Multisensory Integration and Exogenous Spatial Attention: A Time-window-of-integration Analysis

Adele Diederich[1] and Hans Colonius[2]

Abstract

■ Although it is well documented that occurrence of an irrelevant and nonpredictive sound facilitates motor responses to a subsequent target light appearing nearby, the cause of this "exogenous spatial cuing effect" has been under discussion. On the one hand, it has been postulated to be the result of a shift of visual spatial attention possibly triggered by parietal and/or cortical supramodal "attention" structures. On the other hand, the effect has been considered to be due to multisensory integration based on the activation of multisensory convergence structures in the brain. Recent RT experiments have suggested that multisensory integration and exogenous spatial cuing differ in their temporal profiles of facilitation: When the nontarget occurs 100–200 msec before the target, facilitation is likely driven by crossmodal exogenous spatial attention, whereas multisensory integration effects are still seen when target and nontarget are presented nearly simultaneously. Here, we develop an extension of the time-window-of-integration model that combines both mechanisms within the same formal framework. The model is illustrated by fitting it to data from a focused attention task with a visual target and an auditory nontarget presented at horizontally or vertically varying positions. Results show that both spatial cuing and multisensory integration may coexist in a single trial in bringing about the crossmodal facilitation of RT effects. Moreover, the formal analysis via time window of integration allows to predict and quantify the contribution of either mechanism as they occur across different spatiotemporal conditions. ■

INTRODUCTION

The response of a multisensory neuron to stimulation in two (or more) sensory modalities can exceed that observed of either stimulus in isolation. This has been found at a variety of brain sites including subcortical convergence zones such as the superior colliculus and also within cortical areas such as ectosylvian cortex in cats or superior, temporal, parietal, and premotor cortex in monkeys. Specifically, the absolute number of impulses (spikes) of a neuron, registered within a fixed time interval after bimodal stimulus presentation, is larger than in the unimodal conditions, provided that the two stimuli occur fairly close in time and space (Stein & Meredith, 1993). This classic result of multisensory research, often expressed in terms of so-called spatial and temporal rules of integration, has given rise to the concept of a spatiotemporal time window of integration (TWIN) (Meredith, 2002). In the behavioral domain, a corresponding concept is typically referred to as temporal binding window: Even with SOAs of several hundred milliseconds, stimuli from different sensory modalities are "bound" to signal the occurrence of a joint event that leads crossmodal information to trigger faster responses or to lower detection and discrimination thresholds (see Wallace & Stevenson, 2014, for a recent review).

In contrast to studies based on data from single neurons with their overlapping unimodal receptive fields, the possible sources of such behavioral and perceptual effects have been discussed controversially. Early on, it has been well documented that occurrence of an irrelevant and nonpredictive sound facilitates motor responses to a subsequent target light appearing nearby (e.g., McDonald, Teder-Sälejärvi, & Hillyard, 2000). This exogenous spatial cuing effect (Driver & Spence, 2004) is interpreted as involuntary, crossmodal reorienting (shift) of visual attention. There is overwhelming evidence now from numerous studies, both behavioral and electrophysiological, that a sound attracts visual attention to its location even when it provides no information about where a subsequent visual target may occur or even when no visual stimuli are presented at all (for the latter, see, e.g., Brang et al., 2015). This shift of visual attention manifests itself, among others, in terms of speeding detection, improving discrimination of a visual target, or enhancing perceived contrast (see Hillyard, Störmer, Feng, Martinez, & McDonald, 2016, for a recent review). The central issue is whether the distinction between multisensory integration and exogenous spatial cuing is just terminological or is based on distinct neural underpinnings (Macaluso, Frith, & Driver, 2000, 2001). In their review chapter, Spence, McDonald, and Driver (2004)

[1]Jacobs University Bremen, [2]Carl von Ossietzky Universität Oldenburg

speculated that exogenous spatial cuing might be produced by "backprojection influences from putative supramodal 'attention' structures (say, in parietal and/or superior temporal cortex) to representations specific to the target modality (e.g., occipital cortex), with these backprojections being induced by an event in the cue modality even when presented on its own," whereas multisensory integration effects "might be characterized as arising instead only when feedforward projections from each stimulated modality meet at the multimodal level" (ibid., p. 311). However, neurophysiological studies have shown that two association cortical areas (anterior ectosylvian sulcus and the rostral lateral suprasylvian sulcus) have crucial roles to play in multisensory integration occurring in superior colliculus (Alvarado, Stanford, Vaughan, & Stein, 2007), blurring the proposed distinction to some degree.

The temporal profiles of multisensory integration and exogenous spatial cuing effects clearly differ: As observed in Van der Stoep, Spence, Nijboer, and Van der Stigchel (2015, p. 21), the facilitative effect of exogenous shifts of attention is typically most pronounced when SOA between presentation of the auditory and visual stimulus is about 100–300 msec, whereas behavioral benefits of multisensory integration are often most pronounced when auditory and visual stimuli are presented in close temporal alignment (SOAs between 0 and ±50 msec) or in physiological synchronicity, that is, taking the peripheral transition times of different modalities into account (Diederich & Colonius, 2004a). Naturally, these numbers should be taken with a grain of salt because the actual values will always depend on the specifics of the experimental (stimulus and task) conditions. Nevertheless, the main point to be exploited in the modeling to follow below is that exogenous shifts of attention take some time to become effective, whereas multisensory integration has no lower limit of SOA to occur (but obviously an upper limit). Van der Stoep et al. (2015) set out to separate multisensory integration from crossmodal exogenous spatial attention by presenting participants the same auditory and visual stimuli in two different tasks. In the integration block, they were instructed to respond to the onset of the first target stimulus that they detected (A or V). The instruction for the "cuing block" was to respond only to the onset of the visual targets. The targets could appear at one of three locations: left, center, and right. The participants were instructed to respond only to lateral stimuli, targets appearing at the central location serving as "catch" trials. The authors then compared the two types of tasks with respect to the crossmodal response enhancement (MRE), measured as difference between median unimodal and crossmodal RTs. Without going into further details of their procedures (but see Van der Stoep et al., 2015), they found MRE in the integration block only when the auditory and visual stimuli were presented in close spatial and temporal alignment, that is, at the 0- and 50-msec SOA

(with the auditory stimulus always presented first). Moreover, they concluded from further analysis that (i) at SOAs of 100 and 200 msec, MRE is likely driven by the effects of crossmodal exogenous spatial attention, alerting, and response preparation but cannot be explained by multisensory integration and (ii) at SOA of 50 msec, both types of processing may have occurred.

