- Descriptive norms caused increases in mask wearing during the COVID-19 pandemic
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Abstract

- Human sociality is governed by two types of social norms: injunctive norms, which prescribe what people ought to do, and descriptive norms, which reflect what people 20 actually do. The process by which these norms emerge and their causal influences on 21 cooperative behavior over time are not well understood. Here, we study these questions 22 through social norms influencing mask wearing during the COVID-19 pandemic. 23 Leveraging two years of data from the United States (18 time points; n = 915), we tracked mask wearing and perceived injunctive and descriptive mask wearing norms as the pandemic unfolded. Longitudinal trends suggested that norms and behavior were tightly coupled, changing quickly in response to public health recommendations. In addition, longitudinal modeling revealed that descriptive norms caused future increases in mask wearing across multiple waves of data collection. These cross-lagged causal effects of descriptive norms were large, even after controlling for non-social beliefs and demographic 30 variables. Injunctive norms, by contrast, had less frequent and generally weaker causal 31 effects on future mask wearing. During uncertain times, cooperative behavior is more 32 strongly driven by what others are actually doing, rather than what others think ought to 33 be done. 34
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- 36 COVID-19; mask wearing; cooperation
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Social norms are a key aspect of human sociality^{1–3}. Broadly, social norms are defined as commonly known behavioral guidelines enforced by groups of people⁴. By coordinating the behavior of many individuals, social norms enable human groups to cooperate in the face of group-wide challenges and threats, such as resource scarcity, natural disasters, and infectious diseases⁵. Social norms are thus hypothesized to have played a key role in the evolution of large-scale cooperation in humans⁶.

Previous research has distinguished between two types of social norms: injunctive norms and descriptive norms^{1,2,7}. Injunctive norms indicate what others tend to approve or disapprove of and often involve social sanctions if violated. By contrast, descriptive norms simply describe what most people are doing in a given situation, but carry no prescriptive information *per se*. According to the focus theory of normative conduct², these two kinds of social norms often align, but they can also be in conflict with one another and differentially affect behavior depending on which norm is more salient. For example, there may be an injunctive norm that cleaning up litter at a picnic site is the right thing to do: one *ought* to behave this way. However, if an individual observes that most people are leaving their litter behind at the site, they may instead follow the descriptive norm and litter themselves.

Despite decades of research on injunctive and descriptive norms^{2,8,9}, open questions remain regarding the emergence and causal influence of social norms^{4,10}. First, how do injunctive and descriptive norms emerge over time within a population? Second, how do evolving injunctive and descriptive norms causally influence behavior over time?

Research has investigated how social norms emerge in a population over time. In the long term, cultural evolutionary models show that injunctive social norms can be vertically transmitted across generations by imitation or teaching, or horizontally diffused from neighboring populations⁶. However, less is known about how social norms arise endogenously within populations in the short term. While researchers have simulated the emergence of descriptive norms^{11,12}, this modeling work does not capture how descriptive

norms develop alongside injunctive norms in real-world settings. Recent work in behavioral economics has also suggested that injunctive norms of public good provisioning develop in tandem with cooperative behavior through repeated interactions¹³. But it remains unclear whether these findings generalize beyond the laboratory to real human populations.

With regards to normative influences on behavior, studies have demonstrated positive 68 effects of descriptive norms on a variety of cooperative behaviors, including recycling 14, paying taxes¹⁵, and sustainably reusing towels in hotels¹⁶. However, these studies have two key aspects that limit their ability to assess the causal impact of norms, both of which we address in our current work. First, studies have not accounted for other potential non-social explanations for behavior, such as perceptions of the effectiveness of the behavior and personal beliefs that one should behave in a certain way. These non-social beliefs, labeled "factual beliefs" and "personal normative beliefs" often correlate with descriptive 75 and injunctive norms, but they are fundamentally different because they can cause behavior separately from social expectations about what others do or think should be done. 77 For example, willingness to recycle might be driven by perceptions that recycling has a positive impact on the environment and/or personal beliefs that recycling is the right thing 79 to do, even if social norms actively discourage recycling (e.g., recycling is not a common or 80 socially approved behavior). It is thus important to control for non-social beliefs in studies 81 of social norms, especially considering that personal norms have previously been shown to 82 influence prosocial behavior^{18,19}. Second, studies have tended to follow cross-sectional experimental designs in which social norm perceptions are manipulated by the researchers. However, social norms are not static: they change dynamically over time through processes of deliberation and interaction²⁰. An alternative but underutilized method of assessing causality between social norms and cooperative behavior, while retaining ecological validity, is to follow these variables over time amidst a real, unfolding social dilemma.

To understand how social norms emerge over time and shape cooperative behavior in a non-experimental setting, we focus on mask wearing in the United States during the COVID-19 pandemic. In April 2020, one month after the World Health Organization
declared COVID-19 a global pandemic, mask wearing was officially recommended by the
Centers for Disease Control and Prevention (CDC) to minimize the spread of the disease²¹.
Mask wearing has individual benefits, but the CDC also emphasized the collective benefits
in reducing disease spread²². Indeed, mask wearing posed a social dilemma to many
individuals, in that it imposed personal costs (e.g., difficulty breathing, disrupted social
interaction) for the benefit of the community (e.g., "flattening the curve" to protect at-risk
individuals). Thus, the development of mask wearing during the COVID-19 pandemic
enables us to study the emergence of social norms and their causal effects on cooperative
behavior over a short timescale within a single population.

Recent research has studied the relationships between social norms and protective 101 COVID-19 behaviors. In the United States, one study found that perceptions of injunctive 102 norms positively predicted intentions to stay at home to minimize exposure²³, and another 103 study found that experimentally-induced descriptive norms increased mask wearing 104 intentions²⁴. In Italy, an experimental study found no effect of messages highlighting 105 descriptive norms, injunctive norms, or personal norms on time spent reading information 106 about COVID-19 governmental rules 25 . In Germany, a two-wave study found that 107 perceptions of descriptive norms positively predicted future protective behaviors, such as 108 physical distancing²⁶. These studies are informative, but since they are cross-sectional or 100 only minimally longitudinal, they do not have the temporal granularity to capture 110 fluctuating changes in norm strength and adherence across the pandemic. Furthermore, 111 several of the studies do not control for potential confounding variables, such as 112 demographics and political ideology. These variables are important to account for as they 113 have previously been shown to be related to COVID-19 attitudes and behaviors^{27,28}. 114

Here, we use two years of data from a representative sample of adults in the United States (18 time points; n = 915) to track the development of descriptive and injunctive mask wearing norms and mask wearing behavior over the course of the COVID-19

pandemic. Participants reported their frequency of mask wearing during in-person interactions, as well as their perceptions of descriptive and injunctive mask wearing norms.

We also asked participants about their non-social mask wearing beliefs, demographics, and political ideology, and controlled for these factors. We used these longitudinal data to answer two main research questions in a specific real-world context. First, how do descriptive and injunctive mask wearing norms emerge over time? Second, how do descriptive and injunctive mask wearing norms causally influence mask wearing?

125 Results

To answer our first research question about the emergence of mask wearing norms, we first visualized the average descriptive trends of self-reported norm perceptions across the entire study duration, showing how mask wearing social norms emerged and fluctuated over the course of the COVID-19 pandemic. Figure 1 plots self-reported mask wearing and perceptions of descriptive and injunctive mask wearing norms alongside relevant pandemic-related events in the United States, such as CDC public health recommendations and COVID-19 case numbers. These events were obtained from the CDC Museum's COVID-19 Timeline²¹.

Two main observations can be made about the emergence and stability of social norms from these visualizations. First, social norms and behavior were tightly coupled over time. Although social norms are measured on fewer occasions than mask wearing, we can see that as mask wearing decreased in the summer of 2021, so too did perceived descriptive and injunctive mask wearing norms. Subsequently, the steep rise in COVID-19 case numbers in the fall of 2021 saw concomitant increases in both mask wearing and perceived social norms, before declining again in 2022. In line with these patterns, multilevel regression models revealed positive correlations between mask wearing and perceived descriptive mask wearing norms (b = 0.29, 95% confidence interval [0.23 0.35], p < .001) and between mask wearing and perceived injunctive mask wearing norms (b = 0.26, 95%

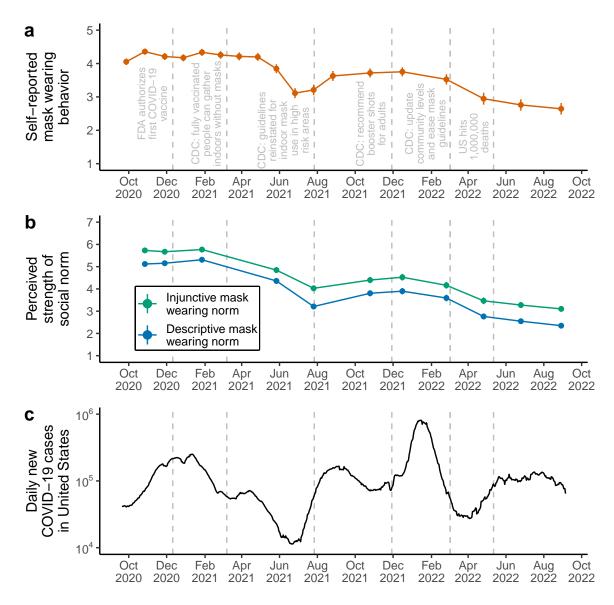


Figure 1. Timeline of self-reported mask wearing and perceived social norms in the United States during the COVID-19 pandemic. (a) Points and line ranges indicate means \pm two standard errors for the self-reported mask wearing item. This item was measured across all eighteen time points on a 5-point Likert scale, with higher values indicating increased frequency of personal mask wearing during in-person interactions. (b) Points and line ranges indicate means \pm two standard errors for perceived injunctive mask wearing norms (green) and perceived descriptive mask wearing norms (blue). These items were measured across eleven time points on a 7-point Likert scale, with higher values indicating stronger perceived social norms. (c) Smoothed data for daily new COVID-19 cases in the United States, displayed on the log scale (data retrieved from Our World in Data; https://ourworldindata.org/). Across all panels, gray dashed lines represent significant pandemic-related events in the United States, such as vaccine approval from the Food and Drug Administration (FDA) and public health recommendations from the Centers for Disease Control and Prevention (CDC).

CI $[0.22\ 0.30]$, p < .001) across individuals and time points (Supplementary Figure S1; Supplementary Table S1).

Second, fluctuations in mask wearing and perceived social norms are in line with 146 recommendations broadcasted by the CDC, an important institution governing public 147 health in the United States. We do not have data for the very start of the pandemic in 148 early 2020, but the high levels of mask wearing and strong perceived social norms at the start of our observation window likely emerged after the initial mask wearing 150 recommendation from the CDC in April 2020. Perceived social norms and mask wearing 151 subsequently declined after the CDC rescinded their mask wearing recommendation 152 following widespread vaccine availability in March 2021, and then increased again after the CDC updated their guidelines for indoor mask use in high-risk areas in August 2021. Finally, perceived social norms and mask wearing declined again after the CDC eased mask 155 wearing guidelines in March 2022. These trends were confirmed by a series of multilevel 156 regression models with change points aligning with changes in CDC mask wearing 157 recommendations (Supplementary Figure S2: Supplementary Table S2). 158

Sample averages can provide informative trends, but they do not allow us to 159 determine whether within-person changes in social norms caused future within-person 160 changes in mask wearing over time. To answer our second research question about causal 161 effects, we fitted a ten-wave random-intercept cross-lagged panel model^{29,30} to the 162 longitudinal data. This model separately estimates stable trait-like between-person 163 individual differences and within-person fluctuations from those trait levels for our main variables (self-reported mask wearing, perceived descriptive mask wearing norms, and 165 perceived injunctive mask wearing norms) and control variables (factual beliefs and 166 personal normative beliefs). In line with our proposed causal model (Supplementary Figure 167 S3), we also control for potential confounding in this model by including demographics 168 (gender, age, ethnicity, socioeconomic status) and political orientation as exogenous 169 controls.

Random-intercept cross-lagged panel models capture within-person changes over time 171 with autoregressive and cross-lagged effects. Autoregressive effects represent "persistence" 172 or "inertia" in within-person fluctuations from stable trait levels. In other words, a positive 173 autoregressive effect indicates that being higher than average on one measure predicts being 174 higher than average on that same measure in the following time point (this is not to be 175 confused with the "stable trait level" over time, which is captured by the random intercepts 176 in our model). For example, an autoregressive effect from mask wearing in February 2021 177 to future mask wearing in June 2021 would suggest that wearing masks more than average 178 in February predicts wearing masks more than average in June. By contrast, and most 179 relevant for the current study, cross-lagged effects represent the effect of a within-person 180 fluctuation in one measure on future within-person fluctuations in other measures. In other 181 words, a positive cross-lagged effect indicates that being higher than average on one 182 measure predicts being higher than average on another measure in the following time 183 point. For example, a cross-lagged effect from descriptive norms in February 2021 to future 184 mask wearing in June 2021 would suggest that perceiving descriptive norms as stronger 185 than average in February predicts wearing masks more than average in June. Cross-lagged 186 effects are thus used to infer within-person causal influences over time. In what follows, we 187 focus on the within-person autoregressive and cross-lagged effects for mask wearing and 188 perceived social norms (see Supplementary Results for between-person results). 189

We first fitted a time-invariant model, which constrained the autoregressive effects, cross-lagged effects, covariances, and variances to equality over time. This model assumes that the relationships between variables are identical across all time points, giving us a sense of the average causal effects of social norms on mask wearing over time. According to established fit statistics, the time-invariant model fitted the data reasonably well (root mean square error of approximation (RMSEA) = 0.038, 95% CI [0.036 0.040]; standardized root mean squared residual (SRMR) = 0.093; comparative fit index (CFI) = 0.906). Table 1 summarizes the autoregressive and cross-lagged parameters from the time-invariant

Table 1 Unstandardized autoregressive and cross-lagged parameters from time-invariant random-intercept cross-lagged panel model. Arrows indicate the direction of prediction. Note that the effects of factual beliefs and personal normative beliefs are omitted from this table for clarity. $SE = standard\ error$.

