

From embodied metaphors to metaphoric gestures

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Abstract

Humans turn abstract referents and discourse structures into gesture using metaphors. The semantic relation between abstract communicative intentions and their physical realization in gesture is a question that has not been fully addressed. Our hypothesis is that a limited set of primary metaphors and image schemas underlies a wide range of gestures. Our analysis of a video corpus supports this view: over 90% of the gestures in the corpus are structured by image schemas via a limited set of primary metaphors. This analysis informs the extension of a computational model that grounds various communicative intentions to a physical, embodied context, using those primary metaphors and image schemas. This model is used to generate gesture performances for virtual characters.

Keywords: embodied cognition; gesture; metaphor; nonverbal behavior; human-computer interaction

Introduction

Metaphoric gestures turn abstract ideas and discourse structures into the visual and the embodied. For example, holding or weighting a large object can suggest the importance of an idea. Metaphoric gestures also structure the discourse, for example by putting ideas in distinct locations in the physical space to allow referring to them later on or to emphasize their difference. The chosen locations can have a metaphorical meaning as well: for example, events located on the left are understood as being in the past while events on the right are in the future (Calbris, 2011).

When modeling how speakers select gestures to realize a communicative intention, a key challenge arises: how can gestures, that are actions inherently specified in physical terms such as size, location or path, communicate meaningful information about abstract elements that do not have physical features? In other words, where does the semantic relation between abstract referents (such as an important idea) and their gesture portrayal (a big object) come from?

There is evidence that the human conceptual system is embodied and structured by metaphors (Tversky & Hard, 2009). We understand abstract concepts by mapping them to image schemas (embodied experiential concepts) (Lakoff & Johnson, 1980). Reasoning processes are actions taken on these image schemas (Barsalou, 2009). For example, we make sense of the sentence “the price rises” by our understanding that an increase in quantity often correlates with an increase in height. Lakoff and Johnson (1980) and other researchers have studied how conceptual metaphors are reflected on the verbal channel via verbal metaphors. One outcome of their research is lists of conventional metaphors that link abstract

domains to concrete domains (see for example Grady’s list of Primary Metaphors (1997).

There is evidence that these conceptual metaphors also shape gestures (see (Cienki, 2008) for a review). Our previous work proposed a computational model that maps communicative intentions to two highly expressive image schemas (CONTAINER and OBJECT) that are common to a wide range of metaphoric gestures (Lhommet & Marsella, 2014). Although it uses only two image schemas and a restricted set of metaphors to guide the mapping, this model supports the generation of gestures that convey a wide range of communicative intentions. In particular, gestures communicate information about the referent (e.g. depicting a big object to suggest an important idea) and structure the discourse itself (e.g. contrasting facts by assigning them opposite locations in space). This suggests that it is possible to model a large range (if not the whole range) of gestures using a restricted set of image schemas and primary metaphors.

More specifically, such a model of gesture generation:

- allows for a large space of communicative intentions to be mapped to a comparatively small space of concrete elements (image schemas).
- can convey complex communicative intentions via composition over this small set of image schemas.
- guides how properties in abstract propositions (such as “important idea”) can be conveyed by manipulations of the gesture property (size of the gesture).

In this paper, we systematically investigate and extend the coverage of our previous model by using a corpus to study how communicative intentions are mapped to gesture elements via primary metaphors. The first section gives an overview of the computational model. The second section presents the analysis of the corpus. We then describe the implementation by focusing on two examples. Finally, we conclude by mentioning the advances and limits of this approach as well as discussing future work.

Model

This work builds on a previous model of gesture generation that maps communicative intentions (CIs) to a mental space structured by image schemas (Lhommet & Marsella, 2014). This mapping is guided by Grady’s list of primary metaphors (1997), referred to as PMs in the rest of this paper.

This process is illustrated in Figure 1. First, a CI is grounded, i.e. mapped to image schemas that have physical properties using PMs. These properties then inform the generation of a gesture plan that conveys the desired meaning.

