

# Perceptions of Domestic Robots' Normative Behavior Across Cultures

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#### Abstract

As domestic service robots become more common and widespread, they must be programmed to efficiently accomplish tasks while aligning their actions with relevant norms. The first step to equip domestic robots with normative reasoning competence is understanding the norms that people apply to the behavior of robots in specific social contexts. To that end, we conducted an online survey of Chinese and United States participants in which we asked them to select the preferred normative action a domestic service robot should take in a number of scenarios. The paper makes multiple contributions. Our extensive survey is the first to: (a) collect data on attitudes of people on normative behavior of domestic robots, (b) across cultures and (c) study relative priorities among norms for this domain. We present our findings and discuss their implications for building computational models for robot normative reasoning.

### Introduction

With the development of robotic technology, robots' set of responsibilities has expanded from manufacture, military and rescue to include diverse roles in our daily life, such as being a personal assistant, a caretaker for children, and a housekeeper. These tasks can be programmed to have explicit rewards purely based on the accomplishment of the assignment; however, when these robots must interact with humans, there is usually no explicit reward function or correctness measure for their behavior. Instead, the appropriateness of an action depends on external factors - such as the physical environment and the social context - and internal, inferred factors - such as the users' personality, prior experience, and cultural background.

One important factor that informs the appropriateness of actions is the set of norms within a particular culture. Norms, such as prohibitions, permissions, obligations, are the socially agreed upon guidelines of behavior which are acknowledged by most of the members of a community (Brennan et al. 2013). The social science literature (e.g. (Malle, Scheutz, and Austerweil 2017) have reported that norm activation is dependent on environmental and social

\*Work done as an intern at Carnegie Mellon University. Copyright © 2019, Association for the Advancement of Artificial Intelligence (www.aaai.org). All rights reserved. context. Additionally, we claim that determination of priorities among different norms also depends on the culture of the society where the robot operates. Each culture has its unique set of norms due to historical and socio-political reasons. Some cultures have strict social norms and severe punishment for norm violations, while others have weaker constraints and higher tolerance to individual discretion (Gelfand et al. 2011). These social norms not only regulate the behavior selection of everyone in the society, but also help predict other agents' actions to improve collaboration (Malle, Scheutz, and Austerweil 2017). Thus, to understand and design for effective interactions of robots with humans, it is critical for the robots to incorporate socio-cultural norms in their decision-making process in performing their various tasks.

The normative reasoning of intelligent agents, also called machine ethics (Moor 2006), has attracted increasing attention in the community in recent years. Generally, representative works mainly concentrate on two types of problems. First is considering thought experiments such as the trolley problem to examine the appropriate moral decision an autonomous agent should make (Bonnefon, Shariff, and Rahwan 2016; Malle et al. 2016). Second is focusing on task-specific environments - like judging performance in a game (Kahn Jr et al. 2012) or navigating indoors (Salem et al. 2015) - to evaluate the normative role of robots in social interactions. Recently, researchers are calling for more realistic scenario settings, as well as a general normative framework (Conitzer et al. 2017; Arnold and Scheutz 2017; Krishnamoorthy et al. 2018). The first step towards these goals is to discover people's opinions about what norms robots should adhere to in specific situations and contexts, and how robots should prioritize their norms. However, to the best of our knowledge, currently there are no surveys that ask participants for their views on these issues. The work presented in this paper fills this gap. Additionally, our work studies these issues across two cultures to determine whether cultural difference exist. The domain of application of our survey is domestic service robots.

# **Related Works**

Previous research in human-robot interaction in a domestic setting mainly focuses on the general acceptance and representation people have towards future domestic robots. Relevant works examine the correlation between age and the degree of autonomy granted to the domestic robot (Scopelliti, Giuliani, and Fornara 2005), the nature of expected tasks of domestic robots at home (Smarr et al. 2014), and the influence of utilitarian attitudes and social norms on the acceptance of domestic robots (de Graaf, Ben Allouch, and van Dijk 2017). However, the aforementioned works ask general questions. As has been found in the literature (e.g. (Malle, Scheutz, and Austerweil 2017)) norm activation is contextspecific and therefore surveys would need to ground their questions to specific, detailed, realistic scenarios.

