Abstract—Observational methods in interaction analysis are defended. Observational methods are distinguished from experimental methods with respect to the mode of data collection. Other approaches to human interaction analysis considered are: prospective, technological, psychoanalytic and philosophical.

I. INTRODUCTION

Advances in technologies associated with artificial intelligence and cognitive infocommunications are frequently underpinned by advances in understanding of human behaviours. Recent works have attempted to characterize the scope of interaction analysis [1], [2]. Given the scope of the cognitive infocommunications field and its relationships to cognate disciplines from artificial intelligence to zoology, it is natural that a plethora of methodological approaches are evident in works that address interaction analysis under the aegis of cognitive infocommunications. Nonetheless, we find it helpful to explicitly defend an observational approach, and that is the purpose of this paper.

We view of interaction analysis as the study of how humans interact with themselves, each other and non-humans, using language, gesture (including laughter) and physical placement. Interaction, in this sense, is an ancient discipline [3], [4]. The rise of artificial interaction agents and mobile communication devices have invigorated explorations in this area, typically in the hope of developing devices that display interaction behaviours that are like those of humans. The pursuit of artificial agents as new technologies emphasizes engineering oriented methods that scale towards “big data”. However, there remains a role for observational methods attached to “small data” [5], [6]. as has been defended within linguistics in the past [7], and data sets in between, such as given by natural language corpora, including multi-modal corpora [8], [9].

This paper is structured as follows. Firstly, (II) we elaborate on what we take to be the content of interaction analysis. Then we explain what we take to be constitutive of an observational method as a paradigm for research in interaction analysis (III). We defend this approach as a properly scientific method (IV). We then observe the range of methodological approaches adopted within interaction analysis, using a small but representative sample (V). Finally, we conclude that researchers need not in each work defend the choice of an observational per se, but rather, with respect to the research questions they pursue (VI).

II. INTERACTION AS AN OBJECT OF STUDY

In contrast to sentence level grammar, where syntactic rules and constraints appear to be explanatory, it is less obvious that instances of interaction follow rules of well-formedness. The main evidence that there might be follows from diagnosis of schizophrenia attending to disordered interaction patterns [10]–[13]. Interaction grammars appear to be implicit in foundational work on artificial dialogue systems. In general, though, there appear to be as many rules as the interaction contexts, the speakers’ intentions in them, the composition of the interaction groups etc. Thus, observational studies are necessary also because of the variability of interaction instances. Consider the turn-taking system and its rules, functioning as a descriptive framework for dialogue. Instantiations of turn-taking though can be numerous, especially when considering multi-modal ways of doing so — and they most probably serve communication goals. In general, aberrations from the turn-taking rules, e.g. overlaps, should not be interpreted similarly to ungrammatical word or sentences, because they tend to have a function in the dialogue.

There is inherent interest in understanding how humans interact in gatherings of varying scale, just as there is inherent interest in understanding planetary motions and subatomic particles. However, there is also increasing demand for technology that replicates human interactions, and the challenges associated with such technologies includes the need to understand human interactions at varying levels and across contexts [14].

In the behavioral analysis domain, a common way to have a controlled methodology of a research topic and the data accompanying it are academic challenges and competitions such as the Interspeech Computational Paralinguistics Challenge (ComParE) [15] Emotion Recognition in the Wild (EmotiW) [16] AudioVisual Emotion Challenge (AVEC) [17] and ChaLEARN Looking At People (LAP) [18]. Organizers of those challenges formulate the problem, provide data and evaluation metrics, as well as forums for the dissemination of results, aiming to advance the state-of-the-art in that particular topic.

http://www.compare.openaudio.eu/ last accessed 26.06.2020
https://sites.google.com/view/emoiw2020 last accessed 26.06.2020
https://sites.google.com/view/avec2019/home last accessed 26.06.2020
http://chalearnlap.cvc.uab.es/ last accessed 26.06.2020
Links to the above challenges point to the website of the latest challenge organised, and include an inventory of past challenges.
Consider the example of personality computing in all three dimensions of automatic prediction, perception and synthesis of personality traits [15]-[17]. Personality is a topic already well-defined theoretically, as it is based on extensively tested psychological theories. Therefore, the computing aspect is related to engineering approaches aiming to create models that best predict the personality traits (e.g. [18]). As constructed within the “big-five” inventory of traits, traits are relational in the sense that scores in any one dimension encode an individual’s percentile position – the percentage of people who have the trait to a lesser extent. Primary data in this area includes the scores that are appropriate to individuals’ responses to validated instruments, and these amount to individuals’ observations of their own preferences and their behaviours in interactions. Thus, the primary data of interaction analysis may include that which follows results of individuals’ introspection, direct interaction with others, or indirect, relational accounts.