Parameter	Estimate	SE	2.5%	97.5%	p
$Mask wearing \rightarrow Mask wearing$	0.21	0.03	0.16	0.26	0.00
Mask wearing \rightarrow Injunctive norms	0.04	0.02	0.00	0.07	0.04
Mask wearing \rightarrow Descriptive norms	0.05	0.02	0.01	0.08	0.01
Injunctive norms \rightarrow Mask wearing	0.00	0.03	-0.05	0.06	0.89
Injunctive norms \rightarrow Injunctive norms	0.27	0.03	0.21	0.32	0.00
Injunctive norms \rightarrow Descriptive norms	0.12	0.02	0.07	0.17	0.00
Descriptive norms \rightarrow Mask wearing	0.12	0.03	0.06	0.18	0.00
Descriptive norms \rightarrow Injunctive norms	0.17	0.02	0.13	0.22	0.00
Descriptive norms \rightarrow Descriptive norms	0.32	0.03	0.27	0.37	0.00

model. Autoregressive effects were significantly positive for mask wearing, perceived 198 descriptive norms, and perceived injunctive norms, indicating that being higher than 199 average on these variables at time t generally predicted being higher than average on the 200 same variables at time t+1. Crucially, cross-lagged effects from the time-invariant model 201 revealed that perceived descriptive norms predicted future mask wearing (unstandardized b202 = 0.12, 95% CI [0.06 0.18], p < .001) while perceived injunctive norms did not (b = 0.00, 203 95% CI [-0.05 0.06], p = .893). In other words, perceiving descriptive norms as stronger than average at time t generally predicted wearing masks more frequently than average at 205 time t+1, while no such effect existed for injunctive norms. All other cross-lagged effects 206 between mask wearing, perceived descriptive norms, and perceived injunctive norms were 207 significantly positive in the time-invariant model. This general pattern of results was 208 unchanged when removing factual beliefs and personal normative beliefs from the 209 time-invariant model (Supplementary Table S3) and when removing factual beliefs, 210 personal normative beliefs, and all exogenous covariates from the time-invariant model 211 (Supplementary Table S4). 212

Given that the strength of perceived social norms varied throughout our data 213 collection window (Figure 1), it is plausible that the causal effects of social norms on mask 214 wearing may have changed over time as well, rather than being identical at each time 215 point. To test whether the equality constraints over time were tenable³⁰, we compared the 216 time-invariant model to an alternative time-varying model that freely estimated the 217 autoregressive effects, cross-lagged effects, covariances, and variances at each time point. 218 This model assumes that the relationships between variables are different across different 219 time points, allowing the causal effects of social norms on future mask wearing to vary over 220 time. The time-varying model fitted the data better than the time-invariant model 221 (RMSEA = 0.031, 95% CI [0.029 0.033]; SRMR = 0.073; CFI = 0.955). Model comparison222 revealed that freely estimating the parameters over time resulted in improved model fit 223 $(\Delta AIC = -483.09, \Delta \chi^2(320) = -1123.09, p < .001)$ suggesting that there was substantial variability in the relationships between mask wearing and social norms across the course of 225 the pandemic. Accordingly, we now turn to the results from the time-varying model. 226

Figure 2 displays the autoregressive and cross-lagged effects for social norms and 227 mask wearing from the time-varying model (see Supplementary Table S5 for full list of 228 estimated autoregressive and cross-lagged effects). In late 2020 and 2021, we find three 229 occasions where within-person increases in perceived descriptive norms predicted future 230 within-person increases in mask wearing. According to recent effect size guidelines for 231 cross-lagged panel models³¹, the standardized coefficients for these cross-lagged effects were 232 large (first wave, standardized $\beta = 0.16$, b = 0.20, 95% CI [0.06 0.34], p = .006; second 233 wave, $\beta = 0.21$, b = 0.26, 95% CI [0.10 0.42], p = .002; fifth wave, $\beta = 0.15$, b = 0.15, 95% 234 CI [0.01 0.29], p = .033). At other time points, the cross-lagged effects for descriptive 235 norms tended to be estimated in a positive direction, though these estimates were not 236 statistically significant and decreased in magnitude in 2022 (Figure 3). Time-varying 237 models without covariates revealed an additional significant cross-lagged effect of 238 descriptive norms on future mask wearing at the fourth wave, but otherwise the general

pattern of results for descriptive norms was unchanged (Supplementary Figures S4 - S7;
Supplementary Tables S6 and S7).

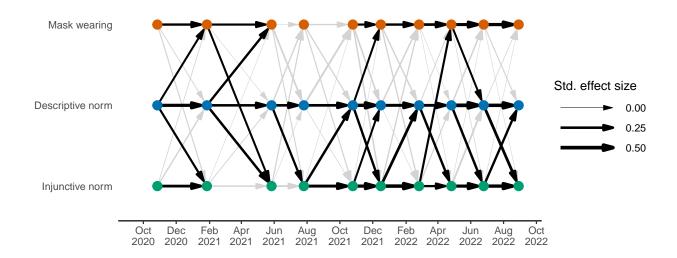


Figure 2. Path diagram of ten-wave time-varying random-intercept cross-lagged panel model. Circles represent data collection time points. Arrows represent within-person autoregressive effects (on one horizontal level) and cross-lagged effects (across levels) for mask wearing and perceived descriptive and injunctive norms, partitioning out stable between-person individual differences and controlling for factual beliefs, personal normative beliefs, demographics, and political orientation. Arrow thickness is scaled according to standardized effect size. Bolded arrows indicate significantly positive parameters, p < 0.05. Gray arrows indicate non-significant parameters.

In contrast, within-person increases in perceived injunctive norms only predicted future within-person increases in mask wearing at a single time point in March 2022 (seventh wave, $\beta = 0.17$, b = 0.20, 95% CI [0.03 0.37], p = .018). This cross-lagged effect was robust to the removal of covariates (Supplementary Figures S4 - S7; Supplementary Tables S6 and S7). At all other time points, the cross-lagged effects of injunctive norms on future mask wearing were non-significant and estimated to be generally weaker than the cross-lagged effects of descriptive norms (Figure 3), explaining the lack of effect of injunctive norms in the time-invariant model.

One possible explanation for the generally weaker causal influence of injunctive norms on future mask wearing is that injunctive norms might only have been sufficiently salient in regions of the United States with stronger governmental enforcement of mask wearing.

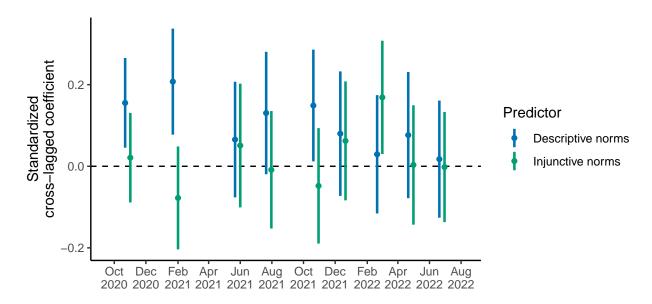


Figure 3. Standardized cross-lagged coefficients for descriptive norms and injunctive norms predicting future mask wearing in the ten-wave time-varying random-intercept cross-lagged panel model. Points are standardized estimates, lines are 95% confidence intervals.

Previous work has shown that, during the pandemic, states with Democratic leadership 253 tended to have more stringent mask wearing policies than states with Republican 254 leadership³². It is thus plausible that injunctive norms had a stronger causal effect on 255 future mask wearing in majority-Democrat states compared to majority-Republican states. To test this explanation, we fitted a multi-group time-invariant random-intercept cross-lagged panel model to the data, with separate groups for majority-Democrat and 258 majority-Republican states. However, contrary to the salience account, perceived 250 injunctive norms failed to predict future mask wearing in both Democrat states and 260 Republican states (see Supplementary Results). 261

Beyond the effects of descriptive and injunctive norms on future mask wearing, our
main time-varying model revealed other interesting patterns (Figure 2). On a few
occasions, we find evidence for a reciprocal relationship between social norms and mask
wearing, whereby within-person increases in mask wearing predicted future within-person
increases in perceived descriptive and injunctive norms. Moreover, several cross-lagged
effects emerged between perceived descriptive and injunctive norms, demonstrating

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reciprocal within-person influences between these variables as the pandemic unfolded.

Discussion 269

Using longitudinal data from the United States across two years of the COVID-19 270 pandemic, we aimed to understand how descriptive and injunctive mask wearing norms 271 emerge and influence behavior in response to a naturally unfolding social dilemma. The 272 trends of norm perceptions and self-reported mask wearing over time suggest that norms 273 and behavior were tightly coupled and both changed dynamically in response to 274 recommendations from public health authorities. Moreover, the results of our cross-lagged panel model indicate that descriptive norms caused future increases in mask wearing in the first year and a half of the pandemic. By contrast, injunctive norms were less frequently 277 related to future mask wearing during the pandemic, with generally weaker effects than 278 descriptive norms. 279

Our finding that social norms and mask wearing are tightly coupled over time 280 provides real-world support for experimental evidence that social norms and cooperative 281 behavior develop synergistically within groups via processes of social interaction¹³. The 282 fact that these changes closely tracked the release of guidelines by the CDC supports the 283 idea that institutions are part of the process by which culture and one's own behaviors are 284 mutually constructed³³. Indeed, previous work has shown that formal institutions are 285 critical for the emergence and rapid adoption of novel social norms³⁴. While new norms 286 can and do emerge spontaneously in populations, the process is slow compared to 287 institution-driven norm change, which, as our trends have shown, can unfold over measurement intervals as short as four to six weeks.

We found that descriptive norms predicted future within-person increases in mask 290 wearing, independent of the effects of injunctive norms, non-social beliefs, and demographic variables. This finding is in line with previous evidence showing that perceptions of

descriptive norms were positively related to other protective COVID-19 behaviors^{24,26}. There are several explanations for why descriptive norms have had these positive effects on 294 protective COVID-19 behaviors like mask wearing. First, people may have followed 295 descriptive norms to quickly coordinate their behavior with others during the pandemic. 296 Descriptive norms are particularly useful for coordinating behavior during fast changing, 297 threatening situations with a high degree of uncertainty, such as the COVID-19 298 pandemic³⁵. This may help to explain why the effects of descriptive norms were more 290 prevalent in earlier waves of our data, when uncertainty was highest. Second, people might 300 have engaged in conditional cooperation, adapting their cooperation levels to the degree of 301 cooperation in the population³⁶. Descriptive mask wearing norms provide evidence that 302 others are cooperating, increasing the likelihood that individuals will themselves contribute 303 to the public good by wearing masks. Third, the increased frequency of mask wearing in the population might have created a bandwagon effect³⁷, encouraging conformist copying. 305 Under this view, people wear masks not to coordinate or cooperate, but simply because they see a majority of others engaging in the behavior. Future research will be required to 307 determine the motivations underlying adherence to descriptive norms during uncertain 308 times.

On the whole, we found that perceived injunctive norms tended not to predict future 310 within-person increases in mask wearing, suggesting that injunctive norms and mask 311 wearing were not strongly causally related during our data collection window. One possible 312 explanation for this result is that, due to the increased opportunities to observe mask 313 wearing in public, descriptive norms of mask wearing were more salient than injunctive 314 norms during the pandemic. According to focus theory², this difference in salience would 315 produce behavior in line with descriptive norms and potentially suppress the effects of 316 injunctive norms. By contrast, for more private behaviors like remaining indoors, it would 317 have been less possible to observe other people's behaviors, increasing the relative salience 318 of injunctive norms. To test this idea, future research should expand our longitudinal

approach to protective behaviors beyond mask wearing, including both public behaviors

(e.g., physical distancing) and private behaviors (e.g., hand washing and home isolation).

Nevertheless, it is worth noting that injunctive norms continued to have no overall causal

effect on mask wearing when we focused specifically on majority-Democrat US states that

tended to employ state-wide mask mandates³², suggesting that a lack of saliency cannot

entirely explain why injunctive norms did not have a consistent effect on mask wearing

during the pandemic.

Regarding injunctive mask wearing norms, several open questions remain. First, 327 given that we see one time point in the later stages of the pandemic in which injunctive 328 norms directly predicted future mask wearing, it is possible that there were also earlier time points where injunctive norms had effects on behavior. We do not have data from the 330 very beginning of the pandemic (March-September 2020) to directly test this, but future 331 work could test this by examining the effects of injunctive norms on behaviour directly 332 after the onset of a crisis. Second, it remains unclear how the source of the injunctive norm 333 influences its efficacy. Our operationalization of injunctive norms referred in part to the 334 behavior of respected others, and so the influence of the perceived approval of prestigious 335 political and nationwide organizational leaders may be an important lever to test. In 336 addition, given that we operationalized injunctive norms in part by local-level 337 encouragement, this might explain why we see the only significant effect of injunctive 338 norms in February 2022, as by this point the CDC was easing their nationwide mask 330 guidelines. At this stage, people may have begun to look more to injunctive information 340 from their local areas for encouragement on what was appropriate. Third, our longitudinal 341 modelling showed that changes in perceived descriptive norms consistently influenced 342 future changes in perceived injunctive norms throughout our study period, while the 343 reverse was only true in the latter half of our study period. This suggests that initially changing empirical expectations of others' behavior could potentially motivate compliance 345 and shift later perceptions of injunctive norms³⁸. Although our model was not specifically

designed to address this question, future work should follow up on the temporal relationship between descriptive and injunctive norms with more fine-grained longitudinal data, perhaps experimentally intervening on perceptions of descriptive or injunctive norms to infer directions of causation.

It is unclear the extent to which our pattern of results might generalize to other 351 cultural contexts. The United States is relatively close to the global average on cultural 352 tightness-looseness, a cross-cultural dimension that measures nationwide strength of social 353 norms^{39,40}. We might therefore expect to see similar effects of social norms on mask wearing in countries with similar scores on this dimension. However, for countries with 355 higher levels of cultural tightness than the United States, we might expect to see stronger effects of descriptive norms on mask wearing, additional effects of injunctive norms on mask 357 wearing, and different dynamics between descriptive and injunctive norms. If borne out by 358 the data, such patterns might explain why countries with higher levels of cultural tightness 350 had fewer COVID-19 cases and deaths compared to culturally looser countries⁴⁰. To test 360 this, future research could expand our longitudinal approach to other cultural contexts. 361

Our results might not generalize to all social norms, behaviors, and social dilemmas. 362 Norms governing sustainability in response to climate change, for example, might take 363 longer to emerge, since the threat of climate change is more remote than the COVID-19 364 pandemic. For more distant social dilemmas that do not cause immediate day-to-day 365 uncertainty, descriptive social norms may not necessarily drive cooperative behavior. Mask wearing is also a unique cooperative behavior in that it is not "purely" cooperative (i.e., 367 imposing costs on the actor while providing benefits to targets). Much of past research on normative influences on prosocial behavior has focused on these purely unselfish 369 cooperative behaviors¹⁹. Mask wearing is different as it does have individual benefits (e.g., 370 reduced likelihood of contracting the disease). However, mask wearing also often imposes non-trivial costs on individuals (e.g., difficulty breathing, discomfort, disrupted social 372 interaction) for the benefit of the wider group, meaning that it is still useful to

conceptualise it as a prosocial or cooperative behavior. With these considerations, our
results may be most pertinent for easily observable behaviors in response to an immediate
or short-term threat that offer both benefits and costs to the individual in service to the
wider group (e.g., other protective health behaviors, joining a protest or strike).

