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A Survey on the Animation of Signing Avatars: From Sign Representation to Utterance Synthesis

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ABSTRACT

Signing avatars make it possible for deaf people to access information in their preferred language. However, sign language synthesis represents a challenge for the computer animation community as the motions generated must be realistic and have a precise semantic meaning. In this article, we distinguish the synthesis of isolated signs deprived of any contextual inflections from the generation of full sign language utterances. In both cases, the animation engine takes as input a representation of the synthesis objective to create the final animation. Because of their spatiotemporal characteristics, signs and utterances cannot be described by a sequential representation like phonetics in spoken languages. For this reason, linguistic and gestural studies have aimed to capture the typical and special features of signs and sign language syntax to promote different sign language representations. Those sign representations can then be used to produce an avatar animation thanks to sign synthesis techniques based on keyframes, procedural means or data-driven approaches. Novel utterances can also be generated using concatenative or articulatory techniques.

This article constitutes a survey of (i) the challenges specific to sign languages avatars, (ii) the sign representations developed in order to synthesize isolated signs, (iii) the possible sign synthesis approaches, (iv) the different utterance specifications, and (v) the challenges and animation techniques for generating sign language utterances.

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A Survey on the Animation of Signing Avatars: From Sign Representation to Utterance Synthesis

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ABSTRACT

Signing avatars make it possible for deaf people to access information in their preferred language. However, sign language synthesis represents a challenge for the computer animation community as the motions generated must be realistic and have a precise semantic meaning. In this article, we distinguish the synthesis of isolated signs deprived of any contextual inflections from the generation of full sign language utterances. In both cases, the animation engine takes as input a representation of the synthesis objective to create the final animation. Because of their spatiotemporal characteristics, signs and utterances cannot be described by a sequential representation like phonetics in spoken languages. For this reason, linguistic and gestural studies have aimed to capture the typical and special features of signs and sign language syntax to promote different sign language representations. Those sign representations can then be used to produce an avatar animation thanks to sign synthesis techniques based on keyframes, procedural means or data-driven approaches. Novel utterances can also be generated using concatenative or articulatory techniques.

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1 1. Introduction

Sign Languages (SL) are the primary means of communication for deaf people all around the world. They are natural
languages with their own syntax and set of rules that drastically
differ from oral languages.

Embodied conversational agents called *sign language avatars* or *signing avatars* are a promising way to present information to deaf people in their preferred language while preserving the anonymity of the signer. Avatars are also more flexible
and interactive than 2D-video recordings of signers. Indeed, Preprint submitted to Computers & Graphics editing sign language content is simplified using avatar animations which can be customized to suit the needs of their users, for example by slowing down the stream of signs, changing their viewpoint, or even adapting the appearance of the agent. The great configurability of avatars allows them to be used in various applications, such as interfaces for bilingual dictionaries or for translators between a specific sign language and a specific oral language, or recreational learning instances.

Depending on the final application, the approaches to generate sign language animations will differ. The creation of an online bilingual dictionary will require the synthesis of isolated September 2, 2020



signs in their citation form, i.e. not inflected by a sentence context. On the contrary, an application of translation into sign lan-2 guage will require a mastery of grammatical rules and the use з of contextualized and coarticulated signs to generate correct ut-4 terances. In both cases, the isolated signs, like the utterances, 5 must be as precise and natural as possible. This survey aims at 6 presenting the different steps and various methods that are currently used to animate SL avatars whether at a sign or at an ut-8 terance level. This survey does not to cover machine translation 9 issues: techniques for translating any oral language into any 10 sign language are beyond the scope of this paper. Moreover, we 11 focus on the animation of the manual features; a complemen-12 tary survey, dedicated to the animation of facial expressions for 13 sign language avatars, was proposed by Kacorri [1]. 14

The remainder of the article is organized as follows: general 15 information on sign languages and on avatars motion are given 16 in Section 2. The scientific issues and challenges of signing 17 avatar animation are detailed in Section 3. The process of iso-18 lated sign synthesis is described in Section 4. Utterance synthe-19 sis is presented in Section 5. Section 6 presents existing work 20 on signing avatars. Finally, Section 7 compares and discusses 21 the presented techniques. 22

23 2. General Information

24 2.1. Sign Languages

Sign languages are visual-gestural languages used by an important part of the deaf population. While oral languages mainly rely on the voice to convey a message and on the audio channel to receive it, sign languages use different sensory channels. The movements of the whole body and facial expressions are used to produce a message which is interpreted by the interlocutors via their visual channels.

Sign languages are languages in their own right that have been developed naturally over time by Deaf¹ communities to communicate. They have their own vocabulary, called *signary*, and precise grammatical rules. They are rich languages that, thanks to their visual and gestural aspects, can take advantage of the possibilities of space to tell stories, communicate information, describe situations with precision, date temporal events, make poetry, jokes, etc.

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There is not just one universal sign language that would al-40 low all deaf people around the world to communicate. Sign 41 languages were born naturally from the need to communicate 42 of the Deaf themselves [3]. As a result, there are as many sign 43 languages as there are Deaf communities. Even if many coun-44 tries present a single official sign language (e.g., French Sign 45 Language, Brazilian Sign Language), there is no direct corre-46 spondence between countries and sign languages: several sign 47 languages can be present in the same country and one sign lan-48 guage can extend beyond the borders of a country (e.g., Indo-49 Pakistani Sign Language). And, like with oral languages, there 50 are regional variants. Moreover, while some sign languages like 51 British Sign Language and New Zealand Sign Language can be 52 considered as dialects of a specific sign language (BANZSL: 53 British, Australian, and New Zealand Sign Language) as they 54 share a common syntax and have a lot of lexical overlaps, others 55 are mutually unintelligible such as, surprisingly, British Sign 56 Language and American Sign Language [4]. Sign languages can differ in their signary (e.g., the sign for [DOG] in British 58 and French Sign Language are very different: in British Sign 59 Language, the signer uses both hands following the movement 60 of the dog's front legs while, in French Sign Language, only 61 one hand is used and is more akin to the movement of a dog's 62 tail), in their grammar (e.g., some examples of the differences 63 in the interrogative constructions between 35 different SL are 64 described in [5]), or in the nature and frequency of use of their 65 fingerspelling alphabet (British Sign Language relies on a two-66 handed alphabet while French Sign Language has a one-handed 67 alphabet). Finally, an international signary exists called Inter-68 national Sign (IS) that can be used by deaf people who lack a 69 common sign language. 70

2.2. Movement of Avatars

In 3D traditional animation, an avatar is represented by a ⁷² complex 3D mesh in the shape of a virtual humanoid. It can ⁷³

¹We distinguish here the "deaf" and "Deaf" spellings: lower-case "deaf" refers to the pathological aspects of deafness while the capitalized "Deaf" designates its cultural dimension [2].

be animated thanks to a *skeleton* which is a tree structure composed of rigid segments (*bones*) connected by *joints*. A *pose* or *posture* is the state of the skeleton at a given time or frame, described by the position and orientation of each joint. The pose *X*(*i*) of the skeleton at frame *i* is therefore defined as:

$$X(i) = \{(pos(i, 1), orient(i, 1)), orient(i, 2), ..., orient(i, n)\}$$
(1)

⁶ where *n* is the total number of joints in the skeleton, ⁷ (*pos*(*i*, 1), *orient*(*i*, 1)) is the absolute position and orientation ⁸ of the root joint at frame *i* and *orient*(*i*, *j*) with $j \ge 2$ is the ⁹ relative orientation of the joint *j* at frame *i*.

¹⁰ A *motion* M is a sequence of k poses: $M = {}^{11} {X(1), X(2), ..., X(k)}$. Its duration is equal to $k * \Delta t$ where Δt ¹² is the timestep between two poses.

Forward and Inverse Kinematics (FK and IK resp.) are the 13 main techniques used to synthesize the poses of the avatar. FK 14 consists in computing a skeleton pose from the explicit speci-15 fication of the position or orientation of all the joints. IK, the 16 inverse problem, traditionally consists in computing the orien-17 tations of the joints of an articulated chain in order for some 18 joints (often its end-effectors) to reach specific positions or ori-19 entations. Different kinds of constraints, among which joint 20 limits, may be added to the system to eliminate physiologically 21 impossible solutions. In order to have a constant Δt , in-between 22 poses for a given frequency can be interpolated. 23

Standard file formats, like *BVH* or *FBX*, are designed to record motions. Generally, the skeleton's hierarchy is specified and the corresponding sequence of poses is stored in the form of a sequence of numerical values. The *FBX* format can, in addition, store the 3*D* mesh of the avatar as well as other features.

This paper focuses on the skeleton motion synthesis in the case of sign language generation. The skinning and rendering steps, which consist in computing the deformation of the *3D* model and in displaying the resulting animation are beyond the scope of this paper.

3. Linguistic Background and Challenges

A sign is a lexical unit of sign languages as is a word to oral languages. An utterance is close to the concept of "sentence" in oral languages: it is composed of signs, performed sequentially or at the same time (*co-occurring* signs), and presents the statement of an idea.

Sign and utterance synthesis are two inherently different pro-41 cesses as sign synthesis is the process of generating the skeletal 42 animation of an isolated sign while utterance synthesis consists 43 in the animation of a whole sign language sentence and there-44 fore requires a more extensive knowledge of sign language lin-45 guistics and involves different mechanisms than the generation 46 of isolated signs. Sign language grammar must be taken into ac-47 count in order to produce a consistent sign language utterance. 48

In this section, two linguistic approaches are presented. They 49 integrate the main linguistic mechanisms of SL and can be used 50 to animate signing avatars. The first one, the parametric ap-51 proach, applies to a phonological level and is mainly used for 52 the synthesis of isolated signs. The second one characterizes 53 the sign inflection mechanisms. It addresses the more variable 54 aspects of the language at a lexical level and should be particu-55 larly taken into account during utterance synthesis. 56

3.1. The Parametric Approach for Isolated Sign Synthesis 3.1.1. Sign Language Phonology

Sign language phonology is born from the need to give a 59 structure to SL and, this way, to make a parallel between signed 60 and oral languages. In oral languages, phonemes are units of 61 sound that compose words and make it possible to distinguish 62 one word from another. Minimal pairs are two words that have 63 an identical pronunciation except for one phoneme. Minimal pairs are used to determine the phonemes relative to one lan-65 guage. For example, the words "tad" and "dad" compose a mini-66 mal pair that illustrates the existence of two separate phonemes, 67 /t/ and /d/ in English.

Moreover, the existence of a phonological system leads to the validation of the *double articulation* principle [6]. This principle claims that human languages can be segmented on two levels: a first level linking an element with a meaning (in oral lan-72

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guages, a word is the element of minimal size for the first level) and a second level composed of distinctive units without mean-2 ings (the phonemes). Here again, SL phonology constitutes a з way to create a bridge between oral and sign language linguis-4 tics. In the case of SL, the parametric approach states that a sign 5 is a sequence of discrete values taken by SL phonological com-6 ponents. These components often refer to five elements, three 7 of which (the hand configuration, the hand placement and the 8 hand motion) have been described in 1960 by Stokoe [7], one, 9 the hand orientation, was specified in 1978 in the work of Bat-10 tison [8] while the non manual features were later added to the 11 definition: 12

1 - Hand configuration corresponds to the overall shape of the hand characterized by the disposition of the fingers. Each configuration corresponds to a discriminating and meaningful posture of the hand (see Fig. 1). Researchers do not agree on the number and nature of hand configurations. For French Sign Language (LSF), Cuxac lists 39 configurations [9]² while Boutora identifies 77 configurations [10] and Millet 41 [3].

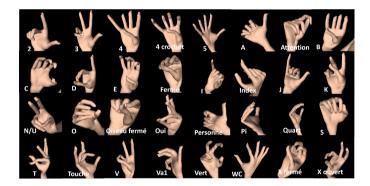


Fig. 1. Hand configurations: the 32 configurations of the *Sign3D* project [11].

20 2 - Hand placement is the location of the hand in the signing space or on the body of the signer. Depending on the field
of study, it is defined differently. In linguistic studies, hand
placement, also called *anchoring* [3, 12], is often the global area
where the sign is produced (neutral space in front of the signer,
eyes, hand palm, etc.) in its *citation form* [13, 14, 15] (also
called "uninflected form" [16], i.e. deprived of any syntactic

context). For the computer animation community, it can either designate the precise Cartesian coordinates, or the discrete area where the hand is positioned at a precise time. When Cartesian coordinates are used, the hand placement often changes during the realization of a sign. When discrete areas are used, the hand placement may vary depending on the sign and the granularity of the partition of the signing space (see Fig. 2).

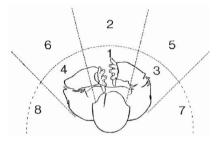


Fig. 2. Hand placement: example of a discretization of the signing space (extracted from [17]).

3 - Hand movement represents the trajectory of the wrist over time. Contrary to discrete placement or hand configuration which take a value in finite sets, hand movement is continuous and can represent any trajectory.

4 - Hand orientation is defined by the direction of the hand palm and of the palm normal (see Fig. 3). It is strongly con-39 strained by the hand movement and the human physiological 40 limits. However some minimal pairs distinguished only by the 41 orientation exists (e.g., in LSF, [MAISON] (house) and [DE-42 MANDER] (to ask) are such a minimal pair; their configura-43 tion, movement and placement are similar while the hand ori-11 entations are different: in [MAISON], the direction of the palms 45 is upwards while in [DEMANDER], the palms are oriented to-46 wards the interlocutor in front of the signer.). 47



Fig. 3. Hand Orientation: definition of the axes.