Beyond the micro context where the interactions occur, the macro socio-culture environment needs to be considered when modeling the norm framework. Existing work found that individuals from different cultures differed in their perceptions of social robots along the axes of trustworthiness (Li, Rau, and Li 2010), appearance (Lee et al. 2012), and politeness (Salem, Ziadee, and Sakr 2014). Literature has adopted culture dimensions such as Hofstede's (Hofstede 2001) to examine the cultural factors in people's attitude and acceptance towards robots (Nomura, Syrdal, and Dautenhahn 2015; Haring et al. 2015; Li, Rau, and Li 2010). Although Hofstedes dimensions provide a general picture of how people behave across cultures, it ignores the impact of social contexts when determining an individual's behaviors in specific situations. As proposed by recent research (Kitayama, Mesquita, and Karasawa 2006; Leung and Cohen 2011), it is necessary for cross-cultural studies to consider cultural syndromes that incorporate the interaction of cultures, individuals, and contexts. We incorporate cultural syndromes (Leung and Cohen 2011) as well as consideration of tight vs loose cultures (Gelfand et al. 2011) since they make particular predictions about norm compliance across cultures.

#### Method

### **Methodological Design**

Previous literature on the general attitudes of people towards robots (Scopelliti, Giuliani, and Fornara 2005; Young et al. 2009; Koay et al. 2014; Smarr et al. 2014; Pino et al. 2015), have determined various issues, such as the capability of the robot to finish a given task, invasion of privacy that may arise due to the robot's presence, and potential danger to safety. Inspired by this literature and literature on ethics, we considered a (not necessarily exhaustive) list of general norms (Table 1) that arise in domestic robot interactions with humans. This list provided a guideline for studying people's attitudes and preferences on the acceptable normative behaviors of domestic robots.

We distinguish between the following terms when discussing the survey:

- A *scenario*, or *situation* refers to the description of the setting where the robot must choose how to respond.
- An *option* refers to a possible action that the robot could take in a specific scenario, which indicates the priority of a certain norm.
- *Context* refers to the physical and social environmental features which are manipulated within a scenario.

Name	Description		
Safety	Protect human from danger		
Consideration	Consider human's feelings		
Privacy	Protect human's privacy		
Security	Secure sensitive information		
Efficiency	Finish the given task efficiently		
Compliance	Obey social rules		
Command	Follow owner's command		
Accommodation	Accommodate human's behavior		
Honesty	Tell the truth		
Loyalty	Maximize owner's interest		

Table 1: Norm List

• *Norms* are the principal expectations, prohibitions and permissions on the behaviors of domestic robots.

In general, context varies in three different aspects: 1) location of the interaction, 2) characteristics of those in the scenario, including age, number of people, and their relationship to the domestic service robot owner, and 3) the consequences of robot's behavior, which depends on the severity of consequences. Scenarios and contexts both represent the physical and social environments where the robot is in, while context features were experimentally manipulated among participants to measure the influence of environments on norm activation. A list of scenarios, corresponding contexts, and norms discussed in this paper is shown in Table 2.

We structured *scenarios* where several norms (some of them conflicting) could be simultaneously activated so the robot would need to choose the most appropriate action. To illustrate the notions of scenario, context, and potential normative actions of the robots, we provide below sample scenario, referenced throughout as the *warning of allergy* scenario:

Imagine that you are hosting a dinner at your home. You/your robot finish cooking and are about to serve a dish to your friends/family members. Your robot detects that one of the guests may be slightly/severely allergic to an ingredient in the dish through the conversation between them. He/she didn't provide allergy information in advance. You and the guests are midconversation. Please rate your opinion toward the following statements about robot's behavior.

- The robot should interrupt the ongoing conversation and tell everyone about the allergy information.
- The robot should discreetly inform you (the robot owner), but not anyone else.
- The robot should do nothing.

To determine people's priority between norms, we designed scenarios, referred to as *dilemmas*, where two or three norms that the robot should obey conflicted. For example, in the warning of allergy scenario, the conflicting norms are *ensure safety*, *consider people's feelings*, and *obey social rules*. For the robot, obeying the "ensure safety" norm could be achieved by interrupting the conversation immediately, informing everyone about the allergy; however, as a

