximum separation constraint

2.5. Optimal Jaw Movement Algorithm Under Maximum Separation Constraint Condition

In this section we present an algorithm that generates an optimal treatment plan under the maximum separation constraint. Recall that Algorithm SINGLEPAIR generates the optimal plan without considering this constraint. We modify Algorithm SINGLEPAIR so that all instances of violation of maximum separation (that may possibly exist) are eliminated. We know that bi-directional jaw profiles do not help eliminate the constraint. So we consider only unidirectional profiles.

2.5.1. Algorithm. The algorithm is described in Figure 10.

Theorem 7 *Algorithm MAXSEPARATION obtains plans that are optimal in therapy time, under the maximum separation constraint.*

Proof: We use induction to prove the theorem.

The statement we prove, $S(n)$, is the following:

After Step 3 of the algorithm is applied n times, the resulting plan, (I_{ln}, I_{rn}) , satisfies

- (a) It has no maximum separation violation when $I < I_2(n)$ MUs are delivered, where $I_2(n)$ is the value of I_2 during the n th iteration of Algorithm MAXSEPARATION.
- (b) For plans that satisfy (a), (I_{ln}, I_{rn}) is optimal in therapy time.

(i) Consider the base case, $n = 1$.

Let (I_l, I_r) be the plan generated by Algorithm SINGLEPAIR. After Step 3 is applied once, the resulting plan (I_{l1}, I_{r1}) meets the requirement that there is no maximum separation violation when $I < I_2(1)$ MUs are delivered by the radiation

Algorithm MAXSEPARATION

- (i) Apply Algorithm SINGLEPAIR to obtain the optimal plan (I_l, I_r) .
- (ii) Find the least value of intensity, I_1 , such that the jaw separation in (I_l, I_r) when I_1 MUs are delivered is $> S_{max}$, where S_{max} is the maximum allowed separation between the jaws. If there is no such I_1 , (I_l, I_r) is the optimal plan; end.
- (iii) Let x_j and x_k , respectively, be the position of the left and right jaws at this time (see Figure 11). Relocate the right jaw at x'_k such that $x'_k - x_j = S_{max}$, when I_1 MUs are delivered. Let $\Delta I = I_l(x_j) - I_1 = I_2 - I_1$. Move the profile of I_r , which follows x'_k , up by ΔI along I direction. To maintain $I(x) = I_l(x) - I_r(x)$ for every x , move the profile of I_l , which follows x'_k , up by ΔI along I direction. Goto Step 2.

Figure 10. Obtaining a plan under maximum separation constraint

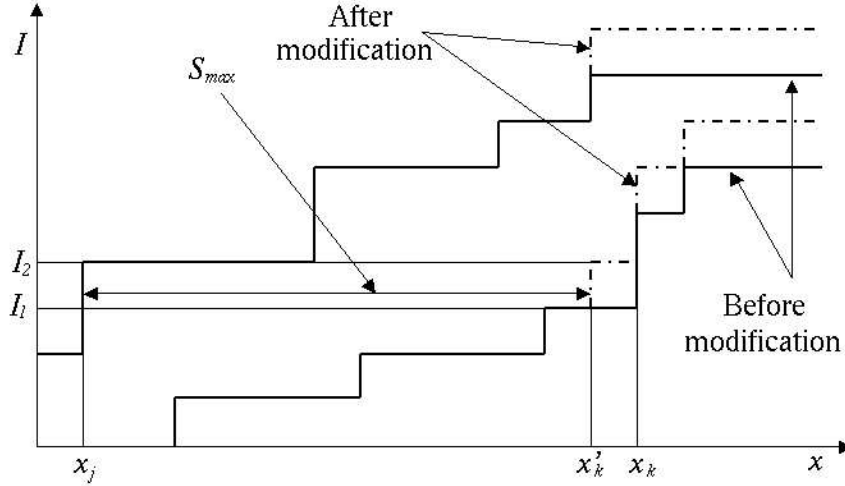


Figure 11. Maximum separation constraint violation

source. The therapy time increases by ΔI , i.e., $TT(I_{l1}, I_{r1}) = TT(I_l, I_r) + \Delta I$.

Assume that there is another plan, (I'_{l1}, I'_{r1}) , which satisfies condition (a) of $S(1)$ and $TT(I'_{l1}, I'_{r1}) < TT(I_{l1}, I_{r1})$. We show this assumption leads to a contradiction and so there is no such plan (I'_{l1}, I'_{r1}) .

Let x_j , x_k and x'_k be as in Algorithm MAXSEPARATION. We consider three cases for the relationship between $I'_{l1}(x_j)$ and $I_{l1}(x_j)$.