5 - Non-manual features (NMFs) include the facial expressions, the mouthing, the gaze and torso direction. NMFs and, 49

²His list identifies up to 41 hand configuration counting the hand configuration alternatives. He specifies that it is not a "closed inventory".

particularly, the facial expressions, have many functions in SL: (i) they are often considered (but not always [3]) as a phono-2 logical component ([GAGNER] (win) and [DOMMAGE] (too bad) in LSF are a minimal pair only distinguished by the facial expression: the first is done with a happy expression while 5 the second is done with a sad expression), (ii) they can also press the affect (surprise, fear or anger hues can be added to the message with the adequate facial expression), or (iii) have syntactic roles (e.g., a raise of the eyebrow can indicate 9 a question while a swelling of the cheek can add information 10 about the width of an object). Those functions can co-occur 11 in signs and utterances and must be managed in synthesis 12 systems [18]. 13

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A sign is therefore a sequence of values taken in parallel 15 by each of these components in finite sets (hand configuration, 16 hand placement) or infinite sets (hand movement, hand orien-17 tation). However, while in vocal languages, words are formed 18 with a simple sequence of phonemes, in sign languages, com-19 ponents take on values simultaneously in addition to having a 20 sequential aspect. To designate this particularity, we refer to 21 sign languages as multilinear languages [19]. 22

23 3.1.2. Challenges for Sign Synthesis

The construction of signs following the parametric approach consists in creating signs from scratch by combining, on one virtual character, the phonological parameters whose values have been fixed. In this case, we consider that a sign is the exclusive result of the values taken by its parameters.

This approach mainly aims at creating signs with relatively stable parameters. We are therefore more interested in signs in their citation form, i.e. without a syntactic context. This context can be added in a second step, as described in Section 3.2.

The parametric approach is beneficial for movement synthesis and signing avatar animation because the decomposition of language into atomic elements allows each component to be treated independently before synchronizing the different channels, and this theory offers a way to represent a language production in the form of a sequence of targets to be reached. However, the implementation of a phonological recombination system raises some challenges: 40

Definition of a corporal mapping between the phonological 41 elements and the set of joints (i.e. the *channel*) of the model to 42 be animated. Indeed, if we want to assign the value taken by 43 a phonological parameter to an avatar, it is necessary to define 44 a mapping between the parameter in question (e.g., the hand 45 configuration) and the articulations affected by this parameter 46 (e.g., the fingers joints). 47

Representation of the objective. In order to specify the sign48to be synthesized, the values taken by the different parameters49of the sign must be made explicit. This representation can, in50addition, contain information on the synchronization of the ele-51ments between the body channels.52

Intra-channel coarticulation. During the realization of a ⁵³ sign, the change from one parameter value to another (e.g., a ⁵⁴ hand configuration change) must be managed in order to have a ⁵⁵ smooth and realistic motion. ⁵⁶

Synchronization of the body channels. To obtain the desired meaning, the channels must be synchronized precisely. 58 On a given channel, the determination of the precise timing to 59 reach the different values is important. In addition, relative synchronization between the different channels is also essential to 61 obtain both a semantically correct sign and a realistic movement. 63

3.2. Sign Inflections for Utterance Synthesis

When synthesizing utterances, the form of some signs will ⁶⁵ vary to take the context into consideration. This is called the ⁶⁶ *sign inflection*. Two types of inflections are distinguished: inflections due to the illustrative nature of SL often referred to as ⁶⁸ iconic mechanisms (Section 3.2.1) and inflections using spatial ⁶⁹ referencing (Section 3.2.2). ⁷⁰

3.2.1. Iconic Mechanisms

Sign language iconicity refers to the similarity between the ⁷² sign and what it designates (resp. the *signifier* and *signified* of ⁷³ Saussure [20]). ⁷⁴

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In his work, Cuxac [9] states that LSF³ has two modes of production: (i) a non-illustrative one based on signs in their 2 citation form (called standard signs by Cuxac) whose gestuз ral execution is relatively invariant and (ii) an illustrative one, 4 called structure of great iconicity, using different spatiotempo-5 ral mechanisms to describe a scene, an object or an animal. 6

We describe hereinafter three illustrative mechanisms of SL: Size and Shape Specifiers consists in using the hand configuration, wrist orientation and amplitude of motion to describe a the shape and size of an object. For example, [TO GIVE] will 10 not be performed with the same configuration and orientation 11 in the sentence "I give you a book" (configuration of the 'duck's 12 beak' representing thick flat objects) and in "I give you a glass" 13 (configuration of the 'C' representing cylindrical objects) (see 14 Fig. 5). In addition, the amplitude of the motion is often used 15 as a size specifier, as shown on Fig. 4.



Fig. 4. Iconicity on the LSF sign [BOL] (bowl): the size of the bowl corresponds to the amplitude of the motion.

In **Proforms**, also called *classifiers predicates*, the hand con-17 figuration and movement embody the depicted situation, object, 18 or person. More precisely, it consists in using a particular hand 19 configuration representing an object (e.g., a flat hand for a car) 20 or a person (the index finger raised for a standing person or bent 21 for a sitting person) and a movement (or a simple placement) of 22 the hand to show the movement performed by (resp. the loca-23 tion of) the object. For example, two flat hands moving forward 24 with one hand behind the other one will depict two cars driving 25 in a line. Proforms are used to describe a scene vividly, accu-26 rately and with few signs. Thus, a sentence like "Two persons 27 are crossing a street." can be signed much more richly using the possibilities of proforms than with the corresponding unin-29

flected signs: details on the precise nature of the walk, on the position of the two persons with respect to each other, or on the size of the street can be given much more naturally and intuitively using proforms.

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Role shift designates the impersonation by the signer of the 34 person, animal or object that he is talking about in order to describe its behaviour. In role shift, the whole upper part of the body of the signer is involved. For example, a character's gait 37 can be accurately described by using the arms of the signer to represent the legs of the described thing. The movements per-39 formed can be very subtle (a subject with a slight or severe limp will not be signed in the same way). 41

3.2.2. Spatial Referencing

The placement of entities inside a scene, their referencing, or the creation of interactions between those entities can be achieved through the variation of the hand placement or of the motion trajectory. We present below two of such spatial referencing inflections:

In **indicating verbs**, the trajectory or *motion path*, of some signs can change according to the relation between the described entities. The hand movement corresponding to the verb [TO GIVE] in the sentence "I give him" will not be performed 51 in the same direction as the same verb [TO GIVE] in the sen-52 tence "you give me" (see Fig. 5).



Fig. 5. Indicating verbs. Hand movements and configurations for the sentences "you give me a glass" (left) and "I give him a book" (right).

Pointing gestures consist in using the hand (often, the tip of the index) to designate an entity or a location. It can be used 55 to indicate the subject(s) or object(s) of an action ([I], [YOU], 56 [THIS ONE]) or to associate virtual objects to 3D locations 57 in the signing space to give a relative placement of one object 58 with respect to the other (in the context of a description for 59 example) or for a future referencing of these objects [16]. 60

³Cuxac research on LSF can be applied to many SL.

These inflected structures, whether iconic or using spatial referencing, are consistently present in SL discourses and are essential in situations of scene description or storytelling.

5 3.2.3. Challenges for Utterance Synthesis

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To highlight the difference between sign and utterance synthesis, we can do a parallel with oral languages. In many languages, words have a different form when they are isolated and uncontextualised than when they are used in a sentence: verbs a are conjugated and some words are put to the singular/plural 10 form, for instance. Moreover, when pronouncing words, speak-11 ers make a liaison between the end of some words and the be-12 ginning of the following. More generally speaking, the pronun-13 ciation of a word will slightly impact the pronunciation of the 14 neighbouring words: it is the coarticulation mechanism. The 15 same mechanisms exist for sign languages. 16

Isolated sign synthesis mainly aims at building signs for 17 bilingual dictionaries or educational applications. The signs 18 are uncontextualised and need just to be in their citation form. 19 Utterance synthesis is mainly used for machine translation 20 systems to accurately express an oral language sentence in a 21 given sign language (e.g., between German and Swiss German 22 Sign Language [21] or between English and Irish Sign Lan-23 guage [22]) and for storytelling. Whether for translation or sto-24 rytelling, the form of some signs is influenced by the context: 25 both signs in their citation form and inflected signs should be 26 used. Indeed, the signs in their citation form are not enough 27 for utterance synthesis: a simple concatenation of those signs 28 to create an utterance does not do justice to the richness of SL 29 and can generate incorrect utterances. The targets that must be 30 reached in space will vary with respect to the context even if the 31 signs have similar gloss denomination. The multiple variations 32 of illustrative signs must be taken into account just as well as 33 the fixed citation form of signs. 34

Many challenges of the synthesis of inflection mechanisms are specific to the mechanisms involved. However, we list here some issues that are common to all iconic mechanisms.

38 **Context awareness:** the context of the signs must be taken

into account to build inflected signs. For instance, as mentioned above, indicating verbs take a different form when put into an utterance. Another example are proforms or classifier predicates which take advantage of the hand configuration and movement to embody an object or a person. They are used to describe an infinite number of situations and are not suited for isolated sign synthesis but are very interesting in utterance synthesis.

Space representation: the signation space is an area in front 46 of and around the signer in which he/she can place the entities 47 of his speech. In this space physically limited by the signer's 48 reaching capabilities, he/she will be able to describe an infinite 49 and constantly changing space. Interestingly, space will also be 50 the carrier of temporal information: a movement of the torso 51 backwards or forwards makes it possible to place events in the 52 past or the future. When doing motion synthesis, the appropri-53 ation of the signing space requires the definition and naming 54 of 3D areas around the signer. The creation of sign language 55 content for avatar animation requires this discretization of the 56 signing space. 57

Coarticulation: in SL, coarticulation effects are character-58 ized by the influence of one sign on the adjacent signs [23]. 59 Coarticulation is expressed both in the transitions between the 60 signs and in the inflection of each sign to take into account its 61 previous and following signs. To have a more natural sign lan-62 guage flow, the transition motion between signs must be gen-63 erated carefully [24]. As coarticulation results in a smoother motion with some spatial targets not reached, some synthesis 65 systems loosens their trajectory constraints to obtain more real-66 istic motions by taking coarticulation into account [25]. 67

4. Isolated Sign Synthesis

Isolated sign synthesis consists in generating the motion corresponding to signs deprived of contextual information. Isolated sign synthesis mainly aims at building uninflected signs for bilingual dictionaries, educational applications or very simple utterance generators using concatenative synthesis.

In the field of sign synthesis, work on the synthesis of signs 74 in their citation form is more common than work on the synthesis of inflected signs for several reasons: signs in their citation 76

form exist in a limited number and are listed in dictionaries,
their description in a notation system often already exists (e.g., *HamNoSys* [26], see Section 4.1) and they have an almost direct
equivalent with words in oral languages. These signs can be defined by a set of fixed values taken by phonological components
of SL following the parametric approach.

Three techniques are used to synthesize isolated signs: the keyframe, procedural, and data-driven techniques. The first consists of a specification of the key poses of the skeleton, the second in an automatic computation of the motion while the last uses motion capture data to produce realistic gestures. To specify the features of the sign to be generated, the three techniques need a representation of the synthesis objective.

We first present, in Section 4.1, visual representations and 14 parametric notations of signs that can be used to manually spec-15 ify keyframes. Then, in Section 4.2, we survey the different 16 computer-friendly representations of signs that are directly used 17 in procedural animation and, potentially, in data-driven pro-18 cesses. All the different sign representations are compared in 19 Table 1. Finally, Section 4.3 presents the existing synthesis 20 techniques. 21

22 4.1. Linguistic Representation of Signs

In order to synthesize a sign, a representation of the synthesis 23 objective is needed. For isolated signs which are mainly syn-24 thesized following a parametric approach, the representation 25 should highlight the structure and, possibly, the values taken 26 by the phonological elements during the sign production. The 27 spatiotemporal aspect of sign languages makes exhaustive rep-28 resentation of signs a complex problem involving researchers 29 both in the linguistic and in the computer animation fields. We 30 present here the representations mainly used by the linguistic 31 communities to study signs. 32

33 4.1.1. Visual Representations

Visual representations are straightforward ways to represent signs. It consists in representing the signs on a 2*D* canvas by being as faithful as possible to the actual sign. Drawings and video recordings are two common visual representations.

Signs are motions specified both in the 3D space and in time: in a drawing, the use of arrows and of different types of con-39 tour (e.g., dotted line or fine line) allow for a partial repre-40 sentation of those dimensions on a 2D paper. However, this 41 schematic representation depends on the interpretation of the 42 user and on the skill of the artist. Drawings are an ambiguous 43 representation that often needs to be clarified with annotations. 44 Fig. 6 is extracted from a French Sign Language (LSF) text-45 book. It shows a drawn representation of the sign [HELLO] 46 complemented with annotations about the hand motion, the fa-47 cial expression and the hand configuration. As a consequence of 48 this ambiguity and of the impractical aspects of 2D drawing for 49 computerization, this type of representation cannot be directly 50 used as a computer formalization for animating an avatar. 51



Fig. 6. The sign for [HELLO] in LSF. To remove any ambiguity of the 2D drawing, some annotations are added to describe the motion, the facial expression and the hand configuration.

Videos recordings are another, more precise and exact representation of signs that is very popular in the linguistic community to store and study SL signs and utterances⁴. Videos do not allow for signer anonymity but are very efficient to record the dynamics of signs. Nevertheless, a video recording alone eliminates the depth information and imposes a point of view on his viewer. Like drawings, it lacks flexibility and its format is not suited for automatic computer synthesis.

Those visual representations may be attractive due to the intuitive understanding of the sign structure and dynamics that they provide. Their visual format are suited to the manual definition of keyframes by graphic designers. However, their ambiguities and format makes them hardly suitable to be used as a sign representation in an automatic animation engine.

