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THEORETICAL REVIEW

Augmented visual, auditory, haptic, and multimodal feedback in motor learning: A review

Roland Sigrist · Georg Rauter · Robert Riener · Peter Wolf

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Abstract It is generally accepted that augmented feedback, provided by a human expert or a technical display, effectively enhances motor learning. However, discussion of the way to most effectively provide augmented feedback has been controversial. Related studies have focused primarily on simple or artificial tasks enhanced by visual feedback. Recently, technical advances have made it possible also to investigate more complex, realistic motor tasks and to implement not only visual, but also auditory, haptic, or multimodal augmented feedback. The aim of this review is to address the potential of augmented unimodal and multimodal feedback in the framework of motor learning theories. The review addresses the reasons for the different impacts of feedback strategies within or between the visual, auditory, and haptic modalities and the challenges that need to be overcome to provide appropriate feedback in these modalities, either in isolation or in combination. Accordingly, the design criteria for successful visual, auditory, haptic, and multimodal feedback are elaborated.

Keywords Skill learning and automaticity · Augmented extrinsic feedback · Unimodal feedback · Feedback strategy

Introduction

In the field of sports, trainers want their athletes to jump higher or run faster—in general, to perform motor tasks

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better. In rehabilitation, therapists want their patients to recover lost motor functions as quickly and permanently as possible. The aim of research in motor learning is to enhance these examples of complex motor (re-)learning by optimizing instructions and feedback. Depending on the motor feature to be learned, trainers and therapists switch modalities to instruct the motor task; for instance, instead of visually demonstrating the movement, they move the athlete or patient through it. Technical displays, which have become increasingly common for providing augmented feedback, can also address different modalities: vision (screens, head-mounted displays), hearing (speakers, headphones), haptics (robots, vibrotactile actuators), or a combination of

Feedback strategies may also be classified according to the point in time at which feedback is provided: either during motor task execution (i.e., concurrent [online, realtime] feedback) or after it (i.e., terminal feedback). Recently, the benefits of concurrent, as compared with terminal, feedback strategies have been controversially discussed. Literature related to this controversy is the basis of this review; we elaborate the potential and the limitations of concurrent feedback strategies for enhancing motor learning. In this context, we will particularly consider motor task complexity and the applied feedback modality.

The review starts with definitions of relevant terms, followed by general remarks on augmented feedback to broaden the contextual integration of the statements. In the subsequent sections, the efficiency of concurrent feedback strategies are separately discussed for the visual, auditory, and haptic modalities, followed by a section on multimodal feedback strategies (see Fig. 1). In each of these sections, the advantages of displaying feedback in that modality or in a multimodal manner are listed, existing studies are reviewed, and guidelines for designing feedback displays are provided.



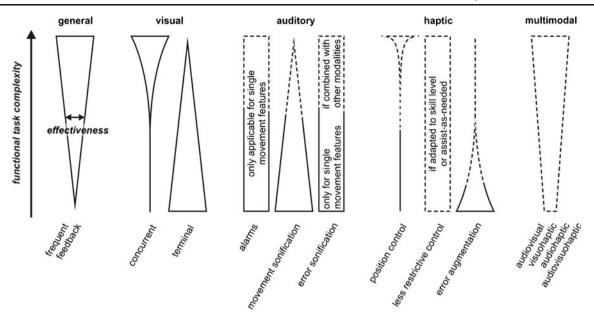


Fig. 1 Illustration of the review outline and summary of the main conclusions. The figure shows the experimentally confirmed (solid) and our hypothesized (dashed) effectiveness of a feedback strategy to

enhance motor learning depending on functional task complexity. The broader the shape, the more effective the strategy is

We mainly review studies with healthy subjects. Studies with patients are only partly considered, since patients often know how a movement should be performed but are physically not able to do so (Yang & Kim, 2002). Feedback may, therefore, not exclusively facilitate motor learning but, rather, enhance compensatory mechanisms and strategies in order to overcome loss of motor function due to a damaged neuromuscular system. Thus, patients may benefit from augmented feedback in a way that is different from motor learning in healthy individuals. Even though the effectiveness of augmented feedback applied in rehabilitation is beyond the scope of the present review and has been discussed elsewhere (Huang, Wolf, & He, 2006; Molier, Van Asseldonk, Hermens, & Jannink, 2010; Ribeiro, Sole, Abbott, & Milosavljevic, 2011), some studies will be considered for a broader discussion of feedback design aspects.

Definitions

Augmented feedback, also known as extrinsic feedback, is defined as information that cannot be elaborated without an external source; thus, it is provided by a trainer or a display (Schmidt & Wrisberg, 2008; Utley & Astill, 2008). The term display is not constrained to the visual modality—for example, screens or projectors. Headphones and speakers are also called auditory displays, and robots can act as haptic displays. Augmented feedback can relate the learner's individual performance to a desired performance or to an instruction.

Instructions are used to emphasize certain aspects of the movement, to remind of previously explained principles (Schmidt & Wrisberg, 2008), or to induce a certain focus (Wulf & Shea, 2002). Intrinsic or internal feedbacks—that is, sensory afferences—are always present during motor learning. In this review, the term *feedback* means augmented feedback; otherwise, we explicitly refer to intrinsic feedback.

In this review, the word haptic refers to both tactile and kinesthetic perception: Tactile perception is usually conveyed through the skin, such as by vibrations or pressure; kinesthetic perception refers to receptors in muscles and tendons that allow us to feel the pose of our body (O'Malley & Gupta, 2008). In our definition, the term haptic augmented feedback extends the term haptic guidance, also known as physical guidance or physical assistance. Haptic guidance refers to physically guiding the subject through the ideal motion by a haptic interface (Feygin, Keehner, & Tendick, 2002). Beyond haptic guidance, haptic augmented feedback also includes any kind of haptic perception that teaches the necessary features that guide the subject toward, and not necessarily through, the desired motion. This definition also distinguishes haptic augmented feedback from haptic rendering, which refers to feeling virtual objects haptically (Salisbury & Srinivasan, 1997).

Motor learning describes a lasting change of motor performance caused by training. Motor learning includes the development of a parameterized motor program, which forms the basis of the feedforward control strategy, as well as the gradual reduction of the variability in the newly developed motor program via sensory feedback loops (Shmuelof, Krakauer, &



Mazzoni, 2012). At a behavioral level, motor learning can be characterized by three different phases (Fitts & Posner, 1967; Schmidt & Wrisberg, 2008). In an early, attention-demanding phase, learning progresses rapidly, and a first movement representation—that is, the motor program—of the to-belearned task is formed. During a second phase, the motor presentations are further refined, and error detection/correction mechanisms are improved. Sensory afferences of the ongoing movement are compared with the intended motor output, and errors are corrected either online, when the movement is slow, or in a subsequent movement, when trials are fast. Consequently, overall error and movement variability are improved. Finally, in a third phase, movements are performed in a highly automatized and consistent manner. Consequently, in this review, we characterize motor learning by a lasting increase of performance assessable in short- and long-term retention tests, when augmented feedback is withdrawn, or in transfer tests, when different or related movements are performed. If an augmented feedback was tested only for its benefits in enhancing current performance—that is, during the training with the feedback—we will explicitly refer to this issue. To define task complexity, we refer to a general description provided by Wulf and Shea (2002): "We will judge tasks to be complex if they generally cannot be mastered in a single session, have several degrees of freedom, and perhaps tend to be ecologically valid. Tasks will be judged as simple if they have only one degree of freedom, can be mastered in a single practice session, and appear to be artificial" (Wulf & Shea, 2002, p. 186). Data from studies on simple tasks reflect the second phase of learning, where studies of complex tasks provide insights about the processes occurring in the first phase.

Important contextual insights gained from studies on visual feedback

During the last few years, vision has been the modality most intensively investigated in the context of optimizing augmented feedback for motor learning. This research has revealed how (visual) feedback strategies can either facilitate or impair motor learning. General opportunities, as well as the pitfalls, of visual augmented feedback will be described next.

In general, concurrent feedback can enhance performance in the acquisition phase, but the performance gains are lost in retention tests. This finding is explained by the guidance hypothesis, which states that permanent feedback during acquisition leads to a dependency on the feedback (Salmoni, 1984; Schmidt, 1991; Schmidt, Young, Swinnen, & Shapiro, 1989). The guidance forces learners to ignore their intrinsic feedback—that is, proprioception. Evidence for this expectation of performance loss has been given in studies on simple motor tasks applying concurrent feedback or very frequent

terminal feedback (Schmidt & Wulf, 1997; Van der Linden, Cauraugh, & Greene, 1993; Winstein et al., 1996). The guidance hypothesis is also supported by results of studies on visuomotor adaptation in simple motor tasks (Bernier, Chua, & Franks, 2005; Heuer & Hegele, 2008; Sulzenbruck & Heuer, 2011).

The specificity-of-learning hypothesis states that learning involves integration of the most optimal sources of afferent information for performing the given task, thereby surpassing other sources of afferent information—for example, proprioception (Proteau, 1992). Usually, augmented feedback is designed to be this optimal source and becomes part of the task itself. This hypothesis has been supported in studies on simple tasks such as aiming tasks (Proteau, 2005; Proteau & Isabelle, 2002; Robin, Toussaint, Blandin, & Proteau, 2005), visuomotor adaptation tasks (Bernier et al., 2005), arm movement pattern reproduction tasks (Blandin, Toussaint, & Shea, 2008), and a force production task (Ranganathan & Newell, 2009). Accordingly, concurrent feedback may change the task (Schmidt & Wrisberg, 2008), and performance is expected to decrease when the feedback information is withdrawn—that is, performance in the original task. The concurrent information may impose training of a specific control strategy that can be recalled better than the untrained strategy when the task is addressed without additional information. For instance, when concurrent visual information is available, a fast-developing component in visualspatial coordinates—for example, location of sequential target positions—is used to control a movement pattern. When no concurrent visual information is available, a slow-developing component in motor coordinates—for example, muscle activation patterns—is used to preplan movements (Kovacs, Boyle, Grutmatcher, & Shea, 2010).

However, one should be careful in transferring conclusions found in studies on simple tasks to complex task learning (Guadagnoli & Lee, 2004; Winstein, 1991; Wulf & Shea, 2002). Concurrent, as well as very frequent, feedback was found to be detrimental for simple task learning, but this might not be true for complex, sport-related task learning, which is promoted by a meta-analysis (Marschall, Bund, & Wiemeyer, 2007). By tendency, it seems that the more complex the task, the more the trainee can profit from concurrent feedback. One reason could be that concurrent feedback attracts an external focus of attention (Shea & Wulf, 1999), which was found to be beneficial for motor learning, since it "promotes automaticity in movement control" (Wulf, 2007a, p. 4). Another reason might be that in an early learning phase, concurrent feedback can prevent cognitive overload and, therefore, enhance learning of complex motor tasks (Wulf & Shea, 2002). The discovery of the new structure of the movement (Braun, Mehring, & Wolpert, 2010; Wolpert, Diedrichsen, & Flanagan, 2011; Wolpert & Flanagan, 2010) may be facilitated by concurrent feedback



that makes the relevant information more accessible. The guiding role of concurrent feedback might, therefore, have a positive effect by making the complex motor task easier to understand (Huegel & O'Malley, 2010).

In the early learning phase, guidance in the form of concurrent feedback or very frequent terminal feedback has been suggested to be effective (Liebermann et al., 2002). As such, concurrent feedback could also be combined with very frequent terminal feedback, since the latter seems to reduce the dependency on the former by limiting information processing of the concurrent feedback (Blandin et al., 2008). However, when the learner has an idea of the movement—that is, the first phase of learning has been overcome—the learner may profit more from less frequent feedback, either concurrent or terminal. No-feedback trials are needed to develop a persistent internal movement representation, which can be recalled in retention tests when augmented feedback is withdrawn (Crowell & Davis, 2011; Kovacs & Shea, 2011; Winstein, 1991). Thus, the frequency of feedback should decrease with increasing skill level—that is, with decreasing functional task complexity to further facilitate motor learning (Guadagnoli & Lee, 2004; Timmermans, Seelen, Willmann, & Kingma, 2009; Wulf & Shea, 2002; Wulf, Shea, & Matschiner, 1998). Functional task complexity depends on the current individual skill level and changes during the learning process, whereas nominal task complexity remains invariant (Guadagnoli & Lee, 2004).

Different adaptations of feedback frequency to an increasing skill level have been proposed for terminal feedback. Fading feedback—that is, reduced feedback frequency over time—has been shown to be effective (Crowell & Davis, 2011; Kovacs & Shea, 2011). However, the optimal fading rate is commonly unknown. Feedback reduction usually follows a predefined schedule and might, therefore, not be optimal for each individual. To respect individual progress, performance-based feedback adaptions have also been introduced (Huegel & O'Malley, 2010). Bandwidth feedback—that is, feedback when the movement error exceeds (or is within) a certain threshold (Ribeiro et al., 2011) —should force the learner to repeat good trials (Winstein, 1991). Bandwidth feedback has been shown to be effective (Timmermans et al., 2009); however, setting the error threshold is not trivial (Ribeiro et al., 2011). Adverse thresholds could promote maladaptive short-term corrections; that is, the learner corrects irrelevant errors originating from noise in the sensorymotor system (Schmidt, 1991), which may "hinder the development of a stable movement representation" (Chiviacowsky & Wulf, 2002, p. 413). Thus, errors caused by motor noise should be ignored; instead, errors in motor planning should be minimized (van Beers, 2009). Since the brain cannot determine the origin of the current error, it has been suggested that the brain corrects errors only incompletely (Liu & Todorov, 2007) to minimize variance in movement (van Beers, 2009). This matches with a theory of optimal motor control, stating that task-irrelevant errors or variability coming from sensory—motor noise should be left untreated to maximize performance (Liu & Todorov, 2007; Todorov, 2004; Todorov & Jordan, 2002; Wei & Körding, 2009; Wolpert et al., 2011).

