Depression Stigma*

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Abstract

Throughout history, the mentally ill have been discriminated against and stigmatized. In this paper, we provide a new measure of depression stigma perceptions and examine their consequences for help-seeking among a sample of 1,800 Americans suffering from depression. First, we establish that our respondents on average overestimate the extent of stigma associated with depression. Second, we find that lowering perceived social stigma through an information intervention leads to a reduction in the demand for therapy. Third, we find evidence that the information intervention increases optimism about future mental health. The reduced demand for therapy therefore plausibly arises from a decrease in the perceived need for therapy. Our findings shed light on the nuanced effects of information campaigns combating stigma.

Keywords: Depression, Stigma, Information, Psychotherapy.

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1 Introduction

Throughout history, the mentally ill have been misunderstood, feared, and discriminated against (Fink, 1992). The stigma attached to mental illness exacts significant psychological tolls on those affected (Moses, 2010). It may also influence whether or not they seek the necessary help to get better (Vogel and Wade, 2009). In the case of depression, it has been posited that social stigma acts as a barrier to taking up psychotherapy, because it raises fears of social backlash and leads to a reluctance to self-label as mentally ill (Corrigan and Rüsch, 2002). On the other hand, reducing perceived depression stigma may lower the perceived need for therapy by increasing optimism about future mental health.¹

We conduct a large-scale online experiment (N=1,844) with US residents that suffer from depression to measure perceived depression stigma and examine its causal effect on the demand for therapy. In the *control* condition, respondents complete an incentive compatible willingness to pay (WTP) elicitation for 4 weeks of online therapy, without having received information or being prompted to think about depression stigma. Participants in the *Stigma info* condition learn that in a broadly representative survey with Americans 16 percent agreed with the view that "People with depression are lazy, hard to be around, and have weak character" before the WTP elicitation.²

Prior to receiving information, our participants, on average, estimate that 38 percent of Americans hold this view. Indeed, a large majority of respondents in our sample (83 percent) overestimate the extent of stigma associated with depression. They therefore exhibit the

¹Perceived need for therapy has been found to be predictive of the decision not to seek therapy (Andrade et al., 2014).

²We selected these stereotypes based on qualitative pilots about the kind of stigma depressed individuals find most harmful.

kind of pessimism that is symptomatic of depression (Beck et al., 1961). This first result suggests that information interventions have the potential to reduce the stigma associated with depression.

We next turn the effects of the information intervention on the demand for therapy. Our main finding is that willingness to pay for online therapy is \$9.2 lower in *Stigma info* compared to the *control* condition (p = 0.05). These results run counter to a literature in psychology that views depression stigma as a barrier to therapy demand, based on a negative correlation between perceived depression stigma and self-reported uptake of therapy (see Corrigan and Rüsch (2002) for a review). Our data also lend no support to the mechanisms hypothesized in this literature: the information treatment affects neither self-reported aversion to self-label as depressed by seeking therapy (p = 0.24) nor fears of social backlash (p = 0.24).

Instead, our results are consistent with lower perceived stigma reducing our participants' perceived need for therapy by either making them feel better in the moment or more hopeful about getting better by themselves in the future. In line with this interpretation, the information treatment positively affects how our participants view themselves. Participants in *Stigma info* are less likely to think that they themselves are "lazy", "hard to be around" or "have weak character".

To provide direct evidence on potential positive effects of stigma information on participants' feelings and outlook, we conduct a mechanism experiment with a different set of 1,008 Americans suffering from depression. Consistent with the proposed mechanism, participants in *Stigma info* are significantly less likely to state that they are "feeling down and don't have the motivation to do anything about it" and more hopeful about their future mental health.

To compare prior correlational evidence on stigma perceptions and therapy demand with

our study, we rely on a third condition, $Stigma\ flag$. In this condition, we elicit pre-treatment beliefs about stigma, but do not provide the information treatment. Consistent with the direction of effects from the information treatment, we document a positive correlation between perceived stigma and willingness to pay for online therapy. To provide direct evidence on the role of beliefs we investigate heterogeneous treatment effects by pre-treatment stigma perceptions with respondents from $Stigma\ info$ and $Stigma\ flag$. Consistent with an important role of beliefs, we find that information increases the demand of treated respondents who underestimated the extent of stigma by \$43.57 (p < 0.05), but decreases the demand of treated respondents who overestimated the extent of stigma by \$10.38 (p < 0.05).

The fact that we do not only find a positive causal effect of perceived stigma on therapy demand, but also a positive correlation between the two variables, suggests that there are likely some substantive differences between our study and previous work, which uncovered a negative correlation.³ To explain these differences, we note that which of several plausible mechanisms dominates the relationship between stigma and therapy demand is likely dependent on the exact setting and sample. For instance, we see that our treatment effect is much more pronounced among more depressed individuals, implying that our effect would be less likely to occur in a less depressed sample. Compared to in-person therapy, our setting of online therapy may decrease the importance social backlash. Of course, concerns about self-labelling as depressed and compromised privacy are ex ante plausible mechanisms even in our setting that should drive treatment effects in the opposite direction to what we observe. More broadly, it is also possible that the extent of social stigma has just significantly decreased

³Instead, us finding a negative correlation and a positive treatment effect might have suggested that negative correlations in prior work were spurious.

over the last years, decreasing the relevance of the social backlash mechanisms.

To provide evidence on the external validity of our findings to a more social setting, we report the results from a field experiment we conducted with a provider of online group therapy. The results from this field experiment, albeit somewhat noisy, show that *Stigma info* also fails to raise demand despite the amplified social dimension in group therapy. Yet, it is still conceivable that stigma discourages conspicuous help-seeking in other domains. For example, Smith (2023) measures willingness to share information about mental health services in refugee networks in Jordan. Smith (2023) documents that giving individuals social cover, by encouraging them to disclose that they are compensated to share information, significantly raises sharing rates.

To investigate whether merely asking participants to think about stigma has an effect on their therapy demand, we compare the Stigma flag treatment with the $Pure\ control$ condition. The Stigma flag treatment has some parallels with information campaigns that purposefully or inadvertently raise stigma awareness without debiasing beliefs about the level of stigma. We find that the Stigma flag treatment reduces the demand for therapy, at marginal statistical significance (p=0.093). Our data allow us to rule out that this is a backfiring effect, whereby the Stigma flag treatment directs attention to an important barrier to demand. First, we find no effect of the Stigma flag treatment on attention to stigma, as measured in an open-ended question during the willingness to pay elicitation. Second, we note that such a backfiring effect is incompatible with positive correlation between stigma beliefs and therapy demand and the prior-dependent treatment effect. Instead, exploratory analyses suggest that the Stigma flag treatment reduces demand by mechanisms that have some similarity to those driving the effect of the Stigma info treatment. Specifically, like the Stigma info treatment, the

Stigma flag treatment increases optimism about future mental health.⁴

A growing body of evidence suggests that psychotherapy significantly increases the likelihood of recovery from mental illness (Cuijpers et al., 2010; Haushofer et al., 2020; McKelway et al., 2023; Singla et al., 2017), even over long time horizons (Bhat et al., 2023). Therapy has also been shown to increase human capital investments (Barker et al., 2021), to increase parental investments (Baranov et al., 2020), and to reduce criminal activities (Blattman et al., 2017, 2022). At the same time, online mental health therapy is fast becoming the dominant delivery mode and puts therapy within the financial reach of ever more people, while achieving similar mental health outcomes as in-person therapy (Lin et al., 2022). These parallel developments make it important to understand why a sizable portion of the depressed population refrains from seeking psychotherapy even if they could afford to (Cronin et al., 2023).

Previous correlational evidence has pointed to social stigma as a key barrier for seeking treatment (Clement et al., 2015; Corrigan and Penn, 1999; Corrigan and Rüsch, 2002; Gulliver et al., 2010). Instead, in our experiment, lowering perceived stigma decreases therapy demand. Our findings caution that policy initiatives that seek to reduce r eal and perceived stigma may do little to boost the demand for therapy.

Our evidence is consistent with a direct effect of stigma information on individuals' well-being and hopefulness. In this way, our information treatment may reduce our participants' subjective need for therapy, which has previously been linked to therapy demand (Andrade et al., 2014; Golberstein et al., 2008). Whether the effects we observe are long-lasting and

⁴These effects may be explained by evidence that explicitly expressing or modifying ways of engaging with frightening thoughts can alleviate mental health issues (González-Sanguino et al., 2023).

whether they reflect decisions that are in our participants' best interest in the long-term are important questions for future research.