⁴Elix is an example of video-based dictionary for French Sign Language https://dico.elix-lsf.fr/

4.1.2. Gloss Representation

Another straightforward way to describe sign language is to 2 use a gloss representation or "glossing". Glossing consists in 3 associating one or more words of an oral language to a sign. It is used by linguists to annotate SL videos. No gloss standard exists (which is a recurrent impediment to obtain consistent annotated corpora [27]) but, as a convention for this paper, we will designate glosses using brackets and uppercase letters (i.e. [GLOSS]). A sequence of glosses is not a translation but the 9 oral language description of a sign language utterance: for ex-10 ample, a sentence glossed as "[YOU][LIVE][WHERE?]" will 11 be translated as "Where do you live?". Furthermore, a sign may 12 not have a one-word equivalent in an oral language. In this case, 13 the corresponding gloss can contain more than one word (e.g., 14 [TO GIVE] may be used in different contexts, such as in the 15 gloss description: "[TO-GIVE-A-PAPER]" or "[TO-GIVE-A-16 GLASS]". 17

The way to execute a sign is not indicated in the gloss de-18 scription. Therefore, few animation systems can choose to rely 19 exclusively on a glossing description of the desired SL produc-20 tion since it implies the presence of a motion database anno-21 tated on the same gloss-level as the specification like in [28] 22 for motion capture data or in [29] for hand-crafted animation⁵. 23 As a consequence, isolated sign animation systems need an-24 other, lower-level sign representation to achieve the actual mo-25 tion synthesis. 26

27 4.1.3. Parametric Notation and Writing Systems

The most obvious way to transcribe a language is writing. 28 For oral languages, alphabets or syllabaries are common ways 29 to describe the sounds that can be produced in a spoken utter-30 ance. Each character is assigned a sound and the concatenation 31 of characters forms new sounds that result in words and sen-32 tences when spoken out loud. The transcription of an entire 33 language is possible using a finite number of letters (using the 34 native writing system or other transcription alphabet such as the 35 Pīnyīn notation for Chinese language). 36

The conception of a similar transcription system for signed 37 languages is the focus of many studies. The written represen-38 tation of the linguistic production is called a notation system. 39 As mentioned in Section 3.1, signs can be decomposed into 40 linguistic components that can be seen as phonemes (the 41 work of Friedman is an example of a phonological analysis of 42 American Sign Language [30]). Parametric notations propose 43 to decompose signs into a combination of those components 44 and to assign a value for each one from a finite set of possible 45 However, due to the spatiotemporal aspect of the values. 46 language, the assignment of a finite number of characters to the 47 description of the whole set of possibilities of the language is 48 not an easy task. The parametric notations that are presented 49 in this section aim at discretizing the continuous concepts that 50 are space and time in order to find the optimal transcription of 51 sign language. Some questions are often raised, such as the 52 partitioning of the signing space, the number of possible hand 53 configurations, or the way to represent kinematic behaviours 54 (acceleration, deceleration, etc.). 55

In 1825, Auguste Bebian, looking for a notation system for sign language, is the first to define the signs as a combination of 58 elementary components [31]. However, due to "The Milan Con-59 ference" of 1880, which promoted the oral education of deaf 60 people in Europe at the expense of sign languages, research 61 concerning sign language writing was stopped until the impor-62 tant work of Stokoe in 1960. Stokoe [7] defined three linguis-63 tic components: hand configuration, hand placement and hand 64 motion (see Section 3.1). His work on a sign language tran-65 scription system resulted in the Stokoe's notation [32] which 66 describes the ASL signs using a combination of those three 67 components: the sign location is called *tabula* or *TAB*, the hand 68 configuration is *designator* or *DEZ* and the hand motion is *sig-*69 nation or SIG. Each component is specified using a limited set 70 of symbols. Hand orientation and non-manual features (NMF) 71 (mainly facial expressions) were later added to complete the 72 definition [8] but only hand orientation was incorporated to the 73 notation. The notation merely describes the signs without tak-74

⁵Glosses can however be used to sequentially specify a full utterance (see more detail in Section 5.1.1).

ing into account the intent of the signer: even if the two hands
perform a symmetric gesture, the hand configuration of each
hand will be described (in Fig. 7, we can see the symbols Brepeated twice, one for each hand).

Later, the Hamburg Notation System or HamNoSys [26] 5 was developed to palliate those limitations. It includes the four components of the Stokoe's notation and some facial expressions. The variety of possible values for each of the compoa nents makes HamNoSys a much more complete notation sys-9 tem. It was designed to be language-independent and extensi-10 ble to new linguistic mechanisms. It can better handle some 11 SL mechanisms like symmetry (the symbol " at the beginning 12 of the transcription in Fig. 7) and can be transcribed in a lin-13 ear way using computer Unicode symbols. However, it is still 14 limited in terms of non-manual features. 15

SignWriting [33] is based on a dancing gestures transcrip-16 tion and constitutes a more graphical and intuitive notation of 17 SL. It integrates some facial expressions, body movements and 18 even iconic signs (see Fig. 7). Hand configurations and orienta-19 tions can be defined using a limited set of symbols but the place-20 ment of the hands with respect to the body is indicated only in a 21 relative manner thus leaving some ambiguities. It differs from 22 the two previous notations in the sense that it was designed to 23 be used by deaf people as a writing system and not by linguists 24 or researchers as a notation system. It is SL independent and is 25 taught in deaf classes around the world [34]. Other writing sys-26 tems exist for different sign languages (like "SEL" for Brazilian 27 Sign Language [35]) but none as popular as SignWriting. 28

Stokoe's notation, HamNoSys and SignWriting focus on deal ing with the representation of the static components of SL but
 fail to represent the dynamics of signs and synchronization of
 the different components.

The temporal aspects of SL were thoroughly studied in the work of Johnson and Liddell. In 1989, they introduced the **Movement/Hold model** [36] where signs were defined as an alternation of static poses (*Hold*) and dynamic transitions (*Movement*) between two consecutive poses. Then, between 2010 and 2012, they defined the **Sign Language Phonetic Annotation**

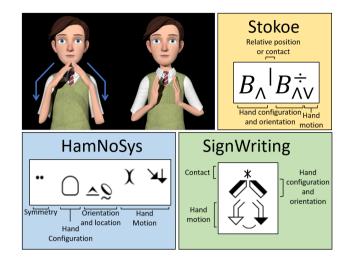


Fig. 7. The sign for [HOUSE] in American Sign Language using the *Stokoe*, *HamNoSys* and *SignWriting* notation systems. The sign is shown on the avatar on the top-left corner.

(SLPA) [37] which relies on the Posture-Detention-Transition-Shift (PDTS) classification. This classification uses two timing features to distinguish between the four classes, called segments 41 or timing units. The first timing feature is the static/dynamic 42 nature of the segment. In static segments, one or more SL com-43 ponent(s) (hand configuration HC, orientation FA, placement 44 PL, non-manual features NM) is stable during a finite amount 45 of time while dynamic segments are transitions from one static 46 segment to the following. The second timing feature is the 47 transient/deliberate quality of the motion during the segment. 48 This feature mainly impacts the duration of the segment. A de-49 liberate segment will have a significantly higher duration than 50 a transient segment. More precisely, the four types of timing 51 units are the Posture (static and transient), the Detention (static 52 and deliberate), the Transform (dynamic and transient) and the 53 Shift (dynamic and deliberate) segments. The SLPA has the par-54 ticularity of transcribing a sign using a table: the timing units 55 are represented in the columns whereas the articulatory com-56 ponents are described on the lines. An " ∞ " symbol designates 57 a change in the articulatory features. Fig. 8 shows the SLPA 58 transcription of the word [CHICAGO] in ASL. 59

4.1.4. Phonetic Codings of Hand Configurations

To describe the hand configuration, the phonetic and the phonological systems must be distinguished. In phonological systems such as *Stokoe's notation*, *SignWriting* or *HamNoSys*, 63

Timing units Articulatory features	Posture	Transition	Posture	Transition	Detention
Manual features	HC1 PL1 FA1	8	PL2	8	PL3 FA2
Non-manual features	NM1	8	NM2	~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~	NM3

Fig. 8. The sign for [CHICAGO] in American Sign Language using the SLPA notation system (table based on [37]). The sign [CHICAGO] draws a "7" in the signing space with a 'C' hand configuration. The three placements PL_i correspond to the three inflection points of the "7".

the hand is seen as a whole and a name or a symbol is assigned to a hand configuration. In phonetic systems, the disposition of each finger or even each finger joint is specified to describe a particular hand configuration. Phonetic codings have been defined by the linguistic communities to describe hand configurations in an exhaustive and generic way. For the same reasons, such low-level descriptions are interesting to automatically synthesize hand configurations. Two examples of such codings are presented hereinafter.

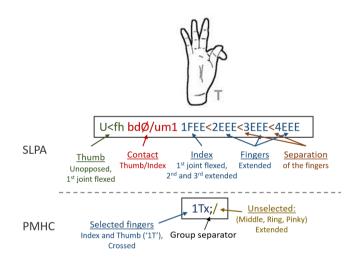


Fig. 9. The coding of the 'T' hand configurations with the *SLPA* and the *PMHC* phonetic codings.

In addition to the temporal aspects, the SLPA introduces a 10 phonetic coding for the hand configurations [38, 39]. Indeed, 11 in Fig. 8, HC1 represents a hand configuration that stays stable 12 during the execution of the sign but it gives no indication on the 13 nature of the hand configuration. The SLPA coding of the hand 14 configuration was defined in order to precisely describe those 15 hand configurations. The position of each finger is described 16 by indicating if each joint (3 joints of each finger + 2 joints of 17

the thumb) is flexed (f or F with respect to the intensity of the 18 flexion) or extended (e or E). The position of the fingers with 19 respect to each other are noted with a particular symbol (e.g., 20 "=" if the fingers touch each other, "<" if they are separated). 21 The description of the thumb position with respect to the other 22 fingers is placed at the beginning of the specification (U for 23 "unopposed", O for "opposed" and L for "lateral"). Additional 24 notations describe the type of contact between the fingers. The 25 SLPA phonetic coding is thus exhaustive but its exhaustiveness 26 makes it a complex system, hard to use in practice. A more 27 user-friendly version of the SLPA could be defined by reducing 28 the number of degrees of freedom and introducing anatomical 29 knowledge to eliminate anatomically impossible hand configu-30 rations [40]. 31

Another phonetic coding of the hand configurations, the 32 Prosodic Model Handshape Coding (PMHC), was proposed 33 by Eccarius and Brentari [41]. Each configuration is coded 34 based on (i) the detection of sets of selected fingers - groups of 35 fingers that are the most relevant for the configuration and that 36 share a state (or *joint configuration*) – more than one group can 37 be identified (separated by ";"), (ii) the determination of the 38 state of those sets of fingers (e.g., curved "@", bent "[", crossed 39 "x" or extended by default), (iii) the determination of the state 40 of the non-relevant fingers (extended "/" or flexed "#") and, (iv) 41 the specification of the thumb position. It uses the standard 42 ASCII characters to represent the hand features and different 43 sign languages were studied to design the system making it a 44 generic and extendable system. Fig. 9 shows the coding of two 45 hand configurations with the SLPA and the PMHC. PMHC is 46 more compact than SLPA but it lacks its precision. 47

While the visual representations can be taken advantage of by graphic designers to manually define the key poses of a skeleton, the notation and writing systems are rarely used as such by the computer animation community. They are useful systems for SL linguistic analyses but lack the precision needed to synthesize motions. Phonetic codings of hand configurations, also defined in the linguistic fields, provide detailed descriptions of

the SL hand configurations and could potentially be integrated
in a specification language. In order to animate SL avatars, SL
notation systems have therefore been used as a basis to design
SL specification languages and scripts that can directly be exploited to create signs automatically.

6 4.2. Scripting Languages for Sign Representation

Scripting languages have been designed to specify the signs
in a way directly understandable by a computer. Those languages have been developed by the computer animation community but are often based on linguistic sign representations
(see Table 1 for a comparison of the different sign language
representations).

4.2.1. Descriptive Languages Based on Existing Notation Sys tems

Descriptive markup languages are used to describe and structure a document or a data set. Among them, the eXtensible Markup Language (XML) describes the data in a way that is understandable both by the humans and the computers. It is commonly used to describe natural languages and is suited to the specification of signs as it can integrate the information of existing notation systems in a computer-readable language.

The SignWriting Markup Language (SWML) [46] is an 22 XML version of SignWriting and has been designed to allow 23 storage and processing of sign language files. The structure 24 corresponding to a sign, called a signbox, contains the exact 25 same information as the SignWriting transcription of the sign. 26 Consequently, it does not overcome the limitations of SignWrit-27 ing, namely the ambiguities of the hand placement and the time 28 management. 29

Similarly, SiGML was initially an XML version of the Ham-30 NoSys transcription system [47]. This language was developed 31 within the European projects ViSiCAST and eSIGN that pro-32 mote Deaf access to information [48]. Contrary to SWML, it 33 was designed with the prospect of animating virtual signers, 34 this is why some aspects of SL, like timing or very precise 35 orientations, can be specified in SiGML and not with Ham-36 NoSys. Moreover, the PDTS classification of Johnson & Lid-37 dell was later added to SiGML in an extended version of the

language [42] additionally providing an explicit timing control, synchronization between elementary motions and a direction specification in various contexts. It is one of the most advanced existing sign language specification for SL synthesis.

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A parametric description of signs based on an XML version 43 of the *Movement/Hold model* of Johnson & Liddell studies 44 was also designed by Amaral et al. [49] in order to animate an 45 avatar using Brazilian Sign Language to translate textbooks for 46 educational purposes [50]. 47

However, XML version and extension of existing notation systems do not have the monopoly of sign representations. Dedicated programming languages can also be used to depict signs.

4.2.2. Programming Languages for Sign Synthesis

The definition of a programming language for synthesizing 53 SL implies the specification of a dedicated lexicon and syntax 54 to be used in subsequent instructions. Such languages are often 55 defined for a specific animation engine and are less generic than 56 descriptive languages but offer more freedom and flexibility to 57 the programmer. 58

In an early work, Lebourque et al. [51] defined **QualGest**, a high-level specification language dedicated to LSF that takes into account the four manual parameters (hand configuration, placement, motion and orientation), called *gestems*.