- (a) $I'_{l1}(x_j) = I_{l1}(x_j) = I_2(1)$

Since there is no maximum separation violation when $I < I_2(1)$ MUs are delivered, $I'_{r1}(x'_k) \geq I'_{l1}(x_j) = I_{l1}(x_j) = I_{r1}(x'_k)$. Since $I(x'_k) = I'_{l1}(x'_k) - I'_{r1}(x'_k) = I_{l1}(x'_k) - I_{r1}(x'_k)$, we have $I'_{l1}(x'_k) \geq I_{l1}(x'_k)$. We now construct a plan (I''_{l1}, I''_{r1}) as follows:

$$I''_{l1}(x) = \begin{cases} I_l(x) & 0 \leq x < x'_k \\ I'_{l1}(x) - \Delta I & x \geq x'_k \end{cases}$$

$$I''_{r1}(x) = \begin{cases} I_r(x) & 0 \leq x < x'_k \\ I'_{r1}(x) - \Delta I & x \geq x'_k \end{cases}$$

Clearly $I''_{l1}(x) - I''_{r1}(x) = I(x), 0 \leq x \leq x_m$. Also, I''_{l1} is non-decreasing ($I''_{l1}(x'_k) = I'_{l1}(x'_k) - \Delta I \geq I_{l1}(x'_k) - \Delta I = I_l(x'_k) \geq I_l(x_{k-1}) = I''_{l1}(x_{k-1})$). Similarly I''_{r1} is non-decreasing. So (I''_{l1}, I''_{r1}) is a plan for $I(x_i)$.

Also, $TT(I''_{l1}, I''_{r1}) = TT(I'_{l1}, I'_{r1}) - \Delta I < TT(I_{l1}, I_{r1}) - \Delta I = TT(I_l, I_r)$.

This contradicts our knowledge that (I_l, I_r) is the optimal unconstrained plan.

(b) $I''_{l1}(x_j) > I_{l1}(x_j)$

This leads to a contradiction as in the previous case.

(c) $I'_{l1}(x_j) < I_{l1}(x_j)$

In this case, $I'_{l1}(x_j) < I_{l1}(x_j) = I_l(x_j)$. This violates Corollary 1. So this case cannot arise.

Therefore $S(1)$ is true.

(ii) Induction step

Assume $S(n)$ is true. If there are no more maximum separation violations in the resulting plan, (I_{ln}, I_{rn}) , then it is the optimal plan. If there are more violations, we find the next violation. Apply Step 3 of the algorithm to get a new plan. Assume that there is another plan, which costs less time than the plan generated by Algorithm MAXSEPARATION. We consider three cases as in the base case and show by contradiction that there is no such plan. Therefore $S(n+1)$ is true whenever $S(n)$ is true.

Since the number of iterations of Steps 2 and 3 of the algorithm is finite (at most one iteration can occur when the left jaw is at $x_i, 0 \leq i \leq m$), all maximum separation violations will eventually be eliminated. ■

Note that the minimum jaw separation of the plan constructed by Algorithm MAXSEPARATION is $\min\{S_{ud-\min(opt)}, S_{max}\}$. From Theorem 7, it follows that Algorithm MAXSEPARATION constructs an optimal plan that satisfies both the minimum and maximum separation constraints provided that $S_{ud-\min(opt)} \geq S_{min}$. Note that when $S_{ud-\min(opt)} < S_{min}$, there is no plan that satisfies the minimum separation constraint.

2.6. Generation of Optimal Jaw Movement Under Inter-Pair Minimum Separation Constraint

2.6.1. Introduction. We use a single pair of jaws to deliver intensity profiles defined along the axis of the pair of jaws. However, in a real application, we need to deliver

intensity profiles defined over a 2-D region. We use Multi-Leaf Collimators (MLCs) to deliver such profiles. An MLC is composed of multiple pairs of jaws with parallel axes. Figure 12 shows an MLC that has three pairs of jaws - $(L1, R1)$, $(L2, R2)$ and $(L3, R3)$. $L1, L2, L3$ are left jaws and $R1, R2, R3$ are right jaws. Each pair of jaws is controlled independently. If there are no constraints on the leaf movements, we divide the desired profile into a set of parallel profiles defined along the axes of the jaw pairs. Each jaw pair i then delivers the plan for the corresponding intensity profile $I_i(x)$. The set of plans of all jaw pairs forms the solution set. We refer to this set as the *treatment schedule* (or simply *schedule*).

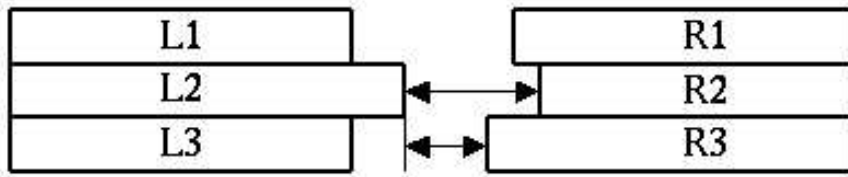


Figure 12. Inter-pair minimum separation constraint

In practical situations, however, there are some constraints on the movement of the jaws. As we have seen in Section 2.3.3, the minimum separation constraint requires that opposing pairs of jaws be separated by at least some distance (S_{min}) at all times during beam delivery. In MLCs this constraint is applied not only to opposing pairs of jaws, but also to opposing jaws of neighboring pairs. For example, in Figure 12, $L1$ and $R1$, $L2$ and $R2$, $L3$ and $R3$, $L1$ and $R2$, $L2$ and $R1$, $L2$ and $R3$, $L3$ and $R2$ are pairwise subject to the constraint. We use the term *intra-pair minimum separation constraint* to refer to the constraint imposed on an opposing pair of jaws and *inter-pair minimum separation constraint* to refer to the constraint imposed on opposing jaws of neighboring pairs. Recall that, in Section 2.3.3, we proved that for a single pair of jaws, if the optimal plan does not satisfy the minimum separation constraint, then no plan satisfies the constraint. In this section we present an algorithm to generate the optimal schedule for the desired profile defined over a 2-D region. We then modify the algorithm to generate schedules that satisfy the inter-pair minimum separation constraint.

