

A Formal Theory for the Discovery of Local Boundaries in a Melodic Surface

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Abstract: *In this paper a general theory will be introduced that facilitates the detection of local boundaries in melodic surfaces. A model will be proposed that discovers points of maximum local change that allow a listener to identify potential perceptual boundaries. It is suggested that the Local Boundary Detection Model (LBDM) presents a more effective method for low-level segmentation in relation to other existing models and it may be incorporated as a supplementary module to more general grouping structure theories.*

1. Introduction

The Gestalt principles of perceptual organisation are a set of rules-of-thumb that suggest preferential ways of grouping mainly visual events into larger scale schemata. [Tenney 1961] discusses the use of the principles of proximity and similarity as a means of providing cohesion and segregation in 20th century music and, later, [Tenney & Polansky 1981] develop a computational system that discovers grouping boundaries in a melodic surface. Musical psychologists [see Deutsch 1982a,b; McAdams 1984; Bregman 1990] have suggested and experimented as to how the Gestalt rules may be applied into auditory/musical perception and [Deutsch & Feroe 1981] further incorporate such rules in a formal model for representing tonal pitch sequences. The grouping component of the Generative Theory of Tonal Music (GTTM) [Lerdahl & Jackendoff 1983] is based on the Gestalt theory and an explicit set of rules is thereby described - especially for the low-level grouping boundaries (the formulation of these rules has been supported by the experimental work of [Deliège 1987]).

In this paper a systematic theory will be described that attempts to define local boundaries in a given melodic surface. The proposed segmentation model (*Local Boundary Detection Model - LBDM*) will be based on two rules: the *Identity-Change rule* (which is lower-level than the Gestalt principles of proximity and similarity) and the *Proximity rule* (which is an extended version of the Gestalt proximity principle). It will be shown that the formulation of the boundary discovery procedures defined by Lerdahl & Jackendoff and Tenney & Polansky are merely specific instances of the proposed theory. Most of the examples and counter-examples will be given in relation to the influential formulation of the local detail grouping preference rules (mainly GPR 2 & 3) and supporting examples presented by [Lerdahl & Jackendoff 1983].

More specifically, the following issues will be addressed:

1. What are some problems, limitations and inconsistencies in the way the Gestalt rules of proximity and similarity are applied to temporal musical sequences by existing theories? How might these problems be resolved?
2. Is there a more general and clear way to define the low-level rules of perceptual organisation? How may the existing rules relate to such lower-level principles?
3. Can one construct a general formal theory that suggests *all* possible grouping boundaries rather than a theory that relies on a restricted set of heuristic rules?
4. How can this general fundamental theory be further refined?

Our goal is to develop a formal theory that may suggest all the possible points for local grouping boundaries on a musical surface with various degrees of prominence attached to them. These are only seen as *potential* boundaries as one has to bear in mind that musically interesting groups can be defined only in conjunction with higher-level grouping analysis (parallelism, symmetry etc.). Low-level grouping boundaries may be coupled with higher-level formations so as to produce 'optimum' segmentations (see fig. 1).

Let us suppose now that a third object is added to the two-object universe and that it's placed on the same axis with the other two (fig. 2c, d, e). The observer can now not only compare the property values of each pair of adjacent objects but the intervals that are defined by each pair as well i.e. inferences can be made as to whether two intervals are identical or not. And what was previously discussed about the two objects can now be applied to two intervals (including space/time intervals).

For the three identical objects of *fig. 2c* the observer may calculate that the two spatial/temporal intervals are identical and consequently that there is no way to group the three identical objects in uniquely defined sub-groups. On the contrary, in *fig. 2d* the two distances are non-identical - i.e. a change is discernible between them - and this change makes it possible to uniquely define and identify any sub-group of adjacent objects relying solely on the immanent features of the three-object world (e.g. find the group that consists of the two adjacent objects that are closer together).

Assuming that we are presented with any sequence of values that are relating to the values of properties of objects or intervals between such values, grouping boundaries may be inserted in the sequence according to the following rule:

Identity-Change Rule: Grouping boundaries may be introduced only between two non-identical elements (objects, parametric values, intervals). Identical elements do not allow any such boundaries between them.