To specify the hand placement, they use a discretization of 63 the signed space, including the definition of: (i) a set of 64 directions (defined from the three main planes - sagittal, 65 frontal and horizontal-, plus two intermediate planes), (ii) of 66 amplitudes (proximal, medial, distal and extended), and, (iii) 67 of body positions. Movements are defined using a finite set of predefined primitives (pointing, straight-line, curve, ellipse, 69 wave, or zigzag), parameterized by a set of starting, ending 70 and, if needed, intermediary locations. Hand configurations are 71 defined, using 5 basic hand configurations (angle, hook, spread, 72 fist, stretched), completed by modifiers. Hand orientation can 73 be specified in a relative or absolute manner from two hand 74 directions (palm and metacarpus). All the different values 75 taken by the parameters can be specified by meaningful terms 76

Category	Name	Fidelity	Temporal aspects, syn- chronization	Non manual features	Flexibility	Understandable by a computer
Visual	Drawings	\checkmark	X	1	X	X
Representation	Video recordings	\checkmark	\$	√	X	X
	Stokoe [32]	(✔)	X	X	(✔)	X
Parametric	HamNoSys [26]	\checkmark	(✔)	(✔)	(✔)	(✔)
Notation	SLPA [37, 39]	\checkmark		×	(✔)	(✔)
	SignWriting [33]	\checkmark	(✔)	(✔)	(✔)	×
	SiGML (extended) [42]	\checkmark	1	(✔)	(✔)	\checkmark
Scripting	QualGest [25]	\checkmark	1	×	\checkmark	11
Language	Losson [43]	\checkmark	1	(✔)	\checkmark	11
Danguage	Zebedee [44]	\checkmark	1	×	<i>s s</i>	11
	EMBRScript [45]	\checkmark			(✔)	

Table 1.	Comparison	of the sign	representation.

Fidelity: absence of ambiguity, fidelity to the original movement, precise description of the sign, preservation of the intent of the signer. **Temporal aspects, synchronization**: the dynamics of the movement is specified, the synchronization between the different channels is managed. **Non manual features**: the status of non-manual components (facial expressions, gaze, etc.) is specified/visible.

Flexibility: the ease with which the representation of a sign is modified to take into account the context of the sentence. A purely visual representation will make the transformation fastidious while some linguistic representations are highly flexible.

Understandable by a computer: it can be reused as it is at the input of an automatic synthesis engine.

or numerical values. Even if non-manual channels are not taken into account in this description, other interesting information about the symmetry of the two arms, the synchronization between the dominated/non-dominated arm or the number of repetitions of elementary gestures can be added, thus indicating the intent of the signer. Moreover, coarticulation mechanisms can be added to the synthesized motion.

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Similarly, Losson defines a sign description where signs are divided into atomic gestures called shifts [43]. Again, the four 10 Stokoe's parameters are used to determine the characteristics of 11 the shifts: initial and final configurations of the hand, orienta-12 tion and placement, and nature of the movement. Hand motions 13 are specified using displacement primitives (straight line, arc or 14 circle) and the location of the targeted destination of the hand 15 (plus the equation of a plane in which the displacement takes 16 place for arc and circle trajectories). The primitives can be aug-17 mented with secondary movements, contact zones or modifiers. 18 To describe the hand configurations, the behavior of the thumb 19 is considered separately from the other fingers (similarly to the 20 hand configuration coding of SLPA). Repetitions in the move-21 ment, synchronicity properties of the hands, symmetry or anti-22 symmetry characteristics, or relative placement of the hands can 23

be specified. In addition, Losson's representation uses a parametric computer language that allow the specification of sign inflection mechanisms (size and shape specifiers, spatial referencing). Fig. 10 shows an example of Losson's specification for the sign [CHIMNEY] in LSF using two *shifts*.

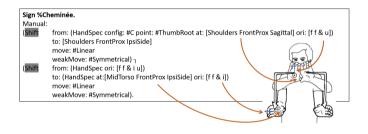


Fig. 10. Example of Losson's description for the sign [CHIMNEY] in LSF (avatar and code extracted from [43]).

In QualGest and Losson's approaches, the time does 29 not explicitly appear in the SL specifications, whereas the EMBRScript is based on the explicit specification of key 31 poses in absolute time, allowing a fine temporal control of 32 the animation [52]. It was originally designed to describe the 33 motions of Embodied Conversational Agents (ECA) and was extended to be applied on SL avatars by adding new hand 35 configurations, facial expressions and gaze directions [45]. It 36 specifies the low-level animation data of the *k-pose-sequence*, 37 a sequence of key postures corresponding to a sign. 38 3

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4.3.1. Keyframe Techniques

While the previous specification used a phonological definition of signs, Zebedee is a sign specification language based on a geometrical definition of signs [44]. Geometric constraints on points, vectors or surfaces replace the set of parameters usually used (hand configuration, orientation, placement). The Zebedee model separates signs into two types of temporal units, following the Movement/Hold model of Liddell and Johnson [36]: the key postures when the parameters of the motion reach a stable state and *transitions* in-between two consecutive key postures. One of the advantages of this description model is that it can also represent signs with inflections by modifying the geometrical constraints describing the sign (e.g., the difference between [BIG BALLOON] and [SMALL BALLOON] in Zebedee will be done by changing the radius parameter). Zebedee captures both the temporal and the spatial constraint of sign languages. Furthermore, the geometric nature of the language can highlight the structure of signs. Fig. 11 shows the representation of the sign for [BALLOON] in LSF with the LIMSI avatar performing the sign.

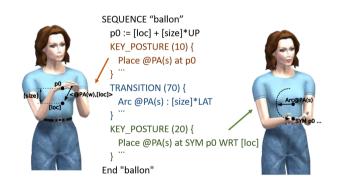


Fig. 11. Example of the representation of the sign for [BALLOON] in LSF with the *Zebedee* language. The left (resp. right) image is the initial (resp. final) position of the LIMSI avatar (avatar and code extracted from [44]).

21 4.3. Synthesis Techniques

The sign representations described in the previous sections constitute the first step of the synthesis of isolated signs. The choice of a synthesis technique is the next step to achieve a meaningful animation.

Keyframe synthesis is the most straightforward technique 27 to generate the animation of an isolated sign. An animation 28 is a sequence of avatar poses displayed at a given frequency. 29 Some poses may be more relevant than others -e.g., the state of the avatar at the beginning and end of a sign, or the pose 31 describing an inflection point in the hand configuration. Those 32 key poses, associated with a time tag, are called keyframes 33 and a special attention should be paid to their description. 34 Keyframe animation consists in describing the pose of an avatar 35 for each keyframe, the transitions between those keyframes is 36 then automatically computed by interpolation. 37

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Hand-Crafted Animation. In hand-crafted animations, the specification of the keyframes is done manually.

3D traditional animation consists in setting the avatar in 41 a specific pose at different frames of a timeline using a spe-42 cialized animation software such as Autodesk Maya [53] or 43 Blender [54] and the knowledge of human anatomy and mo-44 tion. Different joint angles values are tested and the best values 45 are selected for a particular pose of a particular sign. The process is fastidious and cannot be generalized to other signs. The 47 early work of Shantz [55] in 1982 which is considered to be 48 the first work on sign language avatar animation [56], used this 49 technique. 50

3D rotoscoping is a particular instance of 3*D* traditional 51 animation. It is used to produce realistic movements from 52 video footage. It consists in posing over a projection of a video 53 recording of the animated scene using a 3*D* animation software. 54

Examples of avatars relying on hand-crafted keyframes:

- *Paula* of DePaul University is an American Sign Language
 avatar that partially relies on traditional animation and on
 the PDTS classification [57, 58].
- The Italian Sign Language avatar of the university of ⁶⁰ Torino is animated using hand-crafted keyframes [59, 60]. ⁶¹
- Elsi, a French Sign Language avatar designed by the 62

LIMSI laboratory to be exhibited in French train stations, is based on 3*D* rotoscoping [29, 61].

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The work of Irving et al. [62] proposes to synthesize signs
 by defining its keyframes in a parametric way according to
 the Stokoe parameters. Each hand location, configuration,
 movement and orientation can be described very precisely
 using sliders in a graphical interface.

The Turkish Sign Language avatar of Yorganci et al. [63]
uses an original approach: the torso and arm motions, the
facial expressions and the hand configurations of the avatar
are manually modelled separately and are combined in order to generate signs, leading to a parametric and somewhat generic creation of signs.

Hand-crafted techniques can give precise results depending 14 on the skill and choices of the artist. Indeed, he or she is the one 15 in charge of determining the keyframes to be reproduced, the 16 missing frames being deduced using interpolation techniques. 17 However, this is a laborious task and, for the particular appli-18 cation of sign language synthesis, the designers must be expert 19 both in 3D-modeling and in sign language, a combination that 20 can be hard to find. 21

Automatic Keyframing. The tiresome 3D-modeling work can 22 be avoided by using the sign specification of key postures of 23 Section 4.2 to automatically compute the key poses of the 24 avatar. Indeed, a lot of those specifications define signs as a 25 sequence of static and dynamic segments intuitively leading to 26 a key postures/interpolation definition of signs. They can be the 27 basis for the definition of spatiotemporal targets for the avatar 28 joints leading to keyframe animation. 29

A typical approach is to define the hand configuration(s) of 30 a key pose using forward kinematics (FK) by referring to a 31 look-up table where the joint angles of the hand corresponding 32 to each hand configuration are listed. The position of the wrist 33 or the palm of the hand is determined using the placement 34 descriptors of the chosen sign representation and the angles of 35 the arms are computed using the result of an inverse kinematics 36 (IK) algorithm (see Fig. 12 and Fig. 13). The motion between 37

two keyframes is synthesized using different interpolation 38 methods applied to the joints angles. 39

$$X^{*}(t_{k}) \xrightarrow{\qquad \text{Inverse} \qquad q(t_{k}) \qquad \text{Interpolation} \qquad q(t)$$

Fig. 12. The hand motion synthesis process for automatic keyframing techniques. An inverse kinematics system is used to compute $q(t_k)$, the state of the skeleton at discrete time t_k corresponding here to the timestamp of the keyframes, from $X^*(t_k)$, the desired position of the hands at t_k . To obtain q(t), the state of the skeleton at time t, the intermediary poses of the skeleton between each t_k are interpolated.

Examples of avatars relying on automatic keyframing:

- Grieve [64] used an adaptation of the Stokoe notation for
 the ASCII characters (the *ASCII-Stokoe* notation) to place
 its targets.
- The work of Papadogiorgaki et al. [65] is based on the SignWriting Markup Language (*SWML*). 46
- The avatars of Krnoul et al. [66] and Fotinea et al. [67] are 47 based on the *HamNoSys* notation. 48
- Symbolic representation is also used by the VCom3D 49 company to animate the commercial avatars of their Sign 4 Me application [68]. 51
- The avatar of Delorme [69] relies on a segmentation of the motion in terms of key postures and transitions, as defined
 in the *Zebedee* specification system.
- In the EMBR avatar of Kipp et al. [52, 45], the skeleton 55 key poses are described at a gloss level using the *EM*-56 *BRscript*. The transition between two poses is smoothened 57 by enhancing the interpolation with temporal modifiers. 58
- Losson & Vannobel [70, 56] used an analytical approach to compute the hand configuration, placement and movement of their avatar using Losson's specification of signs.

Keyframe animation creates a precisely controlled motion, both temporally and spatially, which is very important for sign language animation. Indeed, signs have to be generated carefully to keep their meaning. However, keyframe techniques, 65

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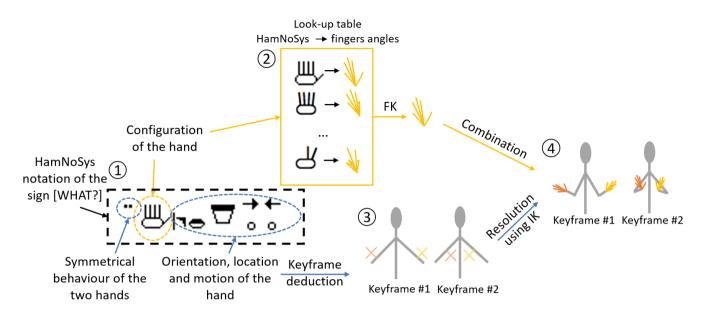


Fig. 13. Automatic keyframing typical process for the sign [WHAT?] in ASL. (1): *HamNoSys* notation of [WHAT?]. (2): Resolution of the hand configuration with FK. (3): Computation of the keyframes and placement of the hands over time based on the *HamNoSys* notation. (4): Combination of the hand configurations and of the hand placement using IK.

whether manual or automatic, while providing consistent animations, are often characterized by robotic motions as interpolation between keyframes does not always convey the kinematic
properties of natural motion.

5 4.3.2. Procedural Techniques

Instead of relying on keyframes techniques where only key poses are computed, procedural techniques automatically synthesize every pose of an avatar resulting in the generation of a continuous motion. The procedural models involved are also driven by a sign representation and solve either inverse kinematics or dynamics problems. Moreover, procedural techniques can be used to add realism to the generated animation regardless of the motion synthesis technique used.