Self-controlled feedback allows the learner to determine when feedback should be provided. Advantages of self-controlled feedback are seen in the adaptation to the learner's needs, in that it allows a focus on the current aspect the learner wants to correct, in the promotion of deeper information processing, and in the involvement of the learner in the learning process, resulting in an increased motivation (Wulf, 2007b). Self-controlled terminal feedback has been proven to be more effective than externally imposed terminal feedback in ball throwing (Janelle, Barba, Frehlich, Tennant, & Cauraugh, 1997; Janelle, Kim, & Singer, 1995), in sequential timing tasks with the index finger (Chiviacowsky & Wulf, 2002, 2005), and in a motor perception task requiring walking through virtual sliding doors on a treadmill (Huet, Camachon, Fernandez, Jacobs, & Montagne, 2009).

Self-controlled feedback per se cannot be the only reason for better learning, as Chiviacowsky and Wulf have shown: Subjects who had to decide prior to the trial whether they wanted to receive terminal feedback were outperformed by subjects who could decide after the trial (Chiviacowsky & Wulf, 2005). It seems that feedback is most effective if it is provided after good trials, due to enhanced motivation and positive reinforcement to repeat good trials (Chiviacowsky & Wulf, 2007). Indeed, self-controlled terminal feedback tends to be requested after learners believe that they have performed well (Chiviacowsky & Wulf, 2002, 2005). This ability to request feedback oneself and relate it to one's own performance may promote self-efficacy (Chiviacowsky & Wulf, 2005). This promotion of self-efficacy has been suggested to have more impact on motor learning than wellchosen feedback frequency (Wulf, 2007b; Wulf, Shea, & Lewthwaite, 2010).

Besides self-efficacy, self-estimation of movement error is also stated to facilitate motor learning (Guadagnoli & Kohl, 2001; Liu & Wrisberg, 1997), due to a better development of error detection capabilities (Swinnen, Schmidt, Nicholson, & Shapiro, 1990). Delaying terminal feedback for a few seconds is believed to allow sufficient time for self-estimation of the error to prevent reliance on extrinsic feedback (van Vliet & Wulf, 2006). Therefore, a disadvantage of concurrent feedback might be that self-estimation of the error is hindered. However, to profit from self-estimation of the actual movement error, learners should know the targeted movement in general to be able to self-estimate their performance—a prerequisite that might not be fulfilled in early learning phases (Sigrist, Rauter, Riener, & Wolf, 2011).



To get an idea of the targeted movement, feedback in complex tasks should be prescriptive—that is, feedback should inform the learner on how to correct the error—rather than descriptive (i.e., information about occurrence of an error) (Tzetzis, Votsis, & Kourtessis, 2008). After an internal movement representation has been developed, descriptive feedback is meaningful. Accordingly, terminal feedback facilitates learning as soon as the learner is able to associate the terminal feedback with the prior performance. Before this ability is acquired, prescriptive terminal feedback, but also concurrent feedback, is suggested to be more effective (Sulzenbruck & Heuer, 2011).

Due to the potential of concurrent feedback to enhance learning, concurrent feedback is more and more provided by a variety of technical systems applied in sports and rehabilitation. Most commonly, concurrent feedback is displayed visually, since this is, at first glance, the most natural and easiest way. The effectiveness of visual concurrent feedback and visualization design aspects are discussed next.

Visual feedback: Impact of task complexity and design criteria

Vision is often regarded as the most important perceptive modality during interaction with the environment in daily life. At least for perceiving spatial information, vision dominates other senses (Nesbitt, 2003). Many motor tasks are impossible or, at least, are much harder to perform without vision—for example, walking on an uneven terrain, hitting a tennis ball, or skiing. In the field of motor learning, visual learning strategies such as learning by observation or by imitation, as well as by video demonstration, are wellestablished. Accordingly, several researchers have investigated the effects of visual feedback on learning a motor task. Applied methods and gained results of related studies have revealed that the impact of augmented feedback depends on task complexity and skill level (Timmermans et al., 2009; Utley & Astill, 2008; Wulf & Shea, 2002). Thus, in the first part of this section, feedback provided during simple tasks is discussed separately from that provided during complex tasks. Besides task complexity, the way of visualizing the feedback can influence its effectiveness. Therefore, different visualization approaches are discussed in the second part of this section.

Effectiveness depends on task complexity

Visual feedback in simple tasks

The effects of concurrent visual feedback have often been investigated in simple labor tasks. During acquisition of a simple lever arm movement, a concurrent visual feedback group outperformed a no-feedback group (Schmidt & Wulf, 1997). However, in the retention tests when feedback was withdrawn, accuracy and stability degraded in the feedback group, as compared with the no-feedback group. Similar effects have been reported in studies on simple isometric force production tasks (Ranganathan & Newell, 2009; Van der Linden et al., 1993) or a partial weight-bearing task (Winstein et al., 1996). As compared with terminal feedback, concurrent visual feedback has led to a better performance during acquisition. However, in retention tests, the concurrent visual feedback groups performed worse than the terminal feedback groups. Park, Shea, and Wright (2000) reported concurrent feedback to be effective in a hand force production task, but only in combination with terminal feedback on the same trial and no-feedback trials on alternate trials. The no-feedback trials during the acquisition phase were suggested to be important "to develop intrinsic error detection and correction capabilities" and to avoid dependency on the augmented, extrinsic feedback (Park et al., 2000, p. 294).

In studies on visuomotor adaptation with simple aiming movements, concurrent feedback was less effective than terminal feedback in acquiring the related internal model. In these studies, the feedback about the movement resulted in a transformed cursor movement on the screen. After training, subjects were still adapted to the manipulated feedback if they had practiced with terminal feedback—that is, aftereffects were present—but not with concurrent feedback (Bernier et al., 2005; Heuer & Hegele, 2008; Sulzenbruck & Heuer, 2011). However, contradictory results have also been reported (Hinder, Tresilian, Riek, & Carson, 2008).

The results of the aforementioned studies indicate that concurrent visual feedback is rather unfavorable for learning simple motor tasks. In general, those findings can be explained by the guidance hypothesis, which states that permanent feedback during acquisition leads to a dependency on the feedback (Salmoni, 1984; Schmidt, 1991; Schmidt et al., 1989). However, it cannot be excluded that learning of simple motor tasks may benefit from concurrent feedback if the training includes trials without feedback (Wulf & Shea, 2002) or is combined with terminal feedback (Blandin et al., 2008). Interestingly, in a simple aiming task, training with weak visual feedback (bad contrast on the screen) seemed to allow processing of visual and kinaesthetic information concomitantly, since performance was better in retention tests than after training with full visual feedback or without visual feedback. The weak visual feedback could provide guidance to complete the task, in principle, but also did not prevent the development of a motor program and, thus, according to the specificity of the learning hypothesis, resulted in the most optimal source of afferent information (Robin et al., 2005).



Visual feedback in complex tasks

In contrast to simple motor tasks, learning of complex tasks with concurrent visual feedback has predominantly been reported to be effective. In physical therapy, practice of complex mobilization skills was facilitated by concurrently displayed bars or force-time plots indicating the deviation from the target force: Snodgrass, Rivett, Robertson, and Stojanovski (2010) compared a group receiving combined concurrent and terminal feedback with a no-feedback group and reported superiority of the feedback group in retention tests (Snodgrass et al., 2010). In the study by Lee, Moseley, and Refshauge (1990), the concurrent feedback group also outperformed the no-feedback group (Lee et al., 1990). Chang, Chang, Chien, Chung, and Hsu (2007) reported that subjects benefited equally from terminal and concurrent feedback (Chang et al., 2007). Indeed, these studies in physical therapy showed that concurrent feedback can contribute to enhancement of motor learning. However, it was not shown to be more effective than terminal feedback.

Swinnen, Lee, Verschueren, Serrien, and Bogaerds (1997) reported that concurrent feedback can enhance learning of a 90° interlimb out-of-phase coordination task, whereas Maslovat, Brunke, Chua, and Franks (2009) reported negative effects of concurrent feedback on the same task. Both studies applied the same feedback visualization in the form of Lissajous figures. Lissajous figures display the displacement of one limb on the abscissa and the displacement of the other limb on the ordinate. Consequently, 90° out-of-phase movements would result in a perfect circle. Maslovat et al. (2009) assumed that the contradictory outcome of the studies originates from the fact that in the study of Swinnen et al. (1997), feedback trials alternated with no-feedback trials. Indeed, also for interlimb 90° relative phase coordination, augmented feedback in the form of Lissajous figures was stated to be very effective if nofeedback trials are considered to ensure that the learner can develop an internal movement representation (Kovacs & Shea, 2011). A recent study by Ronsse, Puttemans, et al. (2011), again on interlimb out-of-phase coordination, revealed that young subjects became dependent on visual feedback in the form of Lissajous figures. These findings and, consequently, the guidance hypothesis were corroborated by results from functional magnetic resonance imaging (fMRI) (Ronsse, Puttemans, et al., 2011).

In a study by Wishart, Lee, Cunningham, and Murdoch (2002) of the same task, younger adults could profit from both terminal and concurrent feedback, whereas older adults could profit from concurrent visual feedback only (Wishart et al., 2002). Thus, older adults may experience the task as more complex than younger adults. Since older adults may remain in an attention-demanding phase of learning longer, concurrent feedback can help them to grasp the general

movement pattern. However, once the general movement pattern is learned, in the second phase of learning, feedback trials need to be mixed with no-feedback trials of terminal feedback, which is superior to building up a movement representation relying on feedforward control and online correction based on proprioceptive afferences.

In general, for complex tasks, it is favorable to decrease cognitive demands to prevent cognitive overload. Concurrent feedback may decrease cognitive load since it attracts an external focus of attention (Wulf, 2007a), which has been confirmed in a balancing task on a stabilometer (Shea & Wulf, 1999). Similarly, more frequent, as well as blocked, feedback can also decrease cognitive load (Wulf & Shea, 2002). For learning a complex slalom type movement on the ski simulator, concurrent visual feedback on every trial was more effective than feedback on every second trial (Wulf et al., 1998), and concurrent blocked feedback tended to be superior to concurrent serial (random) feedback (Wulf, Hörger, & Shea, 1999). These studies point out that the application not only of either terminal or concurrent feedback has an impact on learning, but also of feedback frequency—fixed, reduced over time, or self-controlled. Reduced feedback frequency—that is, fading feedbackseems beneficial for both terminal feedback and concurrent feedback, as was shown in studies on training running technique (Crowell & Davis, 2011) and interlimb out-ofphase coordination (Kovacs & Shea, 2011).

Augmented reality—that is, superposition of visualizations on the real environment—is a very popular technology in medicine for enhancing pre- and intraoperative procedures (Sielhorst, Feuerstein, & Navab, 2008). However, concurrent visual feedback provided by a head-mounted display did not enhance learning of a complex hand movement, as compared with instruction only (watch and reproduce) (Yang & Kim, 2002). As also was noted by the authors, the applied superposition of the target movement with a ghost by the head-mounted display might not be optimal for this task, since the field of view was limited and forced frequent head movements. A converse tendency was shown for complex ball-throwing tasks. The concurrent superposition of target angles over the real video image tended to improve performance (Schack, Bockemühl, Schütz, & Ritter, 2008; Schack & Heinen, 2007).

Instead of using augmented reality to provide feedback on top of the real environment, Todorov, Shadmehr, and Bizzi (1997) built a virtual table tennis simulator, which rendered not only concurrent feedback, but the whole training environment. In an experiment, learning of a specific target shot was supported by concurrent visual feedback—that is, superposition of the virtual racket movement on virtual reference racket movement. Thereby, simulator training with concurrent feedback was more efficient than actually hitting more real balls under the supervision of a real



trainer (Todorov et al., 1997). Augmented reality or virtual reality simulators seem to have a great potential to facilitate motor learning. However, to date, knowledge about how to design simulators including augmented feedback in order to exploit their potential is still limited.

In summary, it seems that the more complex a task is, the more the learner can profit from concurrent visual feedback. Positive effects of concurrent feedback have been demonstrated in quite different tasks, such as mobilization in physical therapy (Chang et al., 2007; Lee et al., 1990; Snodgrass et al., 2010), interlimb out-of-phase coordination tasks (Kovacs & Shea, 2011; Swinnen et al., 1997; Wishart et al., 2002), a slalom type movement on a ski simulator (Wulf et al., 1999; Wulf et al., 1998), a balancing task on a stabilometer (Shea & Wulf, 1999), ball throwing (Schack et al., 2008; Schack & Heinen, 2007), running (Crowell & Davis, 2011), indoor rowing (however, without testing retention) (Anderson, Harrison, & Lyons, 2005), and table tennis (Todorov et al., 1997). In early learning phases of complex task learning, concurrent visual feedback can prevent cognitive overload (Wulf & Shea, 2002), make the relevant information more accessible, and help the learner to build up a first movement representation/motor program. If concurrent feedback is provided in subsequent phases, where the motor program is refined, wrong error detection/correction mechanisms are trained because of the dominant visual modality, which is detrimental once the specific source is withdrawn.