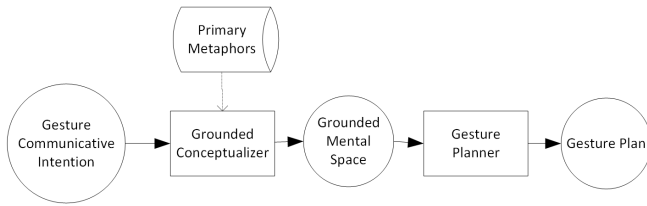


Figure 1: Our model maps CI to concrete elements using PMs to generate gestures.

Communicative Intentions Gesture can express a wide range of information that can complement, reinforce or contradict the information communicated via other modalities (Kendon, 2000). Our model takes as input a CI that describes the meaning that a speaker wants to convey via gesture. This CI contains the minimal set of information required to generate a gesture performance that communicates the intended meaning. For example, a speaker wants to give information about the social status of an individual.

Grounded Conceptualizer The *Grounded Conceptualizer* maps the elements of the CI to image schemas. PMs systematically project the objects, properties and relations from one domain to another¹. For example, the PM SOCIAL STATUS IS VERTICAL ELEVATION links the social status of an individual (or entity) to a location on a vertical scale. Individuals with a lower social status will have a lower location in space, while climbing up the ladder means that they improve their social status.

Grounded Mental Space A grounded mental space is structured by image schemas and actions taken on them. This is in line with the work of Barsalou (2009) and others, that show that the brain regions responsible for perception and action coordinate during meaning creation and comprehension to create “embodied simulations” of linguistic content. This suggests that thought and reasoning processes are actually actions taken on the objects of the grounded mental space. Using our previous example, we can move individuals up and down the social status scale and infer how it impacts their social status.

Since the grounded mental space informs the generation of gesture, it should contain elements that have gesture correlates. For example, the representation of an individual on a social status scale suggests the existence of a concrete OBJECT with a physical elevation in space, and actions of moving up or down.

Gesture Planner Finally, the *Gesture mapper* combines elements of a grounded mental space into a gesture plan. This FML-like output (Heylen, Kopp, Marsella, Pelachaud, & Vilhjálmsón, 2008) can be interpreted by a nonverbal behavior generator (such as (Marsella et al., 2013)) to generate a multimodal performance.

¹This process can be seen as a simplified blending (Fauconnier & Turner, 2008)

Corpus

To help quantify the PMs and image schemas that play a significant role in the generation of metaphoric gestures, we created an annotated corpus of human gesturing. Several criteria were taken into account: 1. the gesturers should be “good gesturers”, 2. have both of their hands visible and free, 3. the discussion topic should be abstract to elicit metaphoric gestures and 4. the discussion should be improvised instead of rehearsed.

Description We used a video² from the footage of the Working Families Summit (Washington D.C., June 23rd 2014). 6 female speakers (a journalist, a politician, two professors, a CEO and an activist) discuss abstract concepts such as time, flexibility, income and social status. The 50 minutes video was chunked into segments that portray only one speaker at a time. Pauses and segments where the journalist holds a pen and a notebook were discarded, leaving a total of 22 videos with a mean duration of 1min 42s (SD=50s), for a total of 37min 32s.

Annotations 2 coders annotated the corpus with VideoAnt³. Coders could freely annotate what they consider as a gesture, then select the CI reflected by the gesture from the following list:

- Generic reference: simple reference to an object or fact
- Specialized reference: reference to an object or fact and depiction of one or several of its properties
- Action: reference to an action
- Discourse structure: enumeration, contrast or causal relationship
- Other: none of the previous categories seems appropriate

They also annotated which element(s) of the gesture convey the desired meaning (e.g. the size of the object depicted, the shape of the motion) and selected the primary metaphor(s) that underlies this association (from Grady’s list of 100 primary metaphors).

The coders were trained using a video segment that was discarded from the corpus. They both carried the analysis on the whole dataset. Inter-coder agreement was .69 using Cohen’s kappa (a kappa value above .61 indicates substantial agreement (Landis & Koch, 1977)). Further analysis indicated that most disagreements were caused by two situations: one coder annotated a movement as a gesture while the other did not consider it as a gesture, or gestures were not perfectly aligned in time. After discussing these cases, a kappa value of .91 was obtained.