Continuous Motion Synthesis. To counter the limitations of 14 keyframing/interpolation techniques which do not guarantee 15 fluid and human-like motions, procedural approaches use kine-16 matics or dynamics control loops in order to generate continu-17 ous motion. Those approaches are still based on sign represen-18 tations which define discrete spatio-temporal targets at the task 19 level. A continuous motion is created in order to reach those 20 targets. 21

Automatic keyframe animation uses IK algorithms as a way 22 to obtain joint angles for a given keyframe without taking into 23 account the possible intermediary solutions of the IK problem; 24 only the output of the IK model is thus exploited. Conversely, in 25 procedural techniques based on IK, the motion of the skele-26 ton is generated by the intermediary postures obtained from the 27 chosen iterative IK method through an IK-based control loop 28 with optional biomechanical or neuromimetic constraints (see 29 Fig. 14). The motion is thus fully generated by IK: no interpo-30 lation is used and, depending on the method, the automatically 31 generated motion may appear smoother and less robotic than 32 the motions resulting from automatic keyframe animation. Fur-33 thermore, constraints on the trajectory of the joints can be di-34 rectly integrated in the IK-based control loop to include coartic-35 ulation effects [71, 72], or biomechanical synergies [73]. How-36 ever, if the animation is computed automatically, the quality 37 of the successive postures cannot be guaranteed (possibility of 38 instabilities or unrealistic trajectories), and it is difficult to tem-39 porally control the process. Therefore, the resulting animation 40 may be less precise than automatic keyframe animation using 41 IK. 42

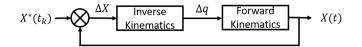


Fig. 14. The hand motion synthesis process for IK-based procedural techniques. At each time step, the difference ΔX between the targeted $X^*(t_k)$ and the actual position and orientation of the hand X(t) is computed to serve as input to an inverse kinematics system. A small displacement of all the skeleton joints Δq is computed, thus estimating the state q(t) of the system at time *t*, and applied to the skeleton, thanks to a forward kinematics system.

trajectories themselves, dynamic animation concentrates on forces. Instead of guiding the gesture like in the kinematic case, it consists in modeling the forces that lead to the motion. Therefore, it is a powerful tool to obtain realistic reaction when interacting with the environment. Although the physically based simulation of avatars in which the forces of interaction between different parts of the body are simulated would be relevant for signing avatars, this raises issues of precision, interaction, and real-time. In particular the physically based animation of hand movements is still an open problem in the 10 field of computer animation. The degree of accuracy required 11 for sign languages, both in terms of complex manual configu-12 rations, simulation time, and multi-segment interactions is not 13 yet reached. Therefore, most techniques developed for signing 14 avatars have focused on kinematic animation which allows to 15 reach both the precision of the animations essential for the hands and the fluidity of the movements. To our knowledge, 17 no work has been dedicated to exclusive dynamic animation 18 for the application of sign language synthesis. Still, some 19 work takes advantage of the realism provided by dynamic 20 controllers combined with IK (see Fig. 15). 21





Fig. 15. The hand motion synthesis process for dynamics-based procedural techniques. First, $q^*(t_k)$, the desired state of the skeleton at discrete times t_k is computed from $X^*(t_k)$, the desired position and orientation of the hands, using an inverse kinematics system. Then, at each time step, the difference Δq between the desired state of the skeleton $q^*(t_k)$ and the actual state of the skeleton q(t) is computed to serve as input to an inverse dynamics system. A force Γ is computed and applied to the skeleton, thanks to a physical system, to obtain q(t).

- GessyCA [25, 72], the synthesis engine based on 24 QualGest, takes as input a discrete sequence of weighted 25 spatio-temporal targets to produce the motion. Both the 26 hand movements and the hand configurations are gener-27 ated with a sensorimotor IK-based control loop includ-28 ing the modeling of biomechanical synergies and a neu-29 romimetic sigmoid function. Furthermore, by taking into 30 account coarticulation effects in the optimization process, 31 phonetic targets implicitly contain information from the 32 past and future context, leading to the generation of a more 33 human-like motion. 34
- In the VISICAST project [74], a dynamic model coupled 35 with IK targets is defined: each joint is represented as a 36 control system for which the controlled variable is the an-37 gle of the joint. Joints are virtual masses whose acceleration is proportional to the force computed to reduce the error between the current angle and the desired angle of 40 the joint. The trajectory of the arm motion is computed 41 using IK and the angles deduced by IK are then fed to the 42 controllers as reference angles. 43

Adding Realism Through Procedural Means. Automatic 44 keyframing and continuous motion synthesis techniques are a 45 convenient way to produce sign language animations. How-46 ever, even using kinematic or dynamic controllers, they are of-47 ten characterized by unrealistic motions as sign specification 48 languages seldom take into account the non-semantically rele-49 vant part of sign language which conveys the natural-looking 50 aspect of motion. 51

In order to add some realism to the animation, some mecha-52 nisms can be implemented. One of the preferred techniques is 53 to add some small human imperfections to the avatar animation to avoid too stiff postures or too perfect performances. Adding 55 noise, ambient motions, autonomous behaviors ensuring 56 breathing motions, or modifying the timing of the motion on the different channels are recurrent methods used to improve 58 the realism of avatar motions. Signal processing techniques 59 based on motion capture data analysis can also be used to 60 improve the realism of avatar motions [58]. 61

Examples of avatars using procedural means to add realism: 2 • In the ViSiCAST project [74], noise, damping and am-3 bient motions (small random eye / head / torso motions) have been added to reduce the robotic and unnaturally stiff movement inherent to their dynamics-based model. 6

• A small de-synchronization of the hands during the performance of symmetrical signs has been added to the Irish Sign Language avatar of Smith et al. [75]. 9

• In the EMBR project of Héloir & Kipp [52], an au-10 tonomous behaviour ensuring breathing and some natural 11 movements like blinking as well as blushing effects has 12 been implemented. 13

• To liven the avatar Paula, noise has been added to its 14 movements [76]. 15

However, even if various techniques are implemented to 16 overcome the limitations of synthesis techniques based on 17 synthetic models, they can not compete with data-driven 18 synthesis techniques in terms of realism. 19

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4.3.3. Data-Driven Sign Synthesis 21

Data-driven synthesis techniques use captured motions to an-22 imate an avatar. They are less exploited than hand-crafted or 23 procedural synthesis techniques even though they provide a 24 high level of realism that can hardly be achieved by procedu-25 ral means. 26

Motion Capture (MoCap) is used to record the position of 27 markers placed on a human being performing a motion. The 28 position and orientation of the human's joints is then deduced 29 from the MoCap data during the post-processing step. 30

Fig. 16 describes the offline motion database creation pro-31 cess. In this section, we are only interested in the synthesis 32 methods based on a *MoCap* database. However, the annotation 33 step which consists in dividing the continuous flow of motion 34 into smaller segments (segmentation) and labeling those seg-35 ments, directly impacts the motion synthesis. This step is neces-36 sary and fundamental for the editing process. For SL gestures, 37

it aims both to identify linguistic features, and to find precise temporal boundaries between linguistic units. The challenges 39 raised by the annotation issues are presented in [77] and [28]. Manual annotation is a fastidious task whose automation has 41 been widely investigated [78, 79, 80]. 42

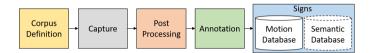


Fig. 16. The offline sign database creation process. The motion database contains the MoCap data while the annotations constitute the semantic database.

Currently, MoCap is used by research labs more for analvsis (MOCAP1 and Signaire 3D [81], two corpora of the 44 LIMSI laboratory in France or Lu & Huenerfauth's work [82] 45 for example) than for synthesis purposes (SignCom [83] and Sign3D [28] projects) [84]. Indeed, MoCap does not only sup-47 ply motion sequences to be played back on an avatar, it also 48 provides material to be analyzed and from which motion fea-49 tures and motion invariants can be extracted and potentially re-50 injected into the animation process. 51

It is technically impossible to capture all the signs in all the possible contexts due the size of the SL vocabulary, the multiple inflection mechanisms of signs and sentences in SL, the need for various Deaf participants, and time and memory constraints. Therefore, synthesizing signs using a limited set of pre-recorded signing sequences is the major challenge of datadriven techniques. Three main approaches exist to create isolated signs using motion capture data:

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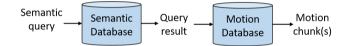
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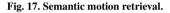
- 1. Play-back: the captured data can be played-back without modification, 61
- 2. Editing: new motion can be created by editing existing motion data,
- 3. Machine Learning: new data can be synthesized using 64 knowledge from MoCap data via machine learning ap-65 proaches.

Regardless of the chosen synthesis technique, data-driven 67 synthesis involves motion retrieval. It consists in choosing 68 and extracting the best motion(s) for a particular application 69

among a set of motions. It can be done by (i) directly querying the motion features (e.g., see Kapadia et. al. [85] for motion 2 retrieval of non linguistic motion using Laban movement analysis), or (ii) using a textual search in a semantic database containing the annotation of the motion [83, 86]. In this second case, the retrieval process relies on a management system database, separating the two levels of representation (semantic symbols and raw motion data) (see Fig. 17). This is the most straightforward technique as the motions of sign language 9 are semantically meaningful. However, motion feature query 10 remains interesting to decide between several motions with the 11 same annotation label [87], or to extract motions at a finer level 12 than gloss. 13

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Assuming that the quality of the captured database and post-15 processing is correct, the play-back of a pre-recorded sign 16 will give an accurate and realistic motion. Indeed, the main ad-17 vantage of MoCap technologies is that it preserves the human 18 qualities of motion. The motion and dynamics of the gener-19 ated sign will therefore be perceived as natural and credible, 20 thus increasing the acceptance of an avatar driven by such a 21 method [88]. However, while this technique can be used to 22 generate new utterances by concatenating existing signs as we 23 will see in Section 5.2.1, the generation of new signs, not ex-24 isting in the original database, or the editing of a sign in order 25 to adapt it to a new context are not the objectives of the play-26 back approach. The utterances produced using this technique 27 are therefore limited by the number and variety of the recorded 28 data. 29

The existing database can also be augmented by **editing** the pre-recorded motion using synthetic animation techniques. For example, in [83], some signs are created by inverting the direction of the hand motion or by modifying the hand configuration of an existing sign. The sign [DARK] in French Sign



Fig. 18. The Sign360 application of MoCapLab [89, 90].

Language can be created by inverting the hand trajectory of the sign [LIGHT] (see Fig. 19) whereas the object of the sign [TO GIVE] can be modified by changing the hand configuration (see Fig. 5).

Motion warping is also a motion editing technique that 30 can be applied to add variability in sign language generation. 40 It consists in altering a motion of the database by changing 41 its trajectory while keeping the kinematic properties of the 42 motion [91]. This is a promising technique for data-driven 43 synthesis of SL, but so far little work has been dedicated to the 44 development of this technique. Another approach, Dynamic 45 Time Warping (DTW), can be used to introduce temporal 46 variability in the sign language production. This technique 47 can be used: i) as an elastic distance to retrieve motions in the 48 database; ii) as a synthesis process to stress/compress the edited 49 motion; iii) as a process to generate style transfer whether at a 50 phonological level [92], or at an utterance level [93]. In terms 51 of style transfer, Gerard, the avatar of [94], could generate 52 stylized sign sequences in LSF by learning the time warping of 53 other recorded sequences. As data-driven techniques, motion 54 warping and DTW ensure natural-looking kinematics of the 55 resulting movements. However, the realism of the transformed 56 and edited movements has still to be verified with respect to 57 the generated postures and the meaning of the synthesized 58 sentences. 59

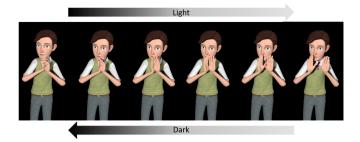


Fig. 19. The inversion of the hand trajectory transforms the sign [LIGHT] into the sign [DARK].

generalize motion data. It relies on the captured data to extract knowledge and models that can provide new plausible and 2 contextualized movements. Carreno et al. [95] present a very R thorough survey on motion synthesis based on machine learning methods. For the particular case of sign language synthesis, 5 Huenerfauth et al. [16] studied and synthesized directional verbs like [ASK], [MEET] or [SEND] using MoCap data of SL 7 performances from fluent signers as a training data set to learn 8 their synthesis models. 9

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Examples of data-driven avatars: 11

• Tessa [96], a British Sign Language avatar, and Si-12 mon [97], a Sign Supported English⁶ avatar both take ad-13 vantage of the play-back technique. 14

• Play-back of signs in Swedish Sign Language was also 15 done by Alexanderson et al. [98], but the main concern 16 of their work was the study of motion capture and skeleton 17 reconstruction. 18

• The Sign3D project combines both play-back and sign 19 synthesis editing techniques [28]. 20

• For commercial applications, Sign360 of the French com-21 pany MoCapLab presents a French Sign Language avatar 22 driven by pre-recorded gestures [90, 89] (see Fig. 18). 23

Data-driven synthesis techniques are effective ways to pro-24 duce natural looking motions. However, the quality of the re-25

sulting avatar animations depends on the granularity of the annotation and on the size and content of the initial corpus. Edit-27 ing techniques to generate new signs are still rare in the SL animation field.

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5. Utterance Synthesis

In the previous section, we reviewed the processes and tech-31 niques for isolated sign synthesis. This section is dedicated to 32 the synthesis of full utterances. An utterance is a set of co-33 occuring and/or sequential signs, that represent the statement 34 of an idea. It is close to the concept of "sentences" in oral lan-35 guages. Utterances are composed of signs in their citation forms 36 and of inflected signs (see Section 3.2). 37

5.1. Utterance Representation

Since an utterance is composed of a set of signs, it is possible 39 to take advantage of the representations of the signs seen in Sec-40 tion 4.1 and in Section 4.2 to specify an utterance. However, a 41 simple concatenation of these signs in their citation form would 42 be incorrect in the same way that a sentence without conjugat-43 ing the verbs would be incorrect in oral language. It is important 44 to take into account the grammar and semantics of SL in order 45 to inflect the signs that need to be inflected and to coordinate 46 the different body channels of the avatar. First, we describe 47 four challenges of the representation of an SL utterance and 48 show, using examples, how the representation by a sequence 49 of glosses may be inadequate. Then, we describe and show the 50 advantages and disadvantages of four utterance representations. 51

5.1.1. Limitation of the Representation with a Sequence of 52 Glosses 53

Many machine translation systems describe an utterance as 54 a simple sequence of glosses. As the order and nature of the 55 signs is given by this representation, it is suited to concatenative 56 synthesis provided the presence of a sign database annotated on 57 the same gloss-level as the specification. 58

However, utterance representation is a complex problem for 59 which a sequence of glosses is not the appropriate solution as 60 co-occurrences of signs are common phenomena. The main 61

⁶Sign Supported English (SSE) : the signs from British Sign Language are used in the order that the words would be spoken in English. It is a code and not a language as the grammar used is the one of English.

challenges of utterance representation are listed here. We illustrate each challenge with an example that highlights the limitations of the gloss representation.