III. A PARADIGM FOR ANALYZING INTERACTION

With reference to natural languages, it is typical to think of the inflection patterns for words as paradigms [19]: given a verb (e.g. forsake) and the information that it has the same conjugation pattern as another verb (e.g. take), one can reach a reliable conclusion about how to form its past perfect (e.g. forsaken). This notion of paradigm is one of the senses of the term paradigm as used in the philosophy of science [20]. Given a particular method, one may apply that method to a range of cognate questions in search of partial answers.

Here we describe a paradigm for interaction analysis anchored in the scrutiny of multi-modal corpora [22]. Observational is an apt single-word characterization. Observation is always conducted within a theoretical framework that provides an inventory of qualities which are relevant to quantify [23]. Observations are particulars, and particulars form the basis of generalizations, hypotheses that may be put to additional testing, towards refining the theoretical framework. Experimental studies are devised in order to test hypotheses about effects involving the qualities observed. An enormous methodological literature provides conventions for determining whether one may reject the null hypothesis that the effects are random interactions, accepting the alternative hypothesis that the qualities involved have explanatory force. Those experimental methods are useful within observational studies as well, in assessing whether the qualities noticed interact with each other in interesting ways. Further, data that informs an observational study in one endeavour may inform an experimental study in another, whether the contrasting conditions are available wholly within the data or the data is combined with other data sets in order to establish the relevant contrasts and controls.

Any number of multi-modal corpora exist. The Switchboard corpus includes speech and text modalities [24], [25]. The HCRC Map Task corpus involves a collaborative task that may be achieved only through linguistic interaction, and is recorded in speech and text [26]. HuComTech involves simulated interviews and structured informal interactions, recorded in video, speech and text [27], [28]. The ILMF-s2s involves a map-task construction but places machine translation between speakers of English and Brazilian Portuguese, recording video, audio, text, eye movements and bio-signals [29]. The MULTISIMO data set includes video, audio and text of three party interactions in a collaborative task [22]. The MULTISIMO corpus was designed to make available an English corpus that would support the analysis of qualities of interaction (gaze, gesture, linguistic content) in relation to participant qualities (personality traits, as measured using the big-five personality inventory) and perception by external parties (of participant dominance and interlocutor collaboration).

Consider dominance [30]. Five independent evaluators rated participants in each of the conversations of the MULTISIMO corpus, using a five point scale, and a definition of dominance as “a person’s tendency to control the behaviour of others when interacting with them”. The question included whether dominance perceived by independent observers would relate directly to combinations of personality trait scores that arose from the dialogue participants own responses to a personality inventory and whether dominance would relate to the balance of contributions from participants to the dialogues. At face value, “the balance of contributions” is a straightforward notion. However, it may be made operational in any number of ways: in relation to the total duration of speaking, the total number of words or turns, the total number of words uttered relativized to speaking time, the counts of interruptions leading to “owning” the floor, and so on. In analyzing the MULTISIMO data, it emerged that relations of both sorts were visible (highest levels of extroversion linked to high dominance, and of agreeableness to low dominance; greater rate of speech in words per minute linked to higher dominance) [30]. However, this is not the end of the scrutiny of either personality traits and dominance or conversational behaviours and dominance within this data. It must still be considered whether that work made operational the main constructs in the most sensible manner. For example, the dominance scores of the five judges were aggregated as medians rather than means. Another alternative is to analyze disagreement about dominance ratings as a primary variable, and then, for example, a greater number of words spoken per minute corresponds to greater disagreement among the dominance judges [31].

Concepts we study–collaboration, dominance, personality, etc.–are not directly measurable from the raw data, hence our approach to construct new ways of making those concepts operational and test the quantitative interactions among those qualities. In the literature, directly measurable features from voice, turn-taking, gestures etc. are often mentioned as “low-level” and dominance and the like as “high level”. We are not aware of any particular theoretical grounding of high level features in that related literature. Indeed, much empirical work using openSMILE [32] attempts to understand how “low level” features cluster and inform “high-level” labeling judgements. The “truth” is normally about human assessments serving as a test-bed for the approaches employed each time.