2.6.2. Optimal Schedule Without The Minimum Separation Constraint. Assume we have n pairs of jaws. For each pair, we have m sample points. The input is represented as a matrix with n rows and m columns, where the i th row represents the desired intensity profile to be delivered by the i th pair of jaws. We apply Algorithm SINGLEPAIR to determine the optimal plan for each of the n jaw pairs. This method of generating schedules is described in Algorithm MULTIPAIR (Figure 13).

Lemma 4 *Algorithm MULTIPAIR generates schedules that are optimal in therapy time.*

Algorithm MULTIPAIR

For($i = 1; i \leq n; i++$)

Apply Algorithm SINGLEPAIR to the i th pair of jaws to obtain plan (I_{il}, I_{ir}) that delivers the intensity profile $I_i(x)$.

End For

Figure 13. Obtaining a schedule

Proof: Treatment is completed when all jaw pairs (which are independent) deliver their respective plans. The therapy time of the schedule generated by Algorithm MULTIPAIR is $\max\{TT(I_{1l}, I_{1r}), TT(I_{2l}, I_{2r}), \dots, TT(I_{nl}, I_{nr})\}$. From Theorem 1, it follows that this therapy time is optimal. ■

2.6.3. Optimal Algorithm With Inter-Pair Minimum Separation Constraint. The schedule generated by Algorithm MULTIPAIR may violate both the intra- and inter-pair minimum separation constraints. If the schedule has no violations of these constraints, it is the desired optimal schedule. If there is a violation of the intra-pair constraint, then it follows from Theorem 2 that there is no schedule that is free of constraint violation. So, assume that only the inter-pair constraint is violated. We eliminate all violations of the inter-pair constraint starting from the left end, i.e., from x_0 . To eliminate the violations, we modify those plans of the schedule that cause the violations. We scan the schedule from x_0 along the positive x direction looking for the least x_v at which is positioned a right jaw (say Ru) that violates the inter-pair separation constraint. After rectifying the violation at x_v with respect to Ru we look for other violations. Since the process of eliminating a violation at x_v , may at times, lead to new violations at $x_j, x_j < x_v$, we need to retract a certain distance (we will show that this distance is S_{min}) to the left, every time a modification is made to the schedule. We now restart the scanning and modification process from the new position. The process continues until no inter-pair violations exist. Algorithm MINSEPARATION (Figure 14) outlines the procedure.

Let $M = ((I_{1l}, I_{1r}), (I_{2l}, I_{2r}), \dots, (I_{nl}, I_{nr}))$ be the schedule generated by Algorithm MULTIPAIR for the desired intensity profile.

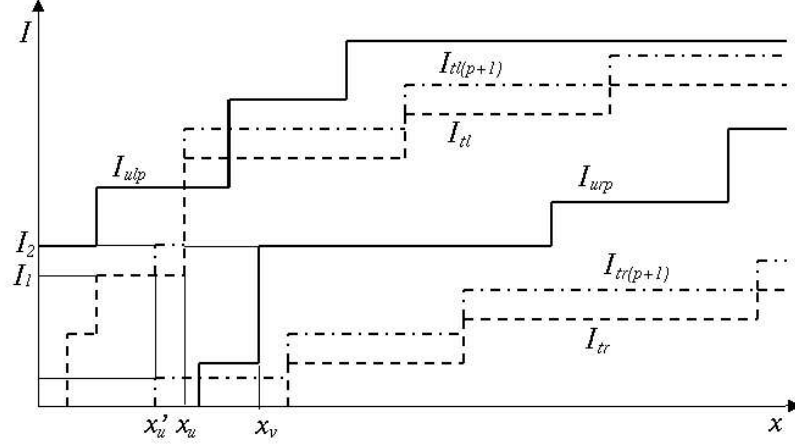
Let $N(p) = ((I_{1lp}, I_{1rp}), (I_{2lp}, I_{2rp}), \dots, (I_{nlp}, I_{nrp}))$ be the schedule obtained after Step iv of Algorithm MINSEPARATION is applied p times to the input schedule M . Note that $M = N(0)$.