Our work contributes to a literature on depression and mental health in economics (Angelucci and Bennett, 2024; Banerjee et al., 2022; Cobb-Clark et al., 2021; De Quidt and Haushofer, 2016; Ridley et al., 2020; Singla et al., 2017) and complements other work on the determinants of therapy demand, including studies on low mental health literacy (Acampora et al., 2022) and low perceived effectiveness of therapy (Roth et al., 2024). We also relate to a literature on the broader adverse effects of stigma. Ridley (2023) provides evidence of discrimination against the mentally ill that is driven by incorrect beliefs about their productivity. More broadly, we connect to work on stigma in the context of sex workers (Ghosal et al., 2022), HIV testing (Yang et al., 2023; Yu, 2023), and welfare recipients (Besley and Coate, 1992; Bhargava and Manoli, 2015; Lasky-Fink and Linos, 2023; Moffitt, 1983).

2 Data and Design

2.1 Sample

We recruit 1,844 US participants using the online platform Prolific, a survey provider commonly used in social science research (Eyal et al., 2021). We only include respondents that suffer from depression, identified by a score of 10 or above on the personal health questionnaire PHQ-8, a widely used scale to identify depression (Kroenke et al., 2009). Moreover, we

⁵The personal health questionnaire includes nine questions, each asking about the frequency of different depressive symptoms on a scale from 0 "Not at all" to 3 "Nearly every day". The first 8 questions of the questionnaire constitute the PHQ-8, a score that ranges between 0 and 24. A score of 10 in the PHQ-8 is a commonly used threshold to consider an individual currently depressed (Kroenke et al., 2009).

only include respondents that have never tried therapy before.

Table A.1 compares our sample with a representative sample of people suffering from depression. We rely on a representative sample of the US population that contains data on the PHQ8, the National Health and Nutrition Examination Survey (NHANES). To make the samples as comparable as possible, we restrict the sample to people suffering from depression according to the PHQ8. Respondents in our sample slightly under-represent women (57% vs 62%, p = 0.06) and are significantly younger (30 vs. 50, p < 0.01). However, our survey matches the restricted NHANES sample quite closely in terms of the PHQ8.

Pre-specification. Our main data collection was pre-registered in the AsPredicted registry (#107190).⁶ We pre-specified the sampling procedure, the main outcomes of interest, the main right-hand-side variables of interest, and the main empirical specifications. The pre-analysis plan can be found in Section I of the Online Appendix.

2.2 Design

2.2.1 Structure of the design

At the start of the survey we elicit a series of background characteristics as well as participants' willingness to pay for an example good. Participants are randomized into three equally-sized treatment groups. Two-thirds of our respondents answer a series of questions about other people's beliefs about people who suffer from depression. Out of those respondents, half receive information about the stigma associated with depression (*Stigma info*), while the other

⁶Our pre-registration features two separate treatment conditions with different samples conducted at the same time. The second experiment aimed to measure and debias beliefs about the effectiveness of psychotherapy Roth et al. (2024). This second experiment uses the same control group as this paper.

half do not receive the information about the stigma (*Stigma flag*). The remaining one third of respondents are assigned to a *Pure control* group that features no mention of stigma (*Pure control*). After these treatments we elicit our respondents' willingness to pay for therapy. At the end of the experiment we elicit an additional set of beliefs to elucidate mechanisms.

2.2.2 Beliefs about social stigma

Pre-treatment beliefs. To get a quantitative measure of perceived stigma we truthfully tell our respondents that we conducted a survey with a sample of over 100 Americans whose composition resembles the American population at large. We then ask them to guess the percentage of Americans from this survey that agreed or strongly agreed with the following statement:

People with depression are lazy, hard to be around, and have weak character.⁷

Respondents are told that one of the questions in which they make quantitative estimates will be randomly selected for payment. They are informed that if their answer in the selected question is within 3 percent of the truth, they will receive a 50 cent bonus.⁸

On top of this quantitative question, we also elicit a qualitative question. We ask our respondents how likely it is that the majority of Americans from this survey agreed or strongly agreed with the statement on a 5-point Likert scale, ranging from (i) very unlikely to (v) very likely.

⁷Rather than imposing our own definition of stigma, we conducted qualitative pilots to inform our design by participants' construal of stigma. Our pilots asked respondents to describe, in their own words, how they think other people think about depressed individuals and which stereotypes they consider particularly harmful. See Appendix C.

⁸We follow best-practices and emphasize that it is in respondents' best interest to provide their best guess (Danz et al., 2022).

Treatments Respondents in both the *Stigma info* and *Stigma flag* condition are reminded of their quantitative beliefs about social stigma:

You said that you believe that X% of Americans either agree or strongly agree with the following statement: People with depression are lazy, hard to be around, and have weak character.

Respondents in the *Stigma info* condition are also told:

According to our survey of over 100 Americans, the actual share of Americans that either agree or strongly agree with this statement is 16.

Respondents in the *Stigma info* condition are also shown a chart contrasting their estimate along with the true value, while respondents in the *Stigma flag* condition are shown a chart displaying only their estimate. Respondents in the *Pure control* do not state pre-treatment beliefs and are not given any information about stigma.

Post-treatment beliefs In order to mitigate experimenter demand effects, we elicit post-treatment beliefs about the stigma associated with depression based on a related but somewhat different statement about people with depression. We elicit beliefs about the percentage of Americans that agreed or strongly agreed with the following statement:

People with depression are often unreliable, incompetent, and have weak character.

To test whether our respondents' extrapolate from general beliefs about stigma to beliefs about the stigma they face personally we ask them whether people they regularly interact with would hold negative views about them if they learned that they struggled with depression.

2.2.3 Willingness to pay elicitation

Our main outcome is our participants' willingness to pay for BetterHelp, a prominent online therapy platform in the U.S. We inform respondents about BetterHelp's offerings, highlighting that clients can reach their therapists anytime via audio, video, or text messages in a dedicated messaging room. Additionally, clients have the option to arrange weekly live sessions, lasting 30 to 45 minutes, for real-time communication through phone, video, or live chat. To contextualize the service's value, we mention its standard rate of \$320 for a four-week period. We then ask respondents to specify the maximum amount they are willing to pay for a four-week therapy service from BetterHelp, between \$0 and \$350. Further, we truthfully inform respondents that the stated preferences of 10 participants in our study will be actualized. We also reiterate the specifics of the Becker-DeGroot-Marschak (BDM) mechanism to our respondents for clarity.

Immediately after stating their willingness to pay, participants are asked for an openended response about the considerations underlying their valuations.

2.2.4 BDM explanation

We first explain the Becker-DeGroot-Marschak (BDM) mechanism at the very beginning of the experiment, where it is applied to determine participants' hypothetical willingness to pay for a one-month spa membership. This early explanation and example serves two purposes. First, assessing willingness to pay for an alternative good yields a potent control variable that allows us to adjust for individual variations in scale usage (Dizon-Ross and Jayachandran, 2022). Second, the initial BDM elicitation streamlines subsequent explanations regarding

willingness to pay for therapy and reduces the time gap between the administered treatments and the main outcomes.

We inform participants that they will be asked to specify the maximum price they are prepared to pay for the spa membership. They understand that this exercise does not involve spending their own money. After stating their price, a computer program will randomly select a price between \$0 and \$350. Participants are informed that if this random price exceeds their stated price, they receive the cash amount. Conversely, if the random price is lower, they gain the spa membership. We stress the importance of honestly stating the maximum price they would pay, supporting this with a simple, illustrative example. Unlike the main elicitation of willingness to pay for therapy, this willingness to pay elicitation is not implemented for any participants.

To verify participants' comprehension, we incorporate a control question. Specifically, we ask them to assess the accuracy of various statements about the payment rules, involved stakes, and potential rewards. Participants must accurately judge the truthfulness of each statement before proceeding with the survey.

2.3 Data quality

Our survey design sought to assure high data quality by providing respondents with monetary incentives in the belief elicitations and by incentivizing their stated willingness to pay for therapy. Several features of our data are suggestive of high data quality. First, the open-ended data reveals that respondents engaged with the question and exerted substantial effort. Respondents wrote an average of 38 words and virtually no respondents provided a

nonsensical response. Second, our survey measures exhibit a high degree of internal consistency (see Appendix Table ??). For example, the quantitative pre-treatment measure of stigma perception is highly correlated with the qualitative measure ($\rho=0.72$, p<0.01), which is elicited on a different scale. Third, pre-treatment stigma beliefs are strongly correlated with the WTP measure ($\rho=0.17$, p<0.01) and highly predictive of treatment effects.

3 Results

3.1 Perceived and actual depression stigma

We start by examining how perceptions of depression stigma differ from actual stigma. In an initial survey with a sample that is broadly representative of the US population, 16 percent of Americans agree with the statement that "People with depression are lazy, hard to be around, and have weak character." Instead, respondents in our main experiment estimate that 37.5 percent of Americans agree with this statement. A large majority of our respondents (83%) overestimate the extent of stigma. The idea that depressed individuals are more pessimistic about the world than people not suffering from depression represents a prominent hypothesis in the literature on depression (Beck et al., 1961). Here, we document pessimism in incentivized beliefs about the prevalence of depression stigma against an objective benchmark. This finding implies that there is scope for correcting average misperceptions with accurate information.⁹

⁹As we will show Appendix Table A.7 shows that the information strongly shifts perceptions of stigma for various measures.

