

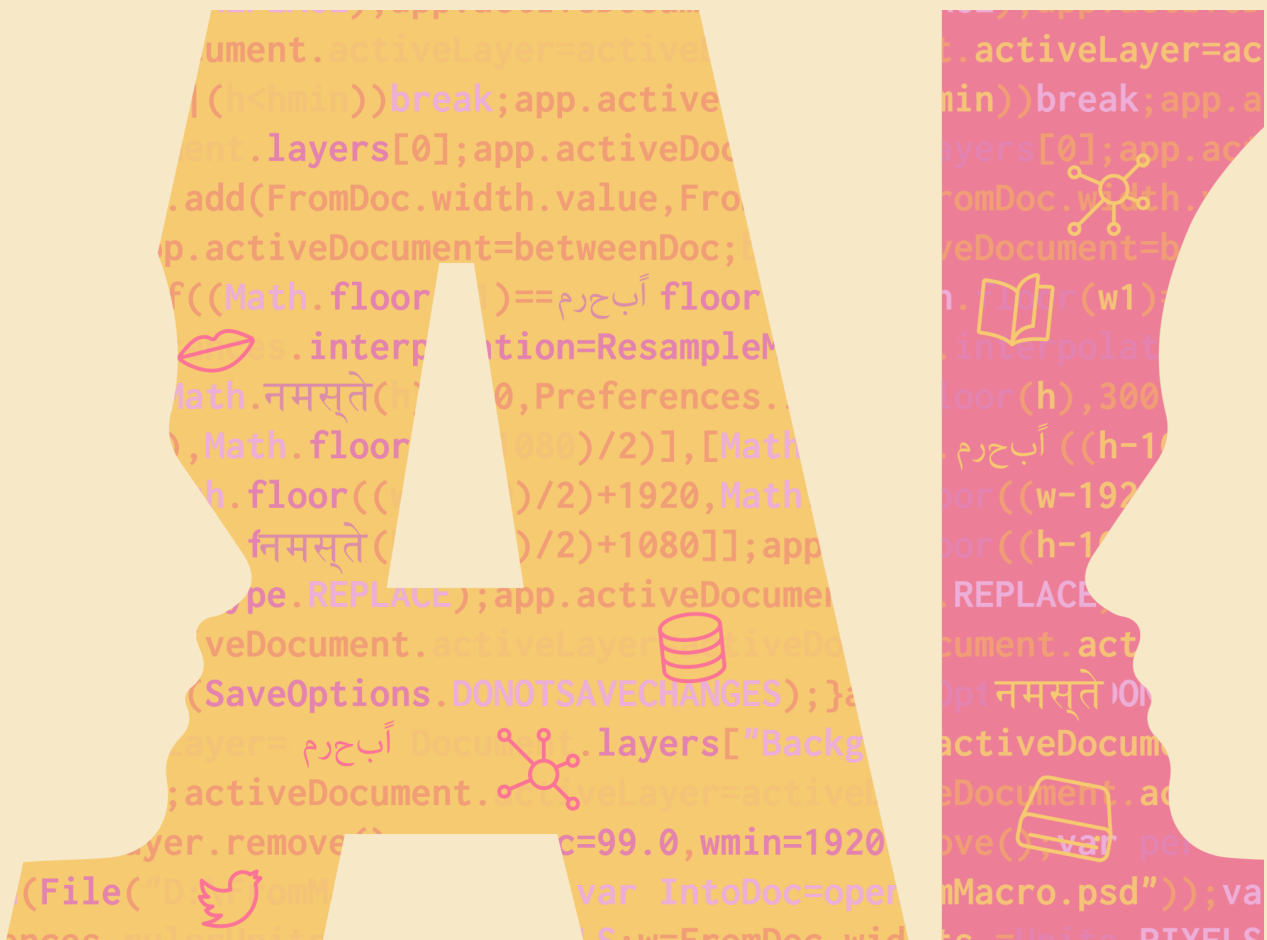
AI TECHNOLOGY AS INTERACTIONAL HUMAN CULTURE: LANGUAGE, DATA PRACTICE AND SOCIAL STRUGGLE



30 / 03 / - 31 / 03 / 23

European University Viadrina
Frankfurt (Oder), Germany

BOOK OF ABSTRACTS



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Poster Design by Alexander Koller from Dreist.at