Scenario	Location	Context Characteristic	Consequence	Norms
Warning of Allergy	Dining Room	Family/Friends	Severe/Mild allergy,	Safety, Consideration,
			Responsibility	Compliance
Entering Room	Bathroom/Bedroom	Fire/Burst Pipe	Drenched/Burned	Safety, Privacy,
				Compliance
Ordering Groceries	Owner's office	Payment Information/	Unwanted Disclosure	Security, Efficiency
		Shopping History		
Encountering Human	Hallway	Elderly/Disabled,	Injury	Compliance, Safety,
		Number of people		Accommodation
Judging Outfit	Party	Friends/Strangers	Embarrassment	Honesty, Consideration
Reporting Evidence	Sidewalk	Elderly/Strangers,	Liability	Honesty, Loyalty,
		Responsibility		Command

Table 2: Scenario List, possible values of a contextual variable are divided by slashes, different variables or norms are divided by commas. Norms in each scenario correspond to optional actions in order.

consequence, it may embarrass the hosts/owners and guests. An alternative action of the robot could be to discreetly inform the owner of the situation, but not anyone else. Doing so considers people's feelings, but sacrifices the opportunity to immediately warn the guest. The third option, "do nothing due to table manners", emphasizes compliance to social rules like do not interrupt ongoing conversations. Surveying people about their preferences regarding those *options* enables us to determine both the norm priorities and the severity of the conflict between norms in the given scenarios.

For each scenario, participants were required to *independently rate their opinion towards each presented option on a scale of 1 (strongly disagree) to 7 (strongly agree)*. The participants' answers within a particular scenario might be mutually exclusive (agree on one option and disagree on the other options), or not (agree or disagree on both options to different degrees). For example, a participant may rate 7 on the "interrupt option" and 1 on the "discreetly inform" option, indicating a strong participant preference of ensuring the guest's safety over embarrassing the hosts. Another participant may rate 6 on the "discreetly inform" option and 5 on the "interrupt option", which shows that they value those two options and the corresponding norms to similar degrees.

To measure the influence of *context* on norm activation, we manipulated key words in the scenario descriptions to present the scenario with different context. In the allergy case, we changed three contextual variables: 1) the owner or robot is serving the dish (responsibility), 2) the guests are friends or family (relationship), and 3) the allergy is slight or severe (consequences). Each participant read a randomly chosen version of this scenario. For example, one participant may read the version where the consequence of allergy is mild, but the other may read the one where it is severe. By comparing the answers between participants who read different versions of the same scenario, we determined the influence of contexts on the priority of norms.

### **Questionnaire Design**

We designed 15 scenarios capturing distinct norm conflicts. To help participants better understand the scenario, we provided a detailed description and picture for each scenario. Each participant read all of the 15 scenarios; however, the context of each scenario randomly varied between subjects. For example, the allergy case had three contextual variables, each with two different levels that were changed: responsibility, relationship, and the severity of consequence. This gives rise to 8 (2\*2\*2) different versions of this specific scenario that were randomly distributed to participants. The number of versions for each scenario ranged from 1 to 8 depending on the number and levels of contextual variables, and they were evenly distributed among participants. For each scenario, participants were asked to rate their opinion towards each of the (2 or 3) given options on a 7-point Likert scale (1- strongly disagree and 7- strongly agree). Before the main section, we included a section to collect demographic information - including gender, age, employment status, educational background, familiarity with robots, and primary source of information for knowledge of robots. After the context section, participants were asked two questions about their general acceptance and purchase tendencies about the robot described in the survey. The survey was originally designed in English, and was then translated to Chinese for running in mainland China. The Chinese version of the survey was then back-translated to English and examined by researchers to ensure equivalence.

# **Data Collection**

To combat the limitations of traditional survey methods, such as less representative sampling (Mason and Suri 2012), we conducted both versions of the survey using online platforms. The English version was built on Qualtrics.com, and published on Amazon Mechanical Turk for workers to access. The Chinese version ran on a similar platform, Wjx.cn, which provides both online questionnaires and sampling services in China. Each participant was paid \$1 to finish the 15-minute survey.

### **Participants**

To ensure that the participants from Amazon Mechanical Turk were American, we filtered the submissions by their IP address. After filtering, we were left with 481 samples from the MTurk American participants and 648 samples from the Wjx Chinese participants. After removing data of participants that did not finish the survey, or those who blindly clicked and had an extremely short finishing time, and those who answered the attention check question incorrectly, we were left with 301 (American) and 435 (Chinese) valid submissions. In the sampling population of the American survey, the average age was 40.6 (SD = 11.6) and the gender ratio was about balanced (49.28% male, 50.71% female). In the Chinese version of the survey, the average age and gender ratio of the sampling population was 30.9 (SD = 7.9) and 36.47% : 63.53% (male:female).