²https://www.youtube.com/watch?v=cQB1ciBr_3w

³VideoAnt is a web-based annotation tool developed by the College of Education & Human Development at the University of Minnesota, available at <http://ant.umn.edu>

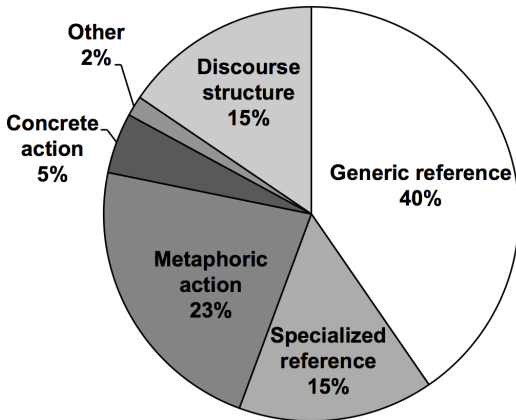


Figure 2: Distribution of CIs in the corpus.

Analysis

The final dataset consists of 740 gestures (with an average of one gesture every 3 seconds). Figure 2 describes the list of CIs that results from the analysis of the corpus.

Generic references 40% of the gestures are known to gesture researchers as “Conduits” (Reddy, 1979). The PM ABSTRACT IS CONCRETE instantiates an object in space to represent a concrete or an abstract object or an element of the discourse. The hand, facing up with an open palm, presents an immaterial object for the viewer to see. The type of the referent has little impact on the gesture shape (McNeill, 2005).

Specialized references 15% of CIs consist in illustrating abstract properties of referents. The following PMs are used in the corpus to map abstract properties to physical properties expressed with gestures:

- *Object location* (46%): location of the object in the physical space
 - SOCIAL STATUS IS VERTICAL ELEVATION (25%)
 - MOMENT IN TIME IS LOCATION (15%)
 - KNOWLEDGE IS LOCATED IN THE HEAD (6%)
- *Object size* (25%): e.g. the distance between two hands or the size of the gap between two fingers
 - QUANTITY IS SIZE (15%)
 - IMPORTANCE IS SIZE (10%)
- *Object shape* (29%): the shape of the hands reflects the shape of the referent
 - ESSENTIAL IS INTERNAL (23%): e.g. palms oriented towards the speaker
 - CERTAIN IS FIRM (6%): e.g. hand shape is a fist

Depicting actions 25% of the gestures represent actions. 20% are metaphoric actions, i.e. prototypical actions that have meaning based on an underlying metaphor (such as depicting improving one’s social status by moving an object up in the physical space). Figure 3 represents the distribution of primary metaphors that underly the generation of metaphoric gesture in the corpus. 5% of the CIs are concrete actions that

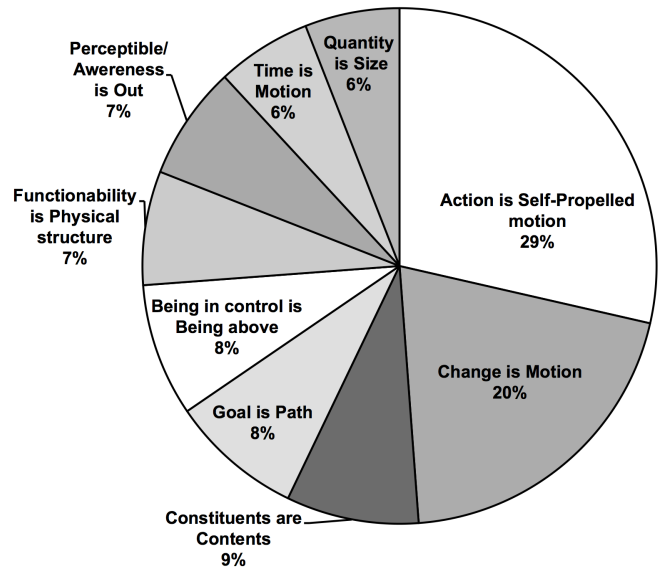


Figure 3: Distribution of the PMs underlying metaphoric actions in the corpus.

mimic an actor acting in the physical space (such as a woman lifting a brick over her head).