Although these results are very interesting, some aspects of the study of Van der Stoep et al. (2015) require further scrutiny. First, to elicit both multisensory integration and spatial cuing, participants had to undergo two different experimental paradigms: a redundant signals task ("respond to stimuli from both modalities") in the integration block and a focused attention task ("only respond to stimuli from the target modality") in the cuing block. This leaves open the question of whether both integration and cuing may, in principle, occur within the same trial. Second, whereas measuring the strength of multisensory integration via the amount of violation of the race model inequality is common practice for the redundant signals task, its use in the focused attention task is rather dubious for the following reason: Race model inequality provides a lower bound for MRE assuming that, in a given trial, the response is elicited by whichever stimulus is detected first. However, in the focused attention task, if the nontarget is the winner of the race, then the response must be inhibited, that is, postponed up until the target is detected.

TWIN MODEL

Results from studies of the temporal profile of crossmodal MRE can conveniently be described within the framework of the TWIN model developed over the last 15 years by the authors (Diederich & Colonius, 2004b, 2015; Colonius & Diederich, 2004). After introducing the basic assumptions, an extension of the model incorporating both integration and spatial cuing effects is presented.

Basic TWIN Model Framework

To predict the spatiotemporal effects on saccadic or manual RT observable in a simple detection task, the model postulates that a crossmodal (audiovisual) stimulus triggers a race mechanism in the very early, peripheral sensory pathways (first stage), followed by a compound stage of converging subprocesses that comprise neural integration of the input and preparation of a response. This second stage is defined by default: It includes all subsequent, possibly temporally overlapping processes that are not part of the first stage. A central assumption concerns the temporal configuration needed for crossmodal interaction to occur:

> TWIN assumption: Crossmodal interaction occurs only if the peripheral processes of the first stage all

terminate within a given temporal interval, the time window of integration.

Thus, the window can be considered a filter determining whether afferent information delivered from separate sensory organs is registered close enough in time to trigger multisensory integration. Given the nature of the task—simple stimuli and response via button press (no choice) or an eye movement toward the target—suggests that this first, peripheral stage is not influenced by the spatial distance between, for example, the visual and auditory stimulus. Importantly, this implies that, in the TWIN model, possible crossmodal effects of the temporal configuration can be separated from spatial effects of the experimental setup. The amount of crossmodal interaction manifests itself in an increase or decrease of second-stage processing time. Although this amount no longer depends on SOA of the stimuli, temporal tuning of the interaction nevertheless is made possible because the probability of integration is modulated by the SOA value. The formal version of the model makes these assumptions explicit.

The race in the first stage is represented by two statistically independent, nonnegative random variables V and A, standing for the peripheral visual and auditory processing times, respectively. With τ as SOA value and ω as (integration) window width parameter, the TWIN assumption for multisensory integration to occur, denoted by I, is

$$I = \{A + \tau < V < A + \tau + \omega\}$$

for the case of visual stimulus as target and auditory as nontarget. The starting point of the visual stimulus is arbitrarily defined as physical zero time point; thus, negative τ values mean that the auditory nontarget is presented before the visual target. The probability of integration to occur, $P(I)$, is a function of both τ and ω, and it can be calculated once distribution functions for A and V have been specified. Note that, in particular, multisensory integration will not occur if the target stimulus wins in the first stage.

Writing S_1 and S_2 for first- and second-stage processing times, respectively, overall expected RT in the crossmodal condition with SOA equal to τ, $E[RT_{V\tau A}]$, is computed conditioning on event I (integration) occurring or not,

$$E[RT_{V\tau A}] = E[S_1] + P(I)E[S_2|I] + [1-P(I)]E[S_2|I^c]$$
$$= E[S_1] + E[S_2|I^c] - P(I) \times \Delta_I \quad (1)$$
$$= E[V] + \mu - P(I) \times \Delta_I$$

Here, the assumption is that the first stage terminates with processing of the target, so $S_1 = V$. The complementary event to I is denoted by I^c, μ is short for $E[S_2|I^c]$, $P(I)$ is the probability of integration, and Δ_I stands for $E[S_2|I^c] - E[S_2|I]$. The term $P(I) \times \Delta_I$ is a measure of the expected amount of crossmodal interaction in the second stage, with positive Δ_I values corresponding to facilitation and negative ones corresponding to inhibition. Obviously, event I cannot occur in the unimodal visual condition, thus expected RT is

$$E[RT_V] = E[V] + E[S_2|I^c] = E[V] + \mu$$

Defining MRE as difference between unimodal and crossmodal condition,

$$MRE = E[RT_V] - E[RT_{V\tau A}]$$
$$= P(I) \times \Delta_I$$

with $P(I)$ depending on both SOA and window width ω and Δ_I only depending on crossmodal aspects of the experiment like, in particular, the spatial distance between the stimuli. In empirical studies probing various aspects of TWIN (Colonius, Diederich, & Steenken, 2009; Diederich & Colonius, 2007a, 2007b, 2008a, 2008b), the peripheral processing times have been assumed to follow exponential distributions. Moreover, adding a Gaussian component as second-stage processing time results in predicting RT distributions in the form of (a mixture of) ex-Gaussian distributions that are quite common in RT modeling (Luce, 1986).

Extended TWIN Model Framework

To accommodate a (spatial) cuing mechanism in the TWIN model, the following assumption is added:

> Cuing assumption: A (spatial) cuing mechanism—resulting in a speed-up of second-stage processing time—occurs whenever peripheral processing of the nontarget stimulus terminates "early enough" before peripheral target stimulus processing is finished.