To illustrate the modification process we use an example (see Figure 15). To make things easier, we only show two neighboring pairs of jaws. Suppose that the $(p+1)$ th violation occurs when the right jaw of pair u is positioned at x_v and the left jaw of pair $t, t \in \{u-1, u+1\}$, arrives at $x_u, x_v - x_u < S_{min}$. Let $x'_u = x_v - S_{min}$. To remove this inter-pair separation violation, we modify (I_{tlp}, I_{trp}) . The other profiles of $N(p)$ are not

Algorithm MINSEPARATION

//assume no intra-pair violations exist

- (i) $x = x_0$
- (ii) While (there is an inter-pair violation) do
- (iii) Find the least x_v , $x_v \geq x$, such that a right jaw is positioned at x_v and this right jaw has an inter-pair separation violation with one or both of its neighboring left jaws. Let u be the least integer such that the right jaw Ru is positioned at x_v and Ru has an inter-pair separation violation. Let Lt denote the left jaw (or one of the left jaws) with which Ru has an inter-pair violation. Note that $t \in \{u - 1, u + 1\}$.
- (iv) Modify the schedule to eliminate the violation between Ru and Lt .
- (v) If there is now an intra-pair separation violation between Rt and Lt , no feasible schedule exists, terminate.
- (vi) $x = x_v - S_{min}$
- (vii) End While

Figure 14. Obtaining a schedule under the constraint

Figure 15. Eliminating a violation

modified. The new I_{tlp} (i.e., $I_{tl(p+1)}$) is as defined below.

$$I_{tl(p+1)}(x) = \begin{cases} I_{tlp}(x) & x_0 \leq x < x'_u \\ \max\{I_{tlp}(x), I_{tl}(x) + \Delta I\} & x'_u \leq x \leq x_m \end{cases}$$

where $\Delta I = I_{urp}(x_v) - I_{tl}(x'_u) = I_2 - I_1$. $I_{tr(p+1)}(x) = I_{tl(p+1)}(x) - I_t(x)$, where $I_t(x)$ is the target profile to be delivered by the jaw pair t . Since $I_{tr(p+1)}$ (potentially) differs from I_{trp} for $x \geq x'_u = x_v - S_{min}$ there is a possibility that $N(p+1)$ has inter-pair separation violations for right jaw positions $x \geq x'_u = x_v - S_{min}$. Since none of the other

right jaw profiles are changed from those of $N(p)$ and since the change in I_{tl} only delays the rightward movement of the left jaw of pair t , no inter-pair violations are possible in $N(p+1)$ for $x < x'_u = x_v - S_{min}$. One may also verify that since I_{tl0} and I_{tr0} are non-decreasing functions of x , so also are I_{tlp} and I_{trp} , $p > 0$.

Lemma 5 *Let $F = ((I'_{1l}, I'_{1r}), (I'_{2l}, I'_{2r}), \dots, (I'_{nl}, I'_{nr}))$ be any feasible schedule for the desired profile, i.e., a schedule that does not violate the intra- or inter-pair minimum separation constraints. Let $S(p)$, be the following assertions.*

- (a) $I'_{il}(x) \geq I_{ilp}(x)$, $0 \leq i \leq n, x_0 \leq x \leq x_m$
- (b) $I'_{ir}(x) \geq I_{irp}(x)$, $0 \leq i \leq n, x_0 \leq x \leq x_m$

$S(p)$ is true for $p \geq 0$.

Proof: The proof is by induction on p .

- (i) Consider the base case, $p = 0$. From Corollary 1 and the fact that the plans $(I_{il0}, I_{ir0}), 0 \leq i \leq n$, are generated using Algorithm SINGLEPAIR, it follows that $S(0)$ is true.
- (ii) Assume $S(p)$ is true. Suppose Algorithm MINSEPARATION finds a next violation and modifies the schedule $N(p)$ to $N(p+1)$. Suppose that the next violation occurs when the right jaw of pair u is positioned at x_v and the left jaw of pair t arrives at $x_u, x_v - x_u < S_{min}$ (see Figure 15). Let $x'_u = x_v - S_{min}$. We modify pair t 's plan for $x'_u \leq x \leq x_m$, to eliminate the violation. All other plans in the schedule remain unaltered. Therefore, to establish $S(p+1)$ it suffices to prove that

$$I'_{tl}(x) \geq I_{tl(p+1)}(x), x'_u \leq x \leq x_m \quad (2)$$

$$I'_{tr}(x) \geq I_{tr(p+1)}(x), x'_u \leq x \leq x_m \quad (3)$$

We need prove only one of these two relationships since $I'_{tl}(x) - I'_{tr}(x) = I_{tl(p+1)}(x) - I_{tr(p+1)}(x), x_0 \leq x \leq x_m$. We now consider pair t 's plan for $x'_u \leq x \leq x_m$. We analyze three cases, that are exhaustive, and show that Equation 2 is true for each. This, in turn, implies that $S(p+1)$ is true whenever $S(p)$ is true and hence completes the proof.

- (a) No modification (relative to $M = N(0)$) has been made to pair t 's plan for $x \geq x'_u$ prior to this. In this case, $I_{tlp}(x) = I_{tl0}(x) = I_{tl}(x), x \geq x'_u$.

The situation is illustrated in Figure 15.