### Results

The survey results consisted of ratings of 39 options from 15 scenarios, and was influenced by both the individual differences of participants (e.g. age and cultural background) and the contextual variables of the scenarios (e.g. locations, characteristics, and consequences). Because participants gave independent ratings to each option based on their preferences, the given responses to the scenarios may or may not be mutually exclusive. Thus, when analyzing the data, the first-fold comparison is between options which explicitly reveal participants' preferences with respect to the conflicting norms. The second-fold comparison is a between-subject comparison of factors, including cultures, contexts, and their interaction effects. Repeated measures ANOVAs were used to statistically evaluate the two-fold comparisons mentioned above, since norm ratings are measured within-subject while culture and context are between subject variables. When it comes to the pairwise comparison on a certain level of variable, one-way ANOVAs were employed. For variables with more than two levels, post-hoc tests using LSD method were reported. Due to the page limitation, the following results section only provides a preliminary analysis on the most informative findings for 6 out of the 15 scenarios. Descriptions of scenarios and options have been condensed.

#### **Encountering Human on Wrong Lane in Hallway**

Imagine your domestic robot is taught the concept of moving on the right side of the hallway. What should the robot do when it is moving down the hallway on the right side, while an (elderly/disabled) person is walking towards it on the same side?

- Stay to the right-hand side of the hallway to **obey** social rules.
- Move out of the way to the left-hand side of the hallway to maintain the **safety** of the human.
- Move out of the way to the left-hand side of the hallway to **accommodate** the human's behavior.

Generally, participants from both countries, as shown in Fig. 1, preferred the robot to give way to the person who is breaking the rule of walking to his/her right side of the hallway ( $F(2, 1468) = 487.94, p < .001, \eta_p^2 = 40.0\%$ , post-hoc test ps < .001). However, we found a significant cultural difference in this scenario: CN participants agreed more ( $3.34 \pm 1.62$ ) on the "stay on right-hand side" option compared with US samples ( $2.65 \pm 1.65, F(1, 734) =$ 

 $31.51, p < .001, \eta_p^2 = 4.1\%$ ). US participants agreed more on the "move out of the way... to accommodate human" option (US:  $5.61 \pm 1.54$  CN:  $4.64 \pm 1.52, F(1,734) =$  $70.87, p < .001, \eta_p^2 = 8.8\%$ ). These findings reveal that, although safety is the major concern in this scenario, Chinese participants would prefer the robot to obey social rules, while American participants would prefer the robot to accommodate the person even if the person is violating a social norm. Additionally, participants from both countries rated the "stay on right-hand side" option lower when the person at fault was elderly or physically disabled compared to a healthy adult ( $F(2,733) = 29.397, p < .001, \eta_p^2 = 7.4\%$ , post-hoc test ps < .001).

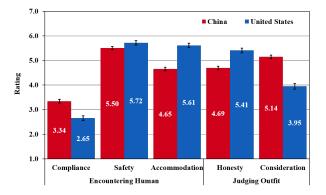


Figure 1: Ratings of the *encountering human* and *judging outfit* scenarios, error bars represent one standard error from the mean.

### Judging outfit

What should the robot do when it is asked to judge your/your friend's outfit choice?

- Make the judgment honestly.
- **Consider** the person's feelings by making the remark tactfully.

For the judging outfit scenario, the robot faced a dilemma between being honest or considering people's feelings. US samples preferred the robot to make an honest judgment  $(US: 5.40 \pm 1.60 \text{ CN}: 4.69 \pm 1.53, F(1, 734) = 36.83, p < 1.53)$  $.001, \eta_p^2 = 4.8\%$ ), while CN samples believed it was more appropriate to consider peoples feelings by making the remark tactfully (US:  $3.94 \pm 2.00$  CN:  $5.14 \pm 1.57$ ,  $F(1,734) = 81.94, p < .001, \eta_p^2 = 10.0\%$ ). The two populations also showed different attitudes towards the contextual variable relationship between people (significant interaction effect of culture \* relationship, F(2,730) = $8.83, p < .001, \eta_p^2 = 2.4\%$ ). When the person whose outfit was being judged had a closer relationship with the owner, Chinese participants believed the robot should more strongly consider the person's feelings (owner:  $5.40 \pm 1.43$  friend:  $5.63 \pm 1.38$  stranger:  $4.47 \pm 1.64$ , F(2, 432) = 25.13, p < 100 $.001, \eta_p^2 = 10.4\%$ ) rather than directly tell the truth (owner:  $4.16 \pm 1.51$  friend:  $4.20 \pm 1.52$  stranger:  $5.61 \pm 1.08$ ,  $F(2,432) = 53.77, p < .001, \eta_p^2 = 20.0\%$ , post-hoc tests only show significant differences between stranger and other two relationships, p < .001). The people's relationship had no significant influence for US samples.