Thursday 30.03.2023	Friday 31.03.2023
DAY 1: Collaborative Human-Machine Practices Zoom Link	DAY 2: The Sociocultural Framing of AI Zoom Link
09.00 – 09.30 REGISTRATION 09.30 - 09.55 WELCOME & INTRODUCTION	9.00-10.00 Andreas Hepp University of Bremen <i>Is the future of communication automation? From the human-machine interaction to communicative AI</i>
10.00-11.00 Joanna Rączaszek-Leonardi University of Warsaw <i>Paths of sense-making: language creation and language use in the fields of values</i>	10.00-10.30 coffee break
11.00-11.30 coffee break	10.30-11.00 Miriam Lind University of Mainz <i>Does Alexa Really Speak German? Concepts of Language and Linguistic</i>
11.30-12.00 Tim Hector Siegen University <i>Joint Journeys: On the Linguistic Construction of Domestic AI-culture Around Smart Speakers</i>	11.00-11.30 Carina Lozo University of Vienna <i>Digital Voice Assistants and the Fetishization of Female Synthetic Voices</i>
12.00-12.30 Barbara Lewandowska-Tomaszczyk University of Applied Sciences in Konin & Sonia Sousa Tallinn University (online) <i>Polish Users' Experience with the Linguistic and AI Realities and Their Persuasive Effects – A Pilot Study</i>	11.30-12.00 Raphael Börger Universität Potsdam <i>The Return of the Musician in the Age of AI-generated Music</i>
12.30-13.00 Michela Gargiulo TU Dresden <i>"Hi, I'm Sophia the Chatbot!": A Contrastive Analysis of Chatbots' Wel-</i>	12.00-12.30 Alicia Fuentes-Calle University of York <i>AI Poetics and the Proto-Aesthetics of Communication. Poetic Function,</i>
13.00-14.30 lunch break	12.30-14.00 lunch break
14.30-15.00 Sina Thäsler-Kordonouri LMU Munich (online) <i>What Comes after the Automation? An Investigation of Journalists' Aims and Practices when Editing Stories Produced with Automated Journalism</i>	14.00-14.30 Nina Markl University of Edinburgh <i>Algorithmic Bias and Algorithmic Language Management: Language Variation and Automatic Speech Recognition</i>
15.00-15.30 Sassan Gholiagha, Jürgen Neyer & Mitja Sienknecht ENS, Viadrina University <i>Objectifying Subjectivity: The Making of Artificial Intelligence.</i>	14.30-15.00 Mandy Lau York University (online) <i>Voice Assistants as Mechanisms of Language Ideology within Human Interactional Culture</i>
15.30-16.00 Siri Lamoureux & Yarden Skop Siegen University (online)	15.00-15.30 Gabriella Chronis University of Texas <i>NLP as Language Ideology: Automated "Toxicity" Detection and the</i>
16.00-16.30 Félix do Carmo University of Surrey (online) <i>If Machines Translate, What Do Translators Do?</i>	15.30-16.00 coffee break
16.30-17.00 coffee break	16.00-17.00 Emily M. Bender , University of Washington (online) <i>Meaning making with artificial interlocutors and risks of language tech-</i>
17.00-18.00 Nicolas Flores-Herr , Fraunhofer Institute for Intelligent Analysis and Information Systems (online, in English) <i>Technologische Souveränität: Entwicklung von Anwendungen für große KI Sprachmodelle aus Deutschland (Technological Sovereignty: Developing Applications for Large Language Models in Germany)</i>	17.00-18.00 Round Table Discussion <i>with all speakers, participants and Francisco Webber (cortical.io), Jan-Hendrik Passoth (ENS Viadrina), Eva Kocher (Juristische Fakultät, Viadrina), Emily M. Bender (University of Washington)</i>
19.00 Conference Dinner (self-paid) <i>Villa Casino (Mickiewicza 11, 69-100 Ślubice)</i>	18.30 Night Out (self-paid) <i>Nirwana (Marktplatz 3, 15230 Frankfurt (Oder))</i>

Keynotes

Meaning making with artificial interlocutors and risks of language technology

Emily M. Bender
University of Washington



Humans make sense of language in context, bringing to bear their own understanding of the world including their model of their interlocutor's understanding of the world. In this talk, I will explore various potential risks that arise when we as humans bring this sense-making capacity to interactions with artificial interlocutors. That is, I will ask what happens in conversations where one party has no (or extremely limited) access to meaning and all of the interpretative work rests with the other, and briefly explore what this entails for the design of language technology.

Is the future of communication automation? From the human-machine interaction to communicative AI

Andreas Hepp,

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University of Bremen



The aim of this presentation is to define in more detail the field of research on the automation of communication, which is currently only vaguely discernible. The main thesis is that, in order to be able to grasp the transformation of the media environment associated with the automation of communication, the view must be broadened from a preoccupation with the “direct interaction of humans and machines” to “societal communication”. This broadening of perspective asks how the dynamics of societal communication as a whole change when “communicative AI” – artificial companions, chat bots, social bots and work bots – becomes increasingly spread. To support this thesis, the presentation first takes a closer look at the automation of communication as a phenomenon. Against this background, the concept of communicative AI is then developed in more detail as a “sensitizing concept” that directs our view to both the breadth and depth of the phenomenon. What exactly should we focus our attention on in research on automated communication? What are the real social challenges of the phenomenon? And what approach should the social sciences develop in this regard?