There are some limitations associated with our longitudinal survey design. First, we 378 asked participants to self-report their frequency of mask wearing. However, self-report 379 measures may be biased by anchoring effects and participants' imperfect recall of their own 380 behavior, resulting in measurement error⁴¹. Such measures were necessary to implement our two-year longitudinal study, but future field studies of mask wearing norms could avoid 382 this pitfall by directly measuring mask wearing through naturalistic observation. Second, as is common in longitudinal designs, there was substantial attrition over the course of the study (Supplementary Figure S8). While this attrition did not substantially affect the 385 demographic representativeness of our sample (Supplementary Figure S9), the sample may 386 have been self-selected in other unknown ways that introduced confounds. Future 387 longitudinal work could encourage higher retention rates with more frequent reminders and 388 fewer survey questions to maintain attention and interest. 380

Despite these caveats, we have shown that mask wearing norms developed rapidly in 390 the United States population during the COVID-19 pandemic and tracked ongoing changes 391 in both recommendations from authorities and current levels of mask wearing behavior. 392 Moreover, we found that descriptive norms, rather than injunctive norms, were the main 393 driver for future mask wearing. Importantly, this key finding slices two ways. Not only does it imply that high local levels of mask wearing encouraged future personal mask use, but it also implies that low local levels of mask wearing discouraged future personal mask use. This echoes recent reports of people in the United States not wanting to be "singled 397 out" by being the only one wearing a mask in their community⁴². Organizations interested in combating such backfire effects might consider making masks easily and cheaply 399 available in local settings (e.g., within smaller institutions or at events) and running media

campaigns to show that mask wearing is common among "everyday people" doing

"everyday things". Once tested in target settings⁴³, such interventions could leverage the

power of consistent, visible community adherence to encourage protective behaviors in

response to global pandemics like COVID-19.

Materials and Methods

406 Ethical approval

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All experimental protocols were approved by the Institutional Review Board of
Arizona State University (STUDY00011678). All methods were carried out in accordance
with relevant guidelines and regulations. All participants in this study provided informed
consent.

Participants and sampling

Using the platform Prolific (https://www.prolific.co/), we distributed surveys to a 412 representative sample of a dults from the United States ($n=915,\,M_{\rm age}=46$ years, 75%413 White, 52% Women; see Supplementary Figure S10 for geographic distribution). From 414 September 2020 to October 2022, we asked participants to complete regular surveys of 415 COVID-19 related attitudes and behaviors (for a visualization of all questions asked of this sample, see https://navigateobscurity.com/cooperation-conflict-lab/us-variable-lookup). 417 This resulted in 18 unique time points of data collection during the pandemic. The first 12 time points were distributed monthly, while the remaining six time points were distributed 419 every two months. Of the initial 915 participants, 634 returned to complete the survey at 420 Time 2, while 347 participants continued through to Time 18 (see Supplementary Figure 421 S8 for attrition rates across all time points). However, this attrition did not substantially 422 affect the demographic makeup of the sample through time (Supplementary Figure S9). On 423 average, participants were paid approximately \$8 USD per hour for completing the surveys. 424

Measures Measures

Self-reported mask wearing. At every time point, participants were asked about 426 the number of in-person interactions they had in the last 7 days and the last 24 hours. 427 These two separate items specified that the interactions could have been either recreational 428 or routine: "How many people (outside of your household) have you had in-person 429 interactions with during the last $\lceil 7 \text{ days} / 24 \text{ hours} \rceil$ (e.g., visiting with friends, buying food 430 or supplies from a cashier)?" Following these questions, participants self-reported their 431 mask wearing by answering: "During these in-person interactions, if you were closer than 6 432 feet (2 meters) from the person(s) did you wear a face mask?" This question was asked 433 regardless of how many in-person interactions the participants reported in the two interaction questions. Participants responded to the mask wearing question on a 5-point Likert scale, from Never (1) to Always (5). Responses to this question were weakly negatively associated with the number of in-person interactions that participants reported 437 in the last 7 days and the last 24 hours, since wearing masks and social distancing are both 438 COVID-19 protective behaviors (Supplementary Figure S11). 439

Perceived descriptive and injunctive social norms. In 11 of the 18 time points (Time 2, 3, 5, 9, 11, 13, 14, 15, 16, 17, and 18), we asked questions about perceived descriptive and injunctive mask wearing norms.

Descriptive social norms were operationalized as the proportion of individuals in participants' local areas wearing masks in routine and recreational settings. We measured perceived descriptive social norms as the mean of the following two items: "What proportion of people in your area wear a mask while doing routine activities indoors (e.g., running errands, shopping, going to work)?" and "What proportion of people in your area wear a mask while doing recreational/social activities indoors (e.g., going to the gym, eating at a restaurant, attending a party)?" These perceived descriptive social norm items were measured on 7-point Likert scales, from None (1) to All (7).

Injunctive social norms were operationalized as respected individuals wearing masks 451 and community encouragement of mask wearing rules to emphasize the perceived social 452 approval of the behavior from group leaders and the community at large. We measured 453 perceived injunctive social norms as the mean of the following two items: "In general, how 454 often do you see people that you respect and trust wearing a mask (e.g., on tv, news, etc.)?" 455 and "How much are mask-wearing rules encouraged in your area (e.g., by local or state 456 government officials, businesses, etc.)?" These perceived injunctive social norm items were 457 measured on 7-point Likert scales, from Never/Rarely (1) to Very Often (7) for the first 458 item, and from Strongly Discouraged (1) to Strongly Encouraged (7) for the second item. 459

There is potential overlap between these operationalizations of descriptive and 460 injunctive norms. For example, the item asking how often participants see people that they 461 respect and trust wearing masks could be capturing descriptive norms as well as injunctive 462 norms. To address this concern about the construct validity of the four social norm items, 463 at time point 7 we asked participants about their interpretations of the items. We asked 464 participants whether each of the four items informed them about what people are doing or 465 what people should be doing (i.e., giving descriptive or injunctive information). We found 466 that participants rated the two descriptive norm questions as providing more descriptive 467 information than the two injunctive norm questions, and vice versa, suggesting that the 468 items are valid measures of perceived descriptive and injunctive social norms (see 460 Supplementary Results and Supplementary Tables S8 and S9). 470

Additional control variables. To identify direct causal effects in our longitudinal analysis, we constructed a directed acyclic causal graph outlining the expected causal relationships between our variables (Supplementary Figure S3). In this causal model, we included two kinds of non-social beliefs highlighted by previous research¹⁷: factual beliefs (i.e., beliefs about the effectiveness or consequences of mask wearing) and personal normative beliefs (i.e., personal beliefs about whether mask wearing is the right thing to do). These variables were included as potential mediators of the effects of descriptive and

injunctive social norms on mask wearing. In addition, we also included demographics
(gender, age, ethnicity, socioeconomic status, and political orientation) as common causes
of all other variables. This is justified by evidence showing that these variables are
associated with COVID-19 attitudes and behaviors^{27,28}. Given this causal graph, it is
necessary to control for factual beliefs, personal normative beliefs, and all demographic
variables in order to estimate the direct causal effects of descriptive and injunctive norms
on mask wearing behavior over time.

Non-social beliefs were measured in 12 of the 18 time points (Time 2, 4, 5, 7, 9, 11, 13, 14, 15, 16, 17, and 18). Factual beliefs were measured as the mean of the following two items: "I wear a face mask when going out in public to keep myself from getting sick" and "I wear a face mask when going out in public to prevent others from getting sick in case I may be infected but don't know it yet". Personal normative beliefs were measured with a single item: "Wearing a face mask when going out in public is the right thing to do". These non-social belief items were measured on 7-point Likert scales, from Strongly Disagree (1) to Strongly Agree (7).

All demographic variables were measured at the first time point only. Gender was 493 measured using a question that asked about participants' biological sex ("What is your 494 sex?") with three possible categories (Male, Female, or Other). We are assuming within 495 these analyses that participants identify as the gender associated with their biological sex. Age was measured numerically ("What is your age?"). Ethnicity was measured with a single item ("What is your ethnicity?") with six possible categories (Asian or Pacific Islander, Hispanic or Latino/a, White or Caucasian, Black or African American, Native American, or Other). Socioeconomic status was operationalized through a composite 500 measure averaging income, education level, and subjective socioeconomic status. Income 501 was captured by a single item measured on a 9-point scale of increasing income amounts 502 ("What was your combined household income in the previous year before taxes?"), 503 education was captured by a single item measured on a 7-point scale of increasing 504

education levels ("What is the highest level of education that you have completed?"), and
subjective socioeconomic status was represented by a ladder with ten rungs, from those
who are "worst off" at the bottom to those who are "best off" at the top. Political
orientation was measured as the mean of the following two items: "How would you describe
your political orientation with regard to social issues?" and "How would you describe your
political orientation with regard to economic issues?". These items were measured on
7-point Likert scales, from Very Liberal (1) to Very Conservative (7).

512 Statistical analysis

To analyze average trends in self-reported mask wearing and perceived social norms, 513 we fitted several multilevel regression models. First, to determine whether mask wearing 514 and social norms were coupled over time, we regressed mask wearing on perceived 515 descriptive and injunctive norms separately, including random intercepts and slopes for 516 participants and time points. Second, to analyze whether changes over time were related to 517 recommendations from the CDC, we regressed mask wearing and perceived social norms 518 onto a continuous time predictor. These models included random intercepts and slopes for 519 participants, as well as change points aligning with changes in CDC mask wearing 520 recommendations. We estimated these multilevel regression models using the lme4 R 521 package⁴⁴ and dealt with missing data via listwise deletion. 522

To quantify the within-person relationships between our variables over time, we fitted random-intercept cross-lagged panel models to our longitudinal data^{29,30}. This structural equation model distinguishes between stable between-person trait levels and within-person fluctuations from trait levels. Positive cross-lagged effects from this model indicate that being above average on one variable at time t predicts being above average in another variable at time t+1. These models are considered the gold standard for identifying Granger causality in longitudinal datasets^{29,30,45}.

We estimated the random-intercept cross-lagged panel models using the lavaan R 530 package⁴⁶. In line with our directed acyclic graph (Supplementary Figure S3), we included 531 three main variables (self-reported mask wearing, perceived descriptive norms, and 532 perceived injunctive norms) and two control variables (factual beliefs and personal 533 normative beliefs) in the model. For each of these variables, the model estimated a stable 534 between-person trait level (random intercept) and time-specific within-person fluctuations 535 from this trait level. We modeled autoregressive and cross-lagged effects between all five 536 variables, and included gender, age, ethnicity, socioeconomic status, and political ideology 537 as exogenous covariates. We restricted the analysis to the ten time points with available 538 data for all five variables. We fitted both a time-invariant model (i.e., a model that 539 constrained the within-person autoregressive effects, cross-lagged effects, covariances, and 540 variance to equality over time) and a time-varying model that freely estimated all parameters. In both cases, full information maximum likelihood estimation was used to deal with missing data.

In addition to the full random-intercept cross-lagged panel model containing all 544 covariates, we additionally fitted (1) a model with factual beliefs and personal normative 545 beliefs removed and (2) a model with all covariates removed. We fitted both time-invariant 546 and time-varying versions of these models. Finally, we fitted a time-invariant multi-group 547 model that estimated parameters separately for majority-Democrat states and 548 majority-Republican states, operationalised using the state-level results from the 2020 540 United States Presidential election. Results for these additional models are reported in the 550 Supplementary Material. 551

Analyses were conducted retrospectively after data collection during the COVID-19 pandemic, meaning that no analyses were preregistered and all analyses should thus be considered exploratory. All analyses were conducted in R v4.1.1⁴⁷. Visualizations were generated using the *cowplot*⁴⁸ and *ggplot2*⁴⁹ packages. The manuscript was reproducibly generated using the *targets*⁵⁰ and *papaja*⁵¹ packages. All code and data are publicly

 $_{557}$ available on GitHub:
 https://github.com/ScottClaessens/covidMaskWearing

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Author Contributions

SLH, JDA, DGB, AV, ERH, AA, and PMT conceptualized the study. SLH, SC, JDA, DGB, and AV oversaw the data curation, investigation, and methodology of the study. SLH and SC wrote the first draft of the paper. SC conducted the analyses and created all visualizations. ERH, AA, and PMT provided funding and supervision for the study. All authors reviewed and edited the final draft of the paper.

Conflicts of Interest

There are no conflicts of interest to declare.

Data Availability Statement

All data and code to reproduce the statistical analyses in this manuscript are publicly available on GitHub: https://github.com/ScottClaessens/covidMaskWearing

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Supplementary Material

Descriptive norms caused increases in mask wearing during the COVID-19 pandemic Samantha L. Heiman, Scott Claessens, Jessica D. Ayers, Diego Guevara Beltrán, Andrew Van Horn, Edward R. Hirt, Athena Aktipis & Peter M. Todd

Supplementary Results

Construct validity for measures of perceived descriptive and injunctive norms. To evaluate the construct validity of our measures of perceived descriptive and injunctive norms, at Time 7 we asked participants to rate the extent to which each perceived norm item provided descriptive and injunctive information. For each item, participants were asked whether the item provided information about what people are doing, and whether the item provided information about what people should be doing. Participants responded on a 7-point Likert scale, from (1) Not At All to (7) Very Strongly. For a full list of questions, see Supplementary Table S8.

We fitted a multilevel model to determine whether participants rated the descriptive norm items as providing more descriptive information than the injunctive norm items, and vice versa. Pairwise comparisons from this model revealed that participants did differentiate the perceived norm items as expected (see Supplementary Table S9 for pairwise comparisons). Both descriptive norm items were seen as providing more descriptive information than both injunctive norm items. Conversely, both injunctive norm items were seen as providing more injunctive information than both descriptive norm items.