The reader familiar with gesture studies may notice that the distribution between concrete and abstract actions differs from what is typically reported, with comparatively few concrete actions and a lot of metaphoric actions. Our view is that this difference is largely due to the nature of the corpora used. Most research on gesture have used corpora about physical phenomena (e.g. retelling a scene from a cartoon (McNeill, 1992) or explaining how to navigate a city (Bergmann & Kopp, 2009)). Therefore, gestures in these corpora reflect concrete actions. Our corpus focuses on abstract topics that do not have concrete features, so most gestures depict metaphoric actions.

Discourse structures 15% of the gestures structure and organize the discourse. Among them, enumerations, contrasts and expression of causality are equally distributed. Half of the enumerations in the corpus are represented as objects sequentially taken out of a container. The other half by counting on fingers. Expression of causality relies on the primary metaphor EFFECTS ARE OBJECTS WHICH EMERGE FROM CAUSES. Contrasting objects over a property relies on the metaphor SIMILARITY IS PROXIMITY where the distance between objects represents how much they differ regarding this property. The property itself can influence elements of the gesture; for example, comparing the social status of two individuals uses the vertical scale while comparing events in time uses the horizontal scale. Our previous work offers additional detail on discourse structures and their relation to primary metaphors (Lhommet & Marsella, 2014).

Others 2% of the gestures communicate intentions that are not covered by the annotation scheme (6 occurrences over 740 gestures). These are gestures that express uncertainty

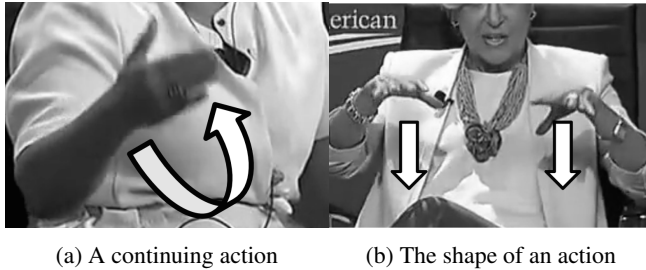


Figure 4: Gestures can depict actions at two levels

(shrugs combined to stereotyped facial expressions) as well as emblem gestures (in particular, the corpus counts two occurrences of “quotes” traced in the physical space).

Implementation

This computational model is implemented into a framework that leverages the Cyc architecture⁴. Cyc embeds a first-order logic reasoning engine that runs forward and backward inferences. The knowledge is hierarchically organized so properties and rules can be propagated along the inheritance links. The previous version of the framework, presented in (Lhommet & Marsella, 2014), can derive gesture performances for several communicative intentions: (a) depicting generic referents, (b) depicting properties of object using elaborate metaphors and (c) realizing enumerations and (d) contrasts .

In the rest of this section, we extend this framework to generate gestures that communicate information about actions. Our corpus analysis showed that gestures can communicate two kinds of information about actions: (a) the status of an action: the speaker on Figure 4a says “In this country we have to continue to do that” while making a loop in the physical space. (b) the physical shape of an action: another speaker says “a lot of countries have horrible cultural mores that are suppressing women” while making the gesture depicted by Figure 4b. This gesture suggests a force applied downwards that represents the control applied on women. It seems driven by the primary metaphor BEING IN CONTROL IS BEING ABOVE.

Communicative intentions are specified using Cyc’s first-order logic declarative language. Script 1 represents the CIs associated to the gestures depicted in Figures 4a-4b, using pseudocode for clarity.

Cyc’s high-level term *Action*, and specializations of this term with more refined meanings, are used to model the CIs. In Script 1(a), *Continuation* specifies that an action previously initiated continues. In Script 1(b), the action is typed as *ExercisingAuthoritativeControl*, a specialization of *ControllingSomething*, which itself inherits from *PurposefulPhysicalAction*. The actor (the mores) and object (the women) of the action are associated to the action using predicates.

Script 1 Communicative intentions to depict actions

(a) Depict a continuing action: “We have to continue to do that”

```
(intention depictAction a)
(isa Continuation a)
```

(b) Depict the shape of an action: “Mores are suppressing women”

```
(intention depictAction b)
(isa ExercisingAuthoritativeControl b)
(performedBy b mores) (objectControlled b women)
```

Primary metaphors are modeled as inference rules that map terms from the CIs to concrete terms that represent image schemas, using Cyc’s forward chaining engine. During the grounding phase, all primary metaphors rules are tested against the contents of a given CI. If the condition side of the rule (i.e. the tuples before the ‘->’ symbol) matches the input, then the predicates in the action side of the rule (i.e. the tuples after the ‘->’ symbol) are set as true. The grounded mental space is created with all the predicates that are true when quiescence occurs (i.e. no rule matches anymore).