Since there is no minimum separation violation in F , the left jaw of pair t passes x'_u only after the right jaw of pair u passes x_v , i.e.,

$$I'_{tl}(x'_u) \geq I'_{ur}(x_v) \quad (4)$$

Since $S(p)$ is true,

$$I'_{ur}(x_v) \geq I_{urp}(x_v) = I_{tl(p+1)}(x'_u) \quad (5)$$

From Equations 4 and 5,

$$I'_{tl}(x'_u) \geq I_{tl(p+1)}(x'_u) \quad (6)$$

Adding and subtracting $I'_{tl}(x'_u)$ to $I'_{tl}(x)$,

$$I'_{tl}(x) = I'_{tl}(x'_u) + I'_{tl}(x) - I'_{tl}(x'_u), 0 \leq x \leq x_m \quad (7)$$

Similarly,

$$I_{tl(p+1)}(x) = I_{tl(p+1)}(x'_u) + I_{tl(p+1)}(x) - I_{tl(p+1)}(x'_u), 0 \leq x \leq x_m \quad (8)$$

Since $I_{tlp}(x) = I_{tl}(x), x \geq x'_u$,

$$I_{tl(p+1)}(x) = I_{tl}(x) + \Delta I, x'_u \leq x \leq x_m \quad (9)$$

From Equations 8 and 9, we get

$$\begin{aligned} I_{tl(p+1)}(x) &= I_{tl(p+1)}(x'_u) + (I_{tl}(x) + \Delta I) \\ &\quad - (I_{tl}(x'_u) + \Delta I), x'_u \leq x \leq x_m \\ &= I_{tl(p+1)}(x'_u) + I_{tl}(x) - I_{tl}(x'_u), x'_u \leq x \leq x_m \end{aligned} \quad (10)$$

Subtracting Equation 10 from Equation 7,

$$\begin{aligned} I'_{tl}(x) - I_{tl(p+1)}(x) &= (I'_{tl}(x'_u) - I_{tl(p+1)}(x'_u)) + (I'_{tl}(x) - I_{tl}(x)) \\ &\quad - (I'_{tl}(x'_u) - I_{tl}(x'_u)), x'_u \leq x \leq x_m \end{aligned} \quad (11)$$

From Equations 6 and 11,

$$\begin{aligned} I'_{tl}(x) - I_{tl(p+1)}(x) &\geq (I'_{tl}(x) - I_{tl}(x)) \\ &\quad - (I'_{tl}(x'_u) - I_{tl}(x'_u)), x'_u \leq x \leq x_m \end{aligned} \quad (12)$$

From Lemma 2b,

$$I'_{tl}(x) - I_{tl}(x) \geq I'_{tl}(x'_u) - I_{tl}(x'_u), x'_u \leq x \leq x_m \quad (13)$$

From Equations 12 and 13, we get

$$I'_{tl}(x) \geq I_{tl(p+1)}(x), x'_u \leq x \leq x_m \quad (14)$$

- (b) Some prior modification has been made to pair t 's plan for $x \geq x'_u$. There exists a modification at x_w such that $I_{tlp}(x) > I_{tl}(x) + \Delta I, x_w \leq x \leq x_m$, and there is no $x < x_w$ that satisfies this condition. Note that $I_{tlp}(x'_u) \leq$ amount of MUs delivered when profile $I_{tlp}(x)$ arrives at x_u (since $I_{tlp}(x)$ is a non-decreasing function of x) $< I_{urp}(x_v)$ (since there is a minimum separation violation when profile $I_{urp}(x)$ is at x_v). Therefore, $I_{tlp}(x'_u) < I_{tl}(x'_u) + I_{urp}(x_v) - I_{tl}(x'_u) = I_{tl}(x'_u) + \Delta I$. So, $x_w > x'_u$.

In this case (see Figure 16),

$$I_{tl(p+1)}(x) = \begin{cases} I_{tl}(x) + \Delta I & x'_u \leq x_j < x_w \\ I_{tlp}(x) & x_w \leq x \leq x_m \end{cases}$$

Note that, in the example of Figure 16, a prior modification was made to pair t 's plan for $x \geq x_q$. However, $I_{tlp}(x) < I_{tl}(x) + \Delta I, x_q \leq x < x_w$.

We get $I'_{tl}(x) \geq I_{tl(p+1)}(x), x'_u \leq x_j < x_w$, for reasons similar to those in the previous case. Also, $I'_{tl}(x) \geq I_{tl(p+1)}(x) = I_{tlp}(x), x_w \leq x \leq x_m$, since $S(p)$ is true. It follows that $I'_{tl}(x) \geq I_{tl(p+1)}(x), x'_u \leq x \leq x_m$.

- (c) Some prior modification has been made to pair t 's plan for $x \geq x'_u$. However, $I_{tlp}(x) \leq I_{tl}(x) + \Delta I, x'_u \leq x \leq x_m$.