Paths of sense making: language creation and language use in the fields of values

Joanna Rączaszek-Leonardi
University of Warsaw



It is useful, it seems, to think about AI in terms of modifying, structuring and stabilizing human-human interaction and not just in terms of creating more efficient, faster, smarter artificial agents. Language itself can be treated in such terms: as a means of social coordination, via replicable constraints (Rączaszek-Leonardi, 2012). Understood in those terms, language shapes human interactions in multiple processes over multiple time-scales that unfold within complex fields of values (Gibson & Crooks, 1938; Baron & Hodges, 1992).

Up until recently, language “productions” were justified or approved in their action, validity, and relevance for real human interactions by being in contact with someone’s first-person experience. Releasing the agency in the process of creating expressions to AI results in omitting this step. In my talk I will try to use the above understanding of language creation and use for tracing the paths of sense making resulting from such a change. Where in such paths omitting the first-person human sensitivity in producing texts and linguistic behaviours is dangerous and where it might be acceptable? Which constraints on the social paths of AI algorithms creation and choices of databases could safeguard the values we care for?

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SPEAKERS

The return of the musician in the age of AI-generated music

Raphael Börger
University of Potsdam



Considering musical sound from a sociological angle, i.e. as an agent in communication systems between (non-)human actors (Born 2019), one may notice, on the one hand, a historically indexed, semiotic nature of musical sound. A feature that is repeatedly ennobled musicologically in its fragility, in its “floating intentionality” and radical context-boundness (Cross 2009: 183; Kaden 1996). From this angle, in addition to their specific semioticity, these musical sounds provide a space for various appropriations in concrete cultural contexts, as underlined in particular by in-depth studies on popular music (Diederichsen 2014): a projection surface on which the sounds can associate with other ‘meaning-bearing material’ and would therefore be better described as multi- and cross-modal involvement rather than as a purely inner-musical phenomenon (Auslander 2008).

These studies emphasise the various forms of “embodiment” of musical sounds in the age of their technical reproducibility, responding not least to the de-referentialisation of sounds, i.e. the “schizophonic” (Schafer 1994 [1977]: 88) separation of sound and sound source, which is made possible prominently in and by the recording studio and later intensified again by the digital possibilities of sound production (Wicke 2008: 13, 2004: 168-9). In the process of reception, these de-referentialised sounds are then situated in a socio-cultural assemblage, associated, for example, with instruments, sound sources on the one hand and musicians, human faces, personae, with bodies on the other, in order to make “authentic testimonies of those [...]cultures” (169) for the corresponding cultures that form around these musical sounds and thus, not least, to be able to be integrated into market contexts (ibid.).

In my contribution, I would like to take a current collaborative production by the software company and the eponymous music AI *Endel* with the pop musician James Blake, *Wind Down* (2022), as a starting point and place it in the framework outlined above. According to my thesis, sounds produced and heard ubiquitously by AIs (like *Endel*'s) (cf. Kassabian 2013) radicalise the fragile semioticity of music and the referencelessness of sounds and bring forth concrete and specific strategies of embodiment as a re-referentialisation and supplementation stabilising this fragility; strategies that can likewise be observed not only in the music (industry). As perhaps the first music AI to be signed to a major label (cf. Benkeser 2019), these embodiments around the *Endel* release raise above all the question of marketable strategies and more generally: the marketability of referenceless, AI-generated content. Furthermore, and related to this, there is also the question of creative agency and its distribution between non-human and human actors: how is this creativity distributed, how is the distribution presented to listeners, to users? Which benefits, which kind of capital can the company exploit and make use of, which ones the artist? And even more generally: what changes in position within the discursive formation of (music and listening) culture go hand in hand with these new AI-generated (sound) contents?

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NLP as language ideology: automated “toxicity” detection and the metapragmatic regimentation of subjectivities in the public sphere

Gabriella Chronis
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Bauman and Briggs (1) demonstrate the mutual influence of language ideologies and principles of scientific practices in John Locke’s writings. Their approach has been applied to show how language technologies such as speech recognition both shape and take shape through discursive constructions of languages (2, 3). I extend this line of thought to automated ‘toxicity’ detection (4) and correction (5–7) describing the ecosystem of beliefs and interests involved in their research and development and analyzing the language-ideological policies they institute both tacitly and overtly. My primary approach is textual analysis of metapragmatic practices among technologists - in other words, how we talk about how people should talk online (8)

I argue that the conception of ‘toxicity’ in NLP discourse is rooted in the historical prioritization of the referential function of language (9) within Western science and philosophy that dates back to the Enlightenment (1) ‘Toxic’ comments connote strong emotions. They also have illocutionary force—they do something in the world. ‘Healthy’ comments, on the other hand, are assertive speech acts (10) like “sharing opinions” and “exchanging ideas” (11). ‘Detoxification’ of comments often emphasizes referential functions and de-emphasizes or removes emotive, conative, and poetic functions.