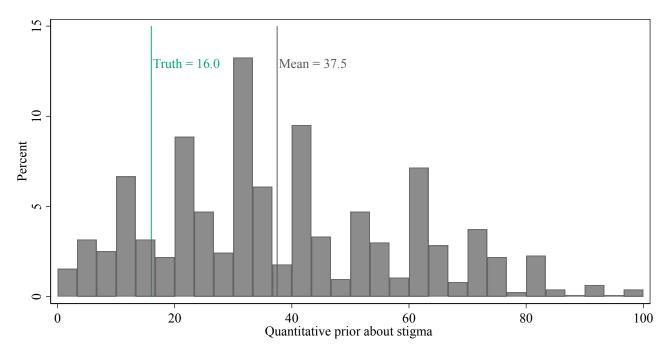


Figure 1: Prior beliefs about the prevalence of depression stigma

Notes: This figure displays the distribution of prior beliefs on stigma measured by asking participants what percentage of Americans agree with the statement: "People with depression are lazy, hard to be around, and have weak character." The blue vertical line indicates the mean of these prior beliefs, while the red vertical line represents the true value, based on an initial survey representative of the US population (see Online Appendix C). This distribution includes data from 1,226 observations within the *Stigma flag* and *Stigma info* treatment groups, from whom the prior beliefs were elicited.

3.2 The effect of information on the demand for online therapy

Our main treatment (Stigma~info) decreases average pessimism about the prevalence of depression stigma. Panel A of Figure 2 presents the main treatment effect on participants' elicited willingness to pay (WTP) for online therapy. Stigma~info reduces WTP by 9.168 dollars (p=0.05). Column 1 of Table A.2 confirms this effect. The positive effect of perceived stigma on therapy demand runs counter to correlational evidence in a large literature on stigma and help-seeking in psychology (Clement et al., 2015; Corrigan and Rüsch, 2002) and speaks against the hypothesis that stigma constitutes an important barrier to the demand of online therapy.

We find that the negative treatment effect of information is substantially more pronounced

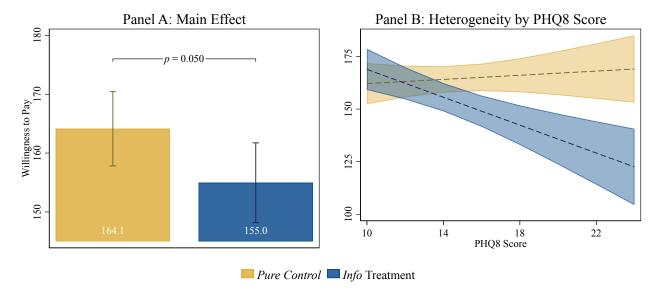


Figure 2: Average and heterogeneous treatment effects of stigma information on willingness to pay for therapy

Notes: Panel A presents the predicted values of willingness to pay for BetterHelp, derived from a regression analysis that examines the effect of treatment status on the willingness to pay for BetterHelp among the *Pure control* and *Stigma info* treatment groups. Panel B depicts the predicted willingness to pay for BetterHelp across different PHQ-8 scores for the same groups, utilizing a regression that incorporates both the treatment indicator and its interaction with a continuous measure of PHQ-8 score. The control variables used in the regressions include the PHQ8 score, willingness to pay for a month of spa membership, an indicator for prior awareness of BetterHelp, and an indicator for previous consideration of individual online therapy for depression. 95 percent confidence intervals and p-values are computed using robust standard errors from relevant regressions.

among those who are more depressed, as captured by their PHQ-8 score (Table A.2, column 2).¹⁰ As becomes clear form looking at Panel B of Figure 2, the estimated treatment effect rises to over 40 dollars among the most depressed. We also find that the treatment effect is larger among those who were not previously diagnosed with depression (Table A.2, column 3). Arguably then, the effect of information about stigma is especially relevant to those that stand to gain a lot from interacting with a therapist.

¹⁰This analysis was not pre-registered.

3.3 Mechanism analysis in main experiment

We elicited several measures post-treatment that allow us to speak to the mechanism behind the main treatment effect. Figure 3 depicts tests for several plausible mechanisms, emphasized in the psychology literature (see Corrigan and Rüsch 2002), by which high perceived stigma may act as a barrier to demand. In line with that fact that we do not observe a positive treatment effect on willingness to pay, we find no evidence that reducing perceived stigma affects how comfortable participants feel to share their identity during therapy $(0.02\sigma, p = 0.72)$ or to interact with a therapist $(-0.01\sigma, p = 0.84)$. Neither does reducing perceived stigma affect worry about others finding out about therapy $(0.07\sigma, p = 0.24)$ and worry that seeking therapy labels the participant as depressed $(-0.07\sigma, p = 0.24)$.

We also test whether the *Stigma info* treatment affects self-stigma. We asked participants about whether they often feel that they are unpredictable, incompetent, unreliable, lazy, hard to be around and that they have weak character. The variable self-stigma (shocked) in the fifth row of Figure 3 sums participants' agreement, on a Likert scale, with the assertions that they are respectively lazy, hard to be around and have weak character. These three harmful stereotypes are what our information treatment explicitly mentions. The final row looks at self-stigma about the remaining three attributes, which the *Stigma info* treatment did not mention.

We see that the *Stigma info* treatment significantly decreases the self-stigma along explicitly mentioned dimensions by 0.12σ (p < 0.05). It decreases self-stigma on dimensions that were not mentioned by 0.04σ , but this effect is not statistically significant (p = 0.45). Therefore, reducing perceived social stigma seems to positively affect how participants feel about

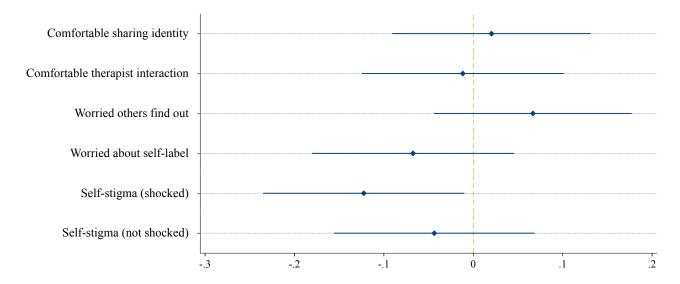


Figure 3: Effects of Stigma info treatment on measures of the mechanisms

Notes: This is a coefficient plot for the effect of the *Stigma info* treatment, estimated against the *Pure control*—denoted by the dashed line. Dependent variables are denoted on the y-axis. For comparability of effect sizes, all outcome variables are standardized by subtracting the mean and dividing by the standard deviation of the variable in the overall sample. 95 percent confidence intervals are based on robust standard errors.

themselves. It is then plausible that this improvement maps into a lower perceived need for therapy, which could explain our main treatment effect. We conduct a mechanism experiment to further explore this hypothesis.

3.4 Mechanism experiment: Social stigma and perceived need

We now investigate more explicitly the possibility that perceived stigma affects individuals' perceived need of therapy. The mechanism experiment delivers the same *Stigma info* and *Stigma flag* treatment as the main experiment and compares them to the *Pure control* condition. We measure three self-reported outcomes related to participants' perceived need for therapy. The main outcomes and analyses were preregistered.¹¹

The first row of Figure 4 shows the treatment effect of *Stigma info* on agreement with the

¹¹See AsPredicted registry (#137055).

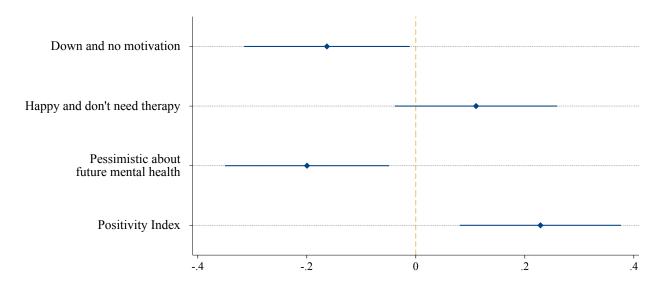


Figure 4: Effects of *Stigma info* treatment on emotions and beliefs

Notes: This is a coefficient plot for the effect of the *Stigma info* treatment, estimated against the *Pure control*—denoted by the dashed line. Dependent variables are denoted on the y-axis. For comparability of effect sizes, all outcome variables are standardized by subtracting the mean and dividing by the standard deviation of the variable in the overall sample. 95 percent confidence intervals are based on robust standard errors.

statement "Right now, I am feeling down and I don't have the motivation to do anything about it." on a 5-point Likert scale. This measure is meant to capture negative emotions and is similar to items on the PHQ-8 scale used to diagnose depression, without being identical. We find that lowering perceived stigma decreases the incidence of momentary feelings of sadness and low motivation by 0.16σ (p < 0.05). The second row shows that stigma information increases agreement with the statement "Right now, I am feeling fairly good and I don't see the need to do anything about my mental health" by 0.11σ , albeit not to an extent that rises to statistical significance (p = 0.146). The third row shows that *Stigma info* decreases agreement with the statement "The way others view depressed people keeps me from being optimistic about improving my future mental health by myself" by 0.19σ (p < 0.05).