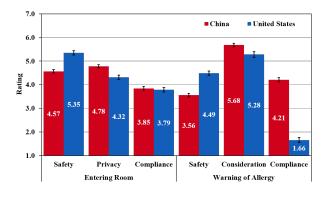


Figure 2: Ratings of the *entering room* and *warning of allergy* scenarios, error bars represent one standard error from the mean.

#### **Entering Room**

What should the robot do when an emergency (pipe burst/fire) arises while you are in the bathroom?

- Barge in to save me to protect my **safety**.
- Knock on the door before entering to protect my privacy.

In the entering bathroom scenario, US participants agreed more  $(5.35 \pm 1.86)$  on the "directly enter" option than CN participants  $(4.56 \pm 1.96, F(1,734) = 29.81, p <$  $.001, \eta_n^2 = 3.9\%$ ). Chinese participants more highly rated the "knock on door" option than American ones (US:  $4.32\pm$ 2.00 CN: 4.79 ± 1.77,  $F(1,734) = 11.26, p = .001, \eta_p^2 =$ 1.5%). The results show different preferences among options between CN and US: the US samples preferred the robot to barge in the room rather than knock on the door, while CN samples preferred it to knock on the door instead of directly entering - even in an emergency situation. These findings can be explained in two ways: people perceive different degrees of privacy invasion for the same behavior of the robot, or that people hold different ideas about whether the robot should obey social rules like knocking on the door. The extremity of the emergency also significantly influenced participants' answers: people preferred the robot to directly enter the room in a severely dangerous situation, like a house fire, than in a less severe situation, like a pipe bursting  $(F(1,728) = 83.396, p < .001, \eta_p^2 = 10.3\%).$ 

# Warning of Allergy

Suppose you/your robot are serving a dish for a dinner at the home among friends/families. What should the robot do when it overhears a conversation and deduces that one of the guest might be slightly/severely allergic to the food?

• Interrupt the conversation to inform everyone of the situation (safety).

- Only inform you, the owner, and not anyone else (consideration).
- Take no action due to table manners (compliance).

In this scenario, although both cultures agreed the most appropriate option was for the robot to only inform the owner  $(F(2, 1468) = 336.45, p < .001, \eta_p^2 = 31.4\%$ , posthoc tests ps < .001), the two populations differed in their opinions on the remaining two choices (shown as Fig.2). Chinese participants preferred the "take no action" option more (US:  $1.66 \pm 0.98$  CN:  $4.21 \pm 1.87$ , F(1,734) = $469.52, p < .001, \eta_p^2 = 39.0\%$ ), whereas American participants preferred the interrupt option more (US:  $4.49 \pm 2.03$ CN:  $3.56 \pm 1.75$ , F(1, 734) = 44.08, p < .001,  $\eta_p^2 = 5.7\%$ ). The dramatic variance in the "take no action" option could be attributed to the different social attitudes to allergy between the two countries: food allergies are less common and not treated as seriously in Asian countries as in western ones (Lee et al. 2008). This cultural difference shows that scenarios can be interpreted differently depending on the cultural lens from which they are viewed and attests to the importance of cultural compatibility when designing social robots.

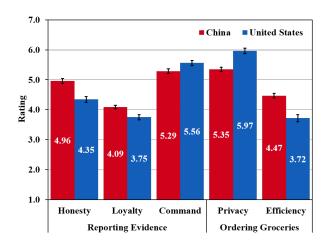


Figure 3: Ratings of the *reporting evidence* and *ordering groceries* scenarios, error bars represent one standard error from the mean.

#### **Reporting Evidence**

Suppose your domestic robot witnesses an accident for which you may (not) be responsible. Should it provide evidence of this accident to a third party who is investigating the incident?

- Yes, it should always tell the truth (honesty).
- Only if the evidence is in favor of you, the owner (loyalty).
- Only if instructed by you to do so (command).