Between-person results from random-intercept cross-lagged panel model.

The random-intercept cross-lagged panel model partitions the data into two components:

(1) between-person trait-like individual differences that persist over time, and (2) within-person fluctuations from trait levels at individual time points. In the main text, we focused on the results from the within-person component of the model, specifically the autoregressive and cross-lagged parameters, as we were interested in within-person causal effects. However, the model also estimates the covariances between the random intercepts in the model, which can be interpreted as the correlations between between-person trait levels for each variable (i.e., whether people who are generally high on one variable tend to be generally high on another variable).

The covariances between the random intercepts in the full time-invariant model revealed positive correlations between stable trait levels of mask wearing and perceived social norms. On average across the whole study, participants who more frequently wore masks during in-person interactions also perceived stronger descriptive mask wearing norms (r = 0.16, 95% CI [0.01 0.30]) and stronger injunctive mask wearing norms (r = 0.30, 95% CI [0.17 0.43]). Stable trait perceptions of descriptive and injunctive mask wearing norms were also highly positively correlated (r = 0.68, 95% CI [0.61 0.75]). This general pattern of correlations at the between-person level was unchanged when removing all covariates and when unconstraining the within-person effects over time.

Multi-group random-intercept cross-lagged panel model. To test whether the causal effects of descriptive and injunctive norms varied across regions of the United States with different mask wearing policies, we fitted a multi-group random-intercept cross-lagged panel model. The model was fitted separately to two groups: majority-Democrat states and majority-Republican states. Participants were linked to US states via self-reported zip codes. We operationalised state-level partisanship using the state-level results for the 2020 Presidential election. For ease of interpretation, we constrained the within-person autoregressive effects, cross-lagged effects, covariances, and variances to equality over time. This multi-group model fitted the data well according to one fit statistic (RMSEA = 0.049, 95% CI [0.046 0.051]) but not according to others (SRMR = 0.100; CFI = 0.856).

In majority-Republican states, the main results are unchanged from the full model fitted to the whole sample: perceived descriptive norms predicted future mask wearing (b = 0.14, 95% CI [0.05 0.24], p = .004) while perceived injunctive norms did not (b = 0.00, 95% CI [-0.08 0.09], p = .910). In majority-Democrat states, perceived descriptive norms have a slightly weaker effect on future mask wearing (b = 0.08, 95% CI [0.00 0.17], p = .0059) but the effect of perceived injunctive norms remains non-significant (b = -0.02, 95% CI [-0.11 0.06], p = .593). For full list of autoregressive and cross-lagged effects from the

multi-group model, see Supplementary Table S10.

Supplementary Figures

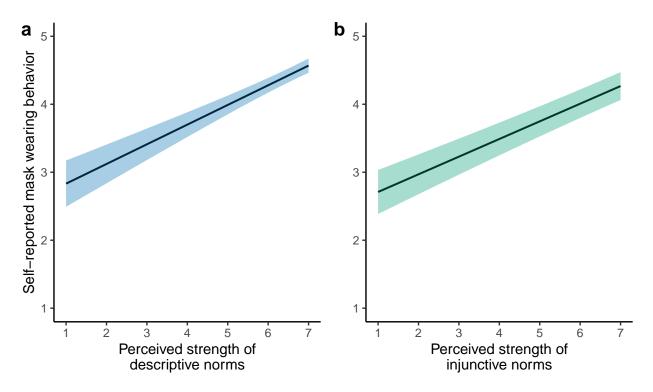


Figure S1. Predictions from multilevel models with self-reported mask wearing as the outcome variable and (a) perceived strength of descriptive norms and (b) perceived strength of injunctive norms as independent predictor variables. Models contain random intercepts for participants and time points. Lines are fixed effect regression lines from multilevel models, shaded areas are 95% confidence intervals.

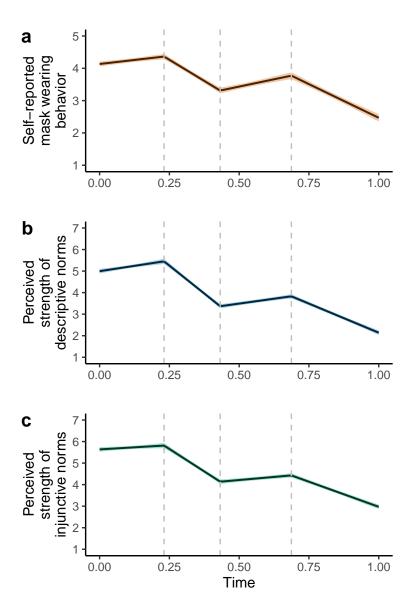


Figure S2. Predictions from multilevel models with change points in line with changes in CDC mask wearing recommendations. These models track temporal changes in (a) self-reported mask wearing, (b) perceived strength of descriptive norms, and (c) perceived strength of injunctive norms. Time is included as a continuous linear predictor, scaled between 0 and 1, with three forced change points (dashed lines). From the left, the first dashed line indicates when the CDC relaxed their mask wearing recommendations in March 2021, the second dashed line indicates when the CDC strengthened their mask wearing recommendations in July 2021, and the third dashed line indicates when the CDC updated their community levels and relaxed their mask wearing recommendations in March 2022. This results in the estimation of five fixed effect parameters: the initial intercept, the slope in the first window, the slope in the second window, the slope in the third window, and the slope is the fourth window. Bolded lines and shaded areas represent fixed effect regression lines from multilevel models and 95% confidence intervals, respectively.

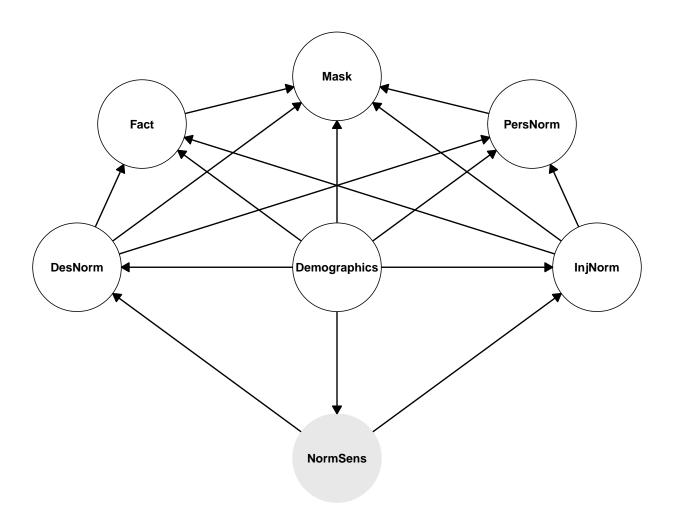


Figure S3. Directed acyclic graph reflecting causal assumptions. In this model, a general unobserved sensitivity to social norms (NormSens) causes perceptions of descriptive social norms (DesNorm) and perceptions of injunctive social norms (InjNorm), and perceptions of descriptive and injunctive norms directly cause mask wearing (Mask). Perceptions of descriptive and injunctive norms also indirectly cause mask wearing through non-social beliefs, specifically factual beliefs (Fact) and personal normative beliefs (PersNorm). Finally, demographic variables such as gender, age, ethnicity, socioeconomic status, and political orientation (summarised as Demographics) are exogenous variables that are common causes of all other variables. Using the backdoor criterion (Pearl, 1995), this causal model implies that it is necessary to control for perceptions of injunctive norms, factual beliefs, personal normative beliefs, and all demographics to estimate the direct causal effect of perceived descriptive norms, factual beliefs, personal normative beliefs, and all demographics to estimate the direct causal effect of perceived injunctive norms on mask wearing.

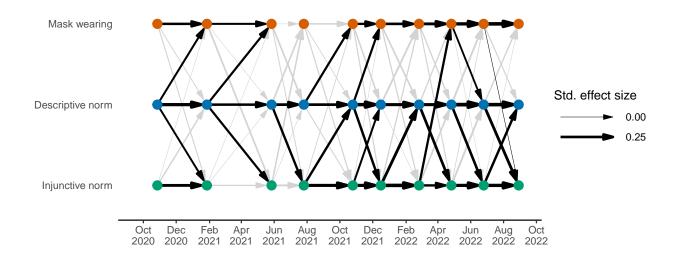


Figure S4. Path diagram of ten-wave time-varying random-intercept cross-lagged panel model (with factual beliefs and personal normative beliefs removed). Circles represent data collection time points. Arrows represent within-person autoregressive effects (on one horizontal level) and cross-lagged effects (across levels) for mask wearing and perceived descriptive and injunctive norms, partitioning out stable between-person individual differences and controlling for demographics and political orientation. Arrow thickness is scaled according to standardized effect size. Bolded arrows indicate significantly positive parameters, p < 0.05. Gray arrows indicate non-significant parameters.

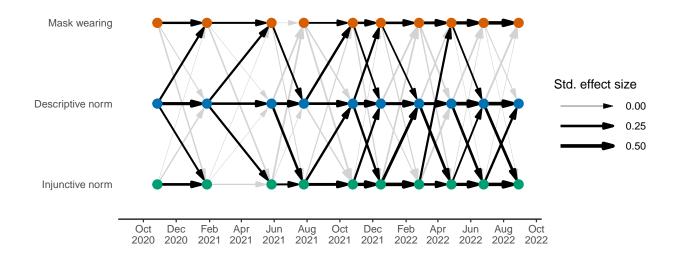


Figure S5. Path diagram of ten-wave time-varying random-intercept cross-lagged panel model (with factual beliefs, personal normative beliefs, and all exogenous covariates removed). Circles represent data collection time points. Arrows represent within-person autoregressive effects (on one horizontal level) and cross-lagged effects (across levels) for mask wearing and perceived descriptive and injunctive norms, partitioning out stable between-person individual differences. Arrow thickness is scaled according to standardized effect size. Bolded arrows indicate significantly positive parameters, p < 0.05. Gray arrows indicate non-significant parameters.

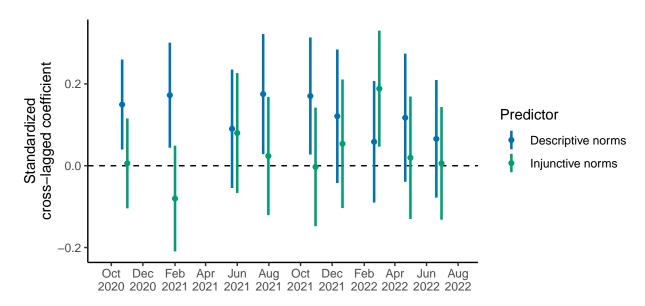


Figure S6. Standardized cross-lagged coefficients for descriptive norms and injunctive norms predicting future mask wearing in the ten-wave time-varying random-intercept cross-lagged panel model (with factual beliefs and personal normative beliefs removed). Points are standardized estimates, lines are 95% confidence intervals.

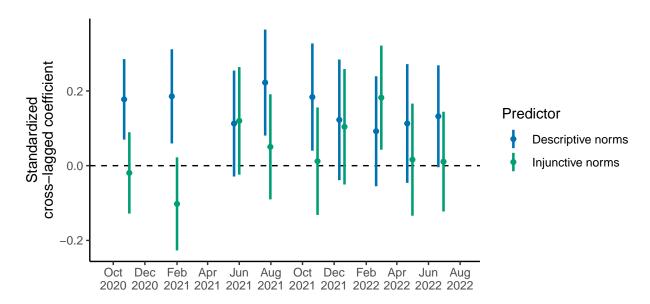


Figure S7. Standardized cross-lagged coefficients for descriptive norms and injunctive norms predicting future mask wearing in the ten-wave time-varying random-intercept cross-lagged panel model (with factual beliefs, personal normative beliefs, and all exogenous covariates removed). Points are standardized estimates, lines are 95% confidence intervals.

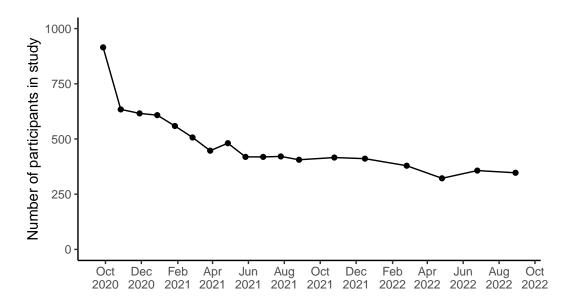


Figure S8. Attrition across the course of the study.

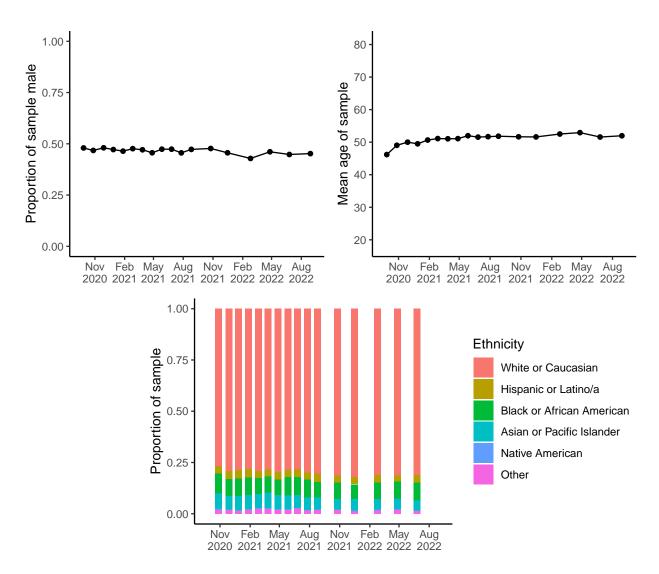


Figure S9. Demographics of the sample across the course of the study.

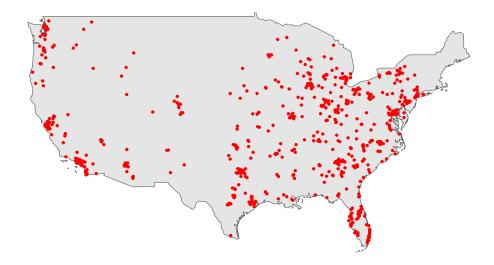


Figure S10. Map of the United States with participant zip code locations.