Commonly, the effects of concurrent visual feedback have been investigated in complex tasks that are rather artificial than related to any sport, with a few exceptions (Eaves, Breslin, van Schaik, Robinson, & Spears, 2011; Todorov et al., 1997; Wulf et al., 1999; Wulf et al., 1998). Although a few sport simulators incorporating augmented or virtual reality have been developed, such as for rowing (Frisoli et al., 2008; Ruffaldi, Gonzales, et al., 2009; von Zitzewitz et al., 2008), canoeing (Tang, Carignan, & Olsson, 2006), bicycling (Carraro, Cortes, Edmark, & Ensor, 1998; Mestre, Maïano, Dagonneau, & Mercier, 2011), bobsledding (Kelly & Hubbard, 2000), archery (Göbel, Geiger, Heinze, & Marinos, 2010), gymnastics (Multon, Hoyet, Komura, & Kulpa, 2007), and dancing (Drobny & Borchers, 2010; Drobny, Weiss, & Borchers, 2009; Nakamura, Tabata, Ueda, Kiyofuji, & Kuno, 2005), these simulators have not been used to examine the effectiveness of augmented feedback for motor learning or to evaluate different visual feedback designs. The design of a visual feedback may have a significant impact on the outcome; for example, reduced visibility fostered learning more than did fully visible feedback (Robin et al., 2005). Approaches to the design of visual feedback will be reviewed in the next section.

Design aspects of visual feedback

In general, the impact of the type of error visualization—that is, of the actual and the desired motor behavior—on the effectiveness of visual augmented feedback has not been

systematically evaluated so far. Many possibilities exist for visualizing errors in kinematic or kinetic variables, ranging from abstract visualizations, such as simple plots, gauges, bars, lines, or numbers, to less abstract (natural) visualizations, such as 3-D animations or virtual mirrors. A systematic comparison of different visualizations has rarely been done in the field of motor learning: To instruct movement tasks, abstract sketches have been shown to be more effective than real pictures, but also more effective than a very abstract stickman illustration (Kruber, 1984). Animations can have an advantage over real videos, because the animations can be reduced to the most relevant information, as has been shown in an assembly task (Petzold et al., 2004). Since humans can recognize complex biological motions by observing only a few point lights placed on a moving body (Giese & Poggio, 2003), point lights can also provide effective feedback, as has been shown for dancing (Eaves et al., 2011). However, feedback about other complex multidimensional movements in 3-D space might require more natural visualizations. In this section, different types of abstract and natural augmented feedback visualizations are discussed in relation to their effectiveness in enhancing motor learning.

Abstract visualizations

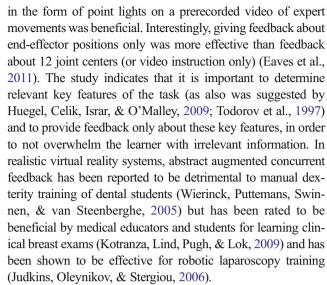
In many simple tasks, the task-relevant variable has been represented on a normal screen in form of lines, curves, gauges, bars, or points (Eriksson, Halvorsen, & Gullstrand, 2011; Morris, Tan, Barbagli, Chang, & Salisbury, 2007; Park et al., 2000; Ranganathan & Newell, 2009; Ruffaldi, Filippeschi, et al., 2009; Schmidt & Wulf, 1997; Shea & Wulf, 1999; Van der Linden et al., 1993; Yang, Bischof, & Boulanger, 2008). In some studies, the actual variable was plotted simultaneously with the target trajectory that was displayed completely at the beginning of the trial (Park et al., 2000; Van der Linden et al., 1993; Yang et al., 2008). In other studies, the target trajectory emerged during the task execution (Morris et al., 2007; Schmidt & Wulf, 1997). An arrow indicating the current score on a scale served as concurrent feedback for a simple weight-bearing task (Winstein et al., 1996). For simple tasks, abstract visualizations might be sufficient, since the small number of relevant variables can be meaningfully represented and cognitively mastered.

In complex tasks, visual feedback has also been provided by abstract visualizations (Crowell & Davis, 2011; Debaere, Wenderoth, Sunnaert, Van Hecke, & Swinnen, 2003, 2004; Eaves et al., 2011; Eriksson et al., 2011; Hurley & Lee, 2006; Kovacs & Shea, 2011; Lee et al., 1990; Lee, Swinnen, & Verschueren, 1995; Maslovat et al., 2009; Shea & Wulf, 1999; Smethurst & Carson, 2001; Snodgrass et al., 2010; Swinnen et al., 1998; Swinnen et al., 1997; Wishart et al., 2002; Wulf et al., 1999; Wulf et al., 1998). For complex interlimb coordination tasks, a displacement–displacement



plot (Lissajous figure) has been used in many studies as an abstract concurrent feedback (Debaere et al., 2003, 2004; Kovacs & Shea, 2011; Maslovat et al., 2009; Ronsse, Puttemans, et al., 2011; Smethurst & Carson, 2001; Swinnen et al., 1998; Swinnen et al., 1997). Usually, the displacement of one limb was represented on the abscissa, the displacement of the other limb on the ordinate. Consequently, for example, a 90° out-of-phase interlimb coordination resulted in a circle configuration; a 135° outof-phase pattern resulted in an ellipse configuration. For a complex 2-D out-of-phase coordination task, Lissajous-type feedback that displayed relative phase of both hands facilitated performance dramatically, but learning was not assessed (Boyles, Panzer, & Shea, 2012). Reference trajectories complemented the Lissajous figure in some studies, giving additional information about the range of the movement (Hurley & Lee, 2006; Kovacs & Shea, 2011; Lee et al., 1995; Maslovat et al., 2009; Maslovat, Chua, Lee, & Franks, 2004, 2006; Wishart et al., 2002). In general, concurrent visual feedback in the form of Lissajous figures was reported to be beneficial for learning a complex coordination pattern. Note that Lissajous figures are commonly not purely concurrent, since the trace of the movement is usually displayed for some time; thus, terminal feedback is provided as well. The challenge of out-of-phase coordination tasks is that two independent effectors have to be controlled in accordance with a common movement plan. The Lissajous figure facilitates this process because it provides a single outcome parameter capturing the relation of both limbs. In these situations, an abstract visualization such as a Lissajous figure seems to be sufficient because the number of relevant movement variables is relatively small.

Similarly, abstract visualizations were shown to be sufficient to enhance learning of other complex motor tasks also with a small number of relevant variables. An oscilloscope could effectively give feedback about the force onset on a skiing simulator (Wulf et al., 1999; Wulf et al., 1998). Accelerationtime plots taught runners how to reduce excessive impact forces (Crowell & Davis, 2011). Force-time plots that indicated the deviation from the target force zone (colored or shaded band) were beneficial in teaching skills in manual therapy (Lee et al., 1990; Snodgrass et al., 2010). In a balancing task on a stabilometer, a bar representing the platform orientation was displayed in relation to horizontal reference bars in order to give effective concurrent feedback about the deviation from the equilibrium (Shea & Wulf, 1999). In a ball-throwing task, concurrently displayed bars representing actual and target joint angles were also shown to be effective in enhancing complex motor learning (Schack et al., 2008). Concurrent visual feedback about relevant rowing variables—for example, in the form of force-angle plots—could enhance rowing performance (Spinks & Smith, 1994), could help to maintain consistency of good rowing performance (Fothergill, 2010), and was valued by rowers and coaches (Smith & Loschner, 2002). To teach dancing skills, superposition of four limb end-effector positions



Abstract visualizations seem to be efficient, since they can represent a key feature of a movement in an unambiguous way. Nevertheless, one should contrast different abstract visualizations prior to their application, in order to prevent any misinterpretation of the design. Moreover, common metaphors should be respected, such as red color standing for "wrong" and green for "correct." However, there are two main disadvantages of abstract feedback designs. First, in the long run, they might become boring and, thus, hinder the learning process by demotivation. Second, feedback about complex multidimensional movements in 3-D space can hardly be abstracted but must be displayed in a more natural way.

Natural visualizations

Natural visualizations incorporate superposition or side-byside 3-D perspectives of a reference and the corresponding user's part. This section reviews the effectiveness of such visualizations, starting with superposition. To pass virtual sliding doors in the correct moment while walking on a treadmill, a superposition of ghost doors with "real" doors (natural visualization) was less effective than gauges (abstract visualization). The authors assumed that the inefficiency of the superposition with respect to feedback errors in walking speed resulted from an interference with the optic flow information (Huet et al., 2009). It may have been more useful to superimpose a virtual ghost avatar walking correctly on the subject's avatar. Such virtual teacher approaches are very popular and, also, effective, as the subsequently discussed studies verify.

In a virtual table tennis environment, the superposition of the performer's racket and the prerecorded expert's racket allowed concurrent feedback about the multidimensional racket movement. The group practicing a table tennis shot in the virtual environment learned the target shot more



quickly than did the group practicing with a real coach (Todorov et al., 1997). Displaying the movements of the body, limb, or end-effector of the learner simultaneously with those of a virtual trainer—that is, of the target movements—forces learning by imitation. No mental rotations are needed, since the learner can place himself/herself virtually inside the teacher in the same coordinate frame (Holden & Dyar, 2002). Accordingly, a virtual teacher has effectively instructed a step-in-place task (Koritnik, Bajd, & Munih, 2008; Koritnik, Koenig, Bajd, Riener, & Munih, 2010), and others have successfully been applied in rehabilitation, focusing also on limb and endeffector movements (Duschau-Wicke, von Zitewitz, Caprez, Lunenburger, & Riener, 2010; Holden & Dyar, 2002; Holden, Todorov, Callahan, & Bizzi, 1999). In contrast, whole-body superposition of learner and trainer did not enhance performance in the case of Tai Chi postures and gestures. Tai Chi was more efficiently learned when the virtual trainer was displayed beside or in front of the learner (Chua et al., 2003). In another study on Tai Chi, a similar visualization—that is, 3-D representations of the teacher and learner next to each other in a virtual reality scenario—was more effective than when the learner was asked to mimic the teacher's movement presented on a video (Patel, Bailenson, Hack-Jung, Diankov, & Bajcsy, 2006). Thus, efficiency of superposition may depend on the amount of superimposed body parts. Too many superimposed parts may overwhelm the learner with too much information; as a consequence, he/she cannot focus on the most relevant ones (Eaves et al., 2011). Focusing on end-effector movements, besides forcing an external focus of attention, might also be beneficial, since end-effector kinematics are believed to play a key role in motor control (Todorov et al., 1997). However, the same goal or end-effector movement can be achieved by different solutions (Todorov, 2004). Thus, in some cases, not only the end-effector, but also the whole-body or limb movement must be optimized to prevent learning of uneconomic and compensatory movements. These assumptions have to be clarified in future studies in order to warrant superposition designs that optimally enhance motor learning.

It might also be important to figure out in which perspective a virtual teacher is most effective in enhancing motor learning. Recent results suggest an advantage of third- over first-person perspectives in a ball-catching task (Salamin, Tadi, Blanke, Vexo, & Thalmann, 2010). Indeed, it was found that first-person views involve other neural processes than do third-person perspectives (David et al., 2006; Kockler et al., 2010; Vogeley et al., 2004). However, virtual teachers for complex motor tasks have rarely been developed, and their design should be systematically evaluated.

In rehabilitation, provision of abstract visual feedback in a realistic, natural virtual environment has also been realized: Instead of a superposition of a virtual reference arm on the patient's virtual arm shown in a natural virtual environment, augmented feedback was given by a semitransparent visualization of a cone and line to display the deviation of the patient's virtual arm from the target trajectory. The patients performed smoother hand movements while being provided with the augmented visual (in combination with auditory) feedback (Huang et al., 2005). The same research group presented an aesthetic feedback design approach, again for a reaching and grasping task. Through exploration of the virtual environment by moving the arm, the user could recognize some embedded rules in the audiovisual feedback, which is the way the authors refer to a "semantic of action" approach. An image assembled or disassembled into particles in the direction of the deviation from the target position, and supination of the forearm was mapped onto the image rotation. Simultaneously, audio features were mapped onto distance, velocity, synchrony, and shoulder extension. The audiovisual feedback assisted subjects in reaching the movement goal (Chen et al., 2006; Wallis et al., 2007). Such an aesthetic feedback approach may motivate the learner to train longer than with a simple and abstract visualization. However, as in many studies involving visual feedback, a comparison with other feedback designs has not been reported, and retention was not tested; thus, conclusions on how visualizations should be designed cannot be drawn in general.

In general, visual concurrent feedback designs are desirable that guide the learner toward the optimal movement without causing a dependency on the feedback. In other words, visual feedback designs are effective when they enable parallel processing of visual and kinesthetic information relevant for movement generation (Wei & Körding, 2009). Thereby, the visual feedback calibrates kinesthetic information (Robin et al., 2005). Visual concurrent feedback may also emphasize the linkage of landmarks or key features of the motor task to kinesthetic information, which may facilitate a recall in no-feedback conditions. Moreover, to reduce dependency on concurrent feedback, the addition of very frequent terminal feedback seems to be helpful (Blandin et al., 2008), which might also be realized by displaying lasting visual traces. These approaches should be evaluated in future studies.

Conclusion on concurrent visual feedback

In simple tasks, the guidance hypothesis as well as the specificity-of-learning hypothesis were confirmed, since concurrent visual feedback increased performance during acquisition, but not during retention tests (Blandin et al., 2008; Proteau, 2005; Proteau & Isabelle, 2002; Ranganathan & Newell, 2009; Robin et al., 2005; Schmidt & Wulf, 1997; Van der Linden et al., 1993). Contradicting the guidance hypothesis, most studies on more complex tasks showed positive effects of concurrent visual feedback (Lee et al., 1990; Shea & Wulf, 1999; Snodgrass et al., 2010; Swinnen



et al., 1997; Todorov et al., 1997; Wishart et al., 2002; Wulf et al., 1999; Wulf et al., 1998). Concurrent visual feedback was suggested to help the learner to access the specific information of the complex task quickly (Camachon, Jacobs, Huet, Buckers, & Montagne, 2007; Huet et al., 2009). Especially in very early learning phases, learners seem to benefit from concurrent feedback (Todorov et al., 1997) because it seems to decrease cognitive load (Wulf & Shea, 2002). If the design that is, the visualization of the concurrent feedback—is inappropriate, positive effects are inhibited even though concurrent visual feedback would actually be effective for learning the task. A next step should be to investigate in parallel the effectiveness of abstract visualizations, natural visualizations such as virtual teachers, weak visualizations that do not block processing of kinesthetic information, and aesthetic, motivating approaches to enhance motor learning. Kinematic and kinetic variables in different tasks should be systematically evaluated prior to a comparison with other feedback strategies.