The ideals of inclusivity, rational scientific discourse, and referentiality - also echoed within critiques of and alternatives to toxicity modeling (12, 13)- are hallmarks of the Habermasian public sphere (14). Jigsaw’s positions itself as a custodian of the “virtual public square” (11) whose systems of governance serve to “raise voices” (15). Their Perspective API often successfully identifies hate speech. However, automated toxicity moderation demands speech in a dispassionate, scientific register historically available only to the society’s most powerful groups and discourages other ways of speaking. Indeed, the concept of the public sphere has been critiqued for perpetuating exclusion of marginalized groups (16, 17). I further argue that inclusion in the public sphere is conditional on the limitation of online subjectivities. To be included is to be subjectivized according to the rational-scientific *dispositif*.

To characterize the conception of ideal online speech developed by Jigsaw, I examine *Medium* articles (18–20, *inter alia*), recorded talks (15, 21–23) web copy (11) research papers (24–35) and datasets (36–40) that circulate with its widely-used product Perspective API (41). Jigsaw/Perspective is chosen as a focus because of its influential status. *The New York Times* moderates comments with it (42) it’s also a standard for evaluating other NLP tasks like neural language generation (43) More broadly, a growing majority of influential ML papers are affiliated with big tech companies like Google (3)

Tracing the genealogy of language ideologies in NLP is critical given the sociopolitical contexts in which they incubate. Jigsaw’s goal of reducing online hate and harassment has been tied since its inception to its larger mission, “to use technology to tackle the toughest geopolitical challenges, from countering violent extremism to thwarting online censorship to mitigating the threats associated with digital attacks” (44). Discourses about toxicity modeling illuminate connections between research that cultivates desired linguistic practice and the economic and political interests of institutions that sponsor this research.

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If machines translate, what do translators do?

Félix do Carmo
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The global conversation that involves AI must be multilingual – although English is the main language of communication across the globe, local realities are linguistically diverse. A “wave of algorithm democratization” (Joscelyne, 2018) brought us AI-based translation, capable of eradicating language barriers and saving endangered languages (NLLB team, 2022) and often presented as the strongest demonstrator of the power and achievement of this technology. Unchallenged, this techno-positivism creates conceptualisations of a new multilingual global culture, in which the transfer of meaning and message, content and form, can be swiftly and autonomously produced by AI. “World-readiness” describes a future in which, thanks to AI, translation is available everywhere, to anyone, at any time (Joscelyne, 2019). Behind this, is the uncontested assumption that AI can “translate”.

The impact of considering that machine translation is “translation”, namely on human practices and training, has raised a new wave of questioning within Translation Studies, which asks for explicit rethinking of the discipline’s core concepts (do Carmo, Kenny & Nurminen (ed.), forthcoming). My perspective is that, by using “translation” to describe what AI does, we are uncritically adopting the discourse of the developers and vendors of AI, when practice shows that the products of AI are provisional, tentative, non-validated hypotheses of translation, and that the actual translation happens only when translators take ownership of the target language production process, namely because without them the effect of the translation remains unchecked. I therefore propose that machine translation should be called “artificial translation”, to emphasise that it is not translation as we know it.

The call for papers of this workshop asks us to give attention to “the people behind the systems”, seemingly the developers of AI. However, practitioners of all professions are also becoming people behind systems, often a single “human-in-the-loop” (Mosqueira-Rey et al, 2022), as their professions are “heteromated”, devalued and removed from the central stage, now taken over by AI (Ekbia & Nardi, 2017). In the case of multilingual communication, translators are becoming feeders and curators of training data, and reduced to quality checkers of machine translation output, when in fact they are the only agents that produce translation.

Artificial translation is being used as a foundational concept to devise a society that communicates seamlessly across the globe. However, this can only be achieved if AI is globally and uniformly available, and has evolved into a state that is very close to singularity, having developed the capacity to manage the message it receives and creatively adapt it to achieve a desired effect, in a target language and for a specific target audience. Until that state is achieved, AI translation is best seen as a tool to be used by translators, or as non-validated hypotheses of translation, for consumption by users, who (un)willingly accept the responsibility for ill-defined levels of risk. This risk inevitably replicates existing levels of inequality and vulnerability, which diversely affect individuals, social and

language groups. We live in this pre-singularity scenario, the only one we can study without delving into speculative fiction.