The intuition here is that a cue needs a sufficient head start to shift visual attention to its location and to enable enhanced processing. In analogy to multisensory integration, the occurrence of cuing and the amount of its effect are separated, such that the cuing effect becomes manifest in a speed-up of second-stage processing. Note that only the case of a facilitating cue is considered here, but a more general formulation could easily be introduced. The specification of "early enough" is by introducing an additional model parameter, denoted by α, so that the event W that cuing occurs is specified as follows:

$$W = \{A + \tau + \alpha < V\}$$

with $\alpha > 0$. Note that large α values make the probability of cuing to occur small and vice versa. Prediction for mean crossmodal RT then changes into

$$E[RT_{V\tau A}] = E[S_1] + P(I \cap W)E[S_2|I \cap W] + P(I^c \cap W)E[S_2|I^c \cap W]$$
$$+ P(I \cap W^c)E[S_2|I \cap W^c] + P(I^c \cap W^c)E[S_2|I^c \cap W^c]$$
$$(2)$$

with $P(I \cap W)$ denoting the probability that, in a given trial, both integration and cuing occur, $P(I^c \cap W)$ denoting

the probability that integration does not occur and cuing does occur, and so on. Using the fact that these probabilities sum up to 1, crossmodal mean can be expressed as

$$\mathrm{E}[RT_{V\tau A}] = \mathrm{E}[RT_V] + \mu - [P(I \cap W)\Delta_{IW} \qquad (3)$$
$$+ P(I^c \cap W)\Delta_W + P(I \cap W^c)\Delta_I]$$

with $\mu = \mathrm{E}[S_2 | I^c \cap W^c]$ denoting second-stage processing time when neither integration nor cuing takes place, $\Delta_{IW} = \mu - \mathrm{E}[S_2 | I \cap W]$, $\Delta_W = \mu - \mathrm{E}[S_2 | I^c \cap W]$, and $\Delta_I = \mu - \mathrm{E}[S_2 | I \cap W^c]$. Thus, MRE becomes a weighted sum of three different facilitation effects

$$\mathrm{MRE} = \mathrm{E}[RT_V] - \mathrm{E}[RT_{V\tau A}]$$
$$= P(I \cap W)\Delta_{IW} + P(I^c \cap W)\Delta_W + P(I \cap W^c)\Delta_I$$

where Δ_{IW} represents the combined effect of integration and cuing, Δ_W the effect of cuing without integration, and Δ_I the effect of integration without cuing. To apply this modeling framework to a crossmodal RT experiment, the Δ-parameters have to be adapted to the experimental conditions, for example, whether crossmodal stimuli occur at coincident or disparate locations. Moreover, specific hypotheses can be formulated, for example, whether or not integration and cuing have additive effects, such that, for example, $\Delta_{IW} = \Delta_I + \Delta_W$.

TWIN Model Specification

The first step in deriving predictions from the TWIN model is to compute the probability of integration and cuing as a function of the SOA(τ) values used in the experiment. Second, Δ values have to be assigned to the various spatial conditions under which RTs have been collected.

Probability of Integration and Cuing

We first consider the probability of both integration and cuing occurring, $P(I \cap W)$, in a given trial. Peripheral processing times A and V are assumed to be exponentially distributed with parameters λ_A and λ_V, respectively. From $I = \{A + \tau < V < A + \tau + \omega\}$ and $W = \{A + \tau + \alpha < V\}$, we conclude

$$P(I \cap W) = P(A + \tau + \alpha < V < A + \tau + \omega) \qquad (4)$$

In this case, $\alpha < \omega$ follows because both α and ω are nonnegative. Given that all SOA(τ) are negative or zero, three different cases must be considered in computing the above probability: (i) $\tau + \alpha \geq 0$, (ii) $\tau + \alpha < 0$ and $\tau + \omega \geq 0$, and (iii) $\tau + \alpha < 0$ and $\tau + \omega < 0$. For case (i), using the assumption that A and V are stochastically independent,

$$P(I \cap W) = \int_0^\infty f_A(a)[F_V(a + \tau + \omega) - F_V(a + \tau + \alpha)]\mathrm{d}a$$
$$= \frac{\lambda_A}{\lambda_A + \lambda_V}(-1)\exp[-\lambda_V(\alpha + \tau) - \lambda_V(\omega + \tau)]$$
$$\times \{\exp[\lambda_V(\alpha + \tau)] - \exp[\lambda_V(\omega + \tau)]\}$$

Cases (ii) and (iii) are obtained in the same way, resulting in

$$P(I \cap W) = \frac{\lambda_A}{\lambda_A + \lambda_V}(1 - \exp[-\lambda_V(\omega + \tau)])$$
$$+ \frac{\lambda_V}{\lambda_A + \lambda_V}(1 - \exp[\lambda_A(\alpha + \tau)])$$

for case (ii) and

$$P(I \cap W) = \frac{\lambda_V}{\lambda_A + \lambda_V}(\exp[\lambda_A(\omega + \tau)]) - \exp[\lambda_A(\alpha + \tau)]$$

for case (iii).

The remaining probabilities $P(I^c \cap W)$ and $P(I \cap W^c)$ can be computed similarly, and $P(I^c \cap W^c)$ follows because the probabilities have to sum up to 1 (details are available on request from the authors' MATLAB code).

Different Versions of the Second Stage of TWIN

The different spatial conditions of the experiment fully described below are as follows: Visual and auditory stimulus are presented (i) either coincident (same position in space) or disparate (different positions in space) and (ii) either in the horizontal or the vertical axis. A fully saturated model would allow distinct Δ-parameters in the response enhancement term for each of these four possible configurations,

$$\mathrm{MRE} = P(I \cap W)\Delta_{IW} + P(I^c \cap W)\Delta_W + P(I \cap W^c)\Delta_I$$

resulting in $3 \times 4 = 12$ Δ-parameters for second-stage processing. Moreover, the probability of integration and/or cuing, depending on window width (ω) and head start parameter (α), could in principle also be modulated by spatial configuration resulting in a redundancy of parameters that would be difficult to identify.

Introducing different parameter restrictions renders a number of model versions amenable to testing, three of which are considered here. In the first model, no cuing mechanism is postulated, so RT differences between spatial stimulus configurations are assumed to be due to multisensory integration alone. In the second, both spatial cuing and integration may occur, and the third version allows different time window widths for vertical versus horizontal presentation, multisensory integration, but no spatial cuing. A more detailed description follows.