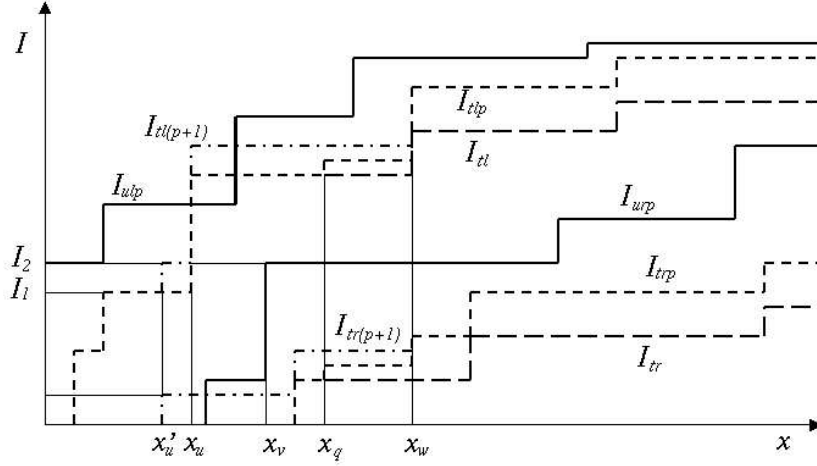


Figure 16. Eliminating a violation

In this case, $I_{tl(p+1)}(x) = I_{tl}(x) + \Delta I, x'_u \leq x \leq x_m$. This is similar to the first case. ■

Lemma 6 *If an intra-pair minimum separation violation is detected in Step v of MINSEPARATION, then there is no feasible schedule for the desired profile.*

Proof: Suppose that there is a feasible schedule F and that jaw pair t has an intra-pair minimum separation violation in $N(p), p > 0$. From Lemma 5 it follows that

- (a) $I'_l(x) \geq I_{tlp}(x), x_0 \leq x \leq x_m$
- (b) $I'_{tr}(x) \geq I_{trp}(x), x_0 \leq x \leq x_m$

where I' and I are as in Lemma 5. However, from the proof of Theorem 2 it follows that if I_{tlp} and I_{trp} have a minimum separation violation, then no treatment plan (I'_{tl}, I'_{tr}) that satisfies (a) and (b) can be feasible. Therefore, no feasible schedule F exists. ■

Example 1 *We illustrate an instance where an inter-pair minimum separation violation is detected in Step v of MINSEPARATION. Figure 17 shows two intensity profiles, to be delivered by adjacent jaw pairs (say t and $t + 1$). The plans for $I_t(x)$ and $I_{t+1}(x)$ are obtained using algorithm MULTIPAIR. They are shown in Figure 18. Each of these plans $((I_{tl}(x), I_{tr}(x)))$ and $((I_{(t+1)l}(x), I_{(t+1)r}(x)))$ is feasible, i.e., there is no intra-pair minimum separation ($S_{min} = 7$). However, when MINSEPARATION is applied (for simplicity consider jaw pairs t and $t + 1$ in isolation), it detects an inter-pair minimum separation violation between $I_{(t+1)l}$ and I_{tr} , when $I_{(t+1)l}$ arrives at $x = 6$ and I_{tr} is positioned at $x = 11$. To eliminate this violation, $I_{(t+1)l}$ is positioned at $x = 4$ (since $11 - 4 = 7 = S_{min}$) and its profile is raised from $x = 4$. Consequently $I_{(t+1)r}$ is also raised from $x = 4$ resulting in the plan $(I_{(t+1)l1}(x), I_{(t+1)r1}(x))$. This modification results*

in an intra-pair violation for pair $t + 1$, when $I_{(t+1)l1}$ is at $x = 1$ and $I_{(t+1)r1}$ is at $x = 4$. From Lemma 6, there is no feasible schedule.