In this scenario, we examined a dilemma between loyalty and honesty. Generally, participants preferred the robot to "obey owner's command" ( $5.40 \pm 1.64$ ) more than "always tell the truth" ( $4.71 \pm 1.80$ ) or "only provide the evidence when it is in favor of the owner"  $(3.95 \pm 1.79)$ , as shown in Fig.3 ( $F(2, 1468) = 114.83, p < .001, \eta_p^2 = 13.5\%$ , posthoc tests ps < .001). Notably, US participants rated "robot should always tell the truth" higher when the owner was not responsible for the accident (responsible:  $3.99 \pm 2.08$  not responsible:  $4.70 \pm 1.93, F(1, 299) = 9.49, p = .002, \eta_p^2 = 3.1\%$ ).

# **Ordering groceries**

What should the robot do when it is tasked with ordering groceries online, but it is not provided with enough information, such as your preferred payment method?

- Ask for the information to protect data security.
- Retrieve the information from the purchase history to finish the task **efficiently**.

Although both populations preferred the robot to ask instead of looking up the information by itself ( $F(1,734) = 276.00, p < .001, \eta_p^2 = 27.3\%$ ), Chinese participants held a relatively more open attitude in the resulting normative conflict between privacy and efficiency. CN samples rated the option "ask owner" significantly lower than US samples (US:  $5.97 \pm 1.14$  CN:  $5.35 \pm 1.38, F(1,734) = 40.59, p < .001, \eta_p^2 = 5.2\%$ ). The alternative "retrieve information" option, was rated significantly higher by the CN samples than the US samples (US:  $3.72 \pm 1.98$  CN:  $4.47 \pm 1.79, F(1,734) = 28.55, p < .001, \eta_p^2 = 3.7\%$ ).

# **Discussion and Conclusions**

### **Normative Reasoning**

There is a complicated relationship between environmental context, relevant norms, and the actions that a domestic robot is expected to take. In any given situation, there could exist multiple norms with varying degrees of conflicts with one another that a robot ought to obey - even in the restricted setting of the domestic environment. The activation and priority of some norms is highly sensitive to contextual factors, such as the perceived danger in a situation. As we found in our results, people valued the norms corresponding to safety and privacy to the same degree for the entering room scenario; however, their preferences shifted depending on the level of danger in the scenario. On the other hand, for other scenarios, like encountering a person on the wrong side of the hallway, the "move out of the way" option dominated the "obey social rules" option, showing a significant priority of one norm in this specific situation regardless of context. To capture the complicated relationship between contexts, norms, and actions, a formal representation of the environment and a comprehensive norm network is necessary.

Our survey of people's preferences regarding the normative behavior of domestic robots provides an initial step of achieving the goal of constructing a comprehensive normative reasoning framework. By constructing dilemmas between pairwise norms, we measured both the norm priorities and the severity of the conflict between norms. This method simplifies the problem by assuming that only two or three norms are activated in the given situation, and each option corresponds to one norm. Our results are preliminary and additional future work is needed to capture the complex interplay of norms and contextual variables.

Our results also show the importance of equipping domestic robots with a normative reasoning component, instead of pre-programming compliance to norms that robot designers think may be appropriate. As our results show, contextual variables significantly influenced participants' ratings of preferences in most scenarios. This finding indicates that users expect the robot to be aware of the social and physical environment and behave accordingly, such as disregarding privacy to save the owner when the house is on fire or telling "white lies" to its owner's friends so as to not hurt their feelings. Although programming pre-defined norm compliance for all these situations could fulfill such expectations, it requires huge computational resources due to the size of norm set and contextual variables. In contrast, a normative reasoning model could enable consideration of only a subset of norms at a time based on the current context, significantly reducing the computational cost (Krishnamoorthy et al. 2018). The data from human participants presents a solid base for designing and building future computational models.

### **Culture Dimensions and Characteristics**

An important challenge of designing social robots with normative reasoning capabilities is acculturating them to the target culture in which they will be deployed (Salem, Ziadee, and Sakr 2014; Wang et al. 2010). People with diverse backgrounds may perceive the same action of a robot as compliance/obedience or violation of different norms. For example, in the warning of allergy scenario, the ratings of the "take no action" option varies across cultures due to differences in the perception of danger between the US and China. Thus, conducting surveys to understand ordinary users' perceptions and attitudes provide crucial design guidelines for norm-aware domestic robots.