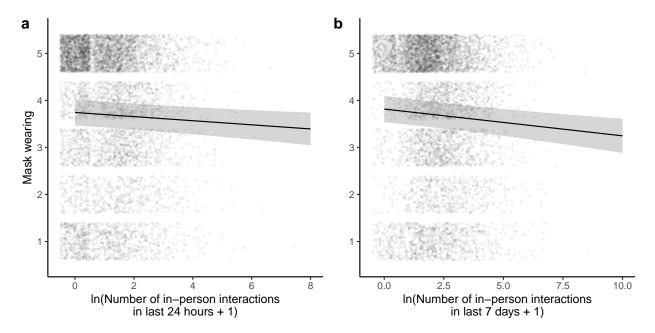


Figure S11. The relationship between self-reported mask wearing and the logged number of inperson interactions in the last 24 hours (a) and in the last 7 days (b). Lines and shaded areas are predictions and 95% confidence intervals from multilevel models with random intercepts for timepoint and participant. The first multilevel model revealed a negative relationship between mask wearing and the log number of in-person interactions in the last 24 hours (b = -0.04, SE = 0.02, p = .007). The second multilevel model revealed a negative relationship between mask wearing and the log number of in-person interactions in the last 7 days (b = -0.06, SE = 0.02, p < .001).

Supplementary Tables

Table S1
Unstandardized fixed effect parameters from
multilevel models: perceptions of social norm
strength predicting self-reported mask wearing.
Standard errors are included in brackets.

	Model 1	Model 2
Intercept	2.54	2.45
	(0.20)	(0.18)
Descriptive norms	0.29	
	(0.03)	
Injunctive norms		0.26
		(0.02)
N	4785	4798
N (id)	783	783
N (time)	11	11
AIC	15309.62	15411.28
BIC	15367.88	15469.57
R2 (fixed)	0.10	0.08
R2 (total)	0.47	0.47

 $\label{thm:condition} \begin{tabular}{ll} Table S2\\ Unstandardized fixed effect parameters from multilevel models: trends over time with change points at CDC events. \end{tabular}$

	Mask wearing	Descriptive norms	Injunctive norms		
Intercept	4.13, 95% CI [4.05 4.21]	5.00, 95% CI [4.90 5.10]	5.64, 95% CI [5.53 5.74]		
Slope1	$0.99,95\%$ CI [$0.56\ 1.42$]	1.98, 95% CI [1.24 2.72]	0.78, 95% CI [0.03 1.52]		
Slope2	-5.23, 95% CI [-5.73 -4.71]	-10.38, 95% CI [-11.07 -9.67]	-8.36, 95% CI [-9.05 -7.64]		
Slope3	1.80,95% CI [$1.332.33$]	1.82, 95% CI [1.35 2.25]	1.15, 95% CI [0.68 1.59]		
Slope4	-4.16, 95% CI [-4.65 -3.68]	-5.40, 95% CI [-5.77 -4.99]	-4.66, 95% CI [-5.03 -4.25]		
N	8505	4851	4861		
R2 (fixed)	0.11	0.4	0.34		
R2 (total)	0.38	0.68	0.67		

Table S3
Unstandardized autoregressive and cross-lagged parameters from time-invariant random-intercept cross-lagged panel model (with factual beliefs and personal normative beliefs removed). Arrows indicate the direction of prediction.

Parameter	Estimate	SE	2.5%	97.5%	р
Mask wearing \rightarrow Mask wearing	0.23	0.02	0.18	0.28	0.00
Mask wearing \rightarrow Injunctive norms	0.02	0.02	-0.02	0.05	0.27
Mask wearing \rightarrow Descriptive norms	0.04	0.02	0.01	0.08	0.02
Injunctive norms \rightarrow Mask wearing	0.02	0.03	-0.04	0.08	0.48
Injunctive norms \rightarrow Injunctive norms	0.26	0.03	0.21	0.31	0.00
Injunctive norms \rightarrow Descriptive norms	0.12	0.02	0.07	0.17	0.00
Descriptive norms \rightarrow Mask wearing	0.15	0.03	0.09	0.21	0.00
Descriptive norms \rightarrow Injunctive norms	0.17	0.02	0.12	0.21	0.00
Descriptive norms \rightarrow Descriptive norms	0.32	0.03	0.27	0.38	0.00

Table S4
Unstandardized autoregressive and cross-lagged parameters from time-invariant random-intercept cross-lagged panel model (with factual beliefs, personal normative beliefs, and all exogenous covariates removed). Arrows indicate the direction of prediction.

Parameter	Estimate	SE	2.5%	97.5%	р
Mask wearing \rightarrow Mask wearing	0.25	0.02	0.20	0.30	0.00
Mask wearing \rightarrow Injunctive norms	0.03	0.02	0.00	0.07	0.06
Mask wearing \rightarrow Descriptive norms	0.07	0.02	0.03	0.10	0.00
Injunctive norms \rightarrow Mask wearing	0.03	0.03	-0.03	0.09	0.32
Injunctive norms \rightarrow Injunctive norms	0.28	0.03	0.23	0.33	0.00
Injunctive norms \rightarrow Descriptive norms	0.14	0.02	0.09	0.18	0.00
Descriptive norms \rightarrow Mask wearing	0.18	0.03	0.12	0.24	0.00
Descriptive norms \rightarrow Injunctive norms	0.19	0.02	0.14	0.24	0.00
Descriptive norms \rightarrow Descriptive norms	0.34	0.03	0.29	0.40	0.00

Table S5 Unstandardized autoregressive and cross-lagged parameters from time-varying random-intercept cross-lagged panel model (full model). Variable name suffixes indicate time points. Arrows indicate the direction of prediction.

Parameter	Estimate	SE	2.5%	97.5%	p
$MaskWearing_02 \rightarrow MaskWearing_05$	0.24	0.06	0.12	0.36	0.00
MaskWearing_02 \rightarrow InjunctiveNorms_05	0.04	0.05	-0.05	0.14	0.39
MaskWearing_02 \rightarrow DescriptiveNorms_05	0.02	0.05	-0.08	0.12	0.64
MaskWearing_02 \rightarrow Factual Beliefs_05	0.00	0.05	-0.10	0.09	0.97
MaskWearing_02 \rightarrow PersonalBeliefs_05	-0.01	0.04	-0.10	0.07	0.74
MaskWearing_05 \rightarrow MaskWearing_09	0.18	0.06	0.06	0.31	0.00
MaskWearing_05 \rightarrow Injunctive Norms_09	0.14	0.06	0.03	0.26	0.01
MaskWearing_05 \rightarrow DescriptiveNorms_09	0.01	0.06	-0.12	0.13	0.92
MaskWearing_05 \rightarrow Factual Beliefs_09	0.15	0.07	0.01	0.29	0.03
MaskWearing_05 \rightarrow Personal Beliefs_09	0.06	0.07	-0.07	0.19	0.35
MaskWearing_09 \rightarrow MaskWearing_11	-0.04	0.08	-0.19	0.12	0.62
MaskWearing_09 \rightarrow Injunctive Norms_11	0.04	0.06	-0.08	0.16	0.51
MaskWearing_09 \rightarrow DescriptiveNorms_11	0.10	0.06	-0.02	0.21	0.09
MaskWearing_09 \rightarrow Factual Beliefs_11	0.22	0.08	0.07	0.37	0.00
MaskWearing_09 \rightarrow Personal Beliefs_11	0.15	0.06	0.02	0.27	0.02
MaskWearing_11 \rightarrow MaskWearing_13	0.05	0.06	-0.06	0.17	0.36
MaskWearing_11 \rightarrow Injunctive Norms_13	0.04	0.05	-0.06	0.14	0.47
MaskWearing_11 \rightarrow DescriptiveNorms_13	0.05	0.06	-0.06	0.16	0.38
MaskWearing_11 \rightarrow Factual Beliefs_13	0.03	0.06	-0.08	0.15	0.55
MaskWearing_11 \rightarrow Personal Beliefs_13	0.03	0.05	-0.08	0.14	0.58
MaskWearing_13 \rightarrow MaskWearing_14	0.19	0.06	0.06	0.31	0.00
MaskWearing_13 \rightarrow Injunctive Norms_14	0.08	0.05	-0.03	0.18	0.14
MaskWearing_13 \rightarrow DescriptiveNorms_14	0.09	0.05	-0.01	0.20	0.08
MaskWearing_13 \rightarrow Factual Beliefs_14	0.09	0.06	-0.02	0.21	0.12
MaskWearing_13 \rightarrow Personal Beliefs_14	0.01	0.05	-0.09	0.11	0.82
MaskWearing_14 \rightarrow MaskWearing_15	0.22	0.06	0.10	0.35	0.00
MaskWearing_14 \rightarrow Injunctive Norms_15	0.06	0.06	-0.05	0.17	0.31
MaskWearing_14 \rightarrow DescriptiveNorms_15	0.07	0.05	-0.03	0.17	0.18

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	p
$MaskWearing_14 \rightarrow FactualBeliefs_15$	0.05	0.06	-0.07	0.18	0.42
MaskWearing_14 \rightarrow PersonalBeliefs_15	-0.07	0.06	-0.20	0.05	0.27
MaskWearing_15 \rightarrow MaskWearing_16	0.29	0.08	0.14	0.44	0.00
MaskWearing_15 \rightarrow Injunctive Norms_16	0.00	0.06	-0.12	0.13	0.94
MaskWearing_15 \rightarrow Descriptive Norms_16	-0.01	0.06	-0.12	0.10	0.91
MaskWearing_15 \rightarrow Factual Beliefs_16	0.09	0.08	-0.06	0.25	0.24
MaskWearing_15 \rightarrow PersonalBeliefs_16	0.08	0.07	-0.06	0.22	0.24
MaskWearing_16 \rightarrow MaskWearing_17	0.37	0.07	0.23	0.51	0.00
MaskWearing_16 \rightarrow InjunctiveNorms_17	0.01	0.05	-0.08	0.10	0.83
MaskWearing_16 \rightarrow DescriptiveNorms_17	0.10	0.04	0.01	0.18	0.02
MaskWearing_16 \rightarrow FactualBeliefs_17	0.27	0.08	0.12	0.42	0.00
MaskWearing_16 \rightarrow PersonalBeliefs_17	0.15	0.07	0.01	0.28	0.03
$MaskWearing_17 \rightarrow MaskWearing_18$	0.38	0.06	0.26	0.50	0.00
MaskWearing_17 \rightarrow Injunctive Norms_18	-0.04	0.04	-0.11	0.04	0.32
MaskWearing_17 \rightarrow DescriptiveNorms_18	0.02	0.03	-0.04	0.09	0.49
MaskWearing_17 \rightarrow FactualBeliefs_18	0.13	0.07	0.00	0.26	0.05
MaskWearing_17 \rightarrow Personal Beliefs_18	0.06	0.06	-0.06	0.18	0.34
Injunctive Norms_02 \rightarrow MaskWearing_05	0.03	0.07	-0.11	0.17	0.71
Injunctive Norms_02 \rightarrow Injunctive Norms_05	0.30	0.06	0.19	0.42	0.00
Injunctive Norms_02 \rightarrow Descriptive Norms_05	0.07	0.06	-0.04	0.19	0.23
Injunctive Norms_02 \rightarrow FactualBeliefs_05	0.05	0.05	-0.06	0.16	0.37
Injunctive Norms_02 \rightarrow PersonalBeliefs_05	0.00	0.05	-0.10	0.10	0.97
Injunctive Norms_05 \rightarrow MaskWearing_09	-0.10	0.08	-0.26	0.06	0.23
Injunctive Norms_05 \rightarrow Injunctive Norms_09	0.09	0.08	-0.07	0.24	0.26
Injunctive Norms_05 \rightarrow Descriptive Norms_09	0.03	0.08	-0.12	0.19	0.68
Injunctive Norms_05 \rightarrow FactualBeliefs_09	0.03	0.09	-0.16	0.21	0.78
Injunctive Norms_05 \rightarrow PersonalBeliefs_09	-0.06	0.09	-0.23	0.11	0.51
Injunctive Norms_09 \rightarrow MaskWearing_11	0.07	0.10	-0.13	0.27	0.51
Injunctive Norms_09 \rightarrow Injunctive Norms_11	0.13	0.08	-0.03	0.28	0.12
$InjunctiveNorms_09 \rightarrow DescriptiveNorms_11$	-0.02	0.07	-0.17	0.12	0.77

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	p
InjunctiveNorms_09 \rightarrow FactualBeliefs_11	0.00	0.10	-0.20	0.19	0.98
Injunctive Norms_09 \rightarrow PersonalBeliefs_11	0.02	0.08	-0.14	0.19	0.76
Injunctive Norms_11 \rightarrow MaskWearing_13	-0.01	0.08	-0.16	0.14	0.91
Injunctive Norms_11 \rightarrow Injunctive Norms_13	0.31	0.07	0.18	0.45	0.00
Injunctive Norms_11 \rightarrow Descriptive Norms_13	0.24	0.07	0.10	0.38	0.00
Injunctive Norms_11 \rightarrow FactualBeliefs_13	0.18	0.08	0.03	0.33	0.02
Injunctive Norms_11 \rightarrow PersonalBeliefs_13	0.10	0.07	-0.04	0.23	0.18
Injunctive Norms_13 \rightarrow MaskWearing_14	-0.05	0.08	-0.21	0.11	0.51
Injunctive Norms_13 \rightarrow Injunctive Norms_14	0.42	0.07	0.28	0.55	0.00
Injunctive Norms_13 \rightarrow Descriptive Norms_14	0.16	0.07	0.02	0.30	0.02
Injunctive Norms_13 \rightarrow FactualBeliefs_14	0.03	0.08	-0.12	0.18	0.68
Injunctive Norms_13 \rightarrow PersonalBeliefs_14	0.10	0.07	-0.03	0.22	0.15
Injunctive Norms_14 \rightarrow MaskWearing_15	0.07	0.08	-0.09	0.23	0.40
Injunctive Norms_14 \rightarrow Injunctive Norms_15	0.45	0.07	0.31	0.59	0.00
Injunctive Norms_14 \rightarrow Descriptive Norms_15	0.28	0.07	0.16	0.41	0.00
Injunctive Norms_14 \rightarrow FactualBeliefs_15	0.11	0.08	-0.05	0.27	0.16
Injunctive Norms_14 \rightarrow PersonalBeliefs_15	0.07	0.08	-0.09	0.23	0.38
Injunctive Norms_15 \rightarrow MaskWearing_16	0.20	0.09	0.03	0.37	0.02
Injunctive Norms_15 \rightarrow Injunctive Norms_16	0.19	0.07	0.05	0.33	0.01
Injunctive Norms_15 \rightarrow Descriptive Norms_16	0.04	0.06	-0.09	0.16	0.56
Injunctive Norms_15 \rightarrow FactualBeliefs_16	0.04	0.09	-0.14	0.22	0.67
Injunctive Norms_15 \rightarrow PersonalBeliefs_16	0.12	0.08	-0.03	0.28	0.12
Injunctive Norms_16 \rightarrow MaskWearing_17	0.00	0.10	-0.19	0.20	0.97
Injunctive Norms_16 \rightarrow Injunctive Norms_17	0.32	0.07	0.19	0.44	0.00
Injunctive Norms_16 \rightarrow Descriptive Norms_17	0.10	0.06	-0.01	0.21	0.08
Injunctive Norms_16 \rightarrow FactualBeliefs_17	0.00	0.11	-0.21	0.21	0.97
Injunctive Norms_16 \rightarrow PersonalBeliefs_17	-0.04	0.09	-0.22	0.14	0.68
Injunctive Norms_17 \rightarrow MaskWearing_18	0.00	0.10	-0.21	0.20	0.98
Injunctive Norms_17 \rightarrow Injunctive Norms_18	0.37	0.06	0.25	0.50	0.00
Injunctive Norms_17 \rightarrow Descriptive Norms_18	0.18	0.06	0.07	0.29	0.00