Auditory feedback: Three different approaches to enhancing motor learning

Auditory perception contributes to elite performance in sports. For instance, top performance in table tennis requires auditory information about the ball bouncing on the table and racket (Hermann, Honer, & Ritter, 2006). Returning a tennis service successfully benefits also from auditory information (Takeuchi, 1993). Although auditory information has an impact on performance, most sports are cognitively mastered in response to visually perceived information. As a consequence, providing additional visual augmented concurrent feedback may overload capacities of visual perception and cognitive processing. To minimize perceptual overload, concurrent feedback could also be displayed acoustically (or haptically). Auditory feedback may not only reallocate perceptual and cognitive workload, but also reduce distraction, since, unlike visual perception, auditory perception requires neither specific athlete orientation nor a focus of attention (Eldridge, 2006; Grond, Hermann, Verfaille, & Wanderley, 2010; Secoli, Milot, Rosati, & Reinkensmeyer, 2011). However, the impact of an auditory feedback depends considerably on the intuitive and correct interpretation of the applied mapping functions and metaphors. Applied functions and metaphors have to be carefully selected, since listening to auditory displays is less common than viewing visual displays.

In the first part of this section, auditory feedback that has been applied in motor learning will be reviewed in the following order. First, the section focuses on studies using an auditory alarm; that is, a sound without any kind of modulation is played as soon as, and as long as, the related movement variable exceeds a predefined threshold. Thereafter, studies are discussed in which movement variables are represented by sonification; that is, their magnitudes and changes over time are represented by nonspeech audio. Finally, studies are reviewed in which the movement error—that is, auditory feedback about the deviation between the actual performance and the target performance—is sonified. Existing ideas for designing a valuable auditory feedback are reviewed in the second part of this section. In the end of the section, an outlook on possible future research directions in the field of concurrent auditory feedback is given.

Auditory alarms

In recent years, auditory alarms have found their way into rehabilitation. For instance, to regain a physiological gait pattern, an auditory alarm was presented to the patient when muscle activity of the affected leg was lower than that of the healthy leg (Petrofsky, 2001), or pressure sensors were placed under the foot sole, providing an auditory alarm when unphysiological loading was present (Batavia, Gianutsos, Vaccaro, & Gold, 2001). When multiple areas under one foot or under both feet were of interest, more than one pressure sensor was integrated in the feedback, and accordingly, multiple alarms differing in frequency were presented to the user (Fernery et al., 2004). On the basis of the first pilot studies, such a kind of auditory feedback about unphysiological loading is said to have the potential to immediately alter gait patterns (Batavia et al., 2001; Fernery, Moretto, Hespel, Thevenon, & Lensel, 2004). This potential has recently been confirmed by a study showing that subjects immediately altered their gait pattern in response to an alarm occurring when predefined angular knee joint positions or accelerations were exceeded (Riskowski, Mikesky, Bahamonde, & Burr, 2009). This immediate modulation of a gait pattern by an auditory alarm was later confirmed for both knee flexion (Helmer et al., 2011) and vertical displacement of the center of mass during treadmill running (Eriksson & Bresin, 2010). However, learning was not assessed in these studies.

Alternations of a movement due to the presentation of an auditory alarm are still present when no feedback is available—for example, during catch trials, or even in transfer tests: After training of a barre exercise in dance, subjects, who had received auditory feedback about excessive foot pronation, significantly reduced the time spent in excessive foot pronation on catch trials, as compared with subjects receiving no feedback (Clarkson, Robert, Watkins, & Foley, 1986). Furthermore, after 2 weeks of training of circles on a pommel horse, an experimental group, which had received an alarm indicating hip flexion greater than 20°, could significantly improve their hip extension, in contrast to a control group, which had trained without feedback. This improvement was still present after 2 further weeks of training without feedback (Baudry, Leroy, Thouvarecq, & Chollet, 2006).



The training of professionals in shooting has also been assisted by auditory alarms that were provided when rifle movements or loading of the front leg exceeded a predefined threshold. The professionals could not improve their shooting performance (Underwood, 2009). It seems that in contrast to beginners, professionals may benefit more from specific information, such as angular displacements in a single joint, than from general information about the endeffector affected by multiple joints and represented by only one alarm.

In summary, an alarm is simple to interpret; athletes can immediately recognize in which direction they have to correct their movement and when the intended performance is gained. However, on the basis of such a discrete feedback, athletes cannot recognize to what extent they have to correct their movement. Recognition of the extent requires a continuous representation of movement data values. Such representations are reviewed in the next section.

Sonification of movement variables

Data values can be used to change the parameters of a sound. This method is termed *audification* if the data values are directly transferred to sound. For instance, the frequency spectrum of electromyographic data is perceivable for humans and can therefore serve as a direct input for loud-speakers. The term *sonification* is used if variables are mapped to sound parameters by a function; for example, each change in force development results in a defined change of the amplitude or frequency.

Sonification is generally applied to explore large amounts of data—for example, to quickly detect irregularities or specific patterns (Kramer, 1994; Walker & Nees, 2011). In this general sense, sonification has also been applied in human movement science: Age-dependent characteristics in electromyographic data have been perceived after assigning a frequency to each surface electrode placed on the *quadriceps femoris* and after mapping monitored activity to the amplitude (Pauletto & Hunt, 2006).

Not only the analysis of movement data can be facilitated by sonification, but also the motor learning itself—in particular, the time-dependent dynamic coordination of the movement (Effenberg & Mechling, 1998). The auditory demonstration of the targeted sequential timing prior to a keypressing task on a keyboard effectively enhanced learning of the relative timing pattern, which has been consistently shown in a few studies (e.g., Han & Shea, 2008; Lai, Shea, & Little, 2000; Shea, Wulf, Park, & Gaunt, 2001). In contrast to these fundamental studies on motor learning, the effect of concurrently presented sonified movement data on sport performance has only rarely been investigated. Chollet, Micallef, and Rabischong (1988) reported on crawl swimmers who could immediately—that is, within the same training session—improve their stability

in velocity on the basis of sonified hydrodynamic pressure at hand paddles. Later on, Chollet, Madani, and Micallef (1992) mapped also the velocity of the waist during crawl to the frequency of a tone, and the training period was extended to 4 days. In a test session on the fifth day, athletes reduced their time to crawl 100 m more than the control group when they received general information first (i.e., about the waist velocity) and general and specific information later (i.e., about waist velocity and pressure at hand paddles). The improved performance associated with an improved coordination of the movement was still present 10 days later—that is, on Day 15. Further experimental groups, which received information in other combinations, showed better performance than the control group only on Day 15. Chollet et al. (1992) concluded that assimilation of information was facilitated when general information was provided prior to other types of information. Since, during the 10 days without training, which were not monitored, other random effects may have influenced the results, this conclusion has to be proven in further studies.

It may also be speculated that the sonified movement motivated subjects in the experimental groups to enhance their effort during the training period. Accordingly, the positive effect of triggering the onsets of elbow and wrist extension by percussions found in a netball task (Helmer, Farrow, Lucas, Higgerson, & Blanchonette, 2010) could be explained: The subjects receiving the auditory feedback were more motivated to repeat the task more often. Motivational effects, as well as emotive effects, are considered in current designs of movement sonifications (Schaffert, Barrass, & Effenberg, 2009). Accordingly, the results of Chollet et al. (1992) may therefore also be explained by improved physiological abilities that would not have been observable immediately after the training period, but a few days later. Although this explanation is only speculative, it still highlights an important issue of future studies on the effect of sonified movements or augmented concurrent feedback: An experimental design should be set up so that it distinguishes between enhanced technical skills and enhanced motivation resulting in enhanced physiological abilities.

Movement variables have also been sonified in sports other than crawl—for example, breast stroke (arm, leg, waist movement; Effenberg, 2000b), karate (timing of wrist and ankle movement; Yamamoto, Shiraki, Takahata, Sakane, & Takebayashi, 2004), ski carving (lateral displacement of ski; Kirby, 2009), rowing (boat acceleration; Schaffert, Mattes, & Effenberg, 2009), and German wheel (its three dimensional orientation; Hummel, Hermann, Frauenberger, & Stockman, 2010). Athletes appreciated the developed sonification and mostly stated that the sonification may have helped them to improve their skills. However, corresponding motor learning studies have not been published so far. Only a movement task on the German wheel was evaluated for novices and experts: Experts could benefit from the sonified movement, but novices

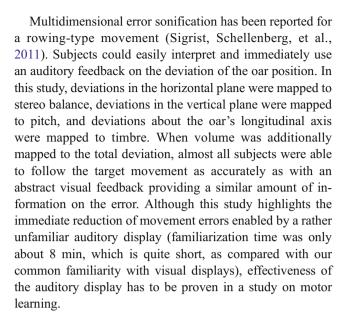


could not (Hummel et al., 2010). Although this statement is based on a limited statistical analysis, it outlines one major limitation of sonified movement variables to be used by novices: If they have no idea of the correct movement sonification, they will not benefit from it.

In general, current literature lacks both a comprehensive identification of movement variables that can be sonified in order to facilitate motor learning and a systematic evaluation of the design of movement data sonification. Movement sonification is useful for facilitating motor learning only if it can be linked to a relatively precise movement representation. To achieve this also at a beginner's stage, a visual or haptic display could guide the learner through the optimal movement, whereby the optimal sonification could be internalized and recalled in no-feedback conditions. Motor learning may be facilitated even more if the optimal movement is displayed simultaneously with the actual movement or if the current deviation between the actual movement and optimal movement is acoustically presented—that is, the movement error is sonified. Studies on this kind of concurrent auditory feedback in human movement science are reviewed in the next section.

Sonification of movement error

Effects of sports training facilitated by auditory feedback, which represents the actual deviation with respect to a reference instead of making the athlete just aware of an error by an alarm, have rarely been investigated. In speed skating, a case study reported that during training, the athlete could benefit from the sonified deviation from a one-dimensional target ankle movement (a harsh sawtooth tone made the athlete aware of the wrong movement; its intensity was proportional to the deviation) (Godbout & Boyd, 2010). In shooting, a one dimensional mapping has also been developed: The deviation of the actual aiming point with respect to the target was mapped to the frequency of a pure tone. The higher the frequency, the smaller was the deviation. A group of conscripts received this feedback in 50 % of 440 training shots, which were distributed over 11 sessions over 4 weeks. As compared with a group of conscripts that saw only the shooting score (knowledge of results), the auditory feedback group improved the shooting score already during the training sessions. Interestingly, the higher score was present in shots both with and without auditory feedback. Besides this immediate benefit of auditory feedback, a significant higher improvement was also observed in retention tests performed 2, 10, and 40 days after the training period. Subjects clearly benefited from auditory feedback, and not by knowledge of results, since in comparison with subjects without any training, improvements based on knowledge of results were not present any more after the first retention test (Konttinen, Mononen, Viitasalo, & Mets, 2004; Mononen, 2007).



In general, it becomes evident that the auditory display has to be designed appropriately in order to reduce the time needed for familiarization: Unfamiliar displays require a certain period of time before athletes can benefit from it, as has been seen in other studies (Baudry et al., 2006; Wulf et al., 1999). Interestingly, related motor learning theories such as the guidance and specificity-of-learning hypotheses have not been examined with auditory feedback, except for auditory demonstration of targeted rhythm prior to the task itself (e.g., Han & Shea, 2008; Shea et al., 2001). The question remains of whether augmented auditory feedback per se induces a dependency on this afferent information, as has been shown for visual feedback, a dependency that is detrimental to performance when the feedback is withdrawn. It is unclear whether auditory feedback per se is as dominant as visual feedback or whether it can provoke a better linkage to kinaesthetic information (with an appropriate design). Existing ideas for designing a valuable auditory feedback in general are discussed in the next section.

Design aspects of auditory feedback

The high number of sound dimensions such as loudness, pitch, or timbre, combined with auditory display attributes such as timing and localization, enable auditory feedback of high-dimensional data (Hermann & Hunt, 2005). This possibility of presenting movement data by a variety of sound dimensions requires a systematic approach to designing an auditory display (Effenberg, 2000a). However, auditory displays were often not systematically evaluated (Dubus, 2012) but, rather, selected in an ad hoc manner (Bonebright, Miner, Goldsmith, & Caudell, 2005). Arbitrarily designed displays may constrain motor learning by reduced motivation, distraction, or misinterpretation. In this section, after presenting a starting point for auditory displays in general,



applicable mappings based on timbre and pitch to one movement variable are presented, followed by suggestions on mappings to more than one movement variable. Thereafter, the impact of the chosen polarity and the potential of music as a carrier signal are elaborated. Finally, the need for a systematic evaluation of the effectiveness of auditory displays is pointed out.

A good starting point for developing an auditory display facilitating motor learning is given by design principles of auditory graphs, which have recently been summarized by Flowers (2005): Perception of data profile changes is facilitated by mapping changes in numeric values to pitch height. Time information is more efficiently provided by rhythmic patterning of a pitch-mapped stream instead of by a stream of clicks or percussion instruments (Smith & Walker, 2005). Key events should be presented by volume changes. Studies on data sonification have revealed that changes in numerical values are preferably not mapped to loudness changes, in order to minimize concerns about interactions between pitch and loudness (Neuhoff, Kramer, & Wayand, 2002). However, studies on error sonification have successfully mapped the total amount of deviation with respect to a target movement to loudness (Drobny et al., 2009; Eriksson et al., 2011; Godbout & Boyd, 2010; Kleimann-Weiner & Berger, 2006; Vogt, Pirró, Kobenz, Höldrich, & Eckel, 2010).