Other important components of the design guidelines are the appropriate strength of social norms and the corresponding sanctions of norm violations. Prior work features cultures as tight (e.g. East Asian countries) or loose (e.g. Western countries) based on the strength of social norms and sanctioning of deviant behaviors (Gelfand et al. 2011). This representation aligns with our results: Chinese participants prefer the robot to comply with social conventions when entering the bathroom or walking in the hallway. Thus, when designing a norm-compliant computational normative model for a robot that would be deployed to Chinese users, the strength of social norms and corresponding sanctions for norm violations in these cases should be higher than for a robot designed for American users.

Cultural syndromes (Triandis 1996) categorize cultures into *face*, *dignity*, *honor*. China is a face culture where the value of an individual is confirmed by other community members. The US is a dignity culture where people value independence and individual goals. This differential valuation of individual values vs relationships that is a characteristic of dignity vs face cultures, has also been considered earlier in the cultural dimensions of individualist (US) vs collectivist cultures (China) by (Hofstede 2001). Our results showed this cultural difference in that Chinese participants preferred robots to consider people's feelings. These results suggest that cultural syndromes and dimensions influence the priority and strength of norms, and should be incorporated into design guidelines for domestic robots.

We also found cultural differences in people's views and expected social roles of domestic robots. In general, Chinese consider the robots as more autonomous with more flexibility to make decisions, whereas US participants tend to treat the robot as a machine that should obey pre-defined rules and its owner's command. For example, US subjects gave higher ratings on options like "ask owners' command", "always tell the truth", and "accommodate human's behaviors".

# **Future Work**

In this paper, we reported preliminary results from the first survey of its kind on scenario-specific and context-specific norms, and relative norm priorities by performing surveys in two different cultures. In future work, we plan to perform additional analysis of our data and refine our questionnaire to consider additional norms and moral dilemmas. We will also survey additional cultures, such as the Honor culture that represents populations in the Middle East.

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# References

Arnold, T., and Scheutz, M. 2017. Beyond moral dilemmas: Exploring the ethical landscape in hri. In *Proceedings of the 2017 ACM/IEEE International Conference on Human-Robot Interaction*, 445–452. ACM.

Bonnefon, J.-F.; Shariff, A.; and Rahwan, I. 2016. The social dilemma of autonomous vehicles. *Science* 352(6293):1573–1576.

Brennan, G.; Eriksson, L.; Goodin, R. E.; and Southwood, N. 2013. *Explaining norms*. Oxford University Press.

Conitzer, V.; Sinnott-Armstrong, W.; Borg, J. S.; Deng, Y.; and Kramer, M. 2017. Moral decision making frameworks for artificial intelligence. In *Proceedings of the 31st AAAI Conference on Artificial Intelligence (AAAI)*.

de Graaf, M. M.; Ben Allouch, S.; and van Dijk, J. A. 2017. Why would i use this in my home? a model of domestic social robot acceptance. *Human–Computer Interaction* 1– 59.

Gelfand, M. J.; Raver, J. L.; Nishii, L.; Leslie, L. M.; Lun, J.; Lim, B. C.; Duan, L.; Almaliach, A.; Ang, S.; Arnadottir, J.; et al. 2011. Differences between tight and loose cultures: A 33-nation study. *science* 332(6033):1100–1104.

Haring, K. S.; Silvera-Tawil, D.; Takahashi, T.; Velonaki, M.; and Watanabe, K. 2015. Perception of a humanoid robot: a cross-cultural comparison. In *Robot and Human Interactive Communication (RO-MAN), 2015 24th IEEE International Symposium on,* 821–826. IEEE.

Hofstede, G. 2001. *Culture's consequences: Comparing values, behaviors, institutions and organizations across nations.* Sage publications.

Kahn Jr, P. H.; Kanda, T.; Ishiguro, H.; Gill, B. T.; Ruckert, J. H.; Shen, S.; Gary, H. E.; Reichert, A. L.; Freier, N. G.; and Severson, R. L. 2012. Do people hold a humanoid robot morally accountable for the harm it causes? In *Proceedings* of the seventh annual ACM/IEEE international conference on Human-Robot Interaction, 33–40. ACM.

Kitayama, S.; Mesquita, B.; and Karasawa, M. 2006. Cultural affordances and emotional experience: socially engaging and disengaging emotions in japan and the united states. *Journal of personality and social psychology* 91(5):890.