Model 1: Integration without cuing. Here, each spatial configuration may have a different effect on integration, but cuing has no effect at all. Thus, response enhancement becomes

$$\mathrm{MRE}_{ij} = P(I \cap W^c)\Delta_{ij}$$

with $i = h, v$ for horizontal and vertical configuration and $j = c, d$ for coincident and disparate configuration, respectively. Other parameters are λ_A, λ_V for auditory and visual peripheral processing time, respectively; μ

for second-stage processing without enhancement; and ω for window width, resulting in eight parameters in total.

Model 2: Integration and horizontal/vertical-specific cuing. In this model, integration occurs specific to coincident versus disparate presentation (Δ_c and Δ_d), and spatial cuing occurs (Δ_W) with vertical/horizontal-specific head start (α_v and α_b):

$$\text{MRE}_j = P(I \cap W)\Delta_{IW} + P(I^c \cap W)\Delta_W + P(I \cap W^c)\Delta_j \quad (5)$$

with $j = c, d$. This implies nine parameters in total.

Model 3: Integration but no cuing and horizontal/vertical-specific time windows. In this model, integration occurs specific to coincident versus disparate presentation (Δ_c and Δ_d); no spatial cuing is assumed, but time window is vertical/horizontal specific (ω_v and ω_b)

$$\text{MRE}_j = P(I \cap W^c)\Delta_j$$

with $j = c, d$. Total number of parameters is seven.

Given the number of parameters and the nonlinear structure of the TWIN model, discriminating between these different model versions may be difficult. The following experiment is meant as a first step to illustrate the general approach.

EXPERIMENT

We want to investigate whether the temporal profile of response enhancement in a crossmodal task is consistent with the separation of facilitation effects into a part due to multisensory integration and another part due to a shift of attention/spatial cuing. Because elicitation of the latter requires presentation of a cue before the stimulus, a focused attention paradigm with a visual target and an auditory nontarget with varying SOA values was chosen. Moreover, to elicit possibly different cuing effects, we set up visual–auditory spatial configurations with either horizontal or vertical disparity. A number of studies have shown that, depending on SOA, response facilitation with vertically arranged stimuli may differ from that to horizontal ones, presumably due to differing auditory localization mechanisms (Frens, Van Opstal, & Van Der Willigen, 1995).

Participants

Four students (aged 19–21 years, one woman) from Jacobs University Bremen were recruited as voluntary participants. They were paid or received credit points required for their studies. All had normal or corrected-to-normal vision, had normal hearing, and were right-handed (self-description; Coren, 1993). Participants gave their written informed consent before their inclusion in the study, and the experiment was conducted according to the principles expressed in the Declaration of Helsinki.

They were screened for their ability to follow the experimental instructions. Approval for this study was granted by the Academic Integrity Committee of Jacobs University Bremen.

Stimuli and Apparatus

Fixation point was an LED (25 mA, 5.95 mcd) located in the medial line at a distance of 90 cm. Auditory stimuli were white noise bursts (59 dBA), generated by two speakers (Canton Plus XS). Visual stimuli were red LEDs (25 mA, 3.3 mcd) located on top of the speakers. There were two different spatial arrangements: For the horizontal arrangement, the speakers were placed at 20° to the left and right of the fixation LED at the height of each participant's ear level at a distance of 120 cm; for the vertical arrangement, the speakers were placed at the medial line 15° above and below the fixation point. Note that the distance between visual and auditory stimuli presented at the same position ("coincident") was always 0°; for stimuli presented at opposite positions ("disparate"), the distance between two stimuli amounted to 40° for the horizontal and to 30° for the vertical arrangement. Figure 1 shows the stimulus configuration schematically. Response devices were two reflective optical sensors mounted on the table in front of the participant.

Experimental Task and Procedure

Participants were seated in a completely darkened, sound-attenuated room with the head positioned on a chin rest, elbows and lower arms resting comfortably on a table. The participant began every experimental session with 10 min of dark adaptation, during which the measurement system was adjusted and calibrated. Each trial started with the appearance of the fixation point of random duration (800–1500 msec). With the offset of the fixation LED, the visual target stimulus was turned on. The onset of auditory nontargets was shifted by a SOA from −250 to 0 msec in steps of 50 msec. The nontargets were turned off simultaneously with the visual target stimulus, which lasted for 500 msec. Stimulus presentation was followed by a break of 2 sec in complete darkness before the next trial began, indicated by the onset of the fixation LED. Participants were instructed to put their left and right index fingers on the sensor buttons related to the spatial position of the visual target and to lift the respective finger as quickly and accurately as possible ignoring any auditory nontargets (focused attention paradigm). Such spatial stimulus–response arrangement is considered necessary for spatial cuing effects to occur (Lee & Spence, 2017). Specifically, for the horizontal arrangement, the right (left)-hand button was associated with the target appearing on the right (left) side of the participant. For the vertical arrangement the right (left)-hand button was associated with the target appearing above (below) the fixation LED. The visual target