To minimize perceptual grouping, separate continuous data streams should be mapped to different timbres, rather than to different rhythms (Dürrer, 2001). To choose distinguishable timbres, the equally spaced timbre-circle provided by Barrass (2005), based on the work of Grey (1975), could be applied: Opposite timbres—for example, soprano sax and flute—should be easily discriminated.

Pitch height may be an intuitive choice for displaying vertically aligned data—for example, vertical movement position. Accordingly, different pitch heights were used to display obstacle clearance (and subjects could benefit from it) (Erni & Dietz, 2001; Wellner, Schaufelberger, Zitewitz, & Riener, 2008). Furthermore, velocity and acceleration have also been successfully mapped to pitch height: Swimmers improved their performance after training assisted by sonified waist velocity (Chollet et al., 1992), and rowers confirmed that sonified boat acceleration represents the characteristic phases of boat motion (Schaffert, Mattes, & Effenberg, 2009).

While pitch height has also been mapped to one movement variable elsewhere (Ohta, Umegaki, Murofushi, Komine, & Sakurai, 2009), an additional movement variable has often been mapped to loudness (Fox & Carlile, 2005; Ghez, Rikakis, DuBois, & Cook, 2000). However, an evaluation of the interpretability and practicability of such a sonification of multiple movement variables has rarely been done. An exception in view of two sonified dimensional movement variables is given by Effenberg (2000b), reporting on a high acceptance rate of a

sonified breaststroke in terms of longitudinal wrist motion and velocity mapped to pitch and loudness, respectively (Effenberg, 2000b).

One of the most complex, real-time sonifications reported so far was applied to arm movement. Harmonics were used to represent arm position, rhythm represented the smoothness of the movement, and auditory alarms were used to indicate a successful movement, as well as a compensatory movement (the severity of the compensation was mapped to loudness) (Chen et al., 2006; Huang et al., 2005). A pilot study revealed that stroke patients were able to improve the movement of their impaired arm—for example, in terms of smoothness (Wallis et al., 2007). However, the impact of the additionally available visual display (described in the visual section before) remains unclear, and a comparison with differently designed auditory feedbacks in order to evaluate its effectiveness has neither been reported by this research group.

A valuable auditory feedback for motor learning may also be based on the parallel display of the actual movement and the target movement. Different timbres enable parallel displaying of different data streams as seen for auditory graphs (Brown, Brewster, Ramloll, Burton, & Riedel, 2003) and for different frequency bands of an electroencephalography (Hinterberger & Baier, 2005). A further parallel display method presents actual movement data to one ear and target movement data to the other ear. This method was applied in a rowing task without explicitly reporting on its effectiveness (Gauthier, 1985). However, displaying different data streams to each ear might be limited: After two different sequences of words had been presented to each ear, subjects could not report on words heard in the nonattended ear (Bergman, 1994). Displaying data sequentially may overcome this limitation. However, in a sequential display, the duration of the presented movement data is a critical issue, due to the limits of the working memory and of the auditory sensory memory (Flowers, 2005).

Instead of sonifying the actual movement and the target movement in parallel, the difference between them—that is, the error—can also be sonified. Besides pitch height and loudness (Kleimann-Weiner & Berger, 2006; Konttinen et al., 2004), further sound dimensions may then work intuitively, such as stereo balance for deviations in the horizontal plane (applied by Sigrist, Schellenberg, et al., 2011), rhythm for deviations in time, or reverb for the distance to the target (Sigrist, Schellenberg, et al., 2011).

Other design aspects must also be determined with caution—for example, the polarity. Should the feedback indicate where you are relative to the target movement (i.e., provide state-indicative information), or should it indicate how to correct the movement (i.e., provide direction-indicative information)? One may speculate that the direction-indicative polarity will facilitate a corrective movement more than will the state-



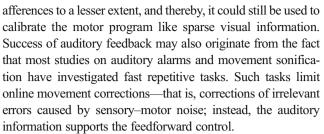
indicative polarity, since the required movement direction is directly presented. This hypothesis is supported by a recent study on immediate effects of multidimensional feedback on a rowing-type movement: When allowed, most subjects chose the state-indicative polarity, which seems to be more intuitive at first glance. However, movement errors were more reduced when direction-indicative polarity was chosen or prescribed (Sigrist, Schellenberg, et al., 2011).

Not only sound dimensions, but also the carrier signal itself can be the subject of auditory feedback design. Most of the reported auditory displays were based on a steady signal, which may get annoying after some time. Music may provide feedback in a more pleasant way, and its modulation has already been successfully applied in a movement synchronization task (Varni et al., 2011). However, if multiple aspects of a movement should be mapped, music as a carrier signal is limited, since continuity is hardly given in its features; thus, multiple error sonification seems hardly possible. An annoying steady signal can also be avoided by a carrier signal based on semantic sounds—for example, represent a high arm position by birds whistling and a low arm position by a frog croaking (Vogt, Pirró, Kobenz, Höldrich, & Eckel, 2009). Such a carrier signal may work for auditory alarms, but neither for movement sonification nor for error sonification, since those sonifications require a continuous mapping to facilitate continuous movement corrections.

In general, several auditory feedback designs have been presented for motor learning, but their interpretability and effectiveness have rarely been evaluated. To establish a general guideline for auditory displays in motor learning, differently designed auditory feedbacks should be compared with each other. Among others, such comparisons may reveal whether abstract sounds facilitate a movement more than do natural sounds (Rath & Rohs, 2006). Additionally, differently designed auditory feedbacks must be evaluated in different movement tasks, since the efficiency of an auditory display is task dependent (Flowers, 2005). The interpretability and effectiveness of the display depend further on the athlete, particularly with respect to age, gender, skill level, and musical abilities (Effenberg & Mechling, 1999). Rhythm and pitch height discrimination depend not on age (as long as young children are not compared with the elderly) but on gender, since females have shown better discrimination abilities (Mauney & Walker, 2007). Higher musical abilities afford a better pitch discrimination (Neuhoff & Wayand, 2002), but in principle, pitch changes of 10 % should be noticeable by almost every healthy learner.

Conclusion on concurrent auditory feedback

Concurrent auditory feedback has been successfully applied in motor learning. In comparison with visual feedback, auditory feedback may hinder processing of other sensory



However, the literature lacks a systematic evaluation of the interpretability and effectiveness of different feedback designs, not only in terms of mapped movement variables, but also in terms of the abilities of the learner itself. Recent technological developments such as real-time monitoring of kinematic data have already found their way into the development of auditory displays (Chen et al., 2006; Rauter et al., 2009; Sigrist, Schellenberg, et al., 2011; Vogt, 2008). These technologies will contribute to overcoming the current initial stage of concurrent auditory feedback in motor learning.

Haptic feedback: Many concepts, few proofs

Especially in human newborns and infants, haptic interaction has a considerable impact on the development and on the motor learning process (Rochat & Senders, 1991). Infants up to 5 months perceive and understand their physical world through their hands without visual control (Sann & Streri, 2007). In our early days, the haptic sense lays the foundation for sensory integration—that is, the organization of sensory information for use in daily life (Ayres, 2005). This is because the haptic sense is the only one that enables us to interact with the world around us and, at the same time, to perceive these interactions (Minogue & Jones, 2006). This unique characteristic is called the bidirectional property of the haptic sense, which provides the basis to further enhance motor learning through haptic interactions (Hale & Stanney, 2004). Thus, it seems natural to investigate the effectiveness of haptic interactions in motor learning: Which haptic interactions enhance learning best for which type of motor task (e.g., simple vs. complex or cyclic vs. acyclic) and for whom (e.g., beginner, expert; or child, adult, elderly)? These questions are addressed in different fields of research: haptic rendering (Höver, Kósa, Székely, & Harders, 2009; McNeely, Puterbaugh, & Troy, 2005, 2006; Salisbury & Srinivasan, 1997), robot-assisted training and rehabilitation (Duschau-Wicke et al., 2010; Emken, Benitez, & Reinkensmeyer, 2007; Lambercy et al., 2007; Marchal-Crespo & Reinkensmeyer, 2009; Metzger, Lamberby, & Gassert, 2012; Nef, Mihelj, & Riener, 2007; Prange, Jannink, Groothuis-Oudshoorn, Hermens, & IJzerman, 2006; Reinkensmeyer, Emken, & Cramer, 2004), motor learning through haptic augmented feedback (Feygin et al., 2002; Flash & Hogan, 1985; Marchal-Crespo &



Reinkensmeyer, 2008b; Reinkensmeyer et al., 2004; Reinkensmeyer & Patton, 2009; Wolpert, Ghahramani, & Flanagan, 2001), and human motor control (Feygin et al., 2002; Flash & Hogan, 1985; Haruno, Wolpert, & Kawato, 2001; Todorov, 2004; Viviani & Flash, 1995).

Among other topics, research on human motor control focuses on motor adaptation within a changing environment (e.g., Shadmehr & Mussa-Ivaldi, 1994), age-related learning (e.g., Takahashi et al., 2003), generalization and transfer of skills from one movement to another (e.g., Conditt, Gandolfo, & Mussa-Ivaldi, 1997; Oakley & O'Modhrain, 2005), internal versus external focus during task execution (e.g., Criscimagna-Hemminger, Donchin, Gazzaniga, & Shadmehr, 2003; Shadmehr & Moussavi, 2000), and internal movement representation (e.g., Haruno et al., 2001; Todorov, 2004). To investigate these topics, researchers have developed devices that provide haptic interaction and assess a subject's performance simultaneously. To study human multijoint limb movement, in the 1980s, the first haptic device with two degrees of freedom (DOF) was built by Mussa-Ivaldi, Hogan, and Bizzi (1985). Since then, many haptic human-machine interfaces have been developed to haptically support and to investigate human motor learning. It is now even possible to use several commercially available haptic interfaces, such as desktop systems, ground and wall-mounted systems, portable systems, and tactile systems. Examples for desktop systems are, for example, the PHANTOM® DesktopTM Haptic Device (www.sensable.com), the 3-DOF omega haptic device and 6-DOF delta haptic device (www.forcedimension.com), Virtuose™ haptic devices (www.haption.com), Novint Falcon (home.novint.com), and Freedom 7S (www.mpbtechnologies.ca). An example for the class of ground and wall-mounted systems is the HapticMaster (Van der Linde, Lammertse, Frederiksen, & Ruiter, 2002). An example for portable systems is the CyberGrasp, and examples for tactile systems are CyberTouch (www.cyberglovesystems.com), STRess (laterotactile.com), and TouchSense® (www. immersion.com) devices.

In this section, haptic strategies are reviewed whose aim is to facilitate human motor learning on the basis of haptic augmented feedback. In particular, the potential of different control strategies for facilitating motor learning is discussed. Since the effectiveness of many control strategies have solely been tested in rehabilitation applications, this section also refers to studies that have been conducted with patients. Detailed design rules for haptic interfaces have already been published elsewhere (O'Malley & Gupta, 2008).

Position-control-based haptic guidance: Feasible for movement instruction?

To facilitate robot-assisted human motor learning, position control is the most restrictive haptic guidance control strategy in terms of position and time. Position control enforces a predefined reference movement of the robot regardless of what the human user intends to do. Thus, from the robot's point of view, the human represents only an external disturbance that has to be compensated for in order to decrease position errors. However, research on motor learning has shown that preventing humans from making errors can be detrimental. It was shown that the process of successful motor learning was prolonged by about 15 times if subjects were prevented from making errors (Scheidt, Reinkensmeyer, Conditt, Rymer, & Mussa-Ivaldi, 2000). Thus, making errors drives motor learning (Emken et al., 2007; Emken & Reinkensmeyer, 2005; Patton, Stoykov, Kovic, & Mussa-Ivaldi, 2006; Reisman, Wityk, Silver, & Bastian, 2007; Thoroughman & Shadmehr, 2000; van Beers, 2009). Nevertheless, position control may be useful for novices who do not know the desired movement at all or for less skilled or impaired subjects who are not physically able to perform a movement task. This hypothesis is supported by the challenge point theory, which states that novices or less skilled subjects may not improve if the task level is too challenging (Guadagnoli & Lee, 2004). Yet the potential of position control to facilitate motor learning has rarely been tested but should be evaluated. Especially in early learning of complex motor tasks, position control may help to acquire a first movement representation.

One of the few studies focusing on position control investigated training of 3-D trajectories with the PHANTOM® device (Feygin et al., 2002). Three different conditions were studied: (1) visual instruction, allowing the subject to watch the end of the robotic arm moving through the target motion; (2) position control guiding the subject, who grasped the end of the visually hidden robotic arm, through the target motion; and (3) a combination of both, enabling the subject to see the robotic arm while being guided through the target motion. Training with vision resulted in a more accurate learning of the trajectory shape than did position control, whereas position control facilitated timing best—that is, the temporal aspects of the trajectory. The best results for shape and timing were obtained when vision was combined with position control. In another study focusing on somehow complex and random movements (without any relation to functional movements), both visual and visuo-haptic training improved short-term retention of a novel path, whereas position control did not result in any significant improvement (Liu, Cramer, & Reinkensmeyer, 2006). In visuo-manual writing tasks, the impact of position control has also been contrasted with force control—that is, when the robot follows a predefined force profile instead of a predefined path (Bluteau, Coquillart, Payan, & Gentaz, 2008). Neither of the controllers facilitated learning of shape aspects of the writing task. However, force control facilitated learning of



kinematic aspects in terms of movement fluidity—that is, number of velocity peaks and mean velocity.