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	p
InjunctiveNorms_17 \rightarrow FactualBeliefs_18	0.07	0.11	-0.15	0.30	0.53
Injunctive Norms_17 \rightarrow PersonalBeliefs_18	-0.02	0.10	-0.22	0.18	0.84
Descriptive Norms_02 \rightarrow MaskWearing_05	0.20	0.07	0.06	0.34	0.01
Descriptive Norms_02 \rightarrow Injunctive Norms_05	0.18	0.06	0.07	0.30	0.00
Descriptive Norms_02 \rightarrow Descriptive Norms_05	0.40	0.06	0.29	0.52	0.00
Descriptive Norms_02 \rightarrow FactualBeliefs_05	0.05	0.06	-0.06	0.16	0.39
Descriptive Norms_02 \rightarrow PersonalBeliefs_05	0.02	0.05	-0.08	0.12	0.71
Descriptive Norms_05 \rightarrow MaskWearing_09	0.26	0.08	0.10	0.42	0.00
Descriptive Norms_05 \rightarrow Injunctive Norms_09	0.26	0.08	0.11	0.41	0.00
Descriptive Norms_05 \rightarrow Descriptive Norms_09	0.29	0.08	0.13	0.45	0.00
Descriptive Norms_05 \rightarrow FactualBeliefs_09	0.19	0.09	0.01	0.37	0.04
Descriptive Norms_05 \rightarrow PersonalBeliefs_09	0.29	0.09	0.12	0.46	0.00
Descriptive Norms_09 \rightarrow MaskWearing_11	0.08	0.09	-0.09	0.25	0.36
Descriptive Norms_09 \rightarrow Injunctive Norms_11	0.19	0.07	0.06	0.33	0.01
Descriptive Norms_09 \rightarrow Descriptive Norms_11	0.24	0.07	0.11	0.37	0.00
Descriptive Norms_09 \rightarrow Factual Beliefs_11	0.05	0.09	-0.12	0.22	0.59
Descriptive Norms_09 \rightarrow PersonalBeliefs_11	0.07	0.07	-0.07	0.22	0.31
Descriptive Norms_11 \rightarrow MaskWearing_13	0.14	0.08	-0.02	0.30	0.09
Descriptive Norms_11 \rightarrow Injunctive Norms_13	0.01	0.07	-0.13	0.16	0.86
Descriptive Norms_11 \rightarrow Descriptive Norms_13	0.31	0.08	0.15	0.46	0.00
Descriptive Norms_11 \rightarrow FactualBeliefs_13	0.11	0.08	-0.05	0.28	0.17
Descriptive Norms_11 \rightarrow PersonalBeliefs_13	0.07	0.08	-0.08	0.23	0.34
Descriptive Norms_13 \rightarrow MaskWearing_14	0.15	0.07	0.01	0.29	0.03
Descriptive Norms_13 \rightarrow Injunctive Norms_14	0.21	0.06	0.09	0.33	0.00
Descriptive Norms_13 \rightarrow Descriptive Norms_14	0.41	0.06	0.29	0.53	0.00
Descriptive Norms_13 \rightarrow FactualBeliefs_14	0.04	0.07	-0.09	0.17	0.54
Descriptive Norms_13 \rightarrow PersonalBeliefs_14	0.01	0.06	-0.10	0.12	0.85
Descriptive Norms_14 \rightarrow MaskWearing_15	0.09	0.09	-0.08	0.26	0.31
Descriptive Norms_14 \rightarrow Injunctive Norms_15	-0.03	0.08	-0.18	0.11	0.65
DescriptiveNorms_14 \rightarrow DescriptiveNorms_15	0.34	0.07	0.20	0.47	0.00

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	р
DescriptiveNorms_14 \rightarrow FactualBeliefs_15	0.13	0.09	-0.04	0.30	0.13
Descriptive Norms_14 \rightarrow PersonalBeliefs_15	0.07	0.08	-0.09	0.24	0.38
Descriptive Norms_15 \rightarrow MaskWearing_16	0.03	0.09	-0.14	0.20	0.69
Descriptive Norms_15 \rightarrow Injunctive Norms_16	0.21	0.07	0.06	0.35	0.00
Descriptive Norms_15 \rightarrow Descriptive Norms_16	0.25	0.06	0.13	0.37	0.00
Descriptive Norms_15 \rightarrow FactualBeliefs_16	0.20	0.09	0.02	0.38	0.03
Descriptive Norms_15 \rightarrow PersonalBeliefs_16	0.03	0.08	-0.13	0.18	0.72
Descriptive Norms_16 \rightarrow MaskWearing_17	0.12	0.12	-0.12	0.36	0.33
Descriptive Norms_16 \rightarrow Injunctive Norms_17	0.22	0.08	0.07	0.37	0.01
Descriptive Norms_16 \rightarrow Descriptive Norms_17	0.47	0.07	0.34	0.60	0.00
Descriptive Norms_16 \rightarrow FactualBeliefs_17	0.14	0.13	-0.10	0.39	0.26
Descriptive Norms_16 \rightarrow PersonalBeliefs_17	0.08	0.11	-0.13	0.30	0.45
Descriptive Norms_17 \rightarrow MaskWearing_18	0.03	0.12	-0.20	0.26	0.81
Descriptive Norms_17 \rightarrow Injunctive Norms_18	0.28	0.07	0.14	0.42	0.00
Descriptive Norms_17 \rightarrow Descriptive Norms_18	0.41	0.07	0.29	0.54	0.00
Descriptive Norms_17 \rightarrow FactualBeliefs_18	0.16	0.13	-0.09	0.41	0.22
Descriptive Norms_17 \rightarrow PersonalBeliefs_18	0.13	0.11	-0.09	0.36	0.24
FactualBeliefs_02 \rightarrow MaskWearing_05	0.07	0.10	-0.13	0.26	0.50
FactualBeliefs_02 \rightarrow Injunctive Norms_05	-0.15	0.08	-0.30	0.01	0.06
FactualBeliefs_02 \rightarrow Descriptive Norms_05	-0.04	0.08	-0.20	0.12	0.62
FactualBeliefs_02 \rightarrow FactualBeliefs_05	0.20	0.07	0.05	0.34	0.01
Factual Beliefs_02 \rightarrow Personal Beliefs_05	-0.09	0.07	-0.22	0.05	0.20
FactualBeliefs_05 \rightarrow MaskWearing_09	0.29	0.12	0.05	0.53	0.02
Factual Beliefs_05 \rightarrow Injunctive Norms_09	-0.06	0.11	-0.27	0.16	0.60
Factual Beliefs_05 \rightarrow Descriptive Norms_09	-0.06	0.12	-0.29	0.17	0.60
FactualBeliefs_05 \rightarrow FactualBeliefs_09	0.21	0.14	-0.05	0.48	0.12
Factual Beliefs_05 \rightarrow Personal Beliefs_09	0.03	0.13	-0.21	0.28	0.80
FactualBeliefs_09 \rightarrow MaskWearing_11	0.16	0.09	-0.02	0.35	0.08
Factual Beliefs_09 \rightarrow Injunctive Norms_11	0.03	0.07	-0.11	0.18	0.63
FactualBeliefs_09 \rightarrow DescriptiveNorms_11	0.08	0.07	-0.06	0.21	0.25

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	p
FactualBeliefs_09 \rightarrow FactualBeliefs_11	0.35	0.09	0.17	0.53	0.00
Factual Beliefs_09 \rightarrow Personal Beliefs_11	0.15	0.08	0.01	0.30	0.04
FactualBeliefs_11 \rightarrow MaskWearing_13	0.12	0.07	-0.01	0.26	0.07
FactualBeliefs_11 \rightarrow Injunctive Norms_13	0.03	0.06	-0.09	0.15	0.59
FactualBeliefs_11 \rightarrow DescriptiveNorms_13	-0.09	0.06	-0.22	0.03	0.14
FactualBeliefs_11 \rightarrow FactualBeliefs_13	0.13	0.07	-0.01	0.26	0.06
FactualBeliefs_11 \rightarrow PersonalBeliefs_13	0.10	0.06	-0.03	0.22	0.12
FactualBeliefs_13 \rightarrow MaskWearing_14	0.03	0.08	-0.13	0.19	0.71
FactualBeliefs_13 \rightarrow InjunctiveNorms_14	0.05	0.07	-0.09	0.18	0.49
FactualBeliefs_13 \rightarrow DescriptiveNorms_14	0.00	0.07	-0.14	0.13	0.96
FactualBeliefs_13 \rightarrow FactualBeliefs_14	0.27	0.08	0.12	0.42	0.00
Factual Beliefs_13 \rightarrow Personal Beliefs_14	0.16	0.07	0.03	0.29	0.02
FactualBeliefs_14 \rightarrow MaskWearing_15	0.30	0.08	0.14	0.45	0.00
FactualBeliefs_14 \rightarrow Injunctive Norms_15	-0.03	0.07	-0.17	0.11	0.67
Factual Beliefs_14 \rightarrow Descriptive Norms_15	0.17	0.07	0.04	0.30	0.01
FactualBeliefs_14 \rightarrow FactualBeliefs_15	0.53	0.08	0.37	0.68	0.00
Factual Beliefs_14 \rightarrow Personal Beliefs_15	0.34	0.08	0.18	0.49	0.00
FactualBeliefs_15 \rightarrow MaskWearing_16	0.08	0.09	-0.09	0.26	0.36
Factual Beliefs_15 \rightarrow Injunctive Norms_16	0.08	0.08	-0.06	0.23	0.27
Factual Beliefs_15 \rightarrow Descriptive Norms_16	0.09	0.07	-0.04	0.22	0.19
FactualBeliefs_15 \rightarrow FactualBeliefs_16	0.42	0.09	0.23	0.61	0.00
Factual Beliefs_15 \rightarrow Personal Beliefs_16	0.12	0.08	-0.04	0.29	0.13
FactualBeliefs_16 \rightarrow MaskWearing_17	0.18	0.09	0.01	0.35	0.04
FactualBeliefs_16 \rightarrow Injunctive Norms_17	0.02	0.06	-0.09	0.13	0.78
Factual Beliefs_16 \rightarrow Descriptive Norms_17	-0.01	0.05	-0.11	0.09	0.82
FactualBeliefs_16 \rightarrow FactualBeliefs_17	0.24	0.09	0.06	0.42	0.01
Factual Beliefs_16 \rightarrow Personal Beliefs_17	0.08	0.08	-0.08	0.24	0.33
FactualBeliefs_17 \rightarrow MaskWearing_18	0.08	0.08	-0.08	0.23	0.34
FactualBeliefs_17 \rightarrow Injunctive Norms_18	-0.05	0.05	-0.15	0.04	0.26
FactualBeliefs_17 \rightarrow DescriptiveNorms_18	0.04	0.04	-0.05	0.13	0.38

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	p
FactualBeliefs_17 \rightarrow FactualBeliefs_18	0.36	0.09	0.19	0.53	0.00
FactualBeliefs_17 \rightarrow PersonalBeliefs_18	0.40	0.08	0.25	0.55	0.00
Personal Beliefs_02 \rightarrow MaskWearing_05	0.06	0.11	-0.16	0.28	0.58
Personal Beliefs_02 \rightarrow Injunctive Norms_05	0.09	0.09	-0.09	0.26	0.33
Personal Beliefs_02 \rightarrow Descriptive Norms_05	0.07	0.09	-0.11	0.24	0.45
Personal Beliefs_02 \rightarrow Factual Beliefs_05	0.16	0.08	-0.01	0.32	0.06
Personal Beliefs_02 \rightarrow Personal Beliefs_05	0.41	0.08	0.25	0.57	0.00
Personal Beliefs_05 \rightarrow MaskWearing_09	-0.45	0.13	-0.70	-0.19	0.00
Personal Beliefs_05 \rightarrow Injunctive Norms_09	-0.26	0.12	-0.49	-0.03	0.03
Personal Beliefs_05 \rightarrow Descriptive Norms_09	-0.09	0.13	-0.33	0.16	0.50
Personal Beliefs_05 \rightarrow Factual Beliefs_09	-0.40	0.14	-0.68	-0.12	0.00
Personal Beliefs_05 \rightarrow Personal Beliefs_09	-0.34	0.13	-0.60	-0.07	0.01
Personal Beliefs_09 \rightarrow MaskWearing_11	0.08	0.10	-0.12	0.27	0.45
Personal Beliefs_09 \rightarrow Injunctive Norms_11	0.06	0.08	-0.09	0.22	0.44
Personal Beliefs_09 \rightarrow Descriptive Norms_11	0.04	0.07	-0.11	0.18	0.60
Personal Beliefs_09 \rightarrow Factual Beliefs_11	0.10	0.10	-0.10	0.29	0.32
Personal Beliefs_09 \rightarrow Personal Beliefs_11	0.19	0.08	0.02	0.35	0.02
Personal Beliefs_11 \rightarrow MaskWearing_13	0.06	0.08	-0.09	0.21	0.41
Personal Beliefs_11 \rightarrow Injunctive Norms_13	0.07	0.07	-0.06	0.19	0.33
Personal Beliefs_11 \rightarrow Descriptive Norms_13	0.11	0.07	-0.03	0.25	0.13
Personal Beliefs_11 \rightarrow Factual Beliefs_13	0.18	0.07	0.03	0.33	0.02
Personal Beliefs_11 \rightarrow Personal Beliefs_13	0.17	0.07	0.04	0.31	0.01
Personal Beliefs_13 \rightarrow MaskWearing_14	0.27	0.09	0.09	0.44	0.00
Personal Beliefs_13 \rightarrow Injunctive Norms_14	-0.10	0.08	-0.24	0.05	0.20
Personal Beliefs_13 \rightarrow Descriptive Norms_14	-0.02	0.08	-0.17	0.13	0.80
Personal Beliefs_13 \rightarrow Factual Beliefs_14	0.36	0.08	0.20	0.53	0.00
Personal Beliefs_13 \rightarrow Personal Beliefs_14	0.44	0.07	0.29	0.58	0.00
Personal Beliefs_14 \rightarrow MaskWearing_15	-0.06	0.09	-0.24	0.12	0.53
Personal Beliefs_14 \rightarrow Injunctive Norms_15	0.12	0.08	-0.05	0.28	0.17
Personal Beliefs_14 \rightarrow Descriptive Norms_15	-0.12	0.07	-0.26	0.03	0.12