Figure 1. Stimulus configuration and time line. (A) Vertical spatial arrangement with disparate stimuli. (B) Vertical with coincident stimuli. (C) Horizontal spatial arrangement with disparate stimuli. (D) Horizontal with coincident stimuli. Note that the target was presented at the top or bottom (not shown in the figure) and left or right (not shown). FIX indicates the fixation point presented at the beginning of each trial. (E) Time line for one trial. Note that the graph does not reflect the actual distances between the stimuli nor the actual duration of the stimuli.
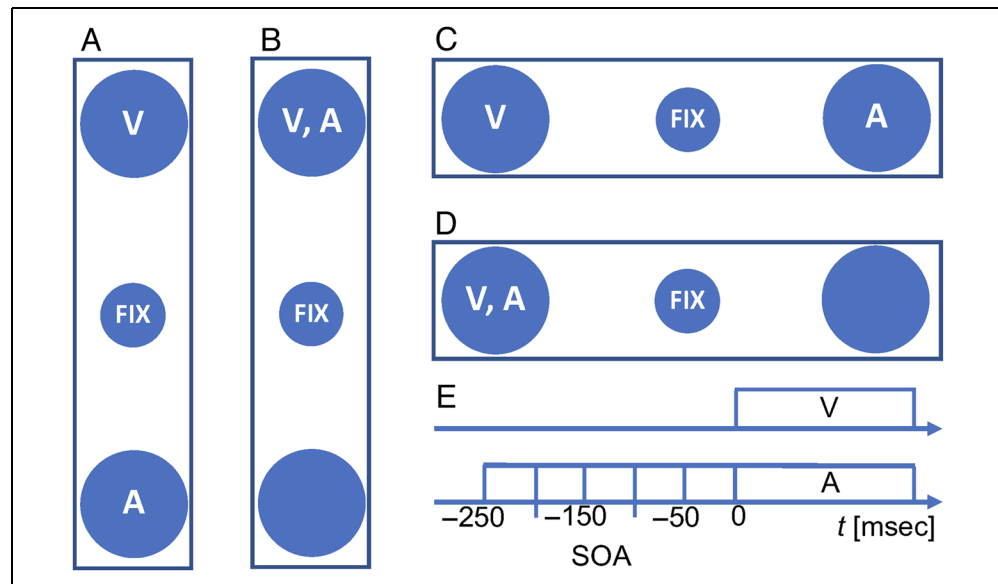
appeared in combination with the auditory nontarget in either coincident or disparate position. One experimental block consisted of 176 trials, 168 bimodal and 8 unimodal (visual target alone) with either a horizontal or a vertical orientation. Each participant performed 28 experimental blocks, four of them presented in one session, which lasted for about an hour. Each session consisted of two horizontal and two vertical blocks in alternating order. Each participant was engaged for 7 hr over the course of 2 weeks and completed 4928 experimental trials.

RESULTS

Data Screening and Preprocessing

RTs were screened for anticipation errors (RT < 80 msec), misses (RT > 500 msec), left/right directional errors, and nonresponses (by not lifting the finger properly). Overall error rates (in %) for horizontal (vertical) orientation were 10 (12) for Participant S1, 4 (9) for S2, 2 (4) for S3, and 20 (17) for S4.

Mean RTs

Although participants differed slightly in their overall response speed, their mean RTs across SOA values from −250 to 0 msec exhibit very similar behavior for the four different combinations of spatial conditions, that is, horizontal–vertical and coincident–disparate. The following general pattern (with very few exceptions) emerges from inspecting Figure 2: (i) Facilitation is always occurring (except for 2 of 96 conditions), and it decreases the later the auditory stimulus is given relative to the visual target; (ii) strength of facilitation is the largest under horizontal-coincident presentation, followed by horizontal-disparate, vertical-coincident, and finally, vertical-disparate

presentations. Thus, both spatial features, the horizontal–vertical and coincident–disparate distinction, have an effect on facilitation, with the former clearly dominating the latter. Moreover, the effect of coincident versus disparate presentation remains more or less invariant across the different SOA values. There is also an impression of further speed-up beyond the 250 msec auditory lead, as actually observed in other studies from our lab (e.g., Diederich & Colonius, 2008a).

Parameter Estimation for TWIN

Performance of Models 1–3 was probed separately for each participant. Seven to nine parameters, depending on the model, were estimated from the means of 24 bimodal conditions: 2 spatial arrangements (horizontal/vertical) × 2 incidence levels (coincident/disparate) × 6 SOA values. Common to all models are parameters λ_A and λ_V for peripheral processing time of auditory and visual stimuli, respectively, and μ presenting mean time of second-stage processing when cuing or integration effects are absent. The remaining model-specific parameters have been described above and are listed in Table 1.

All parameters were estimated by minimizing the following χ^2 statistic,

$$\chi^2 = \sum_{n=1}^{6} \sum_{k=1}^{2} \sum_{j=1}^{2} \left(\frac{RT_{obs}(j,k,n) - RT_{pred}(j,k,n)}{\sigma_{RT_{obs}}(j,k,n)} \right)^2 \quad (6)$$

using optimization routine BADS (Acerbi & Ma, 2017) implemented in MATLAB R2017a. Here, $RT_{obs}(j, k, n)$ and $RT_{pred}(j, k, n)$ are the observed and predicted values of mean RT to visual-auditory stimuli, respectively, presented in positions (coincident, $j = 1$; disparate, $j = 2$) and spatial arrangement (horizontal, $k = 1$; vertical, $k = 2$) with SOA (referred to by n, $n = 1, …, 6$); $\sigma_{RTobs(j,k,n)}$ are the respective standard errors (standard deviation

divided by the square root of the number of observations). For the estimation routine, the following restrictions were made: λ_V and λ_A between 5 and 300 msec; μ between 50 and 500 msec; ω between 50 and 250 msec; moreover, α and Δ values were restricted between 0 and 200 msec.

TWIN Model Account

Parameter estimates for all participants and models (Models 1–3) are listed in Table 1. Some parameter patterns are invariant across all participants and models: (i) peripheral processing for auditory stimuli takes longer than for visual stimuli ($1/\lambda_A > 1/\lambda_V$), (ii) the effect of coincident stimulation is stronger than disparate stimulation (compare Δ values), (iii) second-stage processing (μ) is between 250 and 400 msec. Moreover, there is high consistency across all participants with respect to

parameters in the three model versions: (i) In models without cuing, time window width is equal or close to the upper bound of 250 msec (Model 1) and window widths for horizontal presentations are longer than for vertical ones (Model 3), and (ii) cuing parameter α is about 100 msec for horizontal and zero for vertical presentations (in three of four participants). The fact that peripheral auditory processing was estimated to take longer than visual across all participants seems not consistent with the fact that transmission delays are typically estimated faster for auditory than visual. Note, however, that first-stage peripheral processing time in TWIN comprises more than (neurophysiological) transmission delays, referring to the entire afferent chain up until a first interaction between visual and auditory processing is possible, that is, purportedly at early cortical processes.