To alleviate concerns about multiple hypothesis testing, we combine our measures into a positivity index. We first normalize the Likert score of each answer so that more positive values imply a more positive outlook. We then sum each participants' Likert scores across the three items and z-score this variable. The final row of Figure 4 shows that the *Stigma info* treatment leads to an increase in the positivity index by 0.23σ (p < 0.05).

In sum, the mechanism experiment shows that reducing perceived stigma positively impacts momentary emotions of happiness and makes participants hopeful that they can achieve better mental health by means other than therapy. These results are consistent with the hypothesis that a decrease in pessimism about stigma lowers our participants' perceived need for therapy.

3.5 The correlation between perceived stigma and demand for therapy

Next, we test for the correlation between stigma beliefs and therapy demand in our data. This correlation allows us to examine the external validity of our experimental estimates, which capture a local average treatment effect identified largely off of those with the largest ex-ante misperceptions. If this correlation were negative and, hence, contradicted by our treatment effect, then this might suggest that the negative correlations found in previous papers are also spurious. If the correlation were positive, then this might indicate that the online setting, the nature of stigma today, or our sample give rise to a different relationship between stigma and therapy demand than the relationship uncovered in previous papers. Because our control condition did not mention stigma or measure beliefs about it and our *Stigma info* treatment shocked stigma beliefs, we rely on our third condition (*Stigma flag*) in which we elicited prior beliefs and merely flagged that information about the prevalence of stigma exists without revealing the information content. The correlation between perceived stigma and willingness

to pay for online therapy is 0.168 (p < 0.001).

3.6 Heterogeneous effects by pre-treatment stigma perceptions

Since we observe pre-treatment perceptions of stigma among both respondents in *Stigma info* and *Stigma flag*, we can provide more direct evidence on the role of beliefs in driving treatment effects. In particular, this data enables us to study heterogeneous treatment effects by pre-treatment stigma perceptions. Consistent with an important role of beliefs, we find that information increased the demand of treated respondents who are ex-ante optimistic about stigma by \$43.57 (p < 0.01), but decreased the demand of treated pessimists by \$10.38 (p < 0.05).

Table 1 show the difference between willingness to pay in the Stigma~info~ and Stigma~flag~ treatment for different levels of pre-treatment perceptions of stigma. Column 1 shows that for participants that were ex-ante pessimistic, Stigma~info~ reduces demand significantly by \$10.38 (p < 0.05). In column 2, the smaller group of participants who was optimistic about stigma in their priors increases willingness to pay for therapy by \$43.57 (p < 0.01). In column 3, we provide similar heterogeneity results using the pre-registered regression model. This evidence is consistent with an important role of changes in beliefs rather than attentional mechanisms in driving the main reduced form effects on demand for therapy. Moreover, the prior dependence of our treatment effect corroborates the high quality of our pre-treatment belief measures. 12

¹²Many studies in this literature fail to detect statistically significant heterogeneity of treatment effects by pre-treatment beliefs (Grigorieff et al., 2020; Haaland and Roth, 2020; Hager et al., 2023) and this is commonly attributed to measurement error in those beliefs (Haaland et al., 2023).

Table 1: Treatment Effect on Willingness to Pay

	(1)	(2)	(3)	(4)
	Willingness	Willingness	Willingness	Willingness
	to pay	to pay	to pay	to pay
Stigma info	-10.38**	43.57***	22.23**	-9.247**
	(5.107)	(11.53)	(9.663)	(4.676)
Prior (quant.)			0.650***	
			(0.160)	
Prior (quant.) x Stigma info			-0.634***	
			(0.224)	
Stigma flag				-7.826*
				(4.558)
Sample restriction	Prior >16	Prior ≤16	None	None
Excluded condition	Pure control	Pure control	Pure control	None
Observations	1019	210	1229	1844
\mathbb{R}^2	0.237	0.272	0.240	0.257

Notes: Regressions contain preregistered controls of willingness to pay for a hypothetical example good, age, gender, openness to online therapy, and PHQ-8 score. Column 3 interacts *Stigma info* with the quantitative prior about stigma. Robust standard errors in parentheses, * p<0.1, ** p<0.05, *** p<0.01.

3.7 The effect of merely flagging stigma to participants

Comparing the *Stigma flag* treatment with the *Pure control* condition allows us to investigate whether merely asking participants to think about the extent of stigma has an effect on their therapy demand. This comparison may be informative about the effect of information campaigns that purposefully or inadvertently raise stigma awareness without debiasing beliefs about the level of stigma. Column 3 of Table 1 shows that the *Stigma flag* treatment reduces the demand for therapy, at marginal statistical significance (p = 0.086).

We analyze the mechanisms behind the effect of the *Stigma flag* treatment in more detail in Appendix B. There, we show that our data allow us to rule out that the *Stigma flag* backfires by directing attention to a meaningful barrier to demand without removing participants pessimism. First, we see no effect of the *Stigma flag* treatment on attention to stigma, as measured in an open-ended question during the willingness to pay elicitation.¹³ Second,

¹³One important caveat here is that social concerns, including stigma, are virtually absent from the openended data. This possibly arises from social concerns being harder to verbalize compared to more instrumental considerations. Appendix Figure Y shows that the most commonly mentioned considerations are effectiveness,

such a backfiring effect is incompatible with the positive correlation between stigma beliefs and therapy demand and the prior-dependent treatment effect. Third, exploratory analyses suggest that the *Stigma flag* treatment reduces demand by mechanisms similar to those driving the effect of the *Stigma info* treatment. Appendix Table B.3 shows that the *Stigma flag* treatment also increases positive emotions, hopefulness and the perceived need for therapy in the mechanism experiment. Why would asking participants to engage with stigma and estimate its prevalence have such positive effects? One speculative answer to this question may be provided by evidence on cognitive behavioral therapy that shows that explicitly expressing or modifying ways of engaging with frightening thoughts, like those about stigma, can alleviate mental health issues (González-Sanguino et al., 2023).

4 Discussion

The effect of reducing perceived stigma on demand for group therapy. The fact that our results contradict the psychology literature begs the question of whether what we find here is robust to settings that are more social and feature more observability. Appendix D reports the results of a field experiment with a provider of online group therapy by licensed therapists. In this experiment we failed to achieve the targeted sample size, and we are therefore underpowered on the main pre-registered analyses. With these caveats in mind, we find that also in the context of group therapy reducing stigma decreases the demand for therapy, albeit insignificantly. At a minimum, this evidence lets us rule out large positive effects of reducing stigma on the demand for group therapy.

costs and time.

External validity. It is unclear whether increases in willingness to pay translate into changes in actual therapy take-up. Evidence from our field experiment with the provider of group therapy suggests that an increase in willingness to pay for online group therapy is significantly positively associated with the likelihood of actually signing up for online group therapy ($\rho = 0.171$, p < 0.001). More broadly, there is a large literature in economics that corroborates the power of experimentally-measured preferences for predicting real world behaviors (see e.g. Sutter et al. (2013)).

Could the observed treatment effect be driven by experimenter demand? We think that experimenter demand effects are unlikely in our setting for several reasons: First, we conjecture that it is more likely for participants to believe that experimenters expected positive effects of the information intervention on therapy demand. Second, heterogeneity by pre-treatment stigma perceptions suggests that our patterns could only be explained by heterogeneously occurring demand effects. Third, our willingness to pay measure involves real stakes making demand effects somewhat less plausible. Fourth, as outlined in more detail Appendix E, only a very small fraction of respondents correctly guessed the study purpose and our results are not sensitive to excluding the small group of participants who guessed the aim of our study. This uncertainty in beliefs makes experimenter demand effects a far less likely threat to our findings (de Quidt et al., 2018), but we cannot fully rule out that they play a role.

Substitution to in-person therapy One possible side-effect of the stigma treatment could be that people substitute from online to in-person therapy as the social cost of attending in-person therapy is more strongly reduced by the information intervention. To evaluate this

conjecture, we analyze people's open-ended considerations elicited during their willingness to pay decision. In these open-ended considerations a substantial fraction of respondents talk about substitutes to online-therapy, such as in person-therapy. Our open-ended data reveals no significant differences in paying attention to substitutes to online therapy in the open-ended responses. Indeed, Appendix Table A.3 shows that the fraction of respondents that mention substitutes are close to 7.4 percent across all 3 treatment arms.