Table S5 continued

Parameter	Estimate	SE	2.5%	97.5%	р
$Personal Beliefs_14 \rightarrow Factual Beliefs_15$	0.01	0.09	-0.17	0.19	0.89
Personal Beliefs_14 \rightarrow Personal Beliefs_15	0.14	0.09	-0.04	0.32	0.14
Personal Beliefs_15 \rightarrow MaskWearing_16	0.09	0.09	-0.08	0.27	0.31
Personal Beliefs_15 \rightarrow Injunctive Norms_16	0.05	0.08	-0.10	0.20	0.52
Personal Beliefs_15 \rightarrow Descriptive Norms_16	0.10	0.07	-0.03	0.23	0.11
Personal Beliefs_15 \rightarrow Factual Beliefs_16	0.13	0.10	-0.06	0.32	0.17
Personal Beliefs_15 \rightarrow Personal Beliefs_16	0.41	0.08	0.24	0.57	0.00
Personal Beliefs_16 \rightarrow MaskWearing_17	-0.02	0.09	-0.20	0.16	0.83
Personal Beliefs_16 \rightarrow Injunctive Norms_17	0.00	0.06	-0.12	0.12	0.98
Personal Beliefs_16 \rightarrow Descriptive Norms_17	-0.02	0.05	-0.12	0.08	0.73
Personal Beliefs_16 \rightarrow Factual Beliefs_17	0.28	0.10	0.08	0.47	0.00
Personal Beliefs_16 \rightarrow Personal Beliefs_17	0.58	0.08	0.42	0.75	0.00
Personal Beliefs_17 \rightarrow MaskWearing_18	0.09	0.08	-0.07	0.24	0.26
Personal Beliefs_17 \rightarrow Injunctive Norms_18	0.00	0.05	-0.10	0.09	0.96
Personal Beliefs_17 \rightarrow Descriptive Norms_18	-0.04	0.04	-0.12	0.05	0.41
Personal Beliefs_17 \rightarrow Factual Beliefs_18	0.16	0.09	-0.01	0.33	0.07
$\underline{\text{PersonalBeliefs}_17 \rightarrow \text{PersonalBeliefs}_18}$	0.10	0.08	-0.05	0.25	0.21

Table S6
Unstandardized autoregressive and cross-lagged parameters from time-varying random-intercept cross-lagged panel model (with factual beliefs and personal normative beliefs removed). Variable name suffixes indicate time points. Arrows indicate the direction of prediction.

Parameter	Estimate	SE	2.5%	97.5%	p
$MaskWearing_02 \rightarrow MaskWearing_05$	0.25	0.06	0.13	0.37	0.00
MaskWearing_02 \rightarrow Injunctive Norms_05	0.04	0.05	-0.06	0.13	0.46
MaskWearing_02 \rightarrow Descriptive Norms_05	0.03	0.05	-0.07	0.12	0.60
$MaskWearing_05 \rightarrow MaskWearing_09$	0.15	0.07	0.03	0.28	0.02
MaskWearing_05 \rightarrow Injunctive Norms_09	0.09	0.06	-0.02	0.21	0.11
MaskWearing_05 \rightarrow Descriptive Norms_09	-0.03	0.06	-0.15	0.09	0.61
$MaskWearing_09 \rightarrow MaskWearing_11$	-0.08	0.08	-0.24	0.08	0.31
MaskWearing_09 \rightarrow Injunctive Norms_11	0.03	0.06	-0.09	0.15	0.61
MaskWearing_09 \rightarrow Descriptive Norms_11	0.09	0.06	-0.02	0.21	0.11
MaskWearing_11 \rightarrow MaskWearing_13	0.07	0.06	-0.04	0.18	0.22
MaskWearing_11 \rightarrow Injunctive Norms_13	0.04	0.05	-0.06	0.13	0.44
MaskWearing_11 \rightarrow Descriptive Norms_13	0.02	0.05	-0.08	0.12	0.71
MaskWearing_13 \rightarrow MaskWearing_14	0.20	0.07	0.08	0.33	0.00
MaskWearing_13 \rightarrow Injunctive Norms_14	0.05	0.05	-0.06	0.16	0.36
MaskWearing_13 \rightarrow Descriptive Norms_14	0.08	0.06	-0.03	0.19	0.13
MaskWearing_14 \rightarrow MaskWearing_15	0.25	0.07	0.12	0.38	0.00
MaskWearing_14 \rightarrow Injunctive Norms_15	0.05	0.06	-0.06	0.16	0.38
MaskWearing_14 \rightarrow Descriptive Norms_15	0.09	0.05	-0.01	0.19	0.07
MaskWearing_15 \rightarrow MaskWearing_16	0.32	0.07	0.18	0.46	0.00
MaskWearing_15 \rightarrow Injunctive Norms_16	0.04	0.06	-0.08	0.16	0.52
MaskWearing_15 \rightarrow Descriptive Norms_16	0.05	0.05	-0.06	0.15	0.36
MaskWearing_16 \rightarrow MaskWearing_17	0.42	0.07	0.29	0.56	0.00
MaskWearing_16 \rightarrow InjunctiveNorms_17	0.00	0.04	-0.08	0.09	0.98
MaskWearing_16 \rightarrow DescriptiveNorms_17	0.08	0.04	0.01	0.15	0.03
MaskWearing_17 \rightarrow MaskWearing_18	0.43	0.05	0.33	0.54	0.00
MaskWearing_17 \rightarrow Injunctive Norms_18	-0.08	0.03	-0.15	-0.01	0.02
$MaskWearing_17 \rightarrow DescriptiveNorms_18$	0.03	0.03	-0.03	0.09	0.37

Table S6 continued

Parameter	Estimate	SE	2.5%	97.5%	p
$InjunctiveNorms_02 \rightarrow MaskWearing_05$	0.01	0.07	-0.13	0.15	0.92
Injunctive Norms_02 \rightarrow Injunctive Norms_05	0.31	0.06	0.20	0.43	0.00
Injunctive Norms_02 \rightarrow Descriptive Norms_05	0.07	0.06	-0.04	0.19	0.22
Injunctive Norms_05 \rightarrow MaskWearing_09	-0.10	0.08	-0.26	0.06	0.23
Injunctive Norms_05 \rightarrow Injunctive Norms_09	0.07	0.08	-0.08	0.22	0.38
Injunctive Norms_05 \rightarrow Descriptive Norms_09	0.00	0.08	-0.15	0.16	0.96
Injunctive Norms_09 \rightarrow MaskWearing_11	0.10	0.10	-0.09	0.29	0.29
Injunctive Norms_09 \rightarrow Injunctive Norms_11	0.14	0.08	-0.01	0.29	0.07
Injunctive Norms_09 \rightarrow Descriptive Norms_11	-0.01	0.07	-0.15	0.13	0.92
Injunctive Norms_11 \rightarrow MaskWearing_13	0.02	0.07	-0.12	0.17	0.75
Injunctive Norms_11 \rightarrow Injunctive Norms_13	0.32	0.07	0.19	0.45	0.00
Injunctive Norms_11 \rightarrow Descriptive Norms_13	0.22	0.07	0.08	0.36	0.00
Injunctive Norms_13 \rightarrow MaskWearing_14	0.00	0.08	-0.16	0.16	0.97
Injunctive Norms_13 \rightarrow Injunctive Norms_14	0.39	0.07	0.26	0.53	0.00
Injunctive Norms_13 \rightarrow Descriptive Norms_14	0.16	0.07	0.02	0.29	0.02
Injunctive Norms_14 \rightarrow MaskWearing_15	0.06	0.08	-0.11	0.22	0.50
Injunctive Norms_14 \rightarrow Injunctive Norms_15	0.43	0.07	0.29	0.58	0.00
Injunctive Norms_14 \rightarrow Descriptive Norms_15	0.30	0.07	0.17	0.43	0.00
Injunctive Norms_15 \rightarrow MaskWearing_16	0.22	0.09	0.05	0.39	0.01
Injunctive Norms_15 \rightarrow Injunctive Norms_16	0.20	0.07	0.06	0.35	0.01
Injunctive Norms_15 \rightarrow Descriptive Norms_16	0.08	0.06	-0.05	0.21	0.22
Injunctive Norms_16 \rightarrow MaskWearing_17	0.03	0.10	-0.17	0.22	0.80
Injunctive Norms_16 \rightarrow Injunctive Norms_17	0.32	0.06	0.19	0.44	0.00
Injunctive Norms_16 \rightarrow Descriptive Norms_17	0.10	0.05	0.00	0.21	0.06
Injunctive Norms_17 \rightarrow MaskWearing_18	0.01	0.10	-0.20	0.21	0.93
Injunctive Norms_17 \rightarrow Injunctive Norms_18	0.37	0.06	0.24	0.49	0.00
Injunctive Norms_17 \rightarrow Descriptive Norms_18	0.19	0.06	0.08	0.30	0.00
Descriptive Norms_02 \rightarrow MaskWearing_05	0.19	0.07	0.05	0.33	0.01
Descriptive Norms_02 \rightarrow Injunctive Norms_05	0.14	0.06	0.03	0.26	0.01
Descriptive Norms_02 \rightarrow Descriptive Norms_05	0.40	0.06	0.29	0.52	0.00

Table S6 continued

Parameter	Estimate	SE	2.5%	97.5%	p
Descriptive Norms_05 \rightarrow MaskWearing_09	0.21	0.08	0.05	0.36	0.01
Descriptive Norms_05 \rightarrow Injunctive Norms_09	0.19	0.07	0.05	0.33	0.01
Descriptive Norms_05 \rightarrow Descriptive Norms_09	0.27	0.08	0.12	0.42	0.00
Descriptive Norms_09 \rightarrow MaskWearing_11	0.11	0.09	-0.06	0.28	0.22
Descriptive Norms_09 \rightarrow Injunctive Norms_11	0.20	0.07	0.06	0.33	0.00
Descriptive Norms_09 \rightarrow Descriptive Norms_11	0.26	0.07	0.13	0.38	0.00
Descriptive Norms_11 \rightarrow MaskWearing_13	0.18	0.08	0.03	0.34	0.02
Descriptive Norms_11 \rightarrow Injunctive Norms_13	0.03	0.07	-0.10	0.17	0.63
Descriptive Norms_11 \rightarrow Descriptive Norms_13	0.29	0.08	0.14	0.44	0.00
Descriptive Norms_13 \rightarrow MaskWearing_14	0.17	0.07	0.03	0.31	0.02
Descriptive Norms_13 \rightarrow Injunctive Norms_14	0.21	0.06	0.09	0.33	0.00
Descriptive Norms_13 \rightarrow Descriptive Norms_14	0.41	0.06	0.29	0.53	0.00
Descriptive Norms_14 \rightarrow MaskWearing_15	0.13	0.09	-0.04	0.30	0.15
Descriptive Norms_14 \rightarrow Injunctive Norms_15	-0.01	0.08	-0.15	0.14	0.94
Descriptive Norms_14 \rightarrow Descriptive Norms_15	0.34	0.07	0.21	0.47	0.00
Descriptive Norms_15 \rightarrow MaskWearing_16	0.07	0.09	-0.10	0.24	0.44
Descriptive Norms_15 \rightarrow Injunctive Norms_16	0.25	0.07	0.11	0.40	0.00
Descriptive Norms_15 \rightarrow Descriptive Norms_16	0.28	0.06	0.15	0.41	0.00
Descriptive Norms_16 \rightarrow MaskWearing_17	0.18	0.12	-0.06	0.41	0.14
Descriptive Norms_16 \rightarrow Injunctive Norms_17	0.24	0.08	0.09	0.39	0.00
Descriptive Norms_16 \rightarrow Descriptive Norms_17	0.45	0.06	0.33	0.58	0.00
Descriptive Norms_17 \rightarrow MaskWearing_18	0.10	0.12	-0.12	0.33	0.37
Descriptive Norms_17 \rightarrow Injunctive Norms_18	0.28	0.07	0.14	0.42	0.00
$\underline{\text{DescriptiveNorms}_17 \rightarrow \text{DescriptiveNorms}_18}$	0.42	0.06	0.30	0.55	0.00

Table S7
Unstandardized autoregressive and cross-lagged parameters from time-varying random-intercept cross-lagged panel model (with factual beliefs, personal normative beliefs, and all exogenous covariates removed). Variable name suffixes indicate time points. Arrows indicate the direction of prediction.