The traditional Gestalt rules of proximity and similarity are higher-level than the above rule as they can be applied on *at least* three objects. The main claim made here is that facets of the similarity principle are captured by the ICR rule when this is applied to consecutive pairs of objects or intervals (more on this issue in the next section).

The Identity-Change rule is partially supported by an experiment [Garner 1974, quoted in Handel 1989] wherein an eight-element pattern composed of two different pitch elements, for example XXXOXOOO, is looped indefinitely and listeners are asked to describe the pattern they perceive. Various preferential ways of organisation were recorded (there are eight possibilities starting on each element of the sequence) but hardly ever did any listener break a run of same elements.

When the application of ICR on two consecutive intervals detects a change and suggests a local boundary, this boundary is ambiguous i.e. the middle object can be placed on either side of the boundary (for example, in *fig. 2d* ICR suggests a boundary on the first and/or the second interval). How can a decision be taken as to whether the grouping boundary should occur on the one or the other side of the object? This is where the second fundamental rule (relating to the Gestalt rule of proximity - and similarity - seen as local maxima in interval sizes) comes into play:

Proximity Rule: Amongst three adjacent objects those two will tend to form a group that are closer together (or more similar to each other) i.e. a boundary will be inserted on the larger interval.

In *fig. 1d* the two objects on the left will tend to be grouped together (i.e. the PR rule gives a grouping boundary between the two objects on the right).

3.2 Applying the ICR and PR rules on three-event musical sequences.

We will assume that for each parametric feature of a musical surface we can construct a sequence of intervals on which the ICR and PR rules may be applied. We will start off by presenting the application of the rules to the following intervals defined by parametric properties of contiguous musical events: pitch, dynamics, rests and articulation. The grouping boundaries resulting from the sequence of start-time intervals and durations will be presented at the end of this section.

The pitch intervals may be measured in semitones or scale-steps depending on the kind of melody at hand (tonal, atonal etc.). We use the absolute values, i.e. the interval size regardless of direction (ascending-descending). For the loudness intervals, we use the scale from *ppp*=1 to *fff*=8 to calculate the absolute value of the interval between these scale values (e.g. *mp*-*ff* is 3 units). Rests are considered as the distances between the end-time of the previous and the start-time of the next event (the maximum common denominator of the time intervals appearing in a musical surface can be used as a unit e.g. 16th durational value = 1). Slurs, staccati, breath-marks etc. are considered to be expressional rests and are

inserted between the notes they mark as normal rests that have a value that is a fraction of the preceding note (we will not introduce here any detailed way of measuring them).

The relation between two intervals can be of two types: *identity* or *change*. For reasons of asymmetry that will be introduced later on we will depict the change relation in two directional forms (fig. 3b,c). In the following figures, dots represent parametric values of musical events and the distances between the dots the interval sizes between these values (Δx , Δy are interval values and are placed at the left-hand side of the interval). In *fig. 3a* $\Delta x = \Delta y$ and the identity relation is represented by a zero. In *fig. 3b* $\Delta x > \Delta y$ and in *fig. 3c* $\Delta x < \Delta y$, and the change relations are represented by the + and - signs respectively.

figure 3

	• • •		• • •		• • •
<i>a.</i>	Δx Δy	<i>b.</i>	Δx Δy	<i>c.</i>	Δx Δy
	0		+		-
ICR:	0 0		1 1		1 1
PR:	<u>0 0</u>		<u>1 0</u>		<u>0 1</u>
Total	0 0		2 1		1 2

At this stage we will introduce numeric values for the strength of the ICR and PR rules (more research is necessary for the selection of the most appropriate values). A numeric value is given to each interval as shown below:

- ICR: 0 for the identity relation (0 for each interval)
- 2 for the change relations (1 for each interval)
- PR: 0 for no boundary
- 1 for proximity boundary suggestion

We get thus the total interval boundary preference strengths as depicted in *fig. 3* (last three lines).