The approach to the data that we are engaged in is a series of exercises in which we explore the data on the basis of theoretical perspectives (e.g. the discourse function of laughter, the signs of collaboration, the role of gaze). The sum of this series is a deeper insight into the particulars of the MULTISIMO corpus as well as the generalizations that hold for other collaborative corpora, and beyond. Thus, the paradigm of exploration involves making operational theoretical constructs in terms

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[26] Video was also recorded, but is not available in the corpus releases.
of the data at hand, and then measuring relationships among those operationalized qualities. We explore whether these same relationships hold for alternative operationalizations and we use the relationships that hold to inform our general theories. For example, one may have a general theory of how greater or lesser collaboration may be manifest in a collaborative corpus; such a general theory is elaborated by qualifying it with a regression equation that fits the data to whatever degree of goodness for the MULTISIMO data set, and which may thereafter tested on alternative data sets (to the extent that those data sets support the same operationalizations).

IV. Defending the Paradigm

One might wonder whether it is really necessary to defend the paradigm that we have described. Our experience has been that it is necessary to defend the approach against a number of critiques, such as that research which uses the observational approach is not guided by a coherent theoretical framework or that it is a “statistical significance fishing expedition”.

As suggested above, theory-free observations are impossible. Theoretical qualities that may be explored can be made operational in countless ways, each of them anchored in well-reasoned rationality. Observational studies allow one to obtain information about useful operationalizations of theoretical constructs. Some of those operationalized notions participate in effects that are statistically significant and some do not. If one applies Bonferroni correction as a filter, then one can feel more confident that the effects identified as significant would also emerge in an experimental study of the same effect, and that one is not in a situation in which an estimated probability less than 0.05 is an instance of an event better explained by chance than the hypothetical effect. However, in some cases, visible effects are not even statistically significant: this does entail that they are not significant in a non-statistical sense.

Tests of interactions among effects from inferential statistics have a role in observational studies as well as in experimental studies. Their use in observational studies does not amount to “statistical significance fishing”, but rather to “significance fishing” in the wider sense of identifying patterns in the data that signify processes and relationships underlying the data.

Where one has a theory that one is extremely confident to be true, one might imagine that there would be little reason to engage in demonstrations of the truth of the theory. Instead, what might appear to be attempts to demonstrate truth are actually occasions for potential falsification. The disproof of a theory is as important to theory building as the discovery of generalizations. The identification of generalizations evident in phenomena is at the heart of theory construction, and is the methodological goal of observational approaches. The same data that supports identification of generalizations may also be useful in realizing constraints that apply to the generalizations. However, in articulating theories that arise in this fashion one is aware that, as theories, they need to be tested with additional data and in experimental conditions.

A potential critique of observational studies is that they are premature. Given the difference in the standard of knowledge that arises from a controlled experimental study and an observational study, and given the extreme volume of studies put to peer review in the face of limited publication space, there is a natural inclination to prefer research that has a controlled experimental method (and which results in theory verification rather than disproof). A response is that these facts about the social psychology of scientific publication embed bias towards verification over disproof and limit the nature of theory building. In support of the alternative view of observational studies, one may note a recent trend to support replications of prior works. Further, in disciplines like medicine, it is increasingly seen as best practice to put research protocols to peer review prior to completing the experiments. Some advocate presenting research proposals to the peer review system of scholarly journals. Critiques of experimental studies include noting selective reporting of results, at odds with prior protocols. This suggests that in some cases, it is the experimental research that is premature, and that research would benefit from prior scrutiny of both theory building associated with observational studies and the experimental protocol associated with experimental studies. The connection between the two is in being able to witness the efficacy of alternative operationalizations of theoretical constructs, and therefore enabling a wider and deeper understanding of how proposed experimental protocols might be varied.

Observational approaches are appropriate for establishing the ground truth for assessing emotional states and social behavioral changes in patients with dementia and their caregivers. The need of observational approaches in assistive technologies for dementia patients and their caregivers arises, as highlighted before, because these technologies should act as assistants and companions for patients, and assistants and knowledge repositories for their caregivers and healthcare professionals. In the context of patients with mental disorders, as dementia, it is expected that while interacting with the intelligent assistant and/or health care professionals, both patients and caregivers will express collections of emotional states and behavioral changes which hardly have been accounted by current artificial intelligence and machine learning approaches. The automatic detection of facets associated to such interactional exchanges requires endowing such intelligent devices of emotional and behavioral information very different from those aroused in categorical emotional contexts. In this situation, the involved emotions are far from the expected primary emotions of happiness, sadness, fear, disgust, surprise and anger.

Dyadic interactions between carers and dementia patients are prejudiced by different factors. As for caregivers, there will be latent emotional states of worry, weariness, anxiety, chronic stress, psychological illness and depressive symptoms related to carer’s demographic factors, dementia characteristics of the carer’s recipient, carer’s burden, self-efficacy and received social support, and relationships (spouse, old child, etc.) between carer and carer’s recipient. These emotional states may produce negative consequences not only on the carers’ psychological and physical health but also on the quality of care they are able to release. These are the emotions that an observational approach would aim to identify to develop appropriate ICT devices/carers interactional models of assistance and support.