How do we reconcile our findings with findings in the extant literature? Our results beg the question of why previous work has found a negative association between perceived stigma and therapy demand whereas we find, if anything, the opposite. Our data provide some guidance. Consistent with our treatment effect, we observe a positive correlation between stigma priors and willingness to pay. This makes it less likely that the negative correlation uncovered in previous work is simply spurious and would not survive being put to a causal test. At least in our case, the correlational and causal evidence point to the same conclusion. This suggests that the negative correlation found in prior work reflects differences in time, context, survey instruments or samples.

Considering context, it seems possible that the more anonymous setting of online therapy reduces some of the mechanisms emphasized in previous work, but highly unlikely that it mutes them altogether. In particular, the self-labelling hypothesis forwarded in the literature should lead to just as potent an effect in online therapy. Moreover, while the risk of relatives or friends finding out might be reduced compared to the case of in-person therapy, there are potentially new concerns about data privacy that were absent in in-person therapy. Also, we do not see a negative relationship between perceived stigma and therapy demand even in

the case of group therapy, which increases the social nature of the context.

Next, we may think that perceived stigma is lower today than it was in the past. However, we show that average perceived stigma is high and pessimistic vis-a-vis the objective benchmark. Moreover, we see that there is a bigger negative effect of information on therapy demand among the most pessimistic.

5 Conclusion

Online therapy has seen a significant rise in popularity and usage, particularly in the United States. The online therapy services market in the US was valued at \$5.81 billion in 2021, demonstrating the significant scale and impact of this sector in providing mental health support.

The extant literature views high perceived stigma as a barrier to seeking therapy. Under this view policies that reduce perceived stigma are predicted to increase demand and are unambiguously welfare-improving. We find that reducing perceived stigma actually decreases demand. Our data allow us to argue that a plausible reason for this effect is that reducing stigma makes participants feel better about themselves and more hopeful about their future mental health, thereby reducing the perceived need for therapy. This, in turn, provides evidence of positive psychological benefits of information campaigns aiming to reduce social stigma. Future work should provide more systematic evidence on the mental health effects of such informational campaigns.

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Online Appendix: Perceived Stigma and the Demand for Therapy

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A Additional Tables and Figures

Table A.1: Demographics comparisons, general population and treatment conditions (means and standard errors in parentheses)

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	NHANES	NHANES	Study	Control	Flag	Info	p-value	p-value
		$PHQ8 \ge 10$	Sample				(2)- (3)	(4)- (5) - (6)
Age	49.568	49.604	30.037	30.550	29.338	30.225	0.000	0.189
	(0.259)	(0.846)	(0.232)	(0.422)	(0.381)	(0.399)		
Female	0.511	0.616	0.567	0.566	0.564	0.570	0.060	0.978
	(0.007)	(0.023)	(0.012)	(0.020)	(0.020)	(0.020)		
PHQ8 Score	3.188	13.575	14.145	14.148	14.065	14.221	0.006	0.973
	(0.058)	(0.157)	(0.085)	(0.150)	(0.138)	(0.155)		
Heard of BetterHelp			0.527	0.520	0.520	0.539		0.749
-			(0.012)	(0.020)	(0.020)	(0.020)		
Insurance Covers Therapy			0.483	0.474	0.483	0.494		0.794
• •			(0.012)	(0.021)	(0.021)	(0.021)		
Observations	5068	445	1844	615	615	614		

Notes: Column 1 presents statistics for a representative sample of the U.S. population based on the 2017-2018 National Health and Nutrition Examination Survey (NHANES), excluding individuals lacking demographic data or PHQ8 responses. Column 2 consists of a subset of the NHANES sample exhibiting depressive symptoms, defined by a PHQ8 Score of 10 or above. The p-value in column 7 results from a Kruskal-Wallis test comparing the study sample (column 3) to the NHANES subset with depressive symptoms (column 2). The p-value in column a Kruskal-Wallis test comparing three treatment conditions presented in columns 4 to 6. Due to missing values, Insurance Covers Therapy contains 1,721 observations (574, 574, 573 in Control, Stigma flag, and Stigma info conditions, respectively).

Table A.2: Treatment Effect on Willingness to Pay

	(1)	(2)	(3)
	Willingness	Willingness	Willingness
	to pay	to pay	to pay
Stigma info	-9.224**	-23.36***	-14.09***
	(4.675)	(6.329)	(5.273)
PHQ-8 Score (rescaled)		0.497	
		(0.812)	
PHQ-8 Score (rescaled) x Stigma info		-3.704***	
		(1.195)	
Diagnosed (d)			-22.69***
			(7.002)
Diagnosed (d) x Stigma info			22.37**
			(11.32)
Observations	1229	1229	1229
\mathbb{R}^2	0.258	0.263	0.263

Notes: Regressions contain preregistered controls of willingness to pay for a hypothetical example good, age, gender, and openness to online therapy, columns 1 and 3 also feature a participants PHQ-8 score. To ease the interpretation of regression coefficients, the PHQ-8 score is linearly transformed to start from 0. Robust standard errors in parentheses, * p<0.1, *** p<0.05, *** p<0.01.

Table A.3: Balance table for open-ended data (means and standard errors in parentheses)

	Whole Sample	Control	Flag	Info	p-value
Effectiveness	eness 0.633		0.629	0.603	0.056
	(0.011)	(0.019)	(0.019)	(0.020)	
Financial Cost	0.689	0.668	0.683	0.717	0.172
	(0.011)	(0.019)	(0.019)	(0.018)	
Time	0.208	0.210	0.190	0.223	0.360
	(0.009)	(0.016)	(0.016)	(0.017)	
Social Concerns	0.013	0.005	0.016	0.018	0.090
	(0.003)	(0.003)	(0.005)	(0.005)	
Medication	0.006	0.005	0.005	0.008	0.690
	(0.002)	(0.003)	(0.003)	(0.004)	
Therapist	0.028	0.031	0.021	0.031	0.483
•	(0.004)	(0.007)	(0.006)	(0.007)	
Insurance	0.095	0.122	0.096	0.067	0.004
	(0.007)	(0.013)	(0.012)	(0.010)	
Substitute	0.073	0.078	0.073	0.068	0.810
	(0.006)	(0.011)	(0.011)	(0.010)	
Low Duration	0.022	0.021	0.021	0.023	0.975
	(0.003)	(0.006)	(0.006)	(0.006)	
Inflation	0.012	0.015	0.013	0.010	0.736
	(0.003)	(0.005)	(0.005)	(0.004)	
In-Person Therapy	0.104	0.098	0.114	0.101	0.616
1,7	(0.007)	(0.012)	(0.013)	(0.012)	
Observations	1844	615	615	614	

Notes: Frequency of considerations in the open-ended data, per the categorization presented in Appendix Table A.4. The p-value in the last column is from a Kruskal-Wallis test comparing the 3 groups.

Table A.4: Handcoding scheme of open-ended data

Category	Description	Example Responses
Cost	Financial cost of therapy	"BetterHelp's pricing seems reasonable compared to traditional therapy, especially given its accessibility and flexibility."
Effectiveness	Focus on effectiveness of therapy	"Therapy can be life-changing, offering new perspectives and coping mechanisms that significantly improve mental health"
Inflation	Rise in costs or lower disposable incomes	"The increasing costs of living and healthcare make budgeting for therapy more challenging, especially for those with fixed incomes."
In-Person Therapy	Preference for in-person therapy sessions	"I prefer in-person therapy sessions for their personal touch and direct interaction, despite the convenience of online options like BetterHelp."
Insurance	Therapy covered by insurance	"Having therapy covered by insurance is crucial for me, as it signifi- cantly reduces the financial burden of mental health care."
Low Duration	Insufficient duration (4 weeks) for mental health improvement	"A short therapy duration might not be enough to address deep-rooted issues, raising concerns about its long-term effectiveness."
Medication	Concerns about medication	"I'm open to medication as part of my treatment plan, hoping it can provide the relief I need to function better daily."
Social Concerns	Positive or negative stereotypes about therapy and other social concerns	"There's a lingering fear that seeking therapy might lead others to perceive me as weak or unable to handle my problems on my own."
Substitute	Availability of better substitutes	"I'm exploring other options like support groups or self-help resources as alternatives to traditional therapy."
Therapist	Excitement or concerns about interacting with the therapist	"I'm looking forward to building a rapport with a therapist who can provide guidance and support through my challenges."
Time	Time commitment for therapy	"Finding time for therapy sessions is difficult with my current work and family commitments, making scheduling a key concern."