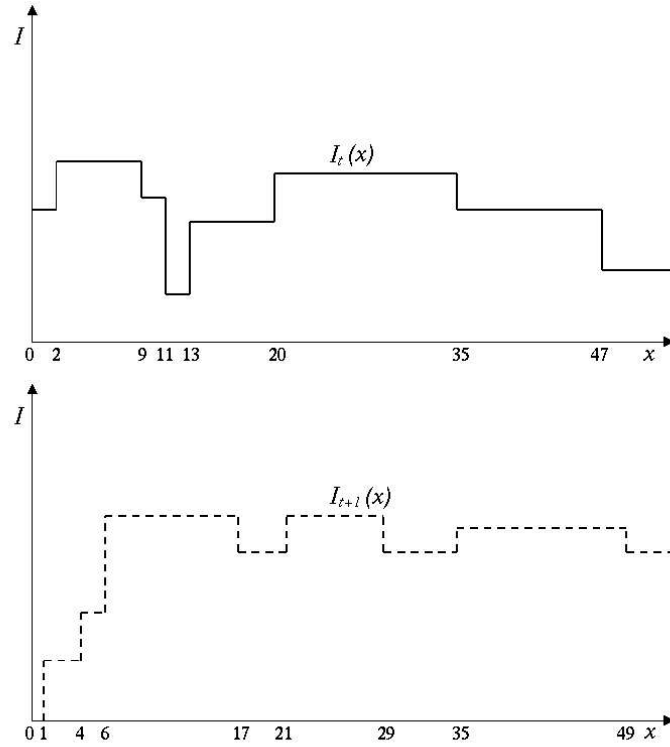


Figure 17. Intensity profiles of adjacent leaf pairs

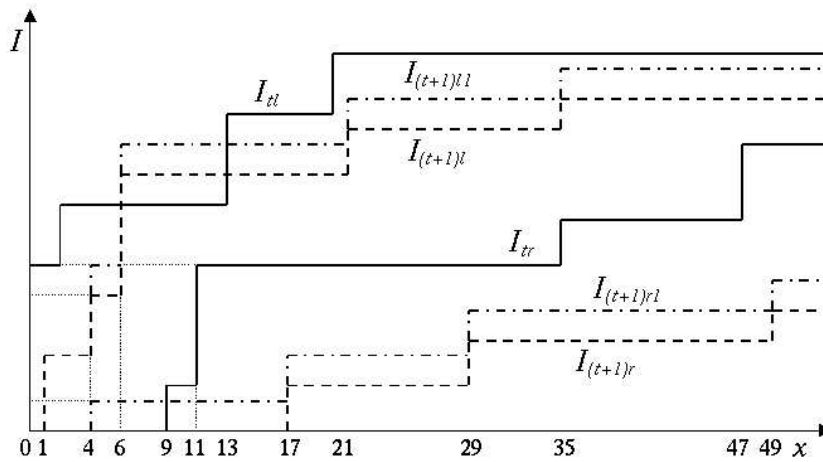


Figure 18. Profiles violating inter-pair constraint

For $N(p), p \geq 0$ and every jaw pair $j, 1 \leq j \leq n$, define $I_{jlp}(x_{-1}) = I_{jrp}(x_{-1}) =$

$0, \Delta_{jlp}(x_i) = I_{lp}(x_i) - I_{lp}(x_{i-1}), 0 \leq i \leq m$ and $\Delta_{jrp}(x_i) = I_{rp}(x_i) - I_{rp}(x_{i-1}), 0 \leq i \leq m$. Notice that $\Delta_{jlp}(x_i)$ gives the time (in monitor units) for which the left jaw of pair j stops at position x_i . Let $\Delta_{jlp}(x_i)$ and $\Delta_{jrp}(x_i)$ be zero for all x_i when $j = 0$ as well as when $j = n + 1$.

Lemma 7 For every $j, 1 \leq j \leq n$ and every $i, 1 \leq i \leq m$,

$$\Delta_{jlp}(x_i) \leq \max\{\Delta_{jlo}(x_i), \Delta_{(j-1)rp}(x_i + S_{min}), \Delta_{(j+1)rp}(x_i + S_{min})\} \quad (15)$$

Proof: The proof is by induction on p . For the induction base, $p = 0$. Putting $p = 0$ into the right side of Equation 15, we get

$$\max\{\Delta_{jlo}(x_i), \Delta_{(j-1)r0}(x_i + S_{min}), \Delta_{(j+1)r0}(x_i + S_{min})\} \geq \Delta_{jlo}(x_i) \quad (16)$$

For the induction hypothesis, let $q \geq 0$ be any integer and assume that Equation 15 holds when $p = q$. In the induction step, we prove that the equation holds when $p = q + 1$. Let t, u , and x_v be as in iteration $p - 1$ of the **while** loop of algorithm MINSEPARATION. Following this iteration, only Δ_{tlp} and Δ_{trp} are different from $\Delta_{tl(p-1)}$ and $\Delta_{tr(p-1)}$, respectively. Furthermore, only $\Delta_{tlp}(x_w)$ and $\Delta_{trp}(x_w)$, where $x_w = x_v - S_{min}$ may be larger than the corresponding values following iteration $p - 1$. At all but at most one other x value (where Δ may have decreased), Δ_{tlp} and Δ_{trp} are the same as the corresponding values following iteration $p - 1$.

Since x_v is the right jaw position for the leftmost violation, the left jaw of pair t arrives at $x_w = x_v - S_{min}$ after the right jaw of pair u arrives at $x_v = x_w + S_{min}$. Following the modification made to $I_{tl(p-1)}$, the left jaw of pair t leaves x_w at the same time as the right jaw of pair u leaves $x_w + S_{min}$. Therefore, $\Delta_{tlp}(x_w) \leq \Delta_{ur(p-1)}(x_w + S_{min}) = \Delta_{urp}(x_w + S_{min})$.

The induction step now follows from the induction hypothesis and the observation that $u \in \{t - 1, t + 1\}$. ■

Lemma 8 For every $j, 1 \leq j \leq n$ and every $i, 1 \leq i \leq m$,

$$\Delta_{jrp}(x_i) = \Delta_{jlp}(x_i) - (I_j(x_i) - I_j(x_{i-1})) \quad (17)$$

where $I_j(x_{-1}) = 0$.