As for patients, neurodegenerative diseases are characterized by altered emotional responsiveness to salient sensory stimuli which mostly generate emotional dysregulation likely to be expressed through a wide spectrum of symptoms that

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[Recall that a type II error is the failure to reject a false null hypothesis.]
impact the lives of patients and their caregivers. Such symptoms are abnormal responses to thermoregulatory and basic homeostatic signals\footnote{We welcome debate regarding both the classification of these works and the appropriateness of including these, as opposed to others, as describing mathematical works as in the tradition of analytic philosophy, and deem them philosophical. Even considering dominance of methods, it nonetheless remains open that some works could be argued to fit more than one category (e.g.\cite{61} which is largely technological, but also observational – the methods are experimental in evaluating technology, but using extant data sets, rather than constructing or harvesting a data-set for the purpose – below we classify this work as observational).}, pathological seeking of rewarding stimuli such as food, sex or drugs\footnote{If there is doubt about this, we hope that this paper may be relied upon as a defence of the observational paradigm.}, derangements of complex social behaviors\footnote{It may be observed that a range of methods are attested. Further, our own work embraces methodological plurality, as can be seen from authors of this paper contributing to works in more than one category – this paper is not proselytizing for observational research as the only true method. One might reasonably ask how we classify this paper: this section is observational and aspects are prospective, but the work as a whole is philosophical.} and emotional disturbances such as depression and anxiety\footnote{Philosophical – \cite{1}, \cite{42}, \cite{47}, \cite{48}, \cite{57}.}.

However, since these abilities require new models of behaviors there is a need to establish a ground truth for the proposed system evaluation. There is a need to foresee scenarios of human/human interactions to be later implemented for the human/agent interactions. These scenarios should elicit interactional exchanges among experimenters, patients, and caregivers. Data thusly collected need to be annotated by experts to provide the ground truth that will drive the assessment of the performances of these intelligent systems which in turn should learn from the data to detect early emotional and social behavioral changes in patients and caregivers. Only an observational approach can provide an initial set of labels for audio, video and biometric data segments collected during the interactions. These labels should account for caregivers’ positive, negative and neutral emotional states as well as for stressed, worried, tired and depressive moods. Labels describing patients’ behavioral changes (which may describe initial dementia symptoms) may include wandering, purposeless activity, fear of being alone, woundling, hurting, stealing, scratching, deviating, restlessness, rambling, agitation, aggressiveness, and restiveness to care\footnote{We have seen that observational methods are well attested within interaction analysis and that the approach more or less defends itself.}. They will pilot the annotation procedures and will be subjected to changes with the addition and/or deletion of labels as new knowledge and meaning will be uncovered while the observational approach is running and the collected data are analyzed.

V. OBSERVING INTERACTION ANALYSIS PARADIGMS

We have seen that the observational method is important in research that aspires to advance health care. Here we consider a moment of time in interaction analysis research, such as reported in the cognitive infocommunications conference series. We focus on the 10th IEEE international Conference on Cognitive Infocommunications, which took place in Naples, Italy during 2019. At this event, 110 research papers were presented. Of these, we deem 32 to be inside the line of research within cognitive infocommunications that is focused on linguistic and behavioural interaction analysis, including speech interaction:\cite{1},\cite{42}–\cite{72}.

Thus, far we have been contrasting observational and experimental methods. We have noted that both include hypothesis testing, but differ in whether the data collection controls contrasts from the outset or instead relevant contrasts available within data collected are explored. In examining the relevant works, it is evident that a range of other methods are also deployed and that few works use one method exclusively. However, thinking of the dominant approach within each, some natural clusters are evident: prospective, observational, experimental, technological, psychoanalytical, philosophical. Prospective works are those that have put forward for peer review a research protocol, for example, for an experiment or new technology. We think of a work as technological if the work involves evaluations of new technologies. We think of

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Our classifications follow: Prospective – \cite{68}, \cite{71}; Observational – \cite{45}, \cite{46}, \cite{50}, \cite{59}, \cite{61}, \cite{63}, \cite{64}, Experimental – \cite{43}, \cite{58}, \cite{60}; Technological – \cite{49}, \cite{51}, \cite{54}, \cite{56}, \cite{62}, \cite{67}; Psychoanalytical – \cite{55}, \cite{65}, \cite{66}, \cite{69}, \cite{70}, \cite{72}; Philosophical – \cite{1}, \cite{42}, \cite{47}, \cite{48}, \cite{57}.