Goodness of fit information is listed in the two final rows of Table 1. For comparing models with different
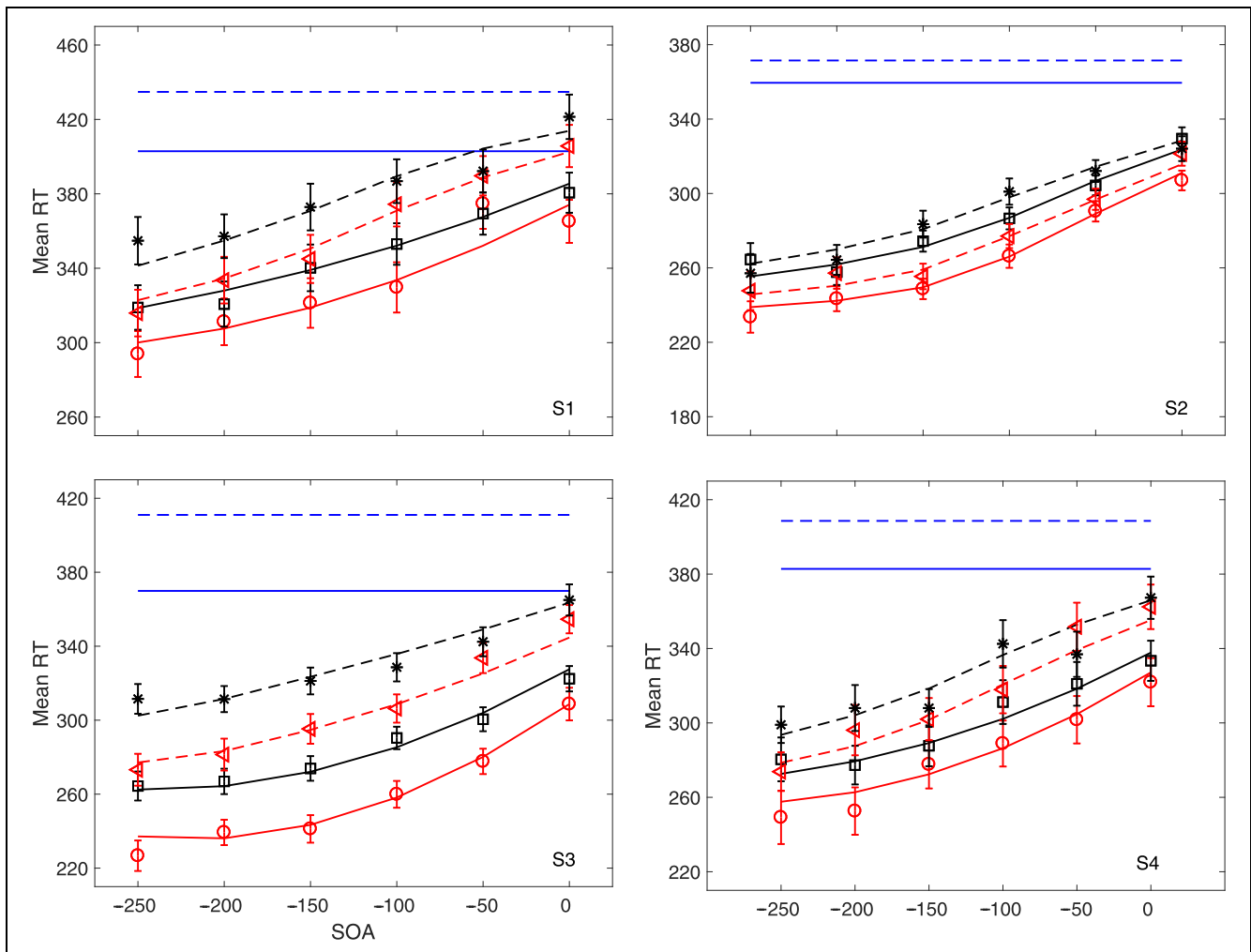

Figure 2. Observed and predicted mean RTs under four different spatial conditions are depicted as a function of SOA with auditory nontarget leading. Note that RTs to visual stimulus decrease monotonically the earlier the auditory is presented. The points indicate observed RT including 95% confidence intervals: Condition horizontal-coincident is presented by O, horizontal-disparate is presented by D, vertical-coincident is presented by /, and vertical-disparate is presented by *. Solid curves present the model predictions for horizontal, and dashed curves present the model predictions for vertical arrangements. The horizontal lines (blue) at the top mark observed RT to unimodal visual stimuli (solid: horizontal, dashed: vertical condition) and serve to gauge facilitation effects. Note that the displayed RT range is the same for all four participants.

Table 1. Estimated Parameters for the Three Different Models (M1, M2, M3) Individually for Each Participant (S1, S2, S3, S4)

	S1			S2			S3			S4		
	M1	M2	M3	M1	M2	M3	M1	M2	M3	M1	M2	M3
$1/\lambda_A$	300	300	300	300	300	300	207	300	279	286	300	300
$1/\lambda_V$	19	117	5	33	105	29	38	158	5	22	146	5
μ	387	316	397	304	253	306	318	256	329	337	256	347
ω	250	250	–	250	190	–	250	250	–	250	250	–
ω_b	–	–	250	–	–	250	–	–	239	–	–	250
ω_v	–	–	185	–	–	243	–	–	77	–	–	184
Δbc	200	–	–	196	–	–	200	–	–	200	–	–
Δbd	164	–	–	144	–	–	146	–	–	153	–	–
Δvc	140	–	–	170	–	–	111	–	–	131	–	–
Δvd	84	–	–	127	–	–	63	–	–	100	–	–
Δ_c	–	46	179	–	136	183	–	200	200	–	81	174
Δ_d	–	0	130	–	77	134	–	132	126	–	42	130
Δ_w	–	165	–	–	138	–	–	143	–	–	160	–
α_b	–	0	–	–	77	–	–	0	–	–	0	–
α_v	–	109	–	–	111	–	–	206	–	–	111	–
k	8	9	7	8	9	7	8	9	7	8	9	7
χ^2	74	30	172	56	28	87	132	38	481	68	31	152
AIC	114	90	194	96	88	109	172	98	503	108	91	174

The last but one row contains χ^2 values; the last row lists AIC values for goodness of fit and model comparison. k indicates the number of parameters.

numbers of parameters, we used the Akaike information criterion (AIC) here defined as $\text{AIC} = \chi^2 + k \cdot (k + 1) - 2 \cdot df$, where k is number of parameters and degrees of freedom $df = N - k$ with N as the number of observations (Kenny, 2015). Model fits are consistent across all four participants. Specifically, the model allowing for both integration and cuing (Model 2) is the clear winner both in terms of the χ^2 statistic (Equation 6) and when taking the number of parameters into account (AIC value). When the cuing mechanism is replaced by distinguishing vertical/horizontal from coincident/disparate spatial effects (four Δ-values) in Model 1, the fit degrades somewhat. Finally, the fit suffers even more when cuing is replaced by allowing different time windows for horizontal and vertical presentations while keeping the coincident/disparate effect in Δ (Model 3). Figure 2 shows predictions of the best fitting model (Model 2) for all participants. As the 95% confidence bands for mean RTs indicate, the model gives a good account of the data. It captures the overall pattern for the different spatial conditions (horizontal/vertical and coincident/disparate) and also accounts for (minor) individual differences.