Table A.5: Handcoding scheme of open-ended data on the perceived aim of the study

Category	Description	Example Responses
Correct Stigma	State that survey tried to measure how in-	"How stigma or stereotypes associated with therapy and
	formation about stigma in the experiment	depression affect people's willingness to spend money on
	affect the valuation of therapy.	getting help."
Depression	State that survey tried to measure views	"Just to understand how people view depression in the
	about depression	world."
Depression History	State that survey tried to study if people	"If depressed people are more willing to spend more or less
	had depression, and how depression might	money."
	impact the result	
Determinants of Ther-	State that survey tried to measure why peo-	"To see what are deciding factors as to why people choose
apy Demand	ple seek therapy	to seek out therapy or not."
Don't Know	Indicate uncertainty	"I have no idea what the goal of this study is."
Junk	Nonsensical responses	"Too cold to type."
Marketing	Survey is a method of marketing for Better-	"To get the name of BetterHelp out there."
	Help	
Mental Health Aware-	Survey is interested in awareness or con-	"Maybe it is related to how we value our mental wellness."
ness	cerns about mental health	
Opinions on Therapy	State that survey tried to measure opinions	"Seeing how people perceive therapy."
	about therapy	
Other	Some other explanation that is not junk	"I think it was to see if people who have depression can
		focus on reading."
Perception of Online	Specifically mention the concept of online	"To gauge people's interest in online therapy."
Therapy	therapy	
Perceptions of Stigma	State that survey tried to measure percep-	"How people feel about the stigma of therapy."
	tions of social or self stigma	
Perceptions of Ther-		"To see if people found therapy effective or not."
apy Effectiveness	tions of therapy effectivenes.	
Valuation	State that survey tried to measure how	"I think it has something to do with seeing how people value
	much people are willing to pay for therapy	therapy."

Table A.6: Correlation of stigma beliefs

	Prior,	Prior,	Posterior,	Posterior,	Posterior,
	quantitative	qualitative	quantitative	qualitative	neighborhood
Prior, quantitative	1.000				
Prior, qualitative	0.721***	1.000			
Posterior, quantitative	0.790***	0.614***	1.000		
Posterior, qualitative	0.257***	0.299***	0.330***	1.000	
Posterior, neighborhood	0.616***	0.462***	0.702***	0.433***	1.000

Notes: "Prior [Posterior], quantitative" is a response to question asking the perceived share of Americans in an initial [another] survey who agreed with the statement that people with depression are lazy, hard to be around, and have weak character [are often unreliable, incompetent, and have weak character], ranging from 0 to 100. "Prior [Posterior], qualitative" is a response to question asking the likelihood that the majority of Americans from an initial [another] survey agreed with the statements above, ranging from 1 (very unlikely) to 5 (very likely). "Posterior, neighborhood" is a reponse to a question asking the perceived share of people in the participants' neighborhood who agree with the statement that people with depression are often unreliable, incompetent, and have weak character, ranging from 0 to 100. * p < 0.1, ** p < 0.05, *** p < 0.01.

Table A.7: Treatment effect on posteriors about stigma

	(1)	(2)	(3)
	Posterior	Posterior	Posterior
	quantitative	qualitative	neighborhood
Stigma info	-16.22***	-0.205***	-12.93***
	(0.956)	(0.0704)	(1.182)
Observations	1229	1229	1229
\mathbb{R}^2	0.198	0.026	0.098

Notes: The reference group is Stigma flag. Regressions contain preregistered controls of indicator for having heard of BetterHelp, openness to online therapy, and PHQ-8 score; robust standard errors in parentheses, * p<0.1, ** p<0.05, *** p<0.01.

B The Stigma flag treatment

This appendix analyses the effect of the Stigma flag treatment, which did not provide information about stigma, but merely elicited prior beliefs and directed attention to the fact that information about stigma exists and will be shared with participants at the end of the experiment. In Table B.1 we regress several measures of attention on whether or not a participant was in the Stigma flag condition. Columns 1 through 3 measure whether being in Stigma flag raised the likelihood of participants mentioning stigma or esteem as considerations that informed their willingness to pay. We find no such effects. Column 4 features a more structured elicitation of attention to stigma that asked participants to pick possible drivers of demand from a list. Stigma flag did not affect whether participants stated that being afraid of what others thought about them informed their demand decision. Table B.2 repeats the mechanism analysis from the main experiment for the Stigma flag treatment. We see that the Stigma flag treatment did not have sizable effects post-treatment measures of the kind of barriers to demand emphasized in the psychology literature. We find that the *Stigma flag* treatment has a small effect on worries about others finding out, but the effect only acieves marginal statistical significance. This measure was elicited a separately from the measure that featured in column 4 of Table B.1 and is contradicted by it. Together with the fact that perceived stigma and willingness to pay are positively correlated (while stigma and worry about others is not), these results spoak against the idea that by merely flagging stigma we raise the salience of an important barrier to demand.

In Table B.3 we explore whether the *Stigma flag* treatment shifted the three main outcomes in our mechanism experiment. The first column shows a small negative effect of *Stigma flag* on

Table B.1: Effect of Stigma flag on attention to stigma

· · · · · · · · · · · · · · · · · · ·				
	(1)	(2)	(3)	(4)
	Negative	Positive	Esteem or	Afraid what
	Stigma	esteem	stigma	others think
Stigma flag	-0.00488	-0.0114	0.00325	0.0130
	(0.0219)	(0.0223)	(0.0268)	(0.0175)
Observations	1230	1230	1230	1230
\mathbb{R}^2	0.000	0.000	0.000	0.000

Notes: All regressions include data from the *Stigma flag* and the *Pure control* condition. Dependent variables in columns 1 through 3 are based on open-ended considerations participants said went into their willingness to pay decision. We handcoded whether participants mentioned stigma (column 1) or positive esteem (column 2) or any notion of esteem or stigma (column 3). The dependent variable in column 4 measures whether participants selected that they were afraid of what others might think from a list of possible considerations that went into their demand decision. Robust standard errors in parentheses, * p<0.1, *** p<0.05, **** p<0.01.

Table B.2: Effects of *Stigma flag* on measures of the mechanisms

	(1)	(2)	(3)	(4)	(5)	(6)
	Comfortable	Comfortable	Worried	Worried	Self-stigma	Self-stigma
	sharing	therapist	others	about	(shocked)	(not
	identity	interaction	find out	self-label		shocked)
Stigma flag	-0.0263	-0.0822	0.109*	0.0159	0.0148	0.161
	(0.0693)	(0.0642)	(0.0574)	(0.0653)	(0.152)	(0.144)
Observations	1225	1225	1225	1225	1225	1225
<u>R</u> ²	0.000	0.001	0.003	0.000	0.000	0.001

Notes: Robust standard errors in parentheses, * p<0.1, ** p<0.05, *** p<0.01.

agreement with the statement "Right now, I am feeling down and I don't have the motivation to do anything about it." In the second column we see that *Stigma flag* increases agreement with the statement "Right now, I am feeling fairly good and I don't see the need to do anything about my mental health", albeit not to an extent that rises to statistical significance. The third column shows that *Stigma flag* decreases agreement with the statement "The way others view depressed people keeps me from being optimistic about improving my future mental health by myself." The effect of *Stigma flag* on a Positivity Index, explained in the main text, that aggregates the previous three measures is positive and highly significant. These findings suggest that *Stigma flag* may have increased willingness to pay through a mechanism that is not too different from the mechanism behind the effect of *Stigma info*.

Table B.3: Effect of Stigma flag on attention to stigma

	(1)	(2)	(3)	(4)
	Sad	Нарру	Pessimistic	Index
Stigma flag	-0.127*	0.0567	-0.180**	0.364**
	(0.0760)	(0.0741)	(0.0785)	(0.161)
Observations	674	674	672	672
\mathbb{R}^2	0.004	0.001	0.008	0.008

Notes: Dependent variables in the first three columns measure agreement with the following statements; "Right now, I am feeling down and I don't have the motivation to do anything about it" (Column 1), "Right now, I am feeling fairly good and I don't see the need to do anything about my mental health" (Column 2), "The way others view depressed people keeps me from being optimistic about improving my future mental health by myself." (Column 3); Column 4 features an index of positively valenced beliefs and emotions that subtracts the column 1 and 3 from column 2; robust standard errors in parentheses, * p<0.1, *** p<0.05, **** p<0.01.

C Stigma measurement

C.1 Qualitative pilots on stigma measurement

Rather than adopting lengthy psychometric scales (such as the often-used 20-item scale proposed by Link et al. (1989)) or imposing our own definition of stigma, we decided to conduct qualitative pilots to inform our design by participants' construal of stigma. To so do, we conducted qualitative pilots in which respondents described in their own words how they think other people think about depression stigma.

Sample We conducted this pilot with two samples of respondents from Amazon Mechanical Turk in January 2021, both selected based on a score on their PHQ-8 questionnaire greater or equal than 10. The first sample includes 103 individuals that were asked to express what depression stigma is in an open-text form. The second sample includes 97 individuals that were asked to select the hurtful stereotypes that they believe to be associated with depression from a closed list.

Qualitative question The first sample of respondents completes the following open-ended question:

Imagine a person with depression. What views about depressed people by others does this person worry about most?

We then carefully read through all of these responses and hand-coded them into 12 hurtful stereotypes, which include: boring, cannot be trusted, childish, dangerous, hard to be around, impatient, incompetent, just pretending to be sick, lazy, overconfident, selfish, weak character. We then used these 12 hurtful stereotypes in a pilot with a structured question.