Parameter	Estimate	SE	2.5%	97.5%	p
$MaskWearing_02 \rightarrow MaskWearing_05$	0.24	0.06	0.12	0.36	0.00
MaskWearing_02 \rightarrow Injunctive Norms_05	0.08	0.05	-0.02	0.18	0.13
MaskWearing_02 \rightarrow DescriptiveNorms_05	0.04	0.05	-0.06	0.14	0.46
MaskWearing_05 \rightarrow MaskWearing_09	0.16	0.07	0.03	0.29	0.02
MaskWearing_05 \rightarrow Injunctive Norms_09	0.09	0.06	-0.03	0.20	0.15
MaskWearing_05 \rightarrow Descriptive Norms_09	0.00	0.06	-0.13	0.12	0.98
$MaskWearing_09 \rightarrow MaskWearing_11$	-0.07	0.08	-0.23	0.09	0.38
MaskWearing_09 \rightarrow Injunctive Norms_11	0.03	0.06	-0.09	0.15	0.58
MaskWearing_09 \rightarrow DescriptiveNorms_11	0.13	0.06	0.02	0.24	0.02
$MaskWearing_11 \rightarrow MaskWearing_13$	0.11	0.05	0.00	0.22	0.05
MaskWearing_11 \rightarrow Injunctive Norms_13	0.08	0.05	-0.01	0.18	0.07
MaskWearing_11 \rightarrow DescriptiveNorms_13	0.07	0.05	-0.03	0.16	0.18
$MaskWearing_13 \rightarrow MaskWearing_14$	0.23	0.06	0.11	0.36	0.00
MaskWearing_13 \rightarrow Injunctive Norms_14	0.06	0.05	-0.04	0.17	0.23
MaskWearing_13 \rightarrow DescriptiveNorms_14	0.13	0.05	0.02	0.24	0.02
$MaskWearing_14 \rightarrow MaskWearing_15$	0.27	0.07	0.13	0.40	0.00
MaskWearing_14 \rightarrow Injunctive Norms_15	0.05	0.06	-0.06	0.16	0.36
MaskWearing_14 \rightarrow DescriptiveNorms_15	0.12	0.05	0.02	0.22	0.02
MaskWearing_15 \rightarrow MaskWearing_16	0.36	0.07	0.22	0.49	0.00
MaskWearing_15 \rightarrow Injunctive Norms_16	0.06	0.06	-0.05	0.18	0.28
MaskWearing_15 \rightarrow DescriptiveNorms_16	0.09	0.05	-0.01	0.19	0.10
$MaskWearing_16 \rightarrow MaskWearing_17$	0.42	0.06	0.29	0.54	0.00
MaskWearing_16 \rightarrow Injunctive Norms_17	-0.02	0.04	-0.10	0.06	0.60
MaskWearing_16 \rightarrow DescriptiveNorms_17	0.08	0.04	0.01	0.15	0.03
$MaskWearing_17 \rightarrow MaskWearing_18$	0.46	0.05	0.35	0.56	0.00
MaskWearing_17 \rightarrow InjunctiveNorms_18	-0.06	0.03	-0.12	0.00	0.07
$MaskWearing_17 \rightarrow DescriptiveNorms_18$	0.02	0.03	-0.03	0.08	0.42

Table S7 continued

Parameter	Estimate	SE	2.5%	97.5%	p
$InjunctiveNorms_02 \rightarrow MaskWearing_05$	-0.02	0.07	-0.17	0.12	0.73
InjunctiveNorms_02 \rightarrow InjunctiveNorms_05	0.29	0.06	0.18	0.41	0.00
Injunctive Norms_02 \rightarrow Descriptive Norms_05	0.08	0.06	-0.04	0.19	0.20
Injunctive Norms_05 \rightarrow MaskWearing_09	-0.13	0.08	-0.28	0.03	0.11
Injunctive Norms_05 \rightarrow Injunctive Norms_09	0.07	0.08	-0.07	0.22	0.32
Injunctive Norms_05 \rightarrow Descriptive Norms_09	-0.03	0.08	-0.18	0.13	0.74
Injunctive Norms_09 \rightarrow MaskWearing_11	0.16	0.10	-0.03	0.35	0.10
Injunctive Norms_09 \rightarrow Injunctive Norms_11	0.16	0.07	0.01	0.30	0.03
Injunctive Norms_09 \rightarrow Descriptive Norms_11	0.01	0.07	-0.12	0.15	0.84
Injunctive Norms_11 \rightarrow MaskWearing_13	0.05	0.07	-0.09	0.20	0.48
Injunctive Norms_11 \rightarrow Injunctive Norms_13	0.31	0.07	0.18	0.44	0.00
Injunctive Norms_11 \rightarrow Descriptive Norms_13	0.22	0.07	0.09	0.36	0.00
Injunctive Norms_13 \rightarrow MaskWearing_14	0.01	0.08	-0.14	0.17	0.87
Injunctive Norms_13 \rightarrow Injunctive Norms_14	0.45	0.07	0.32	0.58	0.00
Injunctive Norms_13 \rightarrow Descriptive Norms_14	0.21	0.07	0.07	0.34	0.00
Injunctive Norms_14 \rightarrow MaskWearing_15	0.11	0.08	-0.05	0.27	0.19
Injunctive Norms_14 \rightarrow Injunctive Norms_15	0.45	0.07	0.32	0.59	0.00
Injunctive Norms_14 \rightarrow Descriptive Norms_15	0.33	0.06	0.20	0.45	0.00
Injunctive Norms_15 \rightarrow MaskWearing_16	0.22	0.09	0.05	0.39	0.01
Injunctive Norms_15 \rightarrow Injunctive Norms_16	0.23	0.07	0.09	0.38	0.00
Injunctive Norms_15 \rightarrow Descriptive Norms_16	0.12	0.06	-0.01	0.25	0.06
Injunctive Norms_16 \rightarrow MaskWearing_17	0.02	0.10	-0.17	0.21	0.83
Injunctive Norms_16 \rightarrow Injunctive Norms_17	0.34	0.06	0.22	0.46	0.00
Injunctive Norms_16 \rightarrow Descriptive Norms_17	0.11	0.05	0.00	0.21	0.05
Injunctive Norms_17 \rightarrow MaskWearing_18	0.02	0.10	-0.18	0.21	0.87
Injunctive Norms_17 \rightarrow Injunctive Norms_18	0.42	0.06	0.31	0.54	0.00
Injunctive Norms_17 \rightarrow Descriptive Norms_18	0.19	0.05	0.08	0.29	0.00
Descriptive Norms_02 \rightarrow MaskWearing_05	0.22	0.07	0.09	0.36	0.00
Descriptive Norms_02 \rightarrow Injunctive Norms_05	0.16	0.06	0.04	0.27	0.01
Descriptive Norms_02 \rightarrow Descriptive Norms_05	0.40	0.06	0.29	0.51	0.00

Table S7 continued

Parameter	Estimate	SE	2.5%	97.5%	p
Descriptive Norms_05 \rightarrow MaskWearing_09	0.23	0.08	0.07	0.38	0.00
Descriptive Norms_05 \rightarrow Injunctive Norms_09	0.20	0.07	0.06	0.35	0.00
Descriptive Norms_05 \rightarrow Descriptive Norms_09	0.30	0.08	0.14	0.45	0.00
Descriptive Norms_09 \rightarrow MaskWearing_11	0.14	0.09	-0.04	0.31	0.12
Descriptive Norms_09 \rightarrow Injunctive Norms_11	0.23	0.07	0.10	0.36	0.00
Descriptive Norms_09 \rightarrow Descriptive Norms_11	0.29	0.06	0.16	0.41	0.00
Descriptive Norms_11 \rightarrow MaskWearing_13	0.24	0.08	0.08	0.39	0.00
Descriptive Norms_11 \rightarrow Injunctive Norms_13	0.07	0.07	-0.06	0.21	0.29
Descriptive Norms_11 \rightarrow Descriptive Norms_13	0.30	0.07	0.16	0.44	0.00
Descriptive Norms_13 \rightarrow MaskWearing_14	0.18	0.07	0.04	0.32	0.01
Descriptive Norms_13 \rightarrow Injunctive Norms_14	0.21	0.06	0.09	0.33	0.00
Descriptive Norms_13 \rightarrow Descriptive Norms_14	0.38	0.06	0.26	0.51	0.00
Descriptive Norms_14 \rightarrow MaskWearing_15	0.13	0.09	-0.04	0.30	0.14
Descriptive Norms_14 \rightarrow Injunctive Norms_15	0.04	0.07	-0.10	0.18	0.61
Descriptive Norms_14 \rightarrow Descriptive Norms_15	0.36	0.07	0.23	0.49	0.00
Descriptive Norms_15 \rightarrow MaskWearing_16	0.10	0.09	-0.06	0.27	0.22
Descriptive Norms_15 \rightarrow Injunctive Norms_16	0.27	0.07	0.13	0.41	0.00
Descriptive Norms_15 \rightarrow Descriptive Norms_16	0.29	0.06	0.17	0.42	0.00
Descriptive Norms_16 \rightarrow MaskWearing_17	0.16	0.12	-0.07	0.39	0.17
Descriptive Norms_16 \rightarrow Injunctive Norms_17	0.26	0.07	0.12	0.40	0.00
Descriptive Norms_16 \rightarrow Descriptive Norms_17	0.47	0.06	0.35	0.60	0.00
Descriptive Norms_17 \rightarrow MaskWearing_18	0.21	0.11	-0.01	0.42	0.06
Descriptive Norms_17 \rightarrow Injunctive Norms_18	0.30	0.06	0.17	0.42	0.00
$\underline{\text{DescriptiveNorms}_17 \rightarrow \text{DescriptiveNorms}_18}$	0.46	0.06	0.34	0.58	0.00

Table S8

List of norm interpretation questions asked at Time 7. These questions were preceded by the following text: "There may or may not be a difference between what people around you are doing and what they should be doing. You can learn about what people are doing and what they should be doing in different ways. For each of the following information sources, we want to know if you can learn from it what people are doing, what people should be doing, or both". Participants answered all questions on a 7-point Likert scale, from (1) Not At All to (7) Very Strongly.

Interpretation	Item	Question	Mean	SD
Provides descriptive information	Descriptive	Does noticing the proportion of people in your area that wear a mask while doing recreational/social activities indoors (e.g., going to the gym, eating at a restaurant, attending a party) tell you what everyone is doing?	4.65	1.68
		Does noticing the proportion of people in your area that wear a mask while doing routine activities indoors (e.g., running errands, shopping, going to work) tell you what everyone is doing?	4.86	1.65
	Injunctive	Do mask-wearing rules encouraged in your area (e.g., by local or state government officials, businesses, etc.) tell you what everyone is doing?	4.35	1.89
		Does how often you see people that you respect and trust wearing a mask (e.g., on tv, news, etc.) tell you what everyone is doing?	4.16	1.88
Provides injunctive information	Descriptive	Does noticing the proportion of people in your area that wear a mask while doing recreational/social activities indoors (e.g., going to the gym, eating at a restaurant, attending a party) tell you what everyone should be doing?	5.09	1.90
		Does noticing the proportion of people in your area that wear a mask while doing routine activities indoors (e.g., running errands, shopping, going to work) tell you what everyone should be doing?	5.14	1.87
	Injunctive	Do mask-wearing rules encouraged in your area (e.g., by local or state government officials, businesses, etc.) tell you what everyone should be doing?	5.70	1.73
		Does how often you see people that you respect and trust wearing a mask (e.g., on tv, news, etc.) tell you what everyone should be doing?	5.38	1.75

Table S9

Pairwise comparisons from a multilevel model testing the construct validity of the four self-reported social norm items. Data were analysed in long format, with the self-report social norm item and the type of normative information provided (descriptive or injunctive) as predictors and a random intercept for participant. All pairwise comparisons account for multiple comparisons using Tukey adjustment.

Туре	Pairwise contrast	Estimate	SE	р
Descriptive	MaskEncouraged - MaskRespect	0.19	0.09	0.11
Descriptive	MaskEncouraged - NeighborMask1	-0.51	0.09	0.00
Descriptive	MaskEncouraged - NeighborMask2	-0.30	0.09	0.00
Descriptive	MaskRespect - NeighborMask1	-0.70	0.09	0.00
Descriptive	MaskRespect - NeighborMask2	-0.49	0.09	0.00
Descriptive	NeighborMask1 - NeighborMask2	0.21	0.09	0.07
Injunctive	MaskEncouraged - MaskRespect	0.32	0.09	0.00
Injunctive	MaskEncouraged - NeighborMask1	0.55	0.09	0.00
Injunctive	MaskEncouraged - NeighborMask2	0.61	0.09	0.00
Injunctive	MaskRespect - NeighborMask1	0.24	0.09	0.03
Injunctive	MaskRespect - NeighborMask2	0.29	0.09	0.00
Injunctive	NeighborMask1 - NeighborMask2	0.05	0.09	0.93

Table S10
Unstandardized autoregressive and cross-lagged parameters from multi-group time-invariant random-intercept cross-lagged panel model, split by majority-Democrat and majority-Republican states. The model contains all covariates. Arrows indicate the direction of prediction.

Group	Parameter	Estimate	SE	2.5%	97.5%	р
Democrat	Mask wearing \rightarrow Mask wearing	0.20	0.04	0.13	0.27	0.00
Democrat	Mask wearing \rightarrow Injunctive norms	0.01	0.03	-0.04	0.06	0.81
Democrat	Mask wearing \rightarrow Descriptive norms	0.01	0.03	-0.04	0.06	0.68
Democrat	Injunctive norms \rightarrow Mask wearing	-0.02	0.04	-0.11	0.06	0.59
Democrat	Injunctive norms \rightarrow Injunctive norms	0.32	0.04	0.24	0.39	0.00
Democrat	Injunctive norms \rightarrow Descriptive norms	0.21	0.04	0.14	0.28	0.00
Democrat	Descriptive norms \rightarrow Mask wearing	0.08	0.04	0.00	0.17	0.06
Democrat	Descriptive norms \rightarrow Injunctive norms	0.24	0.03	0.17	0.30	0.00
Democrat	Descriptive norms \rightarrow Descriptive norms	0.33	0.04	0.25	0.40	0.00
Republican	Mask wearing \rightarrow Mask wearing	0.19	0.04	0.11	0.26	0.00
Republican	Mask wearing \rightarrow Injunctive norms	0.05	0.03	-0.01	0.10	0.10
Republican	Mask wearing \rightarrow Descriptive norms	0.07	0.03	0.02	0.12	0.01
Republican	Injunctive norms \rightarrow Mask wearing	0.00	0.04	-0.08	0.09	0.91
Republican	Injunctive norms \rightarrow Injunctive norms	0.24	0.04	0.16	0.31	0.00
Republican	Injunctive norms \rightarrow Descriptive norms	0.05	0.03	-0.01	0.11	0.12
Republican	Descriptive norms \rightarrow Mask wearing	0.14	0.05	0.05	0.24	0.00
Republican	Descriptive norms \rightarrow Injunctive norms	0.11	0.04	0.04	0.19	0.00
Republican	Descriptive norms \rightarrow Descriptive norms	0.32	0.04	0.24	0.39	0.00

Supplementary References

Pearl, J. (1995). Causal diagrams for empirical research. Biometrika, 82(4), 669-688.