In general, the experiments applying position control did not reveal any significant advantage of position control, as compared with other feedback strategies. This could be due to the instructional character of position control, which might be useful only in an early learning phase. Position control is assumed to be ineffective for motor learning because those motor control loops in the central nervous system between proprioceptive input and motor output are not strengthened even though they are important especially for improving dynamic tasks (Shadmehr & Mussa-Ivaldi, 1994). Furthermore, users behave passively and exert less energy (Israel, Campbell, Kahn, & Hornby, 2006) due to slackness when they execute movements guided by a position controller (Reinkensmeyer, Akoner, Ferris, & Gordon, 2009). Still, position controllers have constituted a basis for more complex control algorithms; thus, some researchers have presented the design of a position controller only as a proof of concept, without further using it in studies related to motor learning (Kousidou, Tsagarakis, Smith, & Caldwell, 2007; Loureiro & Harwin, 2007; Nef et al., 2007; Rauter, von Zitzewitz, Duschau-Wicke, Vallery, & Riener, 2010).

However, using position control as a haptic augmented feedback strategy may still be of use in rehabilitation—for example, through mobilization with a high number of repetitions and to reestablish normative patterns of motor output (Marchal-Crespo & Reinkensmeyer, 2009). In general, position control has the potential to demonstrate an a priori unknown movement to the user, and thus, it has an instructional character. As an instruction, position control may represent the first impetus that starts the process of motor learning, since the need for support depends on the user's skill level (Cesqui et al., 2008).

Haptic guidance beyond position control: Many suggestions, no systematic evaluation

Haptic guidance is an umbrella term for various kinds of haptic augmented feedback strategies that all have in common guiding the human subject through the ideal motion by a haptic interface (Feygin et al., 2002). Commonly, a correcting force pushes the user's limb toward a physiological reference trajectory or posture; for example, the correcting force increases with the deviation from the reference trajectory. Haptic guidance may lead to (1) strengthening of muscles and connective tissue, provoking motor plasticity and preventing stiffening; (2) somatosensory stimulation inducing brain plasticity; (3) reinforcement of the movement pattern by movement repetitions; (4) prolonged trainings by relieving therapists from back-breaking work; and (5) increased motivation due to successful active task completion (Marchal-Crespo & Reinkensmeyer, 2009). Haptic guidance

strategies that allow irrelevant errors caused by noise in the sensory—motor system may mediate not only the new motor program in an early learning phase, but also the improvement of correct error detection/correction mechanisms in a later phase.

Control strategies used for haptic guidance beyond position control are impedance control (Hogan, 1985), admittance control (Van der Linde et al., 2002), path control (Vallery, Duschau-Wicke, & Riener, 2009) (also known as virtual tunnel; Mihelj, Nef, & Riener, 2007), force fields (Vallery, Duschau-Wicke, & Riener, 2009), performancebased adaptive control (Krebs et al., 2003), or combinations of these control strategies. These haptic guidance strategies provide a certain amount of freedom in terms of position and/or timing to the user, in contrary to position control. This freedom may facilitate motor learning (Scheidt et al., 2000) and can vary from completely unconstrained movements in terms of position and timing errors (e.g., provided by zero impedance control; Blaya & Herr, 2004) to completely restricted movements as provided by position control. Intermediate steps from zero-impedance control to position control range from constraints in position (e.g., provided by path control; Khatib, 1986; Vallery, Guidali, Duschau-Wicke, & Riener, 2009), and further over predefined position and soft time constraints (e.g., provided by path control with a flux; Marchal-Crespo, Rauter, Wyss, von Zitzewitz, & Riener, 2012), and further over predefined position and hard time constraints (e.g., provided by path control with a moving time window; Duschau-Wicke et al., 2010), to completely restricted movements in space and time, such as position control. Moreover, haptic guidance can also be provided in temporally (Endo, Kawasaki, Kigaku, & Mouri, 2007; Powell & O'Malley, 2011) or spatially (Gillespie, O'Modhrain, Tang, Zaretzky, & Pham, 1998; Powell & O'Malley, 2011) separated cues (Powell & O'Malley, 2012). Spatial separation of haptic guidance and task-inherent forces could be of importance, since combining those forces might lead to learning the wrong task (Marchal-Crespo & Reinkensmeyer, 2008a). Temporarily separating haptic guidance and task forces, to the contrary, might be important for reducing the user's reliance on the feedback (Li, Patoglu, & O'Malley, 2009; Marchal-Crespo & Reinkensmeyer, 2009). Reliance on haptic guidance might be reduced using paradigms like assist-as-needed or fading feedback (Marchal-Crespo & Reinkensmeyer, 2009; Patoglu, Li, & O'Malley, 2009; Powell & O'Malley, 2012).

In general, control parameters are fixed prior to a study. However, control parameters like stiffness may also be a function of the pose of the haptic interface (Vallery, Duschau-Wicke, & Riener, 2009). Control parameters may further be a function of time or performance; for example, controller stiffness can be adapted in response to the user's current performance and need, which has already been done



(see Krebs et al., 2003; Marchal-Crespo & Reinkensmeyer, 2008b). A further possibility is to vary the control parameters over time and space as a function of the user's performance (e.g., Rauter, von Zitzewitz, et al., 2010).

The control of most haptic guidance feedback strategies is based upon reference trajectories, except for zero impedance control and a few model-based control algorithms (Ronsse, Koopman, et al., 2011; Ronsse et al., 2010; Ronsse, Vitiello, et al., 2011). The reference trajectories are either recorded and postprocessed or artificially generated. Often, the artificially generated trajectories are smooth functions that are based on optimality principles approximating human motor control, such as minimal jerk, minimal torque, and minimal torque change (Todorov, 2004). In a recent control concept, the haptic controller does not rely on reference trajectories and supports arbitrary rhythmic movements of the user. To do so, the controller uses adaptive oscillators that synchronize with the sinusoidal high-level features of the user's movements (Ronsse, Koopman et al., 2011; Ronsse et al., 2010; Ronsse, Vitiello, et al., 2011). Such strategies can be seen as a trade-off between leaving the user in full control of the movement features—that is, trajectory and movement frequency—while still providing a certain amount of assistance/guidance.

Until now, haptic guidance has been successfully applied mainly in simple motor tasks, such as guided point-to-point movements or reaching tasks (e.g., Amirabdollahian, Loureiro, & Harwin, 2002; Flash & Gurevich, 1991; Goodbody & Wolpert, 1998; Loureiro, Amirabdollahian, Coote, Stokes, & Harwin, 2001; Loureiro, Amirabdollahian, Topping, Driessen, & Harwin, 2003; Sainburg & Ghez, 1995; Todorov, 2004), but rarely in complex tasks (except by Brickman et al., 1996; Chen & Agrawal, 2012; Chen, Ragonesi, Agrawal, & Galloway, 2010; Ho, Basdogan, Slater, Durlach, & Srinivasan, 1998; Lewiston, 2009; Marchal-Crespo, Furumasu, & Reinkensmeyer, 2010; Marchal-Crespo et al., 2012; Marchal-Crespo & Reinkensmeyer, 2008b; Oakley, Brewster, & Gray, 2001; Rauter, von Zitzewitz, et al., 2010). The lack of studies on healthy subjects using haptic guidance in complex tasks might be caused by hardly available or affordable haptic interfaces supporting complex tasks in several DOFs and insufficient computer performance to control the desired number of DOFs.

The few existing studies on complex motor tasks revealed that haptic guidance reduces the perceived workload, improves the current performance, and enhances motor learning (Brickman et al., 1996). Furthermore, haptic feedback has been shown to enhance the user's presence and cooperation (Ho et al., 1998; Oakley et al., 2001), which is of great importance for motor learning. For instance, haptic guidance enhanced motor learning in a steering task (Marchal-Crespo & Reinkensmeyer, 2008b) and motor adaption in wheelchair driving (Marchal-Crespo et al., 2010).

In the steering task, haptic guidance was shown to outperform the condition without haptic guidance significantly in terms of driving accuracy. However, users seemed to become dependent on feedback through haptic guidance. promoting the guidance hypothesis. In the wheelchair driving task, haptic guidance was gradually adapted to performance in terms of errors in look-ahead distance and direction and direction change of the users. The results in 22 healthy children and 1 impaired child showed significantly higher learning rates when steering was supported by gradually adapted haptic guidance than without haptic guidance. In a task that required developmentally delayed infants to find their way through a maze while sitting on a mobile robot, haptic guidance by force fields displayed by a joystick was also more effective than no haptic guidance (Chen et al., 2010). All infants who obtained haptic feedback learned to drive through the maze more quickly and more accurately than the control group. These results have been recently extended in a study that showed improvement in driving skills of two subject groups that were trained in wheelchair driving using assist-as-needed and repelling force paradigms, as compared with a control group that did not receive any haptic feedback (Chen & Agrawal, 2012).

Sequential finger-pressing movements in piano playing have also been guided by a haptic device employing magnetic forces. In several experiments and retention tests on auditory-motor short-term memory tasks, the advantage of haptic guidance over auditory feedback and audio-haptic feedback over haptic guidance could be demonstrated (Lewiston, 2009). In future experiments, it would be interesting to see whether the effectiveness of haptic guidance in sequential tasks like piano playing can also be transferred to other tasks.

During the last few years, haptic guidance was also applied in the field of robot-assisted therapy. However, the results are controversial: Some studies reported that patients profit more from conventional therapy than from robotaided therapy (Hidler et al., 2009; Hornby et al., 2008), whereas others reported the opposite (Husemann, Muller, Krewer, Heller, & Koenig, 2007; Lo et al., 2010; Mayr et al., 2007). The reason why conventional therapy through human physiotherapists can still be more effective than robot-aided therapy seems to be based on the fact that a human therapist can adapt his strategy and amount of haptic guidance. This hypothesis seems further to be supported by the results from the steering and the wheelchair experiments described above (Marchal-Crespo et al., 2010; Marchal-Crespo & Reinkensmeyer, 2008b). Thus, feedback adaptation might have in general a large impact on motor learning and should be investigated more intensely in future.

Haptic guidance has not been applied for complex motor task learning in the field of sports, except for a rowing-type



and a tennis-type task. In the rowing task, a conservative force field displayed a virtual tunnel with elastic walls to guide the movement of the oar. The results of a pilot study revealed that the force field was able to compliantly guide a naive subject through a desired trajectory (Rauter, von Zitzewitz, et al., 2010). In the tennis-type task, three different control concepts were implemented—position control, path control, and guidance-as-needed controller—in order to investigate the influence of different haptic guidance concepts on task timing, whereby learning was not assessed (Marchal-Crespo et al., 2012).

Haptic guidance may help beginners to learn complex (sportive) movements in a safe and self-explanatory way (Powell & O'Malley, 2012). For experts, haptic guidance could be effective in teaching detailed technique aspects that can make the difference in professional sports. Since only a few studies have applied haptic guidance on complex motor tasks, which were also quite diverse, the general potential of haptic guidance to facilitate motor learning of complex movements remains open.

Vibrotactile feedback systems need to be evaluated in motor learning

In general, vibrotactile displays have mainly been developed to improve navigation and orientation in order to reduce workload of the visual and auditory system—for example, for steering an airplane (van Erp et al., 2006). Applications in sports are diverse: Vibrotactile displays have been applied to give information about tactics in soccer (van Erp et al., 2006), about the aerodynamic posture in skating and cycling (van Erp, Saturday, & Jansen, 2006), about the coordination of multiple dancers (van Erp et al., 2006), about dancing skills (Nakamura et al., 2005, Rosenthal et al., 2011), or about snowboarding skills (Spelmezan, Hilgers, & Borchers, 2009; Spelmezan, Jacobs, Hilgers, & Borchers, 2009). However, in the field of sports, only in rowing have the effects of vibrotactile feedback on motor learning been evaluated. In a pilot study, learning of an abstract oar trajectory on a rowing simulator was slightly more enhanced by visuo-vibrotactile feedback than by visual or vibrotactile feedback alone (Ruffaldi, Filippeschi, et al., 2009). In another study with expert rowers, no difference between vibrotactile feedback and visual feedback in enhancing timing of knee and back extension could be shown. However, a ceiling effect was present and was assumed to impede learning in either condition (van Erp et al., 2006).

The development of meaningful vibrotactile feedback, as well as practical systems, is challenging (Bark et al., 2011; Rosenthal et al., 2011). Appropriate sites on the body for the vibrators must be found; for example, the vibration must be easy to perceive, and at the same time, the vibrators should not hinder movement. Interestingly, some sites might have

an initial advantage in representing specific information, due to its naturalness; however, the advantage dissolves when users are given enough time to become familiar with less intuitive sites (Stepp & Matsuoka, 2011). Moreover, appropriate signal ranges and modulations (e.g., pulse or amplitude modulation) of the vibration must be evaluated (Stepp & Matsuoka, 2012). The signal should be clear but not irritating or harming. And, as has already been discussed for auditory feedback design, the polarity of the signal must be considered (Bark et al., 2011; Spelmezan, Hilgers, & Borchers, 2009; Spelmezan, Jacobs, et al., 2009). The vibration can be meant either to pull the body part toward the signal (attractive, direction indicative) or to push it away (repulse, state indicative). Intuitive responses to vibrations on different body parts revealed that polarity preferences are mainly individual (Spelmezan, Jacobs, et al., 2009). In a study on learning arm movements with visuo-vibrotactile feedback, neither the attractive nor the repulsive mode was preferred (Bark et al., 2011). In contrast, a preference for the attractive mode was found for initiation of wrist rotations (Jansen, Oving, & Van Veen, 2004) and also for auditory feedback guiding oar movements in rowing (Sigrist, Schellenberg, et al., 2011). The preference for the repulsive or attractive mode might also depend on the vibration properties, since unpleasant vibrations are meant to be avoided, whereas neutral or even pleasant vibrations could attract a movement direction.