Closed question The second sample of respondents the completes the following question

Imagine a person with depression. What views about depressed people by others does this person worry about most? From the list below, please select the three most harmful views about depressed people.

The order of items from this list is randomized.

Results Based on this structured list from the second sample of respondents, we find that the most commonly mentioned characteristics associated with depressed people were the following: weak character (37%), lazy (33%), and hard to be around (31%).¹ These three stereotypes come to form the statement that we use to quantify stigma:

People with depression are lazy, hard to be around, and have weak character

¹Followed by dangerous (31%), selfish (30%), cannot be trusted (26%), just pretending to be sick (26%), incompetent (25%), boring (21%), impatient (15%), overconfident (13%), childish (12%).

C.2 Pre-survey to quantify stigma

Sample We conducted this pilot with respondents from a representative sample of the US population that were recruited on Lucid between November 2020 and January 2021.

Design We asked our respondents to what extent they agree to each of the following statements:

- 1. People with depression are lazy, hard to be around, and have weak character (517 observations).
- 2. People with depression are often unreliable, incompetent, and have weak character (235 observations).

Whereby 1. follows from the prelimary work described in the previous section and 2. captures stereotypes that are particularly harmful in the workplace. They respond on a 5 point-scale (Strongly agree, Agree, Neither agree nor disagree, Disagree, Strongly disagree).

Results We find the following distribution of responses. For the first statement: 5% strongly agree, 11% agree, 20% neither agrees nor disagree, 30% disagree, 34% strongly disagree. For the second statement: 7% strongly agree, 19% agree, 19% neither agrees nor disagree, 23% disagree, 32% strongly disagree.

D Group therapy experiment

In this section, we describe an experiment on group therapy.

D.1 Sample

Respondents were recruited primarily in New York State using Prolific, Dynata and CloudResearch as most of our partner's therapists only have licenses to practice therapy sessions in New York State.² This recruitment took place in the fall of 2021. Moreover, we only included participants who qualify as depressed based on having a PHQ-8 score of 10 or above and who had pessimistic prior beliefs about stigma. Because we hypothesized that increasing perceived stigma would decrease demand and be unambiguously disadvantageous to participants, we did not include participants for whom accurate information would have been bad news. As a result of these restrictions on the recruitment pool, we managed to recruit only 1100 participants, which is substantially less than we aimed for, even though we recruited participants over a period of several months.³

D.2 Design

Treatment groups Our main treatment administered information about stigma in exactly the same way that our main experiment did. Participants in a control condition stated their prior beliefs about stigma, but did not receive information. This condition was therefore similar to the *Stigma flag* condition in the main experiment.

Group therapy The key difference of this experiment is that rather than eliciting willingness to pay for one-on-one online therapy, we offered respondents online group therapy from a prominent an online group therapy service based in the US. This provider offers treatment for

²A few respondents were recruited from neighboring US states.

³This experiment was pre-registered on aspredicted #74868.

a wide range of diagnoses and life challenges, including anxiety, depression, and relationship issues, among others. The service primarily consists of one-hour weekly sessions of group cognitive-behavioral therapy, led by a licensed therapist. An initial consultation allows new subscribers to sort into the group that best suits them. Each group has at most twelve members, who take part in the session via Zoom. Participants can always choose how much to interact during the session depending on how much they have to say or how comfortable they feel, and they can choose to be anonymous to the rest of their group by using a nickname when they enter the Zoom meeting.

Pre-registered outcomes Our main outcome measures willingness to pay for therapy, elicited using a 31-item multiple price list (where the monetary alternative to therapy ranges from 0\$ to 300\$, in 10\$ increments). Every participant had one decision implemented at random, and received either a voucher for therapy or money depending on their choice. Among those who received a voucher for therapy, we also measured whether they enrolled in the therapy service that we offered, in which case we covered their cost. Our software selects with probability 90 percent the choice between 0\$ and therapy, which comes with the two main advantages of (a) maximizing access to therapy and (b) allowing us to investigate the correlation between willingness to pay and actual enrollment net of mechanical effects. We also collected information on whether participants showed up for therapy sessions, but problems on behalf of the provider with scheduling sessions may make this data unreliable.

Table D.1: Treatment effect on posterior beliefs and willingness to pay

	(1)	(2)	(3)	(4)	(5)
	Posterior	Willingness	Willingness	Enrollment	Enrollment
	belief	to pay	to pay	to therapy	to therapy
Stigma info	-20.10***	-1.809	-10.24	-0.00444	-0.0165
	(1.174)	(5.965)	(6.989)	(0.0184)	(0.0209)
Sample restriction	None	None	Not being	0\$ choice	Not being
			treated		treated;
					0\$ choice
Control mean	47.00	70.28	68.04	0.0948	0.0836
Observations	1100	1100	708	993	636
\mathbb{R}^2	0.206	0.000	0.003	0.000	0.001

Notes: The reference group is *Stigma flag.* Sample contains only participants with pessimistic prior. Column 3 restricts the sample to those not currently being treated for mental health; column 4 restricts the sample to those for whom the choice implemented for payoff was the one between 0\$ and therapy; column 5 combines the restrictions in columns 3 and 4. Regressions do not contain controls; robust standard errors in parentheses; * p<0.1, ** p<0.05, *** p<0.01.

D.3 Results

Table D.1 presents the results of the group therapy experiment. Column 1 features a manipulation check and shows that the information significantly reduced posterior beliefs about stigma. Column 2 show a small negative effect of correcting stigma on willingness to pay that is statistically indistinguishable from zero. Column 3 repeats the analysis, but restricts the sample to those who are not already being treated for mental health problems. This is what we did and preregistered in our main experiment with BetterHelp. However, this sample restriction was not preregistered in the group therapy experiment. In this sub-sample, reducing perceived stigma leads to a reduction of willingness to pay by 10.24 dollars, although the effect is not statistically significant at conventional levels. The relevant point of comparison with our main experiment is given by column 1 of Table 1, where we present the treatment difference between *Stigma info* and *Stigma flag* for participants with pessimistic priors and find that *Stigma info* reduced WTP by 10.38 dollars, a strikingly similar point estimate.

There are several potential reasons for why estimates in the group therapy experiment

appear to be more noisy than in the main experiment. Two reasons stand out. First, we did not elicit and include as a control willingness to pay for an example good, a strategy that has been shown to improve the statistical power of analysis that feature willingness to pay measures as an outcome variable. Second, 381 participants seem to categorically dislike group therapy and are not willing to pay anything for it. Others already use alternative forms of therapy. So the group of participants whose demand our treatment could reasonably affect is small thereby reducing our effective sample size.

Columns 4 shows that *Stigma info* has a negative but close-to-zero effect on whether participants who received the voucher sign up for the therapy service. Columns 5 repeats the analysis for only those who are not are not currently under alternative treatment for mental health problems, finding a somewhat more negative yet still statistically insignificant effect.⁴ These results line up with the analyses that features willingness to pay as the outcome variable. In both cases, we do not observe significant negative effects. Yet our results rule out meaningful positive effects of reduced stigma on the demand for group therapy that are hypothesized in the extant literature.

D.4 Does willingness to pay predict enrollment?

The group therapy experiment allows us to speak to the external validity of our willingness to pay measure because we observe it alongside the real outcome of participants actually filling out the forms required to enroll in the online group therapy service and subsequently

⁴Only participants for whom a multiple price list scenario that had them receive the therapy voucher was realized had a choice of whether or not to go through the process of enrolling in the service. Realized scenarios where drawn randomly from a very skewed distribution that featured a "price of zero" scenario 90 percent of the time. Our analysis in columns 4 and 5 looks at the ninety percent of participants who received the voucher regardless of their stated willingness to pay.

choosing to enroll. We see that willingness to pay and enrollment exhibit a correlation of 0.171 (p < 0.001), thereby increasing our confidence in the ecological validity of our WTP measure.

E Experimenter demand effect

To examine the potential role of experimenter demand effects, we rely on an open-ended question: "Please describe in a few words what you think the aim was of the research conducted through this survey." Appendix Figure E.1 shows that only 2.2% of respondents correctly guessed our study's purpose, i.e. studying the effects of perceived social stigma on therapy demand; 5.8% of respondents guessed that the study purpose was studying perceptions of stigma. The vast majority responses are very unspecific: 42% percent of respondents mention that the survey tried to measure people's valuation of therapy. 16.5% mention that the survey tried was about depression, 12% thought it was about perceptions of online therapy and 11.8% believed that it was about opinions on therapy. 8.4% of respondents explicitly indicate that they are quite unsure about the purpose. Table E.1 shows that our main treatment effects are robust to excluding those respondents that correctly guessed the study hypothesis or believed that the study purpose was about stigma perceptions. In light of the evidence on the muted quantitative importance of experimenter demand effects (de Quidt et al., 2018) and the above findings, experimenter demand effects seem less likely to account for the treatment effects we uncover in our experiment. At the same time, we acknowledge that we cannot fully rule them out.