We can now examine the duration and start-time intervals. The duration of a musical event is an internal attribute of that event whereas start-time intervals are temporal distances between two different successive events (a rest is considered to be part of the preceding note's duration - rests are considered independently in a separate parametric profile). We have thus the application of the ICR and PR rules for the start-time intervals exactly as described above plus the application of ICR for the sequence of durations (numeric strength 2). We now have the following kinds of relations for two start-time intervals delimited by 3 start-time points (dots) and the two corresponding durations (rectangles) (fig. 4).

figure 4

	• • •		• • •		• • •
<i>a.</i>	Δx Δy	<i>b.</i>	Δx Δy	<i>c.</i>	Δx Δy
	0		+		-
ICR (st-ints)	0 0		1 1		1 1
PR (st-ints)	0 0		1 0		0 1
ICR (dur)	<u>0 0</u>		<u>2 0</u>		<u>2 0</u>
Total	0 0		4 1		3 2

It is now clear that the + and - change relations are not symmetric. It is not possible to apply the principles of perceptual organisation in the musical domain without introducing local asymmetry.

3.3 Applying the ICR and PR rules on longer musical surfaces

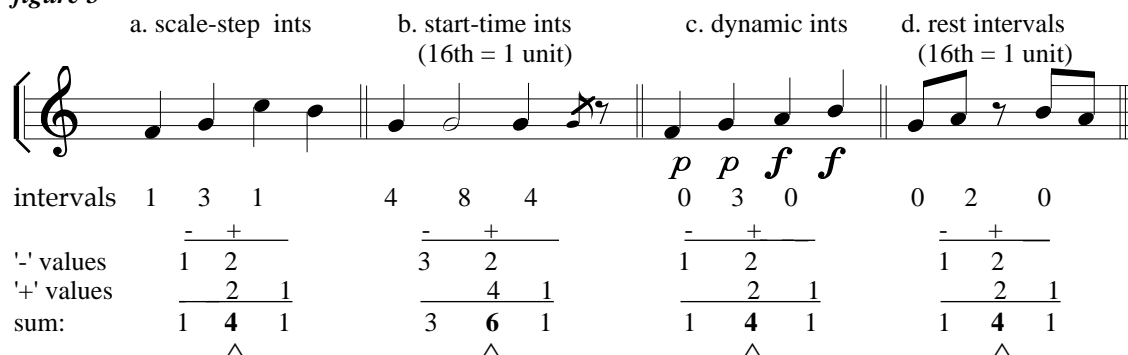
For a given parametric profile of a musical surface one finds all the kinds of interval relations (0, +, -) that exist between every two successive intervals. If there are 3 or more consecutive + or - (e.g. +++, ---), then only the ones at the ends are considered - the others do not contribute to the numeric strengths. Then, the sum of the numeric strengths for each kind of relation is calculated. For a single numeric strength sequence *all* the local maxima suggest the most preferable local grouping boundaries. If a local maximum consists of two numbers, then this is an ambiguous boundary (explained in the next section). If a single maximum has an adjacent numeric strength that differs by one unit, then this suggests a possible ambiguous boundary. If three numbers constitute a local maximum or one maximum is surrounded by

two numeric values that differ by one numeric unit then the middle interval is preferred as a grouping boundary (it is not possible to have a maximum with more than three numbers).

The above procedure is realised for every parametric profile of interest. Then the *total* sum of all the numeric strength strings is calculated. The local peaks are the points in a melodic sequence in which boundaries may preferably appear. Obviously the *LBDM* rules may contradict each other for different parametric profiles leading to local peaks consisting of more than one similar values. In this case one may estimate the relative strength of parametric profile and decide which wins or simply consider this boundary as ambiguous. As in this study we do not aim at reaching a final segmentation of a given surface (higher level grouping rules have to be taken into consideration) we will simply leave ambiguities unresolved.