Given estimates of all model parameters, the extended TWIN model not only yields estimates of the facilitation effects under each of the experimental conditions but also allows to see how the effect of cuing and/or integration evolves across different SOA values. As depicted in Figure 3, for all participants and with SOA going from −250 to 0 msec, (i) the probability of cuing decreases under both horizontal and vertical configurations (dash-dotted/blue curves), (ii) the probability of both cuing and integration to occur tends to first increase and then decrease (dashed/red curves), (iii) the probability of integration occurring without cuing follows a similar shape (dotted/black curves) with the following exception: It remains at probability zero for those conditions where $\alpha_b = 0$ (see Table 1). This is easy to understand: In those cases, we have $W^c = \{A + \tau + 0 > V\}$ (no cuing), which implies that the probability of "no cuing but integration," $P(I \cap W^c)$, must be zero because integration requires $\{A + \tau < V\}$. Finally, the solid (cyan) curves, monotonically increasing toward about 0.7, indicate the probability that neither cuing nor integration occur. Note that all these curves, though not being directly observable, give an excellent insight into how the two purported mechanisms are at work at different levels of SOA.

Finally, an important feature of the TWIN model is that it teases apart the probabilities of cuing/integration from
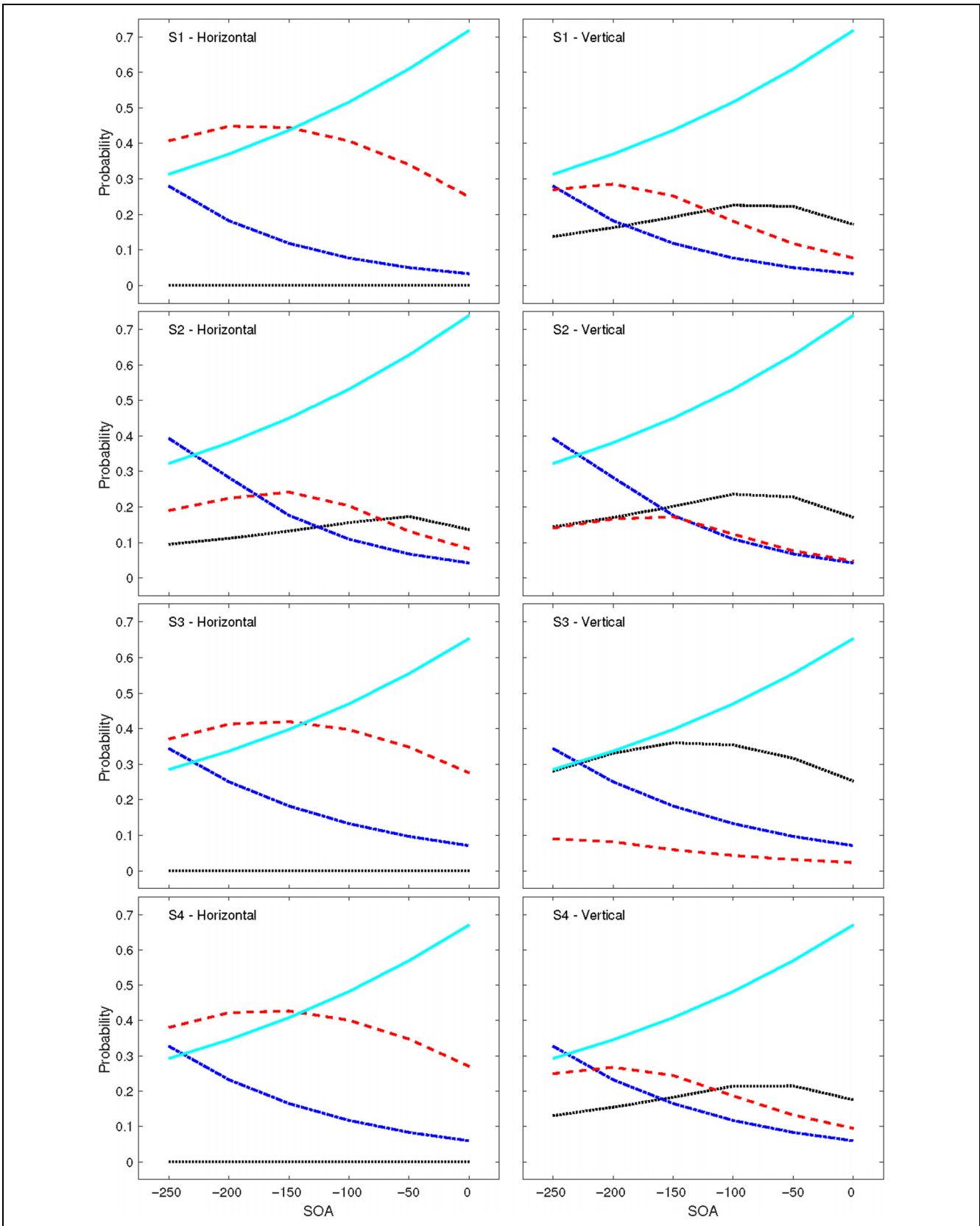
Figure 3. Predictions of TWIN model for the probability of cuing and/or integration to occur within the same trial as function of SOA for participants S1–S4. Left column: horizontal configuration; right column: vertical configuration. Dotted (black) curve: integration and no cuing $[P(I \cap W^c)]$; dot-dashed (blue) curve: no integration but cuing $[P(I^c \cap W)]$; dashed (red) curve: integration and cuing $[P(I \cap W)]$; solid (cyan) curve: neither integration nor cuing $[P(I^c \cap W^c)]$. (i) Probability of cuing without integration (dot-dashed/blue curve) decreases the later the auditory is presented; (ii) probability of both integration and cuing to occur (dashed/red curve) is maximal at some midrange SOA (-150 to -200 msec); (iii) probability of neither cuing nor integration to occur (solid/cyan curve) increases the later the auditory is presented (see text for further explication).

the numerically quantified effects, captured by Δ-values as expressed, for example, in Equation 5 for Model 2. Although neither the probabilities nor the Δ-values are observable, their combined effect results in the observed amount of facilitation (MRE). Specifying which aspects of the experimental setup influence the probabilities, on the one hand, and the Δ-values, on the other hand, makes predictions of TWIN empirically testable.