Non Manual Features (NMFs) synchronization. Facial expressions, gaze and torso directions are channels that are sometimes
not coordinated with manual movements in order to add syntactic or contextual information to an utterance.

The direction of the torso, shoulders and gaze, for example, are often used in role-shift cases (see Section 3) and are not ۵ synchronized to a particular sign. In this case, the signer takes 10 the role of the person, animal or object he/she is describing 11 or whose words he/she is telling. If he/she repeats a dialogue 12 he/she has heard between a person A and a person B, A's state-13 ments can be transmitted with a movement of the shoulders, 14 chest and gaze to the left, while B's statements will be reported 15 with a movement to the right. These movements are associated 16 with the whole statements and not with a particular sign. It is therefore an overlay at the statement level. 18

Similarly, **negation** can be made with a repeated movement of the index finger (sign [NOT]) but is often supported by negative headshake that can begin before and end after the sign [NOT] itself. For example, the sentence "I don't dance" can be represented by the following gloss sequence:

$$[I][DANCE][NOT]$$
(2)

A signer will often make the negative headshake from the beginning of the [DANCE] sign until the end of [NOT] (see 20 Fig. 20). However, the representation by a sequence of glosses 21 as shown in (2) does not provide this information. The 22 [DANCE] sign is not affected by the negative aspect of the sen-23 tence, which can result in incorrect sentences in synthesis. One 24 solution is the use of parameterized glosses in which contex-25 tual information is provided. Parameterized glosses are used by 26 various researchers [99, 3, 100] but no standard exists. 27

Thus, (2) would become:

[I][DANCE_not][NOT] (3)

²⁸ Where [DANCE_not] and [NOT] include the negative head-²⁹ shake. But even so, the movement of the head would be synchronized on each of the signs and not on the whole30{[DANCE][NOT]} as it should be. Glosses, simple or param-31eterized, result in an over-synchronization (the synchronization32is carried out on too many synchronization points) at the gloss33level.34

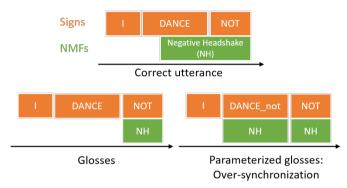


Fig. 20. Example of the the sentence "I did not dance". Top: the correct synchronization between the signs performed with the hands and the NMFs. Bottom left: the result of a simple sequence of glosses. [DANCE] does not include the negative headshake. Bottom right: an example of over-synchronization with parameterized glosses.

Co-occurrence of Signs. In addition to the desynchronization35of the NMFs, two signs can be performed at the same time36with one sign or part of a sign being held while the next sign37is performed. This situation often occurs when using pro-38forms/classifiers to describe a scene. Indeed, the aim is to show39the position and action of one entity in relation to another.40

It is a slightly different case from the synchronization of 41 NMFs where the channels involved had little or no impact on 42 the realization of the signs. In terms of animation, in the case 43 of the NMFs synchronization, the channels involved could be 44 animated by an independent controller. In the case of scene 45 **description**, the entities, often impersonated by the two hands, 46 move and act in relation to each other. The required animation 47 is more precise and controlled. 48

Once again, the sequence of glosses, precisely because of its sequential aspect, is insufficient.

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Let us take the example of the sentence "The frog jumps into the lake". This sentence should be signed with two proforms: one for the lake with the non dominating hand performing a wide C-shaped configuration to show the outlines of the lake, and one for the frog with the dominant hand. The latter jumps into the lake, which results in a jumping movement of the dominant hand towards the space delimited by the non dominant
hand.

A parameterized sequence of glosses where the proforms are indicated by the suffix "_pr" would give :

Again, a sequence of glosses does not transcribe the simultaneity of the signs.

Sign Inflection. The contextualization of the signs leads to
modifications of the citation form of some signs in order to insert them into the utterance. Inflections can be of several types
(see Section 3.2) and characterized by a change in hand configuration (e.g., proforms), trajectories (e.g., directional verbs) or
amplitudes (e.g., size specifiers). Simple glosses do not provide
such information.

For instance, in French Sign Language, the sequence "I give a small balloon to him" encompasses the three phenomena and will be done with only two signs : (i) a sign to specify the given object ("the small balloon") with a size specifier and (ii) the sign [GIVE] with the hand configuration corresponding to a small balloon ('O' configuration) and a motion going from the signer to the side.

It can be represented using different gloss sequences which will have an impact on the resulting animation. With a sequence of simple glosses, this would give:

[I][HE][SMALL][BALLOON][GIVE] (5)

This would certainly result in the concatenation of many isolated signs in their citation form. The utterance would not be grammatically correct.

However, the use of parameterized glosses can cover this type of inflection:

 $[BALLOON_small][GIVE_'O' config_I \rightarrow he] \qquad (6)$

The representation (6) only contains two glosses, a first gloss
naming the specified object and a second gloss corresponding to

an inflected sign that can be retrieved from a database or gen-25 erated on-the-fly. This parameterized representation will cer-26 tainly achieve a result more similar to what a real signer would do. However, it implies a very large database containing an important number of inflected signs or a synthesis engine capable 29 of understanding the syntax of the representation and of creat-30 ing the corresponding sign (e.g., by creating the desired size of 31 the object as a linear combination of the two extreme sizes of 32 the same object present in a database). 33

Timing Information. There are two philosophies in timing 34 management for signing avatars. This timing can be (i) indi-35 cated explicitly, in a relative or absolute manner, in the repre-36 sentation of the utterance at the input of the synthesis model 37 (in this case, it is an additional constraint for the model) [45], 38 or (ii) computed by the synthesis model according to the con-39 straints of the system [28, 60]. For example, if the sentence is 40 a concatenation of movement segments present in a database, 41 the timing will be constrained by the length of these segments. 42 Sequence of gloss representations, whether parametric or not, 43 do not account for the timing but only for the linear order of the 44 signs. 45

5.1.2. Examples of Representations

We describe here four ways of representing the SL utterances, each addressing different problems.

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EMBRScript: Representing Absolute Timing. The EMBRScript 49 represents non-contextualized signs in the form of k-pose-50 sequences. With this script, an utterance is considered as a 51 sequence of glosses, except that the timing of the signs is ex-52 plicitly indicated in an absolute way [45]. Apart from this tim-53 ing information, the shortcomings of this representation are the 54 same as those of the simple gloss sequence representation (no 55 consideration of the context and synchronization of non-manual 56 channels). 57

Example:	58
$I 300 \rightarrow 1190$	59
DANCE $1220 \rightarrow 2620$	60
NOT $2650 \rightarrow 3000$	61

ATLAS and HLSML: Representing Inflections. For the ATLAS
project of the Italian team of Turin, a focus is done on the inflected signs: a sign is defined as the combination of a base
sign (the citation form) and context-dependent modifiers. These
modifiers can be of different types: sign relocation, speed modification, trajectories modification, sign resizing, sign iteration
or hand configuration modification [60, 59].

Their article [59] takes the example of the sentence "Cloudy
at north-east. During the evening, cloudiness increases at northwest" which is interpreted in their animation language as:

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north-east;
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12 zone (relocated top-left);

13 cloud (relocated top-left);

- 14 instead;
- 15 evening;
- 16 cloud (repeating and shifting from top-left
- 17 to top-right);

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18 more (relocated top-right);
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19 zone (relocated top-right);
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In the same way, HLSML was developed by López-Colino et al. [101, 102] for their Spanish Sign Language avatar. It uses an XML-based notation to represent inflected signs (see Fig. 21) or to change the location of a sign. Moreover, time information can be included in the representation to constrain the realization of the signs.

Fig. 21. The representation of the inflected sign [TO GIVE] in the expression "to give a book" in HLSML. The hand configuration used for the sign [TO GIVE] is the one of the sign [BOOK] named "clBOOK" ("book classifier").

- ²⁶ An utterance is therefore defined as a sequence of contextu-
- ²⁷ alized glosses which are a form of parameterized glosses with
- ²⁸ the same limitations.

P/C Model: Representing Synchronization. A common way to 29 analyse a sentence structure in natural language processing for 30 oral languages is to display it in the form of a syntax tree [103]. 31 However, the multichannel aspect of SL makes it difficult to 32 describe an SL utterance as a syntax tree. In his work, Huen-33 erfauth proposes to represent an SL utterance in the form of a 34 3D syntax tree [104]. He thus defines a formalism, called Par-35 tition/Constitute (P/C) model which is a 2D representation of a 36 3D syntax tree to which restrictive rules have been added. This 37 representation allows to visualize from left to right the temporal 38 axis and from top to bottom the body channels. The nodes of the 30 3D tree are represented by rectangles (leaves are the "atomic" 40 rectangles that surround a text while the root is the rectangle 41 that surrounds the whole, the other rectangles are the different 42 branches). This representation allows to manage the coordina-43 tion of the different channels between themselves as well as the 44 use of certain proforms (see Fig. 22 and 23). 45

There is no precise timing information but the "sequential ordering within channels and coordination relationships across channels" are made explicit.

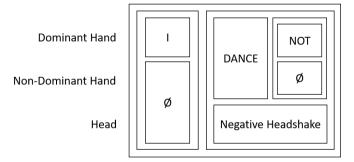


Fig. 22. Example of the P/C modeling of the sentence "I did not dance" in ASL. The coordination of the negative headshake with the signs [DANCE] and [NOT] is explicit (figure done using the representation described in [104]).

Azee: Representing Function-to-forms Associations. With the 49 Azee representation, the common assumption that an SL sen-50 tence is defined as a sequence of glosses is questioned. The 51 originality of Azee is that it is based on the minimal linguis-52 tic assumption that the language is a system where observable 53 forms are associated, in a systematic way, to a meaning. To 54 capture those systematic associations, Azee implements produc-55 tion rules: invariant function-to-forms correspondences where 56

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Representation	NMFs syn- chronization	Co- occurrence of Signs	Sign Inflection	Timing Information
Sequence of glosses	×	X	×	X
Sequence of parameterized glosses	X	X	✓	X
EMBRScript [45]	×	X	X	✓
ATLAS [105, 60]	×	X	✓	X
HLSML [101, 102]	×	X	✓	✓
P/C Formalism [104]	1	(✔)	X	×
Azee [106, 107]	✓	✓	✓	✓

Table 2. Comparison of the utterance representations.

 \checkmark : Good management of the functionality

 (\checkmark) : Partial management of the functionality

✗: Functionality not managed

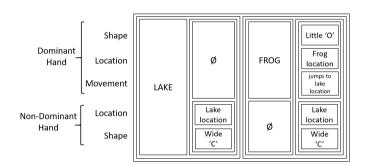
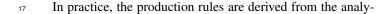


Fig. 23. Example of the P/C modeling of the sentence "The frog jumps into the lake" in ASL. The \emptyset symbol for the non-dominant hand during the realization of the [FROG] sign makes it possible for the non-dominant hand to hold the classifier of [LAKE] (figure done using the representation described in [104]).

a *function* is the desired semantic meaning produced by the *forms*, the "visible states and movements of the body articu-*lators*" [106].

Those production rules capture, using the same process, the formation of isolated signs (in this case, the states of the differ-5 ent channels for the production of this sign will be the *forms*, 6 while the meaning of the sign, the gloss, will be the *function*) and higher-level syntactic mechanisms such as the relationship between entities (e.g., "A is an instance of B" or "A is an infor-9 mation on B") [107, 108]. Some rules can thus be parameter-10 ized according to the context (parameters A and B of the pre-11 vious examples) and, since all mechanisms are put on the same 12 level, the nesting of production rules is done in a natural and 13 direct way. A and B can be isolated signs or complex syntactic 14 functions. A rule tree allows to visualize this type of nesting 15 (see example of rules in Fig. 24 and a rule tree in Fig. 25). 16



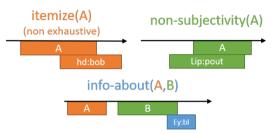


Fig. 24. Individual production rules of Azee (figure inspired from [109]). The *itemize*(A) production rule, for instance, designate the function-to-form association used to do a non-finite enumeration. It makes it possible to create expressions like "theatres, restaurants, etc." in which case, the *itemize*(A) rule is used twice with the parameter "A" taking successively the values "theatre" and "restaurant". When performing the enumeration, a head movement (hd:bob) is done at the end of each item.

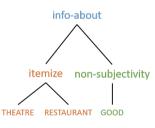


Fig. 25. The rule tree of the sentence "Theatres, restaurants, etc. are usually deemed good" (figure inspired from [109]).

sis of the content of a corpus until an invariant form is found 18 for a large number of instances of the same function. For example, if a left-to-right headshake is found with many instances 20 of negative utterances, a production rule associating the form 21 *left-to-right headshake* to the function *negation* will be created. 22 These production rules can be written in the form of temporal 23 scores (see Fig. 26) and are unambiguously interpretable by a 24 synthesis system. The rules are defined without a priori: the 25 lexical sequence as the base of an SL production is therefore 26 questioned. The sequence of signs is seen as one possible form 27

in the same way as an eye blink or a headshake. In addition,
if timing information has been found consistently for many instances of the same *function*, this timing is added to the *forms*of the *function*.



Fig. 26. The *Azee* representation of the sentence "Theatres, restaurants, etc. are usually deemed good" in the form of a sign language score (figure inspired from [109]).

Moreover, there is ongoing work in order to associate *Azee* formalism with a pictogram representation to make it more accessible to the deaf community and obtain a writing system that can be directly interpreted and synthesized by an animation system [110].

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Table 2 provides an overview and a comparison of the utterance representations.