Script 2 details the implementation of the primary metaphor BEING IN CONTROL IS BEING ABOVE. Applying this rule to the CI defined by Script 1b) results in adding to the grounded mental space two *Concrete Objects* that represent the mores and the women, and assigning them locations on a vertical scale such as the object representing the mores is located above the object representing the women. Another rule, not depicted here, matches with the fact that the action is a *PurposefulPhysicalAction* and adds a (shape act forceful) predicate to the grounded mental space.

Script 2 Primary metaphor: BEING IN CONTROL IS BEING ABOVE

```
(isa ControllingSomething act)
(performedBy act actor) (isa actor Agent)
(objectControlled a object) (isa object Thing)
->
(isa ConcreteObject actor2)
(isa ConcreteObject object2)
(location actor2 locA) (location object2 locO)
(> locA locO s) (isa s VerticalScale)
```

Gesture plans are derived by another set of inference rules. They convert the grounded mental space into a gesture plan that reflects the physical properties using a FML-like formalism (Heylen et al., 2008). The gesture plans for the mentioned examples are described by Script 3. The system proposed by Xu, Pelachaud, and Marsella (2014) converts this formalism into the standard BML format (Kopp et al., 2006) to be rendered by the SmartBody animation system (Thiebaut, Marsella, Marshall, & Kallmann, 2008).

⁴<http://www.cyc.com>

Script 3 Gesture plans

(a) Depict a continuing action

```
<goal=depictShape shape=cycle/>
```

(b) Depict the shape of an action: “Mores are suppressing women”

```
<goal=depictShape shape=force source=locA target=locB  
scale=vertical constraints=[locA>locB]/>
```

Related Work

Researchers have explored several techniques to automate the generation of virtual humans’ nonverbal behaviors that realize communicative intentions. Earlier systems used manual annotations of the information to convey nonverbally (e.g. (Kopp & Wachsmuth, 2002)). Some systems learn the mapping from speech input to specific classes of nonverbal behaviors (e.g. prosody to beat gestures (Levine, Krähenbühl, Thrun, & Koltun, 2010), text to head movements (Lee & Marsella, 2010) or text to gesturing style (Neff, Kipp, Albrecht, & Seidel, 2008)). Other approaches rely on expert rules that infer information from the speech. BEAT infers rheme and theme from the text to generate intonation and emphasis (Cassell, Nakano, Bickmore, Sidner, & Rich, 2001). NVBG detects communicative intentions in the text (e.g. affirmation, emphasis, disfluencies) using a keywords mapping (Lee & Marsella, 2006). Cerebella integrates acoustic, syntactic and semantic analyses to infer communicative intentions and elements of the mental state (emotional state, energy, emphasis,...) (Marsella et al., 2013; Lhommet & Marsella, 2013). Approaches that take speech as input generate nonverbal behavior that is limited in the range of what can be inferred from the speech utterance only.

Some work address the production of speech and gesture from a joint representation. Bergmann, Kahl, and Kopp (2013) studied how linguistic and cognitive constraints impact the coordination of speech and gesture. Lascarides and Stone (2009) formalize the relation of gesture and speech with a logical form of multimodal discourse, in particular between discourse elements and deictic gestures. In the Gestures as Simulated Action framework, perceptual and motor representations automatically become active during language production and, under certain conditions are sources of gestures (Hostetter & Alibali, 2008).

Discussion

In this paper, we presented a computational model of gesture generation informed by embodied cognition that turns various communicative intentions into gesture by grounding them in a physical, embodied context. Using the analysis of a video corpus, we showed that most CIs present in the corpus can be conveyed using a very limited set of PMs (at the exception of stereotyped gestures that could easily be integrated by providing a direct mapping from specific CIs to these emblem gestures.)