DISCUSSION

Facilitating effects of a nontarget auditory stimulus on the speeded response to a subsequent visual target stimulus are well documented (see, e.g., Driver & Spence, 2004, for a review), but the source of this "exogenous spatial cuing" effect is somewhat controversial. Specifically, it is not clear whether facilitation is due to "crossmodal links in exogenous spatial attention" or should be considered as outcome of a multisensory integration mechanism, as typically observed at the single cell level (e.g., McDonald et al., 2001). Here, we extend the TWIN model (Colonius & Diederich, 2004; Diederich & Colonius, 2004b) to combine both sources of facilitation within the same formal framework. A (spatial) cuing mechanism is added that operates whenever peripheral processing of a nontarget stimulus terminates "early enough" before target stimulus processing. Multisensory response enhancement, that is, RT facilitation relative to unimodal RT, occurs in a second stage whenever multisensory integration and/or cuing are induced by a probabilistic time window mechanism in the first stage.

The model was illustrated by fitting it to data from a focused attention task with a visual target and an auditory nontarget presented at horizontally or vertically varying positions with SOA values ranging from −250 to 0 msec (auditory lead). We find facilitation across the entire range of SOAs, but the size of the effect depends on the specific spatial configuration of target and nontarget: It is stronger when both stimulus positions are varied horizontally rather than vertically. With both stimuli presented at the same position (coincident), facilitation was stronger than for stimuli presented at different positions (disparate), and this effect was less salient than for the horizontal/vertical distinction. These findings are consistent with effects observed in saccadic eye movements with respect to both spatial coincidence and the horizontal/vertical dimension (Frens et al., 1995) and also replicate previous data from our lab where, however, the impact of prior knowledge (Diederich, Colonius, & Kandil, 2016) and auditory maskers (Colonius et al., 2009) had been in the focus of investigation, respectively. Here, different model versions were fit to the data, depending on whether or not multisensory integration was postulated as the sole mechanism underlying RT facilitation. The model version allowing both integration and spatial cuing to occur within a trial (Model 2) delivered the best account for the 96 mean RT data collected from four participants.

Comparing our data from the horizontal spatial condition with those in the cuing block of Van der Stoep et al. (2015), the only condition that parallels our focused attention paradigm reveals a high degree of consistency for both coincident and disparate presentations: For SOA = −50, −100, −200 msec, when the nontarget auditory stimulus gets a lead, responses accelerate monotonically with a total speed-up of about 80 msec for coincident presentations and somewhat less for disparate ones. But on closer scrutiny, there are also some differences. Whereas Van der Stoep and colleagues find little or no facilitation at SOA = 0, we do in three of four participants. On the other hand, computation of the exact amount of facilitation critically depends on the unimodal reference point, usually the minimum of the mean visual- and/or auditory-only condition, as a function of the specifics of the experimental conditions, like blocked or mixed presentations, catch trials, or so forth, that were not completely identical in both studies. A potentially more important discrepancy concerns the spatial alignment effect: Although Van der Stoep et al. (2015) report a significant increase in the difference between coincident and disparate conditions across SOAs, in our data the displacement of RTs from coincident to disparate configurations remains more or less invariant for both horizontal and vertical conditions (see Figure 2). Comparing the cuing block data with those in the integration block, the authors hypothesize that, in the cuing block, there was no integration in the 100- and 200-msec SOA conditions but, rather, that facilitation was the result of combined effects of crossmodal exogenous spatial attention, alerting, and temporal preparation effects, whereas at SOA = 0, the observed MRE was, at least in part, a result of multisensory integration. In contrast, in the TWIN model, the probability that both integration and cuing occur at SOA = 0, 100, or 200 is nearly always larger than the probability that only cuing occurs, in particular for the horizontal configuration.

To summarize the main findings of this article, first, although there were some variations between Van der Stoep et al.'s (2015) and our data, we also find high consistency for most SOA conditions, but, second, the interpretation of the cause for facilitation, cuing and/or integration, deviates significantly. Third, the specific contribution of the extended TWIN model is to combine both multisensory integration and spatial cuing in a single process. Notably, the model allows to quantify the effect of either mechanism in facilitating the response within the same trial. Once model parameters have been estimated, the model can predict MRE under various, previously untested spatiotemporal configurations of the stimuli. Specifically, it is possible, at least in principle, to probe whether the conclusions drawn in Van der Stoep et al. (2015) based on comparing data from the

integration and cuing blocks would actually hold up when the fitting the TWIN model to their data.

Although the model fits presented here show a consistent advantage for the assumption that both integration and cuing coexist in bringing about crossmodal facilitation of RT and that both mechanisms may occur in the same trial, a larger data set and more advanced model selection techniques may be required to give a more definite answer to which model version is closest to the truth. As suggested by a reviewer, an informative modification might be an experiment using both within-modal and crossmodal stimuli: The former should only produce cuing in contrast to the latter. However, as reported by Schröter and colleagues investigating the redundant signals task using within-modal stimuli without SOAs (Schröter, Fiedler, Miller, & Ulrich, 2011; Schröter, Frei, Ulrich, & Miller, 2009), the combination of two or more unimodal visual or auditory stimuli may produce unexpected results. Specifically, facilitation of RT depended on the number of percepts, rather than the number of stimuli. Therefore, an experiment to compare results from crossmodal to within-modal stimuli within a focused attention task will require a judicious choice of appropriate stimulus parameters.

Acknowledgments

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