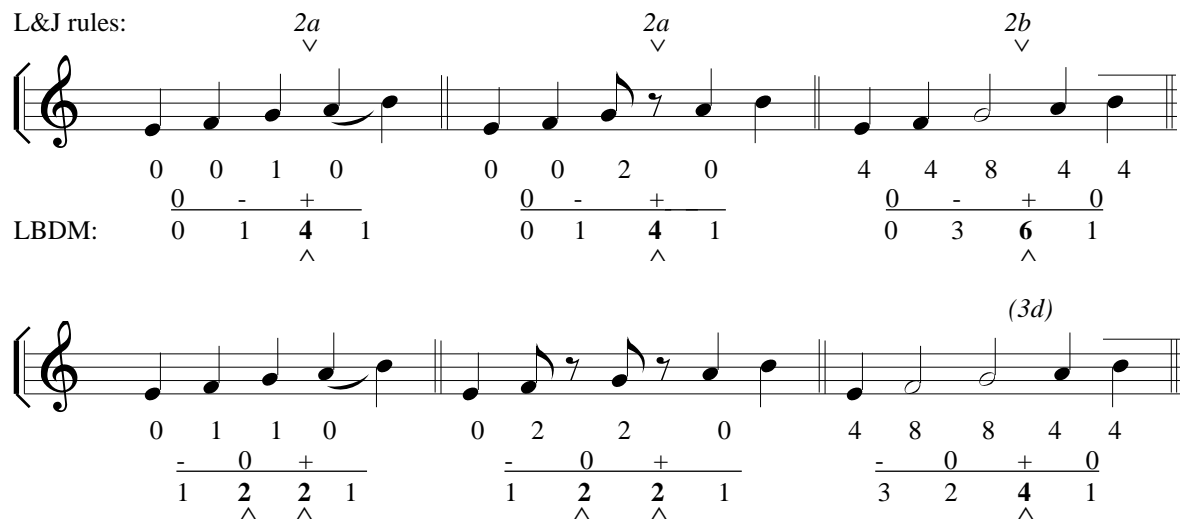
The 0, +, - interval relations can be combined in pairs to form sequences of three intervals (i.e. 4 events). There are $3^2=9$ possible combinations. In *fig 5* we give a first example of how one can use the ICR & PR rules to calculate the strengths of grouping boundaries for the $-+$ combination.





figure 5







As it happens, almost all the grouping preference rules of Lerdahl & Jackendoff and all the grouping rules suggested by Tenney & Polansky fall under the $-+$ category! (Exception: L&J's GPR3d (equal note length) and the articulation changes from legato to staccato and the opposite, fall under the $0+0$ and $0-0$ combinations). See *fig. 6* for the application of the *LBDM* rules to the local detail examples of Lerdahl & Jackendoff's grouping theory. *LBDM* accounts for all the positive instances of the Lerdahl & Jackendoff's groupings and for all the examples where their rules do not apply!

figure 6: Application of the *Local Boundary Detection Model* to the Lerdahl & Jackendoff [1983, p.44-46] local detail grouping examples 3.14-3.17. For the examples not accounted for by the GPR2 and GPR3 rules, the proposed theory suggests ambiguous boundaries (depicted as $\wedge_ \wedge$).








$3a$ ∇	$3b$ ∇	$3c$ ∇	$3d$ ∇
			
p	f		
1 1 4 1	0 0 3 0	0 0 1 3 3	8 8 8 4 4
$\frac{0 \ - \ +}{0 \ 1 \ 4 \ 1}$	$\frac{0 \ - \ +}{0 \ 1 \ 4 \ 1}$	$\frac{0 \ - \ - \ 0}{0 \ 1 \ 3 \ 2}$	$\frac{0 \ 0 \ + \ 0}{0 \ 0 \ 4 \ 1}$
∧	∧	∧ ₋	∧



			
p	f	p	
1 5 5 1	0 3 3 0	0 1 3 0	8 8 4 8 8
$\frac{- \ 0 \ +}{1 \ 2 \ 2 \ 1}$	$\frac{- \ 0 \ +}{1 \ 2 \ 2 \ 1}$	$\frac{- \ - \ +}{1 \ 3 \ 4 \ 1}$	$\frac{0 \ + \ - \ 0}{0 \ 4 \ 4 \ 2}$
∧ ₋ ∧	∧ ₋ ∧	∧ ₋	∧ ₋ ∧

The $- +$ interval relation is the strongest no matter what the interval context in which it appears is. The rest though of the possible combinations are important as well, especially when they are enclosed between two 0's (identical intervals). Most of the existing grouping theories do not account for these cases. In *fig. 7* *LBDM* boundaries are depicted for the following sequences: 0 + - 0, 0 + 0, 0 - 0, 0 + + 0, 0 - - 0 (runs of + and - that do not contribute to the strength values are enclosed in parentheses).