A possible application of this model is the automatic generation of multimodal performances for virtual humans. Virtual humans engage users in face-to-face interactions, ideally using the same verbal and nonverbal behaviors as humans (Cassell, 2000) have proven to be effective in a wide range of applications such as health to training simulations (e.g. (DeVault et al., 2014)). Metaphoric gestures improve message understanding and impact how a speaker is perceived, in particular in terms of persuasiveness and competence (Beaudoin-Ryan & Goldin-Meadow, 2014). This may be another reason why metaphoric gestures dominate in this corpus since all the speakers are professional public speakers. Given that good communication skills, persuasiveness and competence are critical in health interventions and training, metaphoric gestures should be an important capability of virtual humans designed for these applications.

Furthermore, this computational model provides a more controlled yet flexible methodology to experiment with social and psychological constructs; for example, virtual humans can serve as confederates in psychology and social psychology experiments to study the impact of nonverbal behaviors.

A limit to the broad application of this work is the need to manually specify the gesture communicative intent of the speaker. A promising avenue here is the Embodied Construction Grammar (ECG) framework (Bergen & Chang, 2005) that represents a speaker’s intended meaning based on image schemas, along with the mental simulation of these representations using executing schemas (S. S. Narayanan, 1997). Our future work will investigate the integration of our computational model into the ECG framework, in particular applying the work of S. Narayanan (1999) on inferring and reasoning on conceptual metaphors from speech onto gesture.

References

- Barsalou, L. W. (2009). Simulation, situated conceptualization, and prediction. *Philosophical Transactions of the Royal Society B: Biological Sciences*, 364(1521), 1281-1289.
- Beaudoin-Ryan, L., & Goldin-Meadow, S. (2014). Teaching moral reasoning through gesture. *Developmental Science*, 17(6), 984-990.
- Bergen, B. K., & Chang, N. (2005). Embodied construction grammar in simulation-based language understanding. In J.-O. Östman & M. Fried (Eds.), *Construction grammars: Cognitive grounding and theoretical extensions* (p. 147-). John Benjamins Publishing.
- Bergmann, K., Kahl, S., & Kopp, S. (2013). Modeling the semantic coordination of speech and gesture under cognitive and linguistic constraints. In *Intelligent virtual agents* (p. 203-216). Edinburgh, UK.
- Bergmann, K., & Kopp, S. (2009). Increasing the expressiveness of virtual agents: autonomous generation of speech and gesture for spatial description tasks. In *Proceedings of the 8th international conference on autonomous agents and multiagent systems - volume 1* (p. 361-368). Richland,