13 5.2. Utterance Synthesis Approaches

Two main utterance synthesis approaches are often distin-14 guished: the **concatenative** and the **articulatory** synthesis [64] 15 (see Fig. 27). In the case of concatenative synthesis, the utter-16 ance objective is considered as a set of smaller objectives. Con-17 catenative synthesis involves a motion/sign database and con-18 sists in concatenating small chunks of existing data while artic-19 ulatory synthesis computes the sign language utterance directly 20 from the gesture specification. Hybrid avatars with animation 21 systems taking advantage of both techniques are also emerging. 22

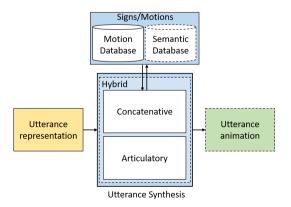


Fig. 27. Overview of the utterance synthesis techniques.

5.2.1. Concatenative Synthesis

It is the process in which chunks of pre-recorded or pre-24 synthesized motions are concatenated successively and/or on 25 the different SL channels (see Fig. 28). Motion interpolation 26 or blending techniques are used to build the transitions between 27 two chunks of motions. Motion blending consists in doing, at 28 each frame, an interpolation of motions present in the database 29 to create new motion having the characteristics of the initial mo-30 tions. The quality of the result strongly depends on the length 31 and granularity of the chunks of motion. The simplest and most 32 common approach is to consider motions at a gloss-level, but 33 smaller motion chunks can also be used, leading to a more pre-34 cise control of the avatar animation. Motion synthesis is there-35 fore based on an annotated database of signs (or finer grained 36 motions) that is queried to compose the utterance. The annota-37 tion of the data is essential: the granularity of the synthesis is 38 restricted by the granularity of the annotation, and the presence 39 or absence of artifacts in the final animation depends partially 40 on the quality of the segmentation of the data. The database is 41 built and annotated offline while the sign concatenation can be 42 done online. Utterance representations based on sequences of 43 glosses are particularly suited to this synthesis technique. The 44 following paragraph details the different avatars technologies 45 that make use of concatenative synthesis for utterance synthesis 46 depending on the nature of the content of the original database. 47

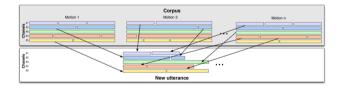


Fig. 28. Multichannel Concatenative synthesis (image extracted from [83]).

Using Hand-Crafted Animations. In this case, concatenative synthesis relies on a database of hand-crafted motions and on motion interpolation to smoothen the transitions between the concatenated gestures. *Paula* [57] and *Elsi* [29], the avatars presented in Section 4.3.1, rely on this principle. *Paula*'s motion is created in real-time by automatically combining and possibly modifying the hand-crafted key postures in accor-54

dance to the desired sign language utterance. *Elsi* can sign full
utterances created by concatenation of isolated signs designed
by rotoscopy. Unfortunately, she can create very few novel
utterances as rotoscopy does not provide for context-dependent
signs. However, this method suits the application of *Elsi*who does not need to convey novel messages since she has
to provide information in train stations to deaf passengers
by combining pre-recorded fill-in-the-blank sign language
utterances and isolated signs.

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11 Examples of avatars using concatenative synthesis with 12 hand-crafted data:

• Paula [57].

- Elsi [29].
- The Turkish Sign Language avatar of Yorganci et al. [63].
- The Spanish Sign Language avatar of López-Colino et
 al. [101, 102].

Using Automatically Generated Signs. It is also possible to 18 build a sign language utterance by editing and concatenating 19 signs extracted from a database of automatically keyframed or 20 of procedurally synthesized signs. Annotation tags are queried 21 to retrieve the relevant keyframes/signs from the database. The 22 avatars relying on automatic keyframing for the generation of 23 isolated signs (Section 4.3.1) often synthesize utterances by 24 simple concatenation of whole signs. 25

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Examples of avatars using concatenative synthesis with au tomatically generated signs:

- The EMBR avatar of Kipp et al. [45, 52].
- The avatar of Krnoul et al. [66].
- The parametric avatar of Irving et al. [62].
- The *eSIGN* avatar [111].

Using MoCap Data. Concatenative synthesis on MoCap 33 data consists in combining and concatenating previously 34 captured motion chunks (often corresponding to a sign or gloss segment). The transition between the motion chunks can be done using different kinds of interpolation and blending 37 methods [24]. This concatenative synthesis produces realistic 38 motions on play-back sequences but the quality of the utterance 39 as a whole strongly depends on the quality of the synthesized 40 transition segments. Moreover, the signs will be played by the 41 avatar the exact same way as they were recorded. It means that 42 the objects described in the new utterance will have the same 43 aspect as the ones recorded. The creation of novel utterance is 44 thus limited by the motions available in the database. 45

Examples of avatars using concatenative synthesis with Mo-Cap data (see section 6 for more details): 46

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- The Sign3D avatar [28]. This system, characterized by high fidelity captured motion (both corporal and manual data, facial expression and gaze direction), proposes datadriven synthesis at the sign/gloss level.
- The SignCom avatar [83]. This system allows for concatenative synthesis at a phonological level.
- 5.2.2. Articulatory Synthesis

One of the drawbacks of concatenative synthesis, regardless 56 of the nature of the database, is that the input is often a se-57 quence (of glosses or motions) while co-occurring spatial phe-58 nomena (e.g., proforms or iconicity) are often present in sign 59 languages and cannot be fully captured by concatenation alone. 60 Therefore, another way to build utterances in sign language is 61 to create them on-the-fly following an utterance specification and not depending on a predefined database of fixed motion 63 chunks. Iconicity, proforms, transitions between the signs or 64 co-occurring phenomena can be incorporated directly into the 65 sign description so as to take the context into account. 66

Sentences build this way can be precisely controlled but the work of describing the utterance using a sign or a gesture specification (taken as input of such a system) can be extremely tedious. Furthermore, the resulting animation lacks realism and

may be rejected by the Deaf community (in [112], the authors show that "natural movement" are the second most important 2 requirement for the acceptance of the avatar). To our knowledge, only the GessyCA system [72] uses the articulatory synthesis alone to build utterances. The sequence of signs described with *QualGest* is assembled by combining sequentially and in parallel the atomic gestems using synchronization operators. Procedural approaches to animate an avatar at a sign level from a sign representation are commonly used but they 9 are rarely extended to the utterance level. However, hybrid ap-10 proaches that mix articulatory and concatenative principles are 11 more developed. 12

5.2.3. Hybrid Synthesis 13

Hybrid models take advantage of the strengths of concatena-14 tive and articulatory synthesis. The CUNY American research 15 group worked on both procedural animation techniques and 16 data-driven synthesis approaches using MoCap data and com-17 pared the two approaches in [82]. The sign language research 18 team of the University of East Anglia also studied both tech-19 nologies, first with Tessa (concatenative) [96], followed by the 20 eSIGN project (articulatory) [113]. They proposed to use Mo-21 Cap data to add realism to their procedurally animated avatar. 22

DePaul University research group implemented this idea on 23 Paula, their avatar animated with hand-crafted keyframes [58]. 24 Moreover, Paula was recently improved with IK solvers that 25 procedurally modify the hand-crafted animations in order to 26 synthesize context-dependant mechanisms such as proforms 27 making it a fully hybrid avatar [114, 107]. The Italian Sign 28 Language avatar of Lombardo et al. [60, 59] defined a con-29 textualized sign as the combination of a base sign (defined 30 mainly by manual and automatic keyframing but also by Mo-31 Cap) and context-dependent modifiers (procedural methods or 32 hand-crafted poses). It showed great promise but the project 33 seems to have been frozen as no subsequent article has been 34 published on the subject. In the same philosophy, the ASL 35 avatar of Adamo et al. [115] relies on a multilayer system with 36 a concatenative synthesis engine to query individual signs that 37 are altered by procedural prosodic modifiers. 38

6. Existing Systems

In this section, we present three SL avatars using differ-40 ent sign and utterance synthesis approaches. To have a more exhaustive overview, Table .3 lists and describes the existing 42 avatars. 43

6.1. JASigning and AnimGen

The Java Avatar Signing (JASigning) system is a multiplat-45 form tool for the synthesis of any sign language [116]. It is 46 freely available for research purposes⁷. It integrates AnimGen, 47 an animation engine for SL synthesis developed for the ViSi-48 CAST [74] and, later, the eSIGN [111] projects. 49

For isolated sign synthesis, AnimGen takes as input the 50 SiGML notation [47] of a sign and translates it into low-level 51 parameters for the animation based on inverse kinematic con-52 trollers. 53

For utterance synthesis, the concatenative method is pre-54 ferred: the signs are assembled to form utterances. Some inflec-55 tions can be added to the isolated signs to take the context into 56 account: the location, direction, gaze and facial expressions of 57 signs can be changed. However those modifications can only be 58 applied at a sign level creating a possible over-synchronization. 59

The AnimGen module was used internationally in numerous 60 works from 2001 until today [21, 113, 116, 117, 74, 48, 118, 61 75, 119]. Notably, Hanke et al. [117] whose work focuses on 62 the study of timing differences on the SL channels, used Ani-63 *mGen* to test their hypothesis on the synchronicity between the 64 hand configuration with respect to the hand location. In more 65 recent work, JASigning constituted the basis of Ebling's anima-66 tion module to test her machine translation system [21]. 67

The AnimGen module is suited for simple translation tasks 68 as it allows the creation of new signs and utterances. Indeed, 69 it only depends on a sign representation (SiGML) and not on 70 annotated data. However, the motions generated lack the nat-71 uralness of human motion. In addition, it depends on a con-72 catenative synthesis module to create utterances: simultaneous 73

⁷http://vh.cmp.uea.ac.uk/index.php/JASigning

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mechanisms cannot be captured by *AnimGen* and the inflections
that can be added to the signs are limited by *SiGML*.

3 6.2. SignCom and Sign3D

The avatars SignCom [83] and Sign3D [28] aim to animate French Sign Language avatars with natural and realistic movements from captured human data. They rely on two databases: (i) a raw motion database in which the captured motion is stored 7 as a hierarchical structure (the skeleton) with a set of transfor-8 mations applied to each joint, and (ii) a semantic database that 9 serves as a mapping between the gloss level annotations and the 10 movements contained in the first database. The Sign3D system 11 operates at a sign/gloss level. Following a stereotyped syntac-12 tic scheme, it allows to precisely synthesize novel utterances by 13 replacing signs or groups of signs. The building of utterances 14 is done following an interactive graphical language [28]. Sign-15 Com is a multichannel system that operates on parallel chan-16 nels (lower body, torso, arms, hands, head, face, and eyes) cor-17 responding to phonological tracks [83]. The channels are tra-18 versed in a tree-like manner through a scripting language that 19 activates animation engines adapted to the different parts of the 20 body. Interpolation, blending and fading in/out operations en-21 sure co-occurrence between channels. 22

For the synthesis of isolated signs, the appropriate sign is 23 retrieved from the movement database. To do this, the seman-24 tic database makes it possible to find the movement(s) labelled 25 with the desired gloss. If several movements correspond to the 26 gloss, a choice can be made using various criteria: length of 27 the time segment, profile of the movement, etc. The sign can 28 be edited if necessary with a temporal inversion of the signal to 29 change [TAKE] to [GIVE] or [LIKE] to [DO NOT LIKE]. As in 30 most data-based systems, the synthesis of novel signs remains 31 limited by the content of the MoCap database. For utterance 32 synthesis, the captured and possibly edited captured signs are 33 concatenated and the transitions are synthesized by motion in-34 terpolation or motion blending. An additional criterion for the 35 retrieval of signs can be added: distance from previous and/or 36 following movements [24]. 37

³⁸ Despite different isolated sign synthesis techniques, *JASign*-

ing and the avatars *SignCom/Sign3D* have the same drawback regarding utterance synthesis: the synthesis mostly uses the signs in their citation form and do not integrate complex mechanisms of SL such as proforms, or size and shape specifiers. 42

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6.3. Paula-Azee

Paula (see Fig. 29) of DePaul University is an American Sign44Language avatar based on a multi-track animation engine while45Azee is a language modeling system, first used for French Sign46Language, that aims to represent the syntax of SL utterances in47a non-sequential way (see Section 5.1) [120]. Paula and Azee48were developed separately but they both rely on a multi-track49system which makes their connection possible.50



Fig. 29. *Paula* from the DePaul ASL Avatar Project (image extracted from [121]).

Paula is an hybrid system mainly animated with hand-crafted keyframes but that can also take advantage of procedural ap-52 proaches to add precision or realism. To build the set of hand-53 crafted animations of the isolated signs, the PDTS classifica-54 tion of Jonhson & Liddell (that defines signs as a sequence of 55 postures and transformation segments) is used as a template to 56 manually draw the keyframes of Paula [57, 58]. Procedural an-57 imation of the spine can be added to increase the naturalness of 58 the animation. 59

For utterance generation, the hand-crafted animations of ⁶⁰ *Paula* can be modified procedurally thanks to IK solvers in ⁶¹ order to synthesize proforms or spatial referencing mechanisms [114, 107]. Moreover, *Paula*'s animation system relies ⁶³ on a timeline of parallel tracks, including "mouth shape" track, ⁶⁴ "blink" track, "head movement" track, or "gloss" track, that is
very similar to the *Azee* sign score shown in Fig. 26. Animation
blocks can be placed in an asynchronous way on the different
tracks of Paula's animation timeline. The resulting animation is
a combination of the effects of the multiple processes. A mapping between *Paula*'s utterance specification tool and *Azee*'s
formalism was created allowing *Paula* to be driven by *Azee*'s
linguistic modeling [107].

7. Discussion

Previous work on sign language avatars do not often ex-10 plicitly discriminate isolated sign synthesis from utterance 11 synthesis. However, we noted that, for a given avatar, signs and 12 utterances are rarely built in the same way. The construction 13 and animation of utterances call for an extensive knowledge of 14 the linguistic specificities of sign languages. As sign languages 15 are multichannel languages that involve the movement of 16 several body parts in parallel as opposed to the sequential 17 restriction of the oral medium, a particular attention must be 18 given to the construction and synchronization of full utterances. 19 20

Isolated signs can be created using hand-crafted or automati cally computed keyframes, procedural animation or data-driven
 techniques.