figure 7

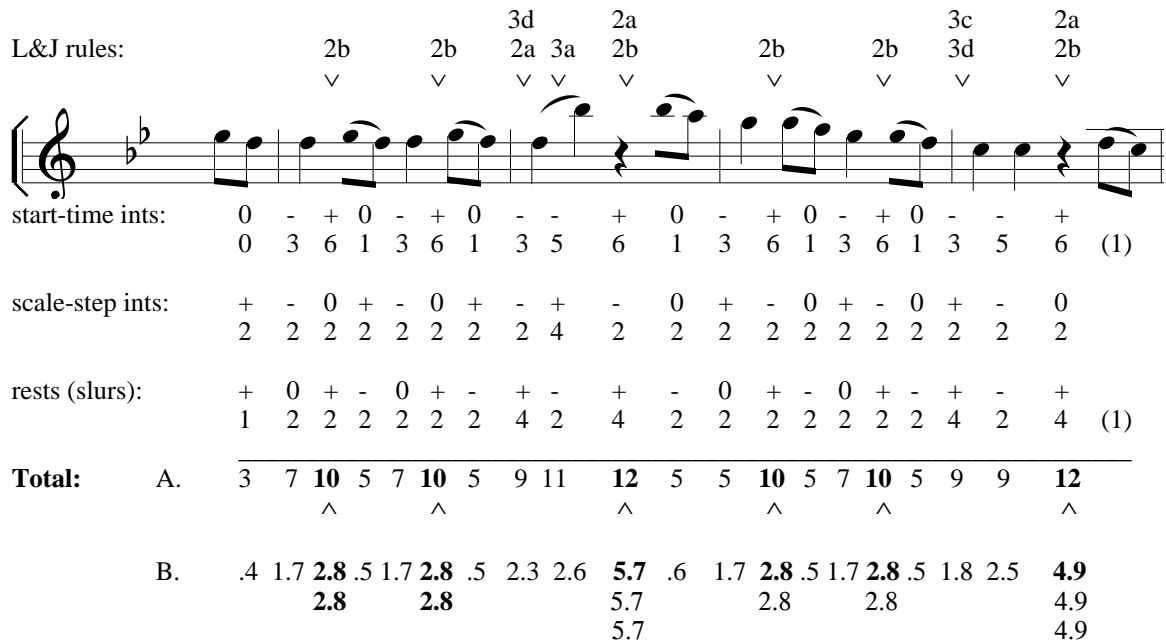
		
8 8 4 8 8	2 2 1 1	1 1 3 5 5 5
$\frac{0 \ + \ - \ 0}{0 \ 4 \ 4 \ 2}$	$\frac{0 \ + \ 0}{0 \ 2 \ 1}$	$\frac{0 \ - \ - \ 0 \ 0}{0 \ 1 \ 3 \ 2 \ 0}$
∧ ₋ ∧	∧ ₋	∧ ₋

	
6 5 4 3 2 1 0 1 2 3 4 5 6	0 0 0 1 2 3 4 1 1
$\frac{(+ \ + \ + \ + \ +) \ + \ - \ (- \ - \ - \ - \ -)}$	$\frac{0 \ 0 \ - \ (- \ -) \ - \ + \ 0}{0 \ 0 \ 1 \ 2 \ 0 \ 1 \ 4 \ 1}$
0 0 0 0 0 2 2 2 0 0 0 0	∧ ₋

	
16 12 8 4 2 1 1 1 1	1 2 3 4 5 5 4 3 2 1
$\frac{(+ \ + \ + \ +) \ + \ 0 \ 0 \ 0}{0 \ 0 \ 0 \ 0 \ 4 \ 1 \ 0 \ 0}$	$\frac{(- \ - \ -) \ - \ 0 \ + \ (+ \ + \ +)}$
∧	∧ ₋ ∧

In the following examples the *LBDM* is applied on musical excerpts from classical and contemporary pieces. The preferred grouping structure is presented for Mozart's opening of the *Symphony in G min.* (fig. 8), an excerpt from Xenakis' *Keren* (fig. 9) and an excerpt from Stravinsky's *Three pieces for solo clarinet*, no. III (fig. 10).