Koay, K. L.; Syrdal, D. S.; Ashgari-Oskoei, M.; Walters, M. L.; and Dautenhahn, K. 2014. Social roles and baseline proxemic preferences for a domestic service robot. *International Journal of Social Robotics* 6(4):469–488.

Krishnamoorthy, V.; Luo, W.; Lewis, M.; and Sycara, K. 2018. A computational framework for integrating task planning and norm aware reasoning for social robots. In *INternational Conference of Robot and Human Interactive Communication (RO-MAN)*. IEEE.

Lee, B. W.; Shek, L. P.-C.; Gerez, I. F. A.; Soh, S. E.; and Van Bever, H. P. 2008. Food allergy–lessons from asia. *World Allergy Organization Journal* 1(7):129.

Lee, H. R.; Sung, J.; Šabanović, S.; and Han, J. 2012. Cultural design of domestic robots: A study of user expectations in korea and the united states. In 2012 IEEE RO-MAN: The 21st IEEE International Symposium on Robot and Human Interactive Communication, 803–808. IEEE.

Leung, A. K.-Y., and Cohen, D. 2011. Within-and betweenculture variation: individual differences and the cultural logics of honor, face, and dignity cultures. *Journal of personality and social psychology* 100(3):507.

Li, D.; Rau, P. P.; and Li, Y. 2010. A cross-cultural study: Effect of robot appearance and task. *International Journal of Social Robotics* 2(2):175–186.

Malle, B. F.; Scheutz, M.; Forlizzi, J.; and Voiklis, J. 2016. Which robot am i thinking about?: The impact of action and appearance on people's evaluations of a moral robot. In *The Eleventh ACM/IEEE International Conference on Human Robot Interaction*, 125–132. IEEE Press.

Malle, B. F.; Scheutz, M.; and Austerweil, J. L. 2017. Networks of social and moral norms in human and robot agents. In *A world with robots*. Springer. 3–17.

Mason, W., and Suri, S. 2012. Conducting behavioral research on amazons mechanical turk. *Behavior research methods* 44(1):1–23.

Moor, J. H. 2006. The nature, importance, and difficulty of machine ethics. *IEEE intelligent systems* 21(4):18–21.

Nomura, T. T.; Syrdal, D. S.; and Dautenhahn, K. 2015. Differences on social acceptance of humanoid robots between japan and the uk. In *Procs 4th Int Symposium on New Frontiers in Human-Robot Interaction*. The Society for the Study of Artificial Intelligence and the Simulation of Behaviour (AISB).

Pino, M.; Boulay, M.; Jouen, F.; and Rigaud, A. S. 2015. are we ready for robots that care for us? attitudes and opinions of older adults toward socially assistive robots. *Frontiers in aging neuroscience* 7:141.

Salem, M.; Lakatos, G.; Amirabdollahian, F.; and Dautenhahn, K. 2015. Would you trust a (faulty) robot?: Effects of error, task type and personality on human-robot cooperation and trust. In *Proceedings of ACM/IEEE International Conference on Human-Robot Interaction*, 141–148. ACM.

Salem, M.; Ziadee, M.; and Sakr, M. 2014. Marhaba, how may i help you?: effects of politeness and culture on robot acceptance and anthropomorphization. In *Proceedings of the 2014 ACM/IEEE international conference on Human-robot interaction*, 74–81. ACM.

Scopelliti, M.; Giuliani, M. V.; and Fornara, F. 2005. Robots in a domestic setting: a psychological approach. *Universal access in the information society* 4(2):146–155.

Smarr, C.-A.; Mitzner, T. L.; Beer, J. M.; Prakash, A.; Chen, T. L.; Kemp, C. C.; and Rogers, W. A. 2014. Domestic robots for older adults: attitudes, preferences, and potential. *International journal of social robotics* 6(2):229–247.

Triandis, H. C. 1996. The psychological measurement of cultural syndromes. *American psychologist* 51(4):407.

Wang, L.; Rau, P.-L. P.; Evers, V.; Robinson, B. K.; and Hinds, P. 2010. When in rome: the role of culture & context in adherence to robot recommendations. In *Proceedings* of the 5th ACM/IEEE international conference on Human-robot interaction, 359–366. IEEE Press.

Young, J. E.; Hawkins, R.; Sharlin, E.; and Igarashi, T. 2009. Toward acceptable domestic robots: Applying insights from social psychology. *International Journal of Social Robotics* 1(1):95.