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AI Poetics and the Proto-Aesthetics of Communication. Poetic function, language and poetic ideologies in AI-technology



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This proposal addresses the poetic ideologies (representations of what poetics involves) behind AI verbal arts, and how they relate to language ideologies at the core of prevailing language technologies. Discourse on AI poetics offers a good observational site to explore AI language ideologies and vice versa. In the context of AI creativity, it is frequently assumed that poetics essentially equates to particularly aesthetic combinations of forms and meanings (Holyoak 2019). Also, computer science would be intrinsically poetic since it is already an “art form of words and punctuation, thoughtfully placed and goal-oriented” (Rockmore 2020). AI poetics draws on this conception for aesthetic effect and to attempt the mimesis of what is formally considered natural language literature/poetry (the sediment of heterogeneous poetic processes of which verbal form is a fraction). A process consistent with a certain interpretation of Jakobson’s (1960) definitions: the “poetic function” involves the reflexive foregrounding of message form; “the poetic function projects the principle of equivalence from the axis of selection into the axis of combination” – i.e., a universe of forms and formal distribution. An approach resonant with the prevailing language ideologies grounding current language technologies -- based on the dualism of words and things; talk versus action; real world events versus ways of talking about them (Rumsey 2009). In sum, notions of language as representation that erases its bodily, interactional origin, and the role of rhythm in that embodied interaction (Gill 2012). A notion of language abstracted away from the proto-aesthetics of communication. In turn, excluding a vast array of language/ communication cultures where this is a transparent feature.

This presentation digs in the poetic function as a quality active in varying degrees in the whole language/ communication spectrum: crystallised verbal arts; multiple forms of ordinary written discourse (Jakobson 1960, 1966; Banti and Giannattasio 2004); and crucially in everyday language in talk and conversation (Sacks 1992; Jefferson 1996; Silverstein 1984, 2004; Tannen 1987, 1989). This analysis is thus framed in a proto-aesthetics of communication which re-analyses “the meaning of aesthetic” and tries to unpack “the complexity of the poetic function of language, reintegrating it into an understanding of communication” (Knoblauch and Kotthoff 2001). This will invite to explore to what extent the little attention paid to interactional poetics (an essential dimension in the origin and experience of language made opaque in prevailing communicative cultures) influences our ideologies of both language technologies and AI verbal art/ poetics.

I draw on discourse and informal accounts by creators, programmers and <users-readers- AI verbal art consumers> from different linguistic and (communicative) cultural backgrounds. Language and poetic ideologies feed each other back. Our conceptions about language fuel our projections of what humans can do and experience with language. What may be the role of a better understanding of interactional poetics

(a dimension, opaque in varying degrees, of everyday human language) in reframing language technologies and AI verbal art?

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“Hi, I'm Sophia the chatbot!”: A Contrastive Analysis Of Chatbots' Welcome Message in German, Italian, English and French

Michela Gargiulo

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Starting with ELIZA (1966), the first rudimentary chatbot in history, increasingly sophisticated conversational interfaces have been developed to assist us with a wide selection of tasks – ranging from scheduling appointments to language learning, but it is particularly in customer service settings that the adoption of these technologies seems unquestionably beneficial (Følstad & Skjuve, 2019). However, despite the constant advancement in their design, current state-of-the-art digital assistants still tend to fail when interacting with customers in a natural and engaging fashion (Drift et al., 2018). This phenomenon can be traced back to the tendency in the field of artificial dialogue systems to focus almost exclusively on computational aspects, neglecting linguistic ones. The present study intends to partially fill this gap by identifying through a fine-grained, qualitative, corpus-based approach the linguistic properties of chatbots' welcome messages. The results of this research study will constitute the starting point of a broader research project that aims at outlining the characteristics of the “virtual assistant talk.”

As suggested by Gretry et al. (2017), online users expect chatbots to respond as quickly and appropriately as possible. When this doesn't occur, the feeling of dissatisfaction may affect their trust in the companies behind those chatbots. As far as is proven in the literature, investigating only welcome messages may represent a limitation. Nonetheless, if we consider online interaction as a sequence of messages sequentially linked (Thomas, 1992), the role of welcome messages in affecting users' conversational style and expectations is not only easily acknowledgeable but also highly significant. Further investigation on this topic seems therefore necessary.

A multilingual corpus of digital welcome messages was created by selecting the first turn of 241 virtual digital assistants (74 responding in English, 70 in German, 53 in Italian, 46 in French) interacting with users via text-chat on the landing page or the customer support page of different companies, mostly from the fashion and the telecommunication industry. While the small size of the dataset prevents us from drawing ultimate conclusions, our results suggest that there is a general tendency to favour an informal register in the messages of Italian speaking chatbots, even in areas traditionally connoted as extremely formal such as those of banking and insurance, in contrast to German-speaking and French-speaking chatbots where a semi-formal communication style is almost always preferred. If the image of the brands, the sector they belong to, as well as the target audience they address are to be considered as determining factors in the creation of the welcome message, it is especially in the analysis of multilingual chatbots that interesting interlinguistic differences emerge.