Proof: We examine $N(p)$. The monitor units delivered by jaw pair j at x_i are $I_{jlp}(x_i) - I_{jrp}(x_i)$ and the units delivered at x_{i-1} are $I_{jlp}(x_{i-1}) - I_{jrp}(x_{i-1})$. Therefore,

$$I_j(x_i) = I_{jlp}(x_i) - I_{jrp}(x_i) \quad (18)$$

$$I_j(x_{i-1}) = I_{jlp}(x_{i-1}) - I_{jrp}(x_{i-1}) \quad (19)$$

Subtracting Equation 19 from Equation 18, we get

$$\begin{aligned} I_j(x_i) - I_j(x_{i-1}) &= (I_{jlp}(x_i) - I_{jlp}(x_{i-1})) - (I_{jrp}(x_i) - I_{jrp}(x_{i-1})) \\ &= \Delta_{jlp}(x_i) - \Delta_{jrp}(x_i) \end{aligned} \quad (20)$$

The lemma follows from this equality. ■

Notice that once a right jaw u moves past x_m , no separation violation with respect to this jaw is possible. Therefore, x_v (see algorithm MINSEPARATION) $\leq x_m$. Hence, $\Delta_{jlp}(x_i) \leq \Delta_{jl0}(x_i)$, and $\Delta_{jrp}(x_i) \leq \Delta_{jr0}(x_i)$, $x_m - S_{min} \leq x_i \leq x_m$, $1 \leq j \leq n$. Starting with these upper bounds, which are independent of p , on $\Delta_{jrp}(x_i)$, $x_m - S_{min} \leq x_i \leq x_m$ and using Equations 15 and 17, we can compute an upper bound on the remaining $\Delta_{jlp}(x_i)$ s and $\Delta_{jrp}(x_i)$ s (from right to left). The remaining upper bounds are also independent of p . Let the computed upper bound on $\Delta_{jlp}(x_i)$ be $U_{jl}(x_i)$. It follows that the therapy time for (I_{jlp}, I_{jrp}) is at most $T_{max}(j) = \sum_{0 \leq i \leq m} U_{jl}(x_i)$. Therefore, the therapy time for $N(p)$ is at most $T_{max} = \max_{1 \leq j \leq n} \{T_{max}(j)\}$.

Theorem 8 *The following are true of Algorithm MINSEPARATION:*

- (a) *The algorithm terminates.*
- (b) *When the algorithm terminates in Step v, there is no feasible schedule.*
- (c) *Otherwise, the schedule generated is feasible and is optimal in therapy time.*

Proof: (a) As noted above, Lemmas 7 and 8 provide an upper bound, T_{max} on the therapy time of any schedule produced by algorithm MINSEPARATION. It is easy to verify that

$$\begin{aligned} I_{il(p+1)}(x) &\geq I_{ilp}(x), 0 \leq i \leq n, x_0 \leq x \leq x_m \\ I_{ir(p+1)}(x) &\geq I_{irp}(x), 0 \leq i \leq n, x_0 \leq x \leq x_m \end{aligned}$$

and that

$$\begin{aligned} I_{tl(p+1)}(x'_u) &> I_{tlp}(x'_u) \\ I_{tr(p+1)}(x'_u) &> I_{trp}(x'_u) \end{aligned}$$

Notice that even though a Δ value (proof of Lemma 7) may decrease at an x_i , the I_{ilp} and I_{irp} values never decrease at any x_i as we go from one iteration of the while loop of MINSEPARATION to the next. Since I_{tl} increases by at least one unit at at least one x_i on each iteration, it follows that the while loop can be iterated at most mnT_{max} times.

- (b) Follows from Lemma 6.
- (c) If termination does not occur in Step v, then no minimum separation violations remain and the final schedule is feasible. From Lemma 5, it follows that the final schedule is optimal in therapy time. ■

Corollary 3 *When $S_{min} = 0$, Algorithm Minseparation always generates an optimal feasible schedule.*

Proof: When $S_{min} = 0$, Algorithm Minseparation cannot terminate in Step v because the Step iv modification never causes the left jaw of a jaw pair to cross the right jaw of that pair. The Corollary follows now from Theorem 8. ■

3. Conclusion

In conclusion, we present mathematical formalisms and rigorous proofs of leaf sequencing algorithms for segmental multileaf collimation. These leaf sequencing algorithms explicitly account for intra-pair maximum separation constraint. We have shown that our algorithms obtain all feasible solutions that are optimal in treatment delivery time. Furthermore, our analysis shows that unidirectional leaf movement is at least as efficient as bi-directional movement. Thus these algorithms are well suited for common use in SMLC beam delivery. It should however be noted that some commercial MLC systems have other delivery constraints such as the two leaf banks cannot interdigitate. Our current algorithms do not take that into account. Moreover, the tongue and groove effect, which is an inherent characteristic of all commercial MLC systems, is also not considered in our algorithms at this time. It should be noted that the leaf sequencing algorithms reported in the literature and commonly used with the commercial treatment delivery equipment have ignored leaf movement constraints, with the exception of the maximum leaf speed constraint for dynamic delivery. The natural progression of our work is to first develop algorithms that explicitly account for interbank leaf interdigitations and then extend it to true dynamic multileaf collimator delivery, with the leaves in motion during radiation delivery. For example, algorithms those are applicable to the *sliding window* technique in which opposing pair of leaves traverses across the tumor while the beam is on.

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