Applying a meaningful, intuitive metaphor is believed to be crucial for vibrotactile feedback (Spelmezan, Hilgers, & Borchers, 2009; Spelmezan, Jacobs, et al., 2009), especially if the task becomes more complex (Jansen et al., 2004). Lieberman and Breazeal (2007) took advantage of the sensory saltation phenomenon to give feedback about erroneous arm movements. Thereby, four vibrators around a rotational joint (e.g., wrist rotation) were sequentially pulsing to give a feeling of a rotating signal. A simpler mapping was used for hinge joints; that is, too far inward bending of the wrist resulted in more intense vibration of the actuator placed below the wrist. Results were less promising for feedback for the rotational joints when the rotational signal was applied than with the simpler mapping on the hinge joints (Lieberman & Breazeal, 2007). However, other designs that are also effective for rotational movements can still be found. Detailed studies focusing on design, long-term learning, and practicability of vibrotactile feedback in sports are needed to rate its value. To date, many vibrotactile systems are still in their early phase.

Augmenting the movement errors or the environment

In the last sections, strategies that guided the user to the correct movement (haptic guidance), as well as vibrotactile feedback, were reviewed. In this section, haptic strategies



that augment the environmental conditions to optimally challenge or support the user are reviewed.

In general, the optimal learning condition may be given in an environment that challenges users depending on actual performance, learning progress, individual skills, and biomechanics. Such a challenging environment could be obtained by a controller that can modify spatial and/or temporal features of the target trajectory automatically. To our knowledge, to date, only once has such an approach been realized: a planar tele-operated system that adapted trajectory boundaries online for visuomanual tracking (Garcia-Hernandez & Parra-Vega, 2009). However, the trajectory boundaries in this teleoperated system are obtained by interpolation from a human master's trajectory, not by an automated system.

Another approach that accounts for the demand to support or challenge each user adaptively in an optimal manner has been presented recently. The controller can modify its behavior continuously from haptic guidance by path control to error augmentation through continuous scaling of a torque field (Rauter et al., 2011). So far, a proof-of-concept has been provided; the impact of this controller on motor learning has yet to be evaluated.

Error augmentation, also known as error amplification, amplifies the movement error by disturbing force fields. Since errors drive motor learning (Emken et al., 2007; Emken & Reinkensmeyer, 2005; Patton et al., 2006; Reisman et al., 2007; Thoroughman & Shadmehr, 2000; van Beers, 2009), error augmentation seems to be promising by definition. However, it has been shown that skilled subjects may profit from learning with error amplification rather than from haptic guidance, in contrast to less skilled subjects (Cesqui et al., 2008; Milot, Marchal-Crespo, Green, Cramer, & Reinkensmeyer, 2010). These results are also supported by the challenge point theory stating that advanced users can profit from challenging feedback but novices cannot (Guadagnoli & Lee, 2004). Random noise-based perturbations were shown to be more effective than haptic guidance in one experiment on a path-following task in healthy subjects (Lee & Choi, 2010). For stroke patients, error augmentation in the form of speed-dependent disturbance forces was shown to be more effective than haptic guidance for learning a reaching task (Patton et al., 2006). It has further been found that limb impedance is increased in order to limit movement variations due to perturbations through error augmentation (Takahashi, Scheidt, & Reinkensmeyer, 2001).

In the context of challenging control concepts, control strategies that apply resistance against the executed motion—that is, constraint-induced control concepts—also could enhance motor learning. For example in rehabilitation, such controllers can hinder patients from executing wrong movement patterns, or even restrain the use of single body parts. Due to training against resistances, subjects can increase

muscle strength and self-reported function and further reduce disabilities (Lambercy et al., 2011; Ouellette et al., 2004). Restraining movements of nonimpaired limbs may reduce hyperreliance on healthy limbs and improved impaired limbs (Kolb, 1995; Ogden & Franz, 1917; Ostendorf & Wolf, 1981; Royet, 1991; Sterr et al., 2002; Wolf, Lecraw, Barton, & Jann, 1989). Due to increased motor function, increased functional potential for motor learning, especially in the impaired limbs, could be expected.

Another principle for haptic augmented feedback amplifies the environmental dynamics of a task so that the subjects experience the task dynamics more intensely (Emken & Reinkensmeyer, 2005). The benefit of this "amplification of movement dynamics" has been exemplified in a walking task during which a force field was applied in an upward direction depending on the horizontal velocity of the foot during the swing phase. Subjects were able to adapt 26 % faster to the force field when it was transiently amplified, instead of being kept constant.

Counterbalance-based control—that is, gravity compensation—does not guide the human subject, but it cancels or reduces the experience of the earth's gravitational field. This type of control relieves the human subject from the burden of his/her own limb weight and helps the subject to focus on the motor task. This form of haptic support is mostly used in locomotion training for patients in an orthotic device such as the Lokomat (Hidler et al., 2009; Hornby et al., 2008; Husemann et al., 2007; Mayr et al., 2007). It was not till counterbalance-based controllers had been applied that even heavily impaired subjects could profit from automated treadmill training.

For motor learning, processing of proprioceptive information should be forced when the key features of the movement are performed correctly, and not when they are performed incorrectly (Chiviacowsky & Wulf, 2007; Winstein, 1991). This can be addressed by haptic feedback strategies—for example, error augmentations or emphasizing control. However, until now, such emphasizing control strategies have been neither developed nor investigated in a systematic way.

Conclusion on concurrent haptic feedback

Position control strategies characterize the simplest form of haptic augmented feedback. Especially in patients, they seem to be useful in motor (re-)learning because of their motivational aspect provided through successful task completion and increased training duration and intensity. Still, the strongest feature of position control is its instructional character, which has hardly been investigated and might have been underestimated in the field of motor learning to date. A variety of haptic guidance control strategies have revealed promising results, especially if an adaption to the skill level of the learner was considered. Error augmentation



was shown to outperform other haptic control strategies, since it intensifies error-based learning. Similarly, control concepts that modify the environment seem promising, since the task-inherent dynamics become more obvious to the learner. Other control strategies relieve subjects from their own weight and, thus, might enable learning of tasks that would exceed the learner's physical abilities.

Most results on the effectiveness of haptic feedback have emerged from studies of simple motor tasks, and only a few from complex motor tasks, such as in sports. Vibrotactile feedback devices have been applied in sports, but learning has generally not been assessed. In general, haptic feedback has hardly been tested to be more or less effective than other feedback modalities. There is a need for a more systematic evaluation of haptic feedback in dependence on the task, the subject's current performance, and skill level.

Multimodal feedback is promising

As has been shown in the previous sections, concurrent augmented unimodal visual, auditory, or haptic feedback has been reported to be able to accelerate complex motor learning. However, in daily life, multimodal, rather than unimodal, stimuli are present. Not only are humans used to processing stimuli in different modalities at the same time, but also multimodal information even facilitates acting in the world. For example, seeing a person talking makes understanding easier, as compared with only hearing the person talking (Campbell, Dodd, & Burnham, 1998; Munhall, Gribble, Sacco, & Ward, 1996). Hence, it can be hypothesized that in motor learning, augmented multimodal feedback is more efficient than unimodal feedback. In this section, a theoretical examination for concurrent multimodal feedback in motor learning is given first. Then studies are reviewed that applied audiovisual feedback and visuohaptic feedback. To our knowledge, concurrent augmented audiohaptic, or even audiovisuohaptic feedback, for motor learning has not been investigated so far.

Theoretical considerations promoting multimodal feedback

Researchers have suggested that the threshold of neural activation is reached earlier by multimodal learning than by unimodal learning (Seitz & Dinse, 2007; Shams & Seitz, 2008). Multimodal stimuli are typically perceived more precisely and faster than unimodal stimuli (Doyle & Snowden, 2001; Forster, Cavina-Pratesi, Aglioti, & Berlucchi, 2002; Fort, Delpuech, Pernier, & Giard, 2002; Giard & Peronnet, 1999). This holds true even during active movements (Hecht, Reiner, & Karni, 2008), an effect commonly described as sensory enhancement or intersensory facilitation (Carson & Kelso, 2004). Importantly, it has also been suggested that

multimodal learning strengthens multimodal representations and the connections between the unimodal areas (Shams & Seitz, 2008). Researchers have assumed that, after training with multimodal stimuli, multimodal processing is activated even if only unimodal stimuli are present (Kim et al., 2008; Seitz et al., 2006; Shams & Seitz, 2008). In fact, after training with audiovisual feedback, learning of motion perception tasks was still enhanced even though auditory feedback was withdrawn (Kim, Seitz, & Shams, 2008; Seitz, Kim, & Shams, 2006). Moreover, it has been shown that enhanced performance with multimodal stimuli does not originate from additional alerting effects. Evidence for this conclusion is given by experiments showing that congruent audiovisual feedback was effective for learning the task, whereas incongruent audiovisual feedback was not (Kim et al., 2008). If alerting effects had existed, both conditions would have led to enhanced learning. Related results were presented in brain research. Congruent multimodal stimuli increased cellular activity in a supra-additive manner, which was greater than the sum of individual stimuli. This phenomenon is known as response amplification, which is especially pronounced when cross-modal stimuli are derived from the same events and have a spatiotemporal linkage (Carson & Kelso, 2004). In contrast, incongruent multimodal stimuli led to a subadditive response (Calvert, Campbell, & Brammer, 2000). These findings suggest that multimodal learning can be superior to unimodal learning, due to optimized neural activation and neural representation.

Many researchers believe that the positive effect of multimodal learning originates from a reduction of the cognitive load due to a distribution of information processing. For instance, Burke et al. (2006) has stated that people have different cognitive resources for information processing, even though not all can be used simultaneously without interference. This theory refers to the multiple-resource theory of Wickens (2002), which states that a distribution of information to different modalities is superior than providing the same amount of information in one modality. The multiple-resource theory is in line with Baddeley's (1992) theory of working memory; visual-spatial information is maintained in one area, and auditory-verbal information in another area of the working memory. Both unimodal processors are believed to be controlled by the central executive, declared to be an attentional-controlling system, but being largely functionally independent. This allows extending the working memory by the provision of multimodal information inputs (Baddeley, 1992). Indeed, users preferred multimodal to unimodal interaction when complexity of a task was increased, which indicates that users self-manage resources of the working memory by shifting from unimodal to multimodal interaction with increasing cognitive demands (Oviatt, Coulston, & Lunsford, 2004). All these findings on memory and cognitive load imply that if



workload is high in one modality, augmented feedback should be given in another modality or in a multimodal way. This might prevent cognitive overload and, therefore, might enhance motor learning.

The human senses differ in their capabilities. Vision is very precise in the perception of spatial information, whereas hearing is very precise in the perception of temporal information (Freides, 1974; Nesbitt, 2003; Welch & Warren, 1980). In particular, sound is effective for perceiving periodicity, regularity, and speed of motion (Kapur, Tzanetakis, Virji-Babul, Wang, & Cook, 2005; Kramer, 1994; Nesbitt, 2003). The perception of haptics can fulfill relatively high demands on processing both temporal and spatial information (Nesbitt, 2003) and is believed to be the most direct form of motor information (Lieberman & Breazeal, 2007), because haptic feedback can mechanically change the movement by applying forces on the body. Therefore, it is suggested that augmented information should be displayed in the appropriate modality (Huang et al., 2005), according to the modality appropriateness hypothesis (Welch & Warren, 1980), or in a multimodal way, since imperfect estimations gained by one modality can be improved by more precise information in another modality (Hecht & Reiner, 2009; van Beers, Sittig, & Gon, 1999). Multimodal integration is believed to follow a general principle; thus, the nervous system weights the information available in each modality in an optimal way (reducing final estimation variance), whereas attention can influence these weights (Alais & Burr, 2004; Ernst & Banks, 2002; van Beers et al., 1999). Designs of augmented multimodal feedback should exploit the modality-specific advantages. The optimal display modality or modalities should be chosen in order to gain the most precise perception, but, thereby, the challenge is to prevent a dependency on the augmented feedback. Moreover, a possible trade-off between performance and comfort should be considered. For instance, moving a pen inside a cyclic path was rated to be most comfortable with audiovisual alarm-type feedback, but accuracy was best with tactile or audiovisuotactile feedback (Sun, Ren, & Cao, 2011).

The study of Ronsse, Puttemans, et al. (2011) highlights the importance of choosing the right modality. A visual group was asked to learn an interlimb out-of-phase coordination task with Lissajous figures and could not benefit in terms of learning. For the auditory group, the turning points of the wrist movement were represented by tones during training. Their rhythm should have matched a target rhythm resembling the pattern of a galloping horse, which they could listen to prior to the training. The auditory group did learn; thus, they showed correct coordination even in a retention test. It might be that the auditory group could keep in mind the target rhythm and move their wrist accordingly, even without auditory feedback in retention tests (Ronsse, Puttemans, et al., 2011). Therefore, it might be very

effective to combine movement sonification with either visual or haptic concurrent feedback for learning movements with complex temporal patterns, such as rowing or swimming, since the now well-known sonification might be kept in mind on no-feedback trials.

On the basis of research on learning related to information processing and motion perception, positive effects of the provision of information in a multimodal way can be expected. The question arises as to whether multimodal concurrent feedback also has a positive effect on motor learning. According to the guidance hypothesis and specificity-oflearning hypothesis, how multimodal feedback can be used to calibrate kinesthetic afferent information for later recallthat is, after training—should be examined. Since few studies on augmented concurrent multimodal feedback in motor learning have been published, in the following sections, not only studies on motor learning, but also studies with multimodal feedback on interaction or motor-perception are discussed. The latter studies did not apply augmented feedback about a kinematic or kinetic variable of a human movement, but about a variable of the environment that was relevant for the task.