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Objectifying Subjectivity: The Making of Artificial Intelligence

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The development of artificial intelligence is often conducted behind the walls of private research institutions and little is known about their making. How do AIs develop their cognitive operating systems and why do they come up with their respective points of view? Are they simply producing objective patterns out of a universe of data or do have AIs personality comparable to human intelligence? The talk reports first findings from an ongoing research project which develops an AI by combining natural language processing (NLP) and machine learning (ML) with an in-depth domain knowledge in international politics. It discusses the difficulties of training the trainers of the AI, of developing a conceptual and analytical frame of the AI and of assigning subjectively meaningful interpretations to an objectifiable schema. This difficulty is first expressed in the definition of separable categories at the domain level. On the one hand, the categories have to be specific enough to allow a high degree of inter-annotator reliability. At the same time, they have to be sufficiently general to be applicable to different theories. What becomes clear in this process is that the structure of arguments in scientific texts is far more complex than in other text genres such as debate articles. The difficulty of objectifying subjective meanings is also evident in the fact that annotators and domain experts each work with subjective understandings about IR theories. Establishing an intersubjectively shared understanding thus requires not only mutual explanation but also a high degree of external understanding. This presents one of the greatest challenges: how to develop a sufficiently intersubjectively shared understanding of theory without one of the existing interpretations claiming hegemonic status and thus marginalizing equally valid contending interpretations? Or is it the case that the method of pattern recognition by necessity implies the setting of an exclusionary "gold standard"? Is ML and NLP thus necessarily establishing an algorithmic entity with a quasi-scientific "personality" which relies on specific interpretations of reality and which will hardly ever be more objective than its annotators? The talk will present data and interpretations which document the process of annotation and of the making of the cognitive operating system of an AI. It will thus provide new insights into better understanding what AI is – and what it is not.

Analyzing Machine Learning as Semiotic Mediation

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Machine Learning (ML) mediates between humans and their objects of interest by offering a relatively mechanized interpretive process that not only can handle huge quantities of data in seconds, but also solve often-thought intractable problems easily. Social scientists and journalists are increasingly vocal as to the ethical consequences of such automated inferring systems on public life especially in terms of governance (Rottenburg and Merry 2015; Porter 1994). Much less critical attention has been paid to ML practices – how ML systems are designed, implemented, and transformed through human-machine interactions in cooperative work; and how, in turn ML affects human sensibilities and interpretive authority in the production of new forms of knowledge about the world, as well as transforming the world itself through such modeling.

We address the still poorly understood ML process, by focusing on the actors, skills, values, events, categories, and algorithms at work across settings of ML, and to hypothesize the importance of semiotic processes in the “translation” of such expertise. The ML community speaks of “sense-making” practices (Gu, Yan, and Rzeszotarski 2021) as a way towards “debiasing” the ML pipeline. We understand sense-making as a fundamentally semiotic process by which signs are interpreted and made-sense-of, and thereby attributed with meaning and value in a cooperative way, both in context and across contexts, by human and algorithmic agents (Mondada 2021; Gibson and Vom Lehn 2020). With this analytic framing, we examine the encounters of human actors with ML thereby considering Machine Learning algorithms as actors that participate in the knowledge producing process along with humans. Given the seemingly radical ontological heterogeneity of such publics (collectivities or cultures), whereby algorithms are semiotic, social and skilled agents no less than humans, we think this framing can be useful to rethink classic notions like public, culture, agent, cooperation, and convention.

In our talk, we present two case studies that center developments in ML: the first concerns Perspective API, an automated NLP tool for content moderation developed by Google-jigsaw, first in English and then expanded to other languages. The second looks at expert practices in galaxy classification, comparing “citizen scientists” with Machine Learning astronomers.

Through these cases, we consider the questions:

- 1) What new and old modes of reasoning, learning and knowing emerge via Machine Learning (epistemologies);
- 2) What new and old kinds of events, people, and properties emerge via machine learning (ontologies); and
- 3) How the relation between ontology and epistemology is coupled to the cooperative practices of diverse kinds of agents.

Our ethnographic approach emerges from the conceptual vocabularies offered by Science and Technology Studies (STS), linguistic or semiotic anthropology, and ethnomethodology. With these resources, we aim to unpack the situated actions, cooperative practices, and modes of semiotic labour that mediate the relation between machines and people (both developers and users), and thereby better grasp the events and practices that contribute to – or forestall – epistemic closure.

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Polish users' experiences with the linguistic and AI realities and their persuasive effects – a pilot study

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The focus of the research is a pilot study to pursue persuasive effects of selected Polish users' experiences concerning communicative High-Risk AI applications. Lately, trustworthy AI has been mentioned as a key aspect of fostering the interrelationship between technology and humans, especially to diminish associated fears and threats in highly risky AI applications (Gulati, Sousa, and Lamas 2019; Sousa and Beltrão 2021). The main question of the study is to identify the effects of trust on Polish users' experiences of a linguistic description of events (cf. Paradedda et al 2020), and contrasting those experiences with the subjects' answers to a questionnaire concerning their general opinions of the AI applications (cf. Kapania et al. 2022).