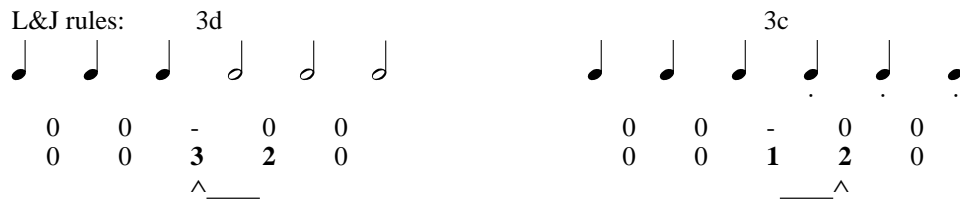
figure 8: Low-level grouping structure for the theme of Mozart's *Symphony in G min.* (sequence A). Sequence B depicts the most probable local boundaries given by the refined version of *LBDM* (see last section of this paper for further details).



3.4 Further comments on the application of the *LBDM* rules

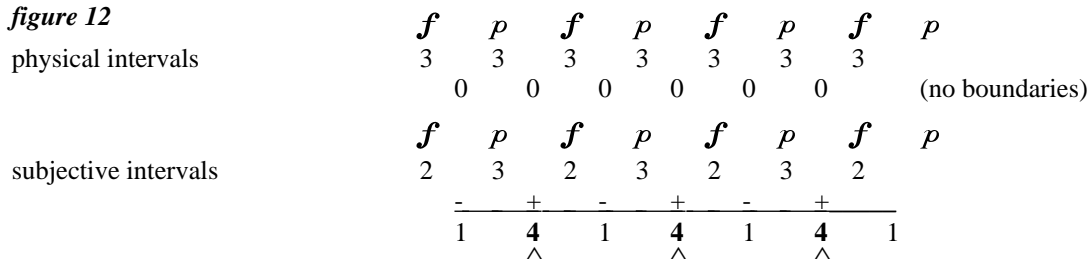
- Most grouping formal theories define exclusively clear boundaries that appear unambiguously between two musical objects. There are cases though where a boundary is ambiguously suggested. This phenomenon is conveniently accommodated within the present theory wherein numeric peaks with two identical or similar values suggest a blurred boundary (higher level grouping mechanisms may support one interpretation over other possibilities). [Deliège 1987, p. 331, 342] suggests that in the following sequences (fig. 11) the grouping boundary perceived by listeners tends to appear after the first half-note and staccato note respectively. The current theory suggests an ambiguous boundary on those notes.

figure 11



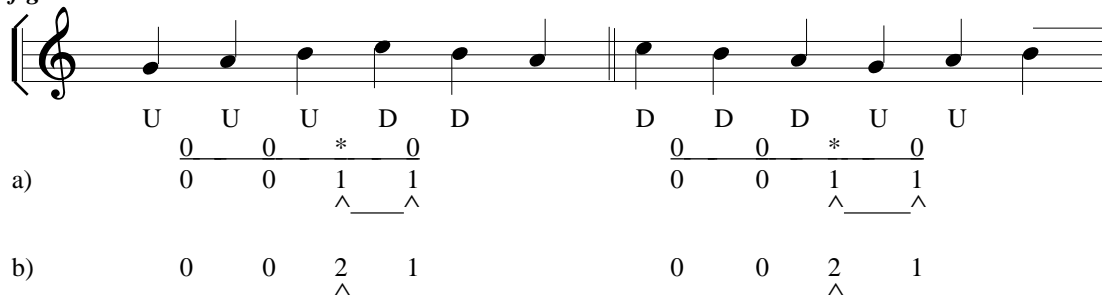
- It may be preferable in some cases to use subjective scales for interval sizes instead of acoustic ones. For example, in the following series of equally timed elements (fig. 12) the more intense ones tend to be perceived as beginnings of groups [Handel, 1989, p. 386-389]. In other words, it may be said that the interval $p \rightarrow f$ is larger than the reverse $f \rightarrow p$. The sequence below will have the following grouping boundaries:

figure 12



- [Deliège 1987] suggests that a change in melodic contour contributes weakly towards the establishment of a local boundary. This may be incorporated in the current theory by detecting changes of contour of the form $0 * 0$, e.g. U U D D, and at the point of change applying the ICR rule - 1 numeric value for each interval (fig. 13a).

figure 13



Deliège [1987, p.353] reports that the analysis of the responses of listeners to the change of the melodic contour "revealed a preference for cutting *before* the pivot sound". Taking this observation into account it would seem plausible to give an extra numeric weight at the first interval (fig. 13b).