- SC: International Foundation for Autonomous Agents and Multiagent Systems.
- Calbris, G. (2011). *Elements of meaning in gesture* (Vol. 5). John Benjamins Publishing.
- Cassell, J. (2000). *Embodied conversational agents*. MIT Press.
- Cassell, J., Nakano, Y., Bickmore, T., Sidner, C., & Rich, C. (2001). Annotating and generating posture from discourse structure in embodied conversational agents. In *Workshop on representing, annotating, and evaluating non-verbal and verbal communicative acts to achieve contextual embodied agents*.
- Cienki, A. (2008). Why study metaphor and gesture. In A. Cienki & C. Müller (Eds.), *Metaphor and gesture* (p. 5-25). Amsterdam; Philadelphia: John Benjamins Pub. Co.
- DeVault, D., Artstein, R., Benn, G., Dey, T., Fast, E., Gainer, A., ... Morency, L.-P. (2014). Simsensei kiosk: A virtual human interviewer for healthcare decision support. In *Proceedings of the 2014 international conference on autonomous agents and multi-agent systems* (p. 1061-1068). Richland, SC: International Foundation for Autonomous Agents and Multiagent Systems.
- Fauconnier, G., & Turner, M. (2008). *The way we think: Conceptual blending and the mind's hidden complexities*. Basic Books.
- Heylen, D., Kopp, S., Marsella, S., Pelachaud, C., & Vilhjálmsón, H. (2008). The next step towards a function markup language. In *Intelligent virtual agents* (p. 270-280). Tokyo, Japan.
- Hostetter, A. B., & Alibali, M. W. (2008). Visible embodiment: Gestures as simulated action. *Psychonomic bulletin & review*, 15(3), 495-514.
- Kendon, A. (2000). Language and gesture: Unity or duality. In D. McNeill (Ed.), *Language and gesture* (p. 47-63). Cambridge University Press.
- Kopp, S., Krenn, B., Marsella, S., Marshall, A., Pelachaud, C., Pirker, H., ... Vilhjálmsón, H. (2006). Towards a common framework for multimodal generation: The behavior markup language. In *Intelligent virtual agents* (p. 205-217). Marina del Rey, CA.
- Kopp, S., & Wachsmuth, I. (2002). Model-based animation of co-verbal gesture. In *Computer animation, 2002. proceedings of* (p. 252-257). Geneva, Switzerland.
- Lakoff, G., & Johnson, M. (1980). *Metaphors we live by* (2003rd ed.). Chicago: University of Chicago Press.
- Landis, J. R., & Koch, G. G. (1977). The measurement of observer agreement for categorical data. *Biometrics*, 33(1), 159-174.
- Lascarides, A., & Stone, M. (2009). A formal semantic analysis of gesture. *Journal of Semantics*, 26(4), 393-449.
- Lee, J., & Marsella, S. C. (2006). Nonverbal behavior generator for embodied conversational agents. In *6th international conference on intelligent virtual agents*. Marina del Rey, CA.
- Lee, J., & Marsella, S. C. (2010). Predicting speaker head nods and the effects of affective information. *Multimedia, IEEE Transactions on*, 12(6), 552-562.
- Levine, S., Krähenbühl, P., Thrun, S., & Koltun, V. (2010). Gesture controllers. In *Acm siggraph 2010 papers* (p. 124:1-124:11). New York, NY, USA: ACM.
- Lhommet, M., & Marsella, S. (2014). Metaphoric gestures: Towards grounded mental spaces. In *Intelligent virtual agents* (Vol. 8637, p. 264-274). Boston, MA: Springer International Publishing.
- Lhommet, M., & Marsella, S. C. (2013). Gesture with meaning. In *Intelligent virtual agents* (Vol. 8108, p. 303-312). Edinburgh, UK: Springer Berlin Heidelberg.
- Marsella, S., Xu, Y., Lhommet, M., Feng, A., Scherer, S., & Shapiro, A. (2013). Virtual character performance from speech. In *Proceedings of the 12th acm siggraph/eurographics symposium on computer animation, anaheim, ca* (p. 25-35). New York, NY: ACM.
- McNeill, D. (1992). *Hand and mind: What gestures reveal about thought*. University of Chicago Press.
- McNeill, D. (2005). *Gesture and thought*. Chicago: University of Chicago Press.
- Narayanan, S. (1999). Moving right along: A computational model of metaphoric reasoning about events. In *In proceedings of the national conference on artificial intelligence (aaai'99)*. Orlando, FL.
- Narayanan, S. S. (1997). *Knowledge-based action representations for metaphor and aspect (karma)*. Unpublished doctoral dissertation, UNIVERSITY of CALIFORNIA.
- Neff, M., Kipp, M., Albrecht, I., & Seidel, H. P. (2008). Gesture modeling and animation based on a probabilistic recreation of speaker style. *ACM Transactions on Graphics (TOG)*, 27(1).
- Reddy, M. J. (1979). The conduit metaphor: A case of frame conflict in our language about language. In A. Ortony (Ed.), *Metaphor and thought* (Vol. 2, p. 164-201). Cambridge: Cambridge University Press.
- Thiebaux, M., Marsella, S., Marshall, A. N., & Kallmann, M. (2008). Smartbody: behavior realization for embodied conversational agents. In *Proceedings of the 7th international joint conference on autonomous agents and multi-agent systems* (Vol. 1, p. 151-158). Richland, SC: International Foundation for Autonomous Agents and Multiagent Systems.
- Tversky, B., & Hard, B. M. (2009). Embodied and disembodied cognition: Spatial perspective-taking. *Cognition*, 110(1), 124-129.
- Xu, Y., Pelachaud, C., & Marsella, S. (2014). Compound gesture generation: A model based on ideational units. In T. Bickmore, S. Marsella, & C. Sidner (Eds.), *Intelligent virtual agents* (p. 477-491). Springer International Publishing.