Audiovisual feedback enhances perception

A meta-analysis on audiovisual (and visuotactile) feedback in tasks activities such as alert, warning, interruption, target acquisition, communication, navigation, and driving or vehicle operation revealed that audiovisual feedback is most effective in single tasks under normal workload conditions. In tasks with a high workload, audiovisual feedback is rather detrimental. In that meta-analysis, it is suggested that the use of both the auditory and the visual channel increases workload because the two modalities are cognitively linked (Burke et al., 2006). However, in interaction tasks studied with navigation simulators, the provision of augmented information in an audiovisual way increased flight performance (Bronkhorst, Veltman, & Van Breda, 1996; Tannen, Nelson, Bolia, Warm, & Dember, 2004) or driving performance (Liu, 2001). These findings are in agreement with the multiple-resource theory described earlier (Wickens, 2002): Since vision is highly loaded in navigation tasks, a distribution of augmented information to the visual and auditory modalities is appropriate. Note that a flight or a drive task has a high demand on cognition, whereas the motor task is quite simple (Todorov et al., 1997).

Not only the representation of audiovisual information in navigation tasks, but also the representation of a movement in an audiovisual way seems to be superior to visual or auditory representation only. In the studies reported by Effenberg (2005), the subjects were asked to estimate the height of a countermovement jump (Effenberg, 2005). The countermovement jump was presented visually on a screen



and/or by sonification of the force on the force plate by loudness and pitch. The audiovisual condition led to the best estimation of the jump height and to the highest reproducibility. Besides the sonification, the no-sound-period during the flying phase of the jump could have facilitated the estimation, since the pause was directly correlated with the jump height. In some cases, temporal aspects of a movement can imply spatial properties of a movement (Liebermann et al., 2002). However, multimodal information could have enhanced performance, due to increased precision of perception, neural activity, and neural representation.

For movements with a small number of relevant variables, such as countermovement jumps, the representation of a single variable by visual and auditory features at the same time can increase task performance. For movements with a high number of relevant variables, providing feedback on different variables in different modalities might be effective. Such an approach was applied in a reaching task: Kinematic variables were each represented in a unimodal way, either by visual feedback (e.g., on hand orientation) or by sonification (e.g., of elbow flexion). Therewith, an engaging, multimodal feedback design was present that enhanced performance during the reaching task (Chen et al., 2006; Huang et al., 2005; Wallis et al., 2007).

Regarding the reviewed studies, it is conceivable that audiovisual concurrent feedback could have positive effects on motor learning. However, in general, retention tests without audiovisual feedback have not been done so far but should be included in future studies in order to assess the impact of audiovisual feedback on motor learning. A systematic evaluation of the effectiveness of audiovisual feedback in motor learning may also complement the theories on multimodal information processing.

Visuohaptic feedback can be effective for spatiotemporal learning

Visuohaptic information was used to enhance task realism, rather than to give augmented feedback. In simple targeting tasks, visuotactile information decreased error rate, as compared with visual information only (Oakley, McGee, Brewster, & Gray, 2000). During navigation in a driving simulator, reaction time and mental effort decreased when visual and vibrotactile displays were present (Van Erp & Van Veen, 2004). In a simple ball-balancing computer game, subjects preferred combined haptic and visual feedback to visual feedback only; however, performance was not enhanced, due to the addition of haptic feedback (Swindells, Unden, & Sang, 2003). Visuotactile displays were reported to be most effective in various tasks with high workload (Burke et al., 2006).

In particular, learning of temporal aspects can be accelerated with haptic guidance (Marchal-Crespo, McHughen, Cramer, & Reinkensmeyer, 2009), which seems also to be true if haptic

guidance is added to visual feedback. In a study on drawing different shapes, Bluteau et al. (2008) showed that the addition of haptic to visual concurrent feedback did not further enhance learning of shape drawing. Instead, movement fluidity was improved by additional haptic guidance, but only if it was force controlled and not position controlled (Bluteau et al., 2008). For visual feedback, the line drawn by the subject was superimposed on the target figure. Haptic feedback was applied when the end-effector movement deviated from the target movement in order to guide the subject back to the target trajectory. Fluidity and speed were also enhanced for handwriting after children had trained with visuohaptic feedback, as compared with classical handwriting training (Palluel-Germain et al., 2007). For learning of a 3-D hand movement, haptic guidance combined with watching the target trajectory was more effective than unimodal training only. Interestingly, training with haptic guidance alone enhanced the timing-related performance, whereas visual training alone facilitated learning of position and shape (Feygin et al., 2002). In dancing, performance was more enhanced while having vibrotactile timing cues than by video instruction; however, retention was not tested (Nakamura et al., 2005).

For trajectory learning, the use of visuohaptic displays to provide augmented information was reported to be beneficial mainly in reducing spatial errors, but not exclusively. In a small study on a simple arm movement, subjects benefited slightly more from visuo-vibrotactile feedback than from visual feedback only and least from vibrotactile feedback only (Ruffaldi, Filippeschi, et al., 2009). To teach children handwriting, visuohaptic feedback training was more effective than visual feedback only (Garcia-Hernandez & Parra-Vega, 2009). In a study on shape drawing, visual and visuohaptic feedback enhanced learning similarly (Yang et al., 2008). Haptic guidance combined with visual instruction was even marginally less effective in teaching a 3-D hand movement than was visual instruction alone (Liu et al., 2006). Since the design of visual and haptic feedback can further be explored and improved, it might be too early to draw strong conclusions on the effectiveness of visuohaptic feedback. In general, related studies suggest superiority over unimodal feedback, especially for training temporal aspects of a movement.

So-called patient-cooperative haptic control strategies have been successfully applied in combination with visual feedback in gait rehabilitation. The haptic assist-as-needed strategy allows patients to control their movements, while still being provided sufficient guidance and support depending on the deviation from the target movement (Duschau-Wicke et al., 2010). Visual feedback incorporated the legs of an avatar of the patient and a second pair of semitransparent legs that indicated the target movements. The impact of the visual feedback and that of the haptic feedback were not assessed separately. Visuohaptic feedback strategies might also be applicable to the field of sports. The lack of studies



in this area might originate from the huge technical effort that is needed to provide augmented haptic feedback for complex movements in sports.

Conclusions on multimodal feedback

The reviewed studies and related theories reveal that multimodal feedback can enhance motor learning. The positive effects are often explained by a reduction of workload, which is believed to be beneficial during complex motor task learning. Relevant information should be provided in an interpretable way and should not overwhelm the learner (Guadagnoli & Lee, 2004), which could be achieved by multimodal feedback designs taking advantage of each modality. Another benefit of multimodal concurrent feedback may be its support of learning of several aspects of a movement simultaneously. For example, augmented visual feedback could facilitate learning of spatial aspects of the movement effectively, and at the same time, auditory feedback could support learning of temporal aspects. However, prior to any comparison of multimodal augmented feedback strategies, feedback designs should be optimized and systematically evaluated.

General suggestions on future application of augmented feedback

Earlier studies on simple tasks found that concurrent feedback is detrimental for motor learning, but more recent studies have revealed that concurrent feedback can be effective if the motor task to be learned is complex (Fig. 1). Particularly in the early, attention-demanding learning phase, concurrent augmented feedback may help the novice to understand the new structure of the movement faster and prevent cognitive overload, which may accelerate the learning process. Concurrent augmented feedback may also be beneficial for experts, since learning of specific details of the movement can be complex, when the expert has to overcome automated but incorrect movement.

Consequently, we suggest that complex motor learning should start with concurrent feedback in order to facilitate an understanding of the movement in principle. Thereafter, it should be switched to lower frequency of concurrent feedback or to terminal feedback to facilitate automation of the movement. Self-controlled feedback offers one possibility for adapting the feedback to the current phase of the learner. The learner decides by himself/herself when he/she wants feedback, about what, and how—for example, in which modality. Besides the self-regulation of feedback frequency, self-controlled feedback has the advantage that it highly involves and motivates the learner (Wulf, 2007b) and may also promote self-efficacy. It might be necessary to let the learner select feedback within some constraints that

are based on motor learning theories—for example, selection of movement features that are meaningful for the current skill level, a feedback frequency within a specified range, or a modality or combination of modalities that is appropriate. Still, selections might not be optimal, because learners' self-estimation of their current performance might be wrong and learners might not have the valuable expertise of a trainer who knows which actions are needed to make progress. Thus, the learner might stick at a certain skill level. A solution to overcoming stagnation in learning is to monitor the learning process and switch the feedback accordingly. An intelligent virtual trainer feedback system, introduced by Rauter, Baur, Sigrist, Riener, and Wolf (2010) can switch feedback modality, feedback variables or movement features, and target thresholds in order to provide optimized and individualized training. With such a system, learners can always be challenged adequately, which is important for successful motor learning (Guadagnoli & Lee, 2004).

In order to prevent cognitive overload in a complex motor task, either augmented feedback may be provided in a modality that has free capacities, or it may be provided in a multimodal way. Multimodal feedback can be applied to exploit the specific advantages of each modality, such as the aptitude of visualizations to display spatial aspects and of sound or haptic feedback to display temporal aspects. In general, it should be started from the relevant variable of the movement (Spinks & Smith, 1994; Wulf et al., 1998) or relevant key features (Huegel et al., 2009; Todorov et al., 1997; Wolpert & Flanagan, 2010). Thereafter, an appropriate modality and augmented feedback design can be selected. It might also be interesting to investigate whether distinct feedback design in a specific modality can lead to a faster minimization of cost functions discussed in optimal motor control theories (Friston, 2011; Todorov, 2004; Todorov & Jordan, 2002). Thus, in terms of future feedback strategies, we suggest evaluating feedback designs in each modality on their interpretability, practicability, and motivational character first.

This review highlights the importance of a comparison of the effectiveness of different feedback strategies presented in different modalities. It also discusses important consequences that can influence the effectiveness of a feedback strategy. Since an external focus was stated to be more beneficial than an internal focus for motor learning (Shea & Wulf, 1999; Wulf, 2007a; Wulf & Shea, 2002; Wulf et al., 2010), feedback should be given about a variable that can force an external focus of attention. Moreover, the provision of feedback about a general variable in early learning phases and about more specific aspects in later phases is advised (Chollet et al., 1992). The feedback should not force the learner to correct task-irrelevant errors (Liu & Todorov, 2007; Todorov, 2004; Todorov & Jordan, 2002; Wei & Körding, 2009; Wolpert et al., 2011). The mapping function



of the feedback should be carefully treated, since a change in perceptual information can alter motor control (Fernandez & Bootsma, 2008; Kovacs, Buchanan, & Shea, 2008). It should be examined whether visual, auditory, and haptic feedback induce a similar dependency, whereby measuring brain activation in different feedback conditions (e.g., Carel et al., 2000; Mima et al., 1999; Weiller et al., 1996), as compared with no-feedback conditions (e.g., Debaere, Wenderoth, Sunaert, Van Hecke, & Swinnen, 2003, 2004) can lead to fundamental insights. Accordingly, it should be explored how this dependency can be minimized, without losing the information that is relevant to calibrating the movement (Robin et al., 2005). In some cases, it can be effective in conveying an effective cognitive strategy to the learners to simplify motor control (Carson & Kelso, 2004), which may be achieved by mediating a metaphor for their pattern of action in a prescriptive way (Schmidt & Wrisberg, 2008). Recently, Krakauer and Mazzoni (2011) suggested that an explicit strategy may help to solve the task, or explicit cognitive processes could enhance implicit processes. Accordingly, augmented feedback might be very effective if it provides information (explicitly) that mediates the relevant aspects of the movement implicitly to best enhance performance in no-feedback conditions.

General conclusions

To date, general conclusions on the efficiency of concurrent feedback cannot be drawn, due to the following main reasons. First, a large diversity of movements have been investigated so far, but a systematic evaluation within movement classes is lacking. Within movement classes, it might be possible to transfer gained knowledge about effectiveness of a certain augmented feedback strategy in the future. Second, a systematic comparison of concurrent feedback with other feedback strategies, such as terminal feedback, is often missing but is necessary to find the best strategy. Third, feedback designs within a modality should be evaluated prior to a comparison with feedback displayed in other modalities. Conclusions such as "visual feedback is more effective than auditory feedback" are weak if the auditory feedback is not well designed. Fourth, this review shows that research on multimodal feedback in complex motor learning is still in its early phases, since not many studies have been reported.

Up to now, mostly low-dimensional, simple, and rather artificial labor tasks have been investigated even though, in real life, most motor tasks are multidimensional and complex (Winstein, 1991; Wulf & Shea, 2002). It is questionable how many of the insights gained from laboratory task can be transferred to other tasks (Krakauer & Mazzoni, 2011) and

whether the results gained from motor control studies are also true for complex learning with augmented feedback. The low number of studies in real-world tasks might be explained by the huge (technical) effort that is needed to cope with the given complexity (Wolpert et al., 2011), especially to provide haptic feedback. However, simulators in virtual environments can facilitate research about augmented unimodal and multimodal feedback in motor learning in sports and rehabilitation (Holden, 2005). Simulators in virtual environments, with their displays providing unimodal and multimodal concurrent and terminal feedback. enable investigation in a safe, modifiable, and realistic environment. Task complexity, feedback designs, feedback variables, and modalities can be manipulated in order to optimally challenge the learner, a main factor for accelerating motor learning (Guadagnoli & Lee, 2004). An optimized combination of simulator training with augmented feedback and real training may be very effective (Todorov et al., 1997) and might be the key for a successful inclusion of simulator training in different sports, such as that suggested for rowing (Smith & Loschner, 2002; Ruffaldi et al., 2011; Sigrist, Rauter, et al., 2011) and skiing (Kirby, 2009). As has been highlighted recently, there is a strong need to more carefully validate the effectiveness of (sports) simulator training—that is, the transferability of the trained skills to the real world (Miles, Pop, Watt, Lawrence, & John, 2012; Ruffaldi et al., 2011).

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