Keyframe-based techniques (either hand-crafted or automat-24 ically generated) give a non-continuous definition of motion 25 where each keyframe is a given posture of an avatar at a 26 given time. As the number of keyframes is too small to de-27 fine a smooth motion, interpolation between two consecutive 28 keyframes must be performed. The resulting motion greatly 29 depends on the definition of the keyframes and on the complex-30 ity of the interpolation. Hand-crafted animations require a te-31 dious process for which the realism of the results depends on the 32 skills and choices of the graphics designer. They are generally 33 based on a visual representation of signs (e.g., video recordings 34 or drawings). Automated keyframing animations are based on 35 keyframes generated using isolated targets and forward and in-36 verse kinematics algorithms. 37

Procedural techniques take advantage of the temporal control of systems (whether kinematic or dynamic), using cost functions to be minimized to achieve objectives (e.g., moving targets), in order to create continuous motion.

In the cases of automatic keyframing and procedural tech-42 niques, the targets are generated thanks to a sign representation 43 based on a phonological view of the sign. Both the automatic 44 keyframing and procedural techniques are appropriate for gen-45 erating precise, configurable and flexible animation but produce 46 robotic and stiff motions since gaze direction, facial expression 47 and body movement are often not stated in sign specifications 48 where only the relevant manual features are described. Random 49 noise and signal processing methods are often used to improve 50 the final animation. 51

Still, those synthesis methods lack the expressiveness of hu-52 man motion whereas, in data-driven techniques, the resulting 53 animation has the authenticity of natural human motion without 54 needing to add special treatments. MoCap is thus a great tool 55 for linguists and computer animators to analyze and synthesize 56 motion. It can be a way to find motion laws using statistics 57 on the data or to observe some linguistic phenomena of inter-58 est. However, the calibration, capture and post-processing of 59 the data are complex, tedious and time-consuming. The Mo-60 Cap equipment can be invasive with the presence of markers or 61 sensors potentially impacting the realization of the signs. 62

The capture of SL signs and utterances can be performed 63 in a limited space as the signer does not move during the lin-64 guistic production but it also brings important technical con-65 straints [122]: (i) the need to accurately capture gestures with 66 small but meaningful variations (the finger motions particu-67 larly), (ii) the temporal dynamics (velocity, acceleration, jerk) 68 must be preserved which requires a high sampling rate and (iii) 69 the whole body is involved in sign language production: facial 70 expressions, torso motions and manual characteristics must be 71 captured simultaneously. Concerning the content of the corpus, 72 two main trends are often confronted. In Duarte's PhD the-73 sis [123], they are named *breadth* and *depth*. Breadth consists 74 in capturing a large number of different signs to try to cover 75

the whole language, while depth consists in capturing a limited set of signs numerous times with many variations (for ex-2 ample, by varying the location of the sign in space). As sign languages do not contain a finite number of signs due to mech-4 anisms such as proforms or role-shifts, and because capturing 5 data is costly, covering all the possible signs in all the possible 6 contexts (the *breadth* solution) is not a viable design solution. Moreover, the motion data, after being captured, is not directly workable. In the case of passive MoCap, the signer whose mo-9 tion are recorded is covered by numerous markers (sometimes 10 more than 100). Those markers are often not or wrongly iden-11 tified by the motion capture system leading to a task of man-12 ual verification and relabelling. Then, potential gaps due to the 13 occlusion of markers have to be filled. The resulting data (ei-14 ther from active or passive MoCap) may be filtered to remove 15 unwanted noise. Finally, the joint orientations of the skeleton 16 have to be reconstructed from the sensor data or from marker 17 positions in order to obtain workable skeletal motion data in 18 the form of a motion file. 19

The use of data leads to the development of optimized mo-20 tion retrieval techniques to prevent slowing down the animation 21 process. Moreover, the data must be annotated at a more or less 22 fine-grained level depending on the animation technique. This 23 annotation work can be tedious and time-consuming, especially 24 when done manually. In addition, new sign language utterances 25 are hard to generate from a limited set of motions in the 26 database and context-based variation in the captured motions is 27 not easy to synthesize which is a problem considering the great 28 iconicity and variability of signed languages. Machine learning 29 methods associated to MoCap data are a promising way to 30 reduce the limitations of data-driven techniques. In the near 31 future, with the advent of deep learning, captured motion data 32 could be replaced by video data, thus facilitating the generation 33 of SL content. 34

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Sign representations can be the basis for precise, flexible and
fast generation of movements allowing for real-time animation.
However, the exploitation of sign representations often requires

the prior manual intervention of transcribers to perform the mapping from a specific gloss to the lower-level sign represen-40 tation. The automation of the gloss-to-representation mapping 41 is an open issue that greatly depends on the chosen sign 42 representation. Indeed, some representations are configurable 43 - the difference between [BIG BALLOON] and [SMALL 11 BALLOON] in Zebedee will only be a parameter to change 45 (the radius of the balloon) while it will be necessary to modify 46 each symbol if these same signs are described in HamNoSys. 47 The gloss-to-representation mapping for illustrative/iconic 48 signs can be automated using key words (like BIG or SMALL 49 in the previous example) while the correspondence for signs in 50 their citation form can only be done manually. 51

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In the case of utterance animation, concatenative synthesis 53 consists in concatenating chunks of motion (corresponding to 54 the isolated signs previously defined or to sub-lexical struc-55 tures) in order to create the utterance. This kind of synthesis 56 is based on a database built offline and often relies on a se-57 quence of glosses to retrieve the relevant motions. The tran-58 sitions between the motions are smoothened using signal processing functions like blending or interpolation, and modifiers 60 of the original signs are often added to add prosodic cues or to 61 take into account the context of the sign. Concatenative syn-62 thesis is an inherently sequential technique that can be seen as 63 contradictory to sign languages philosophy; however, concate-64 nating chunks of motions along the temporal axis are not the 65 only option of concatenative synthesis. Little work has been 66 dedicated to the concatenation of smaller motions on the differ-67 ent channels of sign language (hand configuration, motion, orientation, facial expression, etc.) and this could be the focus of 69 future research. Currently, data-driven utterance synthesis sys-70 tems rely on concatenative synthesis to achieve three linguistic 71 purposes: (i) replacing signs or groups of signs within an utter-72 ance, (ii) replacing phonetic or phonological components and 73 in this way modifying the grammatical or semantic aspects of 74 the utterance, or (iii) altering prosody in the produced sign lan-75 guage utterances [84]. 76 Articulatory synthesis aims to build sentences on-the-fly
 based on a sign or gesture specification. The animation can be
 computed from biocontrol or inverse kinematics models. This
 approach can sometimes lead to real-time animation as no data
 has to be retrieved from a pre-built database.

The benefits and drawbacks of articulatory and concatenative approaches are oddly complementary. On the one side, the articulatory techniques allow for a real-time generation of novel utterances but are poorly accepted by the Deaf community 9 due to their inexpressive and robotic motions. On the other 10 side, concatenative approaches based on MoCap technologies 11 or hand-crafted signs allow for authentic, human-like motion. 12 However, the variety of utterances that can be synthesized is 13 limited by the initial corpus. Moreover, the sequential aspect of 14 concatenative approaches, enforced by the sequential represen-15 tation taken as input, does not do justice to the richness of the 16 language. However, new, non sequential ways of specifying 17 utterances like Azee [106] or the P/C Formalism [104], or 18 specifications taking sign inflections into consideration such 19 as ATLAS [105] or HLSML [101], are being developed to 20 overcome the limitations of the current representations. 21

Hybrid models, taking advantage of the strengths of both
the concatenative and articulaty approaches could result in
a generic and well accepted avatar. Hybrid synthesis is a
promising technique for sign language animation and will
certainly be one of the main concerns of future work.

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Moreover, even though Non-Manual Features (NMFs) are 28 mentioned and that some of the described techniques are used 29 to animate the face and torso of the avatar, the focus of this 30 survey is the animation of the avatar's arms and hands. By no 31 means do we want to lessen the importance of NMFs which are 32 paramount in any sign language animation, a great part of the 33 meaning being conveyed by them. A survey dedicated to the 34 animation of facial expressions for sign language avatars was 35 proposed by Kacorri [1]. 36

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³⁸ Furthermore, it is interesting to note that the challenges

of animating SL avatars may be similar to the issues raised 39 by the generation of communicative gestures for Embodied 40 Conversational Agents (ECA), or more broadly for expressive 41 virtual characters. Indeed, as with SL avatars, ECA gestures 42 convey meaning and must demonstrate non-verbal behaviours 43 such as shrugs or head movements that can be associated with 44 the production of a speech utterance [124]. Consequently, 45 ECA's gestures, like those of SL, must be precise, realistic, 46 and expressive. Different challenges have been identified in 47 the ECA community for deictic [125] or metaphoric gestures 48 (use of the form and motion of a gesture to convey abstract 49 concepts [126]), or more broadly for expressive virtual agent 50 gestures guided by semantics [127]. Such challenges are very 51 similar to those of the SL animation community. 52

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Finally, as sign language avatars are mainly intended to be used by the Deaf, their approval by the community is neces-55 sary. A deaf person will be badly receptive to a robotic mo-56 tion the same way a hearing person will to a robotic, unnatu-57 ral voice. However, the quality of an avatar's motions is not 58 the only factor guaranteeing the acceptance of the avatar: the 59 avatar's appearance is also important. One of the main issues of 60 the human-looking avatars is the risk of falling into the uncanny 61 valley, first introduced by Mori in [128]. To prevent this risk, 62 some research teams on sign language avatars choose to give 63 a cartoon-like appearance to their virtual signers (e.g., avatar 64 of Sign360 [90] or Adamo et al. [115]). 'Cartoon' avatars are 65 more easily accepted by the deaf population due to their likable 66 appearance but they bring specific problems (e.g., the gap be-67 tween the proportions of the signer skeleton and of the 3D car-68 toon avatar can impact the accuracy of the animations). Surveys 69 assessing the acceptance of sign language avatars by deaf peo-70 ple have been made by Kipp et al. [112], by Adamo-Villani et 71 al. [129], and by Lu et al. [88, 82]. They show that non-manual 72 features like facial expressions and natural movements are of 73 great importance to deaf users. Such surveys provide precious 74 insights on the acceptance of the sign language avatars (e.g., 75 the choice of the colors for the avatar clothes, the presence of 76

- shadows and the absence of mesh interpenetration are very im-
- portant to improve the comprehensibility of the sign languages 2
- animations). Perceptual evaluation of signing avatar animations з
- by deaf consumers should therefore be performed systemati-4
- cally to ensure a good response to the technology. 5

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Year	Name of the avatar and/or the project	Input of the anima- tion system (specifi- cation language)	Sign synthesis technique	Utterance syn- thesis technique	Targeted applications
1982	Shantz Avatar [55]	List of fingers angles	Keyframe: hand-crafted	/	Study of SL perception
1999 & 2003	SignAnim [97] & Tessa [96]	Gloss sequence	Data-driven: play-back	Concatenative	Subtitle-to-SSE translation & Face- to-face speech-to-sign translation
1999-2001	GessyCA [51, 25]	QualGest	Procedural: with IK-based con- trollers	Articulatory	Animation of gestures for human communication
2001-2004	ViSiCAST [74]	SigML	Procedural : with dynamic con- trollers	Concatenative	Broadcasting, Face-to-face transac- tions and Interactive Internet info
2005	Vsigns [65]	SWML	Keyframe: automatic using kine- matics	Concatenative	SL dictionnary and/or SL editor for newscast animation
2006	Gérard [94]	Gloss + biomechanic features	Data-driven : augmented database	Concatenative	Expressive animation of SL
2007	Elsi [29]	Video footage + gloss sequence	Keyframe: hand-crafted	Concatenative	Train station pre-recorded informa- tion
2007-2008	Czech signed speech avatar [66]	HamNoSys + NMFs	Keyframe: automatic using kine- matics	Concatenative	Speech-to-sign translation
2008	Greek SL avatar [67]	HamNoSys + NMFs	Keyframe: automatic using kine- matics	Concatenative	Text-to-sign translation
2009	LSF Avatar [69]	Zebedee	Keyframe: automatic using kine- matics	Concatenative	Sign Synthesis
2010	EMBR Avatar [52]	EMBRScript	Keyframe: automatic using kine- matics	Concatenative	Animation of Embodied Conversa- tional Agent
2010-2016	JASigning [116, 21]	SigML	Procedural: with dynamic con- trollers	Concatenative	Multiplatform SL avatar, Text-to- Sign translation
2011	SignCom [83]	MoCap & Gloss Se- quence	Data-driven: augmented database	Concatenative	Interactive assisting Internet tech- nologies, translation
2011	Italian SL Avatar[59]	Gloss + modifiers	Keyframe: hand-crafted	Concatenative + modifiers	Text-to-sign translation, Virtual interpreter
2012	LSE Synthesizer [101, 102]	HLSML	Keyframe: hand-crafted	Concatenative + modifiers	Multimedia applications, inflected sign synthesis
2015	Huenerfauth [16]	Huenerfauth	Data-driven: machine learning	Concatenative	Directional verbs study
2016	Yorganci [63]	MoCap & phonolog- ical notation	Keyframe: hand-crafted	Concatenative	Educational tool for deaf children
2016	Sign3D [28]	MoCap & Gloss se- quence	Data-driven: augmented database	Concatenative	Interactive assisting Internet tech- nologies, Translation
2016	Libras Avatar [50]	XML version of Movement/Hold	Data-driven/Keyframe: MoCap keyframes	/	Translation of written textbooks for children
2016-now	Paula [57, 114]	SLPA/Azee	Keyframe: hand-crafted and auto- matic using kinematics	Hybrid	Translation

Table .3. Non-exhaustive list of the existing sign language avatars.



Three sign language avatars: Raymond from the IRISA lab (<u>http://lsf.irisa.fr/</u>), Paula of DePaul University (<u>http://asl.cs.depaul.edu</u>) and the cat of MoCapLab (<u>https://www.mocaplab.com/fr/</u>)