The research subjects are teams of philology and media and business students at a Polish university and a comparable number of older users (30-75 years of age), asked to answer the same questionnaire concerning their digital experience and its effects. We examine their reactions to verbal descriptions of scenarios in which AI applications are used as well as their general attitude to the AI applications. Furthermore, we make an attempt to investigate the extent their trust level changes with regard to these instruments and to posit a preliminary hypothesis to what extent, considering the demographic variables, this change is related to the persuasive effects concerning truthfulness of these narratives and of the devices.

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Voice assistants as mechanisms of language ideologies within human interactional culture

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Voice assistants are becoming increasingly pervasive; They are installed on a growing number of devices¹, are used more frequently for voice-mediated search functions², and generate substantial commercial interest³. There is much enthusiasm for voice assistants as language partners in such areas as language learning (e.g., See Ibaraki, 2018 and CBC News, 2022 on language revitalization efforts through AI conversation partners), healthcare (e.g., Jadczyk et al., 2021) or caregiving (e.g., Alexa Together; Amazon, 2022). The increasing accessibility features (i.e., Siri's Pause Time or Apple Live Captions; Apple, 2022) and languages offered enhances its uptake. However, a closer look at the available language options can reveal powerful beliefs about the value of languages and ideologies on language purity and legitimization. While voice technologies may be new, their embedded language beliefs and ideologies are an extension of language policy scholarship, such as language standardization (Milroy & Milroy, 2012), language as a nation-state/colonial governance mechanism (Flores, 2020), or linguistic imperialism (Phillipson, 2009).

This presentation will discuss an exploration of the language ideologies that underpin the four major voice assistants: Apple's Siri, Google Assistant, Amazon's Alexa, and Microsoft's Cortana. Through a review of common devices that the voice assistants are installed on, their corresponding manuals, and their voice options, the case study identifies and analyzes the language options (as of May 2022). The findings suggest the assumption of several interconnected language ideologies, including standard language culture (Milroy, 2001), methodological nationalism (Schneider, 2019), native speakerism (Holliday, 2006), and language prestige (Milroy & Milroy, 2012; Milroy, 2001). As such, these voice technologies are powerful ideological mechanisms that shape users' languaging practice and work to reinforce hegemonic language beliefs.

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1) Four billion digital voice assistants were installed in devices in 2020, projected to grow to 8.4 billion units by 2024, more than there are people (Laricchia, 2022).

2) Between 2008 and 2018, the use of voice search increased 35 times, accounting for 20% of all mobile searches in 2018 and projected to be 50% by 2020 (Bentahar, 2017 as cited in West et al., 2019).

3) Voice and speech technologies were valued at US\$8.3 billion in 2021 and are forecasted to reach US\$22.2 by 2027 (Research and Markets, 2022).

Does Alexa really speak German?

Concepts of language and linguistic competence in voice assistant technology



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In public discourse, voice user interfaces that can react to spoken-language questions and commands with speech-like responses are constructed as communicating or speaking entities. Based on their ability to process spoken language and to have a voice-like output, they are not only attributed the ability to speak or communicate in general terms but are discursively constructed as speaking specific languages (“Amazon’s Alexa now speaks Hindi”), dialects (“The Swisscom Voice Assistant is unique as it can speak up to five languages, especially Swiss German”), and even to be multilingual (“Google Assistant is now bilingual”). While these claims to linguistic proficiency may function as marketing promises of increasing usability to access more diverse markets, they raise the question of what it actually means to speak a language and which concepts of linguistic competence are applied here.

This paper aims to address these questions in a multi-method approach by combining German corpus data on the attribution of linguistic competence to Amazon’s Alexa with data from the automatic log of an Amazon Echo used in a bilingual German-English household. It aims to deconstruct the discursive claims to machine’s ability to language by highlighting the superficial conceptualisations of language(s) employed in mass media discourse on voice assistants and contrasting them with natural interactional data from human-voice assistant engagement that demonstrates the machine’s lack of basic communicative competence in both mono- and multilingual settings. Overall, this paper argues that the rise of voice user interfaces exacerbates disparities between concepts of linguistic vs. communicative competence by discursively privileging a machine’s capability to produce grammatically correct speech-like output as “language competence” over its fundamental inability to adequately engage in communicative interaction.

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Digital voice assistants and the fetishization of female synthetic voices

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With the domestication of new technologies, digital voice assistants (DVA) have entered our personal spheres and become an undeniable part of our everyday lives. Here, feminized DVAs take on a relevant part in gender stereotype perpetuation as they often perform a woman's hegemonic normative role. Amazon's Alexa as a smart home device for example takes an active part in the household organization and Apple's Siri, as a DVA located mostly in mobile phones, performs a stereotypical personal assistant role. Thereby both DVAs mirror conceptions rooted in gender-essentialist views that push women into service-oriented roles. Further, the feminine voices in DVAs reflect an ideology of design that privileges the so-called male gaze that simultaneously put gender-inclusive strategies for building DVA's voices at a disadvantage. A DVA's character is permeated by inherent, often unconscious sexist ideologies which are emphasized by the acoustic characteristics of its voice that should sound pleasant, calm, helpful, and natural.