4. Refinements in the *Local Boundary Detection Model*

The *LBDM* can be enhanced in various ways so as to accommodate further nuances of musical perception that contribute towards a more accurate description of the low-level grouping structure of a musical surface. Some of these are described below:

1. The various parametric profiles may be given different weights depending on the degree of prominence they may have for a given melodic surface. If, for instance, start-time intervals are considered more important, then the start-time profile may be given a higher weight factor before it is added to the other profiles.
2. The numeric value of the PR rule may be augmented (e.g. have a value of 2). This will produce sharper local maxima.
3. The 0, +, - identity/change relations may be refined by taking into account the ratio/difference between two interval sizes (factor α). As [Deliège 1987, p. 328] points out, the sensation of a boundary is strengthened in correspondence to the increase in difference between two intervals. For example, the second of the following two sequences suggests a stronger boundary:



4. A further factor that contributes to the perceived strength of a boundary relates to the total sum of the two intervals. The larger the sum is, the greater the prominence of the perceived boundary (factor β). For example, the second of the following two sequences suggests a stronger boundary:



5. Values that appear under slurs may be attenuated or deleted altogether.

Taking in account some of the above suggestions (mainly factors α & β) the local boundary strengths have been calculated for fig. 8 & 10 (if x, y are positive integer interval sizes then factors α & β may be calculated using functions such as: $\alpha = (x-y)/(x+y)$ and $\beta = 1 - 1/(x+y)$ and $0 < \alpha, \beta < 1$). For the theme of Mozart's *Gmin Symphony* it is clear that the middle and last boundaries are more prominent and could be considered as best candidates for higher level groupings (actually, these boundaries would emerge if the second-order local maxima were selected i.e. the maxima of the first-order maxima). This is a rather interesting result, especially if one bears in mind that no higher level perceptual principles have been employed (e.g. symmetry, parallelism).

A second example is given for an excerpt from the 3rd piece from the *Three pieces for solo clarinet* by I. Stravinsky. Lerdahl and Jackendoff apply their grouping preference rules on the beginning of the 1st of these pieces to show that their theory is general and not style specific. If though a different excerpt from this set of monophonic pieces (fig. 10) is examined the local boundaries proposed by Lerdahl and Jackendoff show limitations in two respects: firstly, not all the perceptually significant points of segmentations are accounted for (see, for example, the third grouping boundary - after the 10th note); secondly, many points are given excessive grouping boundary importance (see, for example, the second half of the excerpt in which strong GPR 2a and 2b boundaries are placed on every rest). On the contrary, the refined version of *LBDM* accounts for all the possible local boundaries and also highlights those that are more prominent (actually, as it happens, the second-order maxima suggest boundaries which correspond to the composer's articulations).

The refined *LBDM* encompasses facets of similarity more effectively as it accounts for the degree of difference between two intervals. The refined *LBDM* may be incorporated in real-time systems that attempt to segment input musical data. If, for instance, two input durations are almost the same - but not identical - factor α will tend to become zero so this slight performance difference will not contribute towards the establishment of a boundary (there is no need for quantisation of musical parameters before segmentation). It can also cope with the longer strings of only + or - change relations (e.g. +++) because these changes will receive different strengths according to their relative factor importance. In addition to musical sequences, it seems plausible that the proposed model may be applied to any sequence of visual or auditory events.

5. Conclusion

In this paper a formal theory has been described that attempts to define local boundaries in a given melodic surface. The proposed *Local Boundary Detection Model* is based on two rules, namely the Identity-Change and the Proximity rules, and it is suggested that it presents (especially the refined version) a more effective and general method for low-level segmentation in comparison to other existing models.

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