This contribution illustrates how gender ideologies bleed into the design process and manifest as ideologies of design in new technologies. By the acoustic analysis of the voices of two commercial DVAs, German Alexa and German Siri, I can (i) contextualize DVAs in terms of their voices and connect their social meaning to a physical reality, and (ii) illustrate how antiquated conceptions of gender roles still manifest as a robust part of the design process in new technologies and thereby reproducing gender stereotypes.

Speech samples from both DVAs were collected and annotated at the sentence level. Vowels in stressed position were segmented at the phone level and measurements were extracted in a stable middle portion of the vowel. These measurements include fundamental frequency (F0), amplitude relations of the first two harmonics (H1-H2), and the noise measurement HNR as these measurements are crucial to discriminate between different modal and non-modal voice qualities. For both DVAs, evidence was found for non-modal vocal characteristics that are associated with specific types of perceived femininity: Alexa appeals to a wider audience in terms of age by employing a breathy voice that is associated with a traditional, domestic notion of femininity, expressed by high H1-H2 and low HNR values.

Siri's voice shows both low H1-H2 and HNR values, making it a creaky voice that appeals specifically to a younger

audience and is associated with a modern and mobile notion of femininity (Yuasa 2010). The non-modal character of their voices results from a combination of the original speakers' voices and noise artifacts from development. Albeit being part of a technical artifact, additive noise may still be interpreted by the user as a designed variable that is desired by development. Additionally, when the DVA is framed as female, additive noise in its voice output may also function as an auditory index for femininity (other than the same amount of additive noise in male synthetic voices would do).

Digital voices emerge in interaction of technical possibility and intention. These results illustrate how DVA design capitalize on feminized voice qualities to contextualize their systems in their commercial purpose.

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What comes after the automation? An investigation of journalists' aims and practices when editing stories produced with automated journalism

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Computational thinking is increasingly applied in the production of news articles as news companies automate this step in the journalism workflow to boost productivity (Diakopoulos, 2019). This practice, called *automated journalism*, uses “algorithmic processes [to] convert data into narrative news texts” (Carlson, 2015, 417) and, in its technological complexity, can range from highly sophisticated applications based on machine learning (Danzon-Chambaud, 2021) to less sophisticated, rule-based applications (Graefe & Bohlken, 2020). The human-computer interaction that takes place when journalists work with automated journalism, challenges traditional conceptions of human agency in news production.

Journalists experience and evaluate this human-computer interaction within the context of their professional culture and ideologies (Schapals & Porlezza, 2020; Milosavljević, M., & Vobič, 2019a). Accordingly, some perceive the technology as having rather limited capabilities when it comes to writing news articles (Diakopoulos, 2020) and have concluded that “it is the creative part of journalism that cannot be automated” (Wu, Tandoc, & Salmon, 2019, 1450). It is unsurprising then that journalists sometimes manually edit stories produced with automated journalism before publication to compensate for their perceived narrative and editorial shortcomings, thus creating so-called *post-edited* variants—a news production process that has yet to be examined empirically.

This study aims to advance research on post-edited automated journalism by investigating how journalists say they edit automatically-generated stories prior to publication and evaluating whether and how they actually do so. Therefore, we compare the content of fully-automated news stories and their post-edited offspring based on journalists' claims about the process of post-editing. This approach allows us to evaluate whether journalists' intentions are realised and whether post-editing involves editorial steps that go beyond their claims (see Mellado & van Dalen, 2014).

Therefore, we inductively developed a category system using data from semi-structured interviews with journalists and a qualitative content analysis of both story types. The interviews were conducted between September 2021 and March 2022 with nine journalists from the UK who work in various news companies and use automated journalism regularly. Findings show that when post-editing automated stories the journalists claim to *transform the presentation of numbers* by reducing the overall amount of numbers in the text and by transliterating their presentation; to *add contextual information* such as explanations, definitions, and solutions; and to *increase the relevance of the reporting for the readership* by adding quotes from local authorities and including the experiences of individuals.

Additionally, the qualitative content analysis of both story types showed that journalists sometimes *alter the wording of the articles' headlines*, for instance, by making it more attention-grabbing; add *data visualisations*; and use different *by-lines* that are transparent—to varying degrees—about the stories' authorships, including their automated origin.

The automated news stories were compared with their post-edited offspring using these categories. The final sample consisted of 268 news articles (equal parts automated and post-edited) published between 2020 and 2022, which were found through extensive online research.

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NOTES