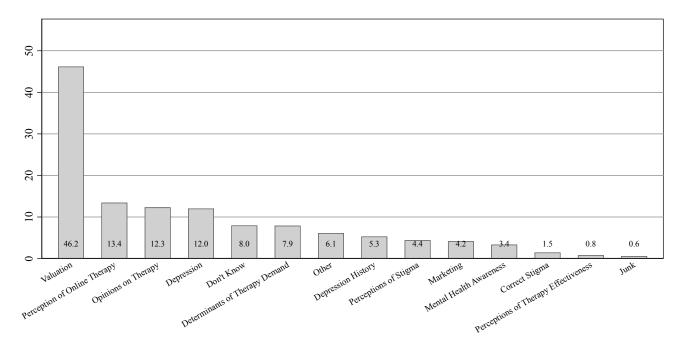


Figure E.1: This Figure displays data from all respondents.

Notes: The bars represent the fractions of respondents (1844 observations) who mentioned a given category in their written responses when asked what they thought the study is about.

Table E.1: Treatment Effect on Willingness to Pay: Experimenter Demand Effect Robustness Check

	(1)	(2)
	Willingness	Willingness
	to pay	to pay
Stigma info	-9.224**	-8.879*
	(4.675)	(4.824)
Observations	1229	1171
\mathbb{R}^2	0.258	0.257

Notes: Regressions contain preregistered controls of willingness to pay for a hypothetical example good, age, gender, and openness to online therapy, participants PHQ-8 score. Column 2 excludes the respondents that correctly guessed the study hypothesis or believed that the study purpose was about stigma perceptions. Robust standard errors in parentheses; * p<0.1, ** p<0.05, *** p<0.01.

F Instructions: main experiment

Consent

Thank you for taking part in this survey. You must be 18 or above to participate. You are not allowed to participate in this study more than once. The survey takes just a few minutes. If you decide to participate in the survey, then we ask you to take all questions seriously. Data is collected for the purpose of research. Keep in mind that your participation is voluntary and that you can decide to withdraw from the study at any point. At the end of the survey, we may offer you a health service to which you may enroll for 4 weeks. This service is sponsored by a research grant so that you will not have to pay anything out of pocket. All information is treated as highly confidential. Note that there will be no deception in the instructions. Everything we tell you about the tasks you face will be implemented in the exact way we tell you. Any analysis and publication will only use data in anonymous form. This study was cleared by the ethics committee of the University of Essex.

If you experience a technical error or problem, then do not try to restart or retake the study. Rather, send us an email with a description of your problem and we will get back to you. For any question or complaint, please contact Egon Tripodi (egontrpd@gmail.com). By clicking on "Yes, I consent to participate in the study" you give your consent to take part in the study.

[Yes, I consent to participate in the study; No, I would not like to participate in the study]



Attention screener

The next question is about the following problem. In questionnaires like ours, sometimes there are participants who do not carefully read the questions and just quickly click through the survey. This means that there are a lot of random answers which compromise the results of research studies. To show that you read our questions carefully, please enter 333 as your answer to the next question. Given the above, what is your favorite number?

[Number]



Demographics

What is your age?

[Dropdown list of possible ages]

What is your gender?

[Male; Female; Non-binary]

In which state do you currently reside?

[Dropdown list of possible states]



Personal health questions

Over the last 2 weeks, how often have you been bothered by any of the following problems?

- Little interest or pleasure in doing things
- Feeling down, depressed, or hopeless
- Trouble falling or staying asleep, or sleeping too much
- Feeling tired or having little energy
- Poor appetite or overeating
- Feeling bad about yourself or that you are a failure or have let yourself or your family down
- Trouble concentrating on things, such as reading the newspaper or watching television
- Moving or speaking so slowly that other people could have noticed. Or the opposite being so fidgety restless that you have been moving around a lot more than usual
- Thoughts that you would be better off dead, or of hurting yourself in some way

[Not at all; Several days; More than half of the days; Nearly every day]



The previous questions are commonly used to measure depression. By depression we mean a mental disorder that can be characterized by sadness, a lack of interest and a loss of pleasure, feelings of guilt and low self-esteem, sleep disorders, loss of appetite, tiredness and poor concentration.



We will now ask you a few additional questions about depression.

- Have you ever been diagnosed with depression?
- Have you ever overcome depression?
- Have you ever attended psychological therapy for depression?
- Are you currently undergoing any form of treatment for depression (e.g. psychological therapy)
- Do you have health insurance that covers psychological therapy?
- Would you ever consider taking part in individual online therapy for depression?

[Yes; No]



Do you want to continue participating in this study, answer additional questions for 5 more minutes, and receive a \$1.2 bonus for your participation?

[Yes, I will take part in this 5 minute survey for a \$1.2 bonus; No, I don't want to participate]



Explanation for WTP

HOW MUCH ARE YOU WILLING TO SPEND? During this experiment, we may ask you how much you would be willing to pay for certain products or services. These decisions may have real consequences in that they will actually be implemented for some participants in the survey. Let us take you through a hypothetical example to explain how this kind of buying decision will play out. Please make sure you understand the example. Example: How much would you spend on a 1 month spa membership? Suppose the product in question is a one month membership at a spa in your area, valued at 250 dollar. The membership entitles you to use a sauna, an indoor swimming pool, and to receive one free massage a week.

We will ask you for the maximum amount of money you would be willing to pay for the membership. We call this amount your valuation. You will state your valuation using a slider. You will not have to use your own money to buy the product. After you stated your valuation, the computer will randomly pick a dollar amount between 0 and 300. If this dollar amount is larger than your valuation, then the dollar amount will be paid out to you.

If the dollar amount is smaller than your valuation, then you will receive the spa membership.

This rule means that it is in your best interest to state the maximum amount of money you would be willing to pay for the product. To see why, consider the case where you selected a number smaller than your true valuation. Then there is a chance that the computer picks a dollar amount that is larger than your chosen amount, but smaller than your true valuation. Receiving this dollar amount means that you would have been better of stating your true valuation, which would have resulted in you receiving the product. Remember, during the survey the buying decision of some participants will actually be implemented. Depending on their decisions and the random dollar amount generated by the computer, these participants will then either receive money or the product.

Control question

Given the payment rule, it is in my best interest to state the largest amount of money that I would be willing to pay for the product.
My buying decision during the survey may have real consequences because it may be implemented.
If my decision is implemented, then I will either receive money or the product, depending on my choices.

Practice question

Just for practice, please state your valuation: On the slider below, indicate the maximum amount of money you would pay for the one month spa membership? (Please give us your best answer)

My valuation is ___

[Slider from 0 to 300]



Explanation of incentives

WHAT IS YOUR BEST GUESS?

Some of the questions that follow will ask you to make estimates and will be marked with a \$ sign. One of these questions will be randomly selected for payment, regardless of whether your buying decision is implemented. If your answer in the selected question is within 3 percent of the truth, then you will receive a \$0.50 dollar bonus. Therefore, it is in your best interest to provide your best guess.



Prior stigma

We recently conducted a survey with a sample of over 100 Americans. The composition of this sample resembles the American population at large.

\$ What percentage of Americans from this survey would you say agreed or strongly agreed with the following statement?

"People with depression are lazy, hard to be around, and have weak character."

[Number from 0 to 100]

Here is a related question. How likely is it that the majority of Americans from this survey agreed or strongly agreed with the following statement?

"People with depression are lazy, hard to be around, and have weak character."

[Very unlikely; Unlikely; Neither likely nor unlikely; Likely; Very likely]



Stigma flag

You said that you believe that XX% of Americans either agree or strongly agree with the following statement:

"People with depression are lazy, hard to be around, and have weak character."

At the end of this study we will send you the correct answer to this question as a private message on Prolific.

Stigma information

You said that you believe that XX% of Americans either agree or strongly agree with the following statement:

"People with depression are lazy, hard to be around, and have weak character."

According to our survey of over 100 Americans, the actual share of Americans that either agree or strongly agree with this statement is XX%.



Post-treatment stigma beliefs

\$ We recently conducted another survey with a sample of over 100 Americans. The composition of this sample resembles the American population at large. What percentage of Americans from this survey would you say agreed or strongly agreed with the following statement?

"People with depression are often unreliable, incompetent, and have weak character."

[Number from 0 to 100]



Next, suppose that we conducted the same survey with 100 people from your neighborhood. What percentage of these people would you say would agree or strongly agree with the following statement?

"People with depression are often unreliable, incompetent, and have weak character."

[Number from 0 to 100]



How likely do you think it is that people you regularly interact with would hold negative views about you if they learned that you struggled with depression?

[Very unlikely; Unlikely; Neither likely nor unlikely; Likely; Very likely]



Betterhelp

On the next screen we introduce BetterHelp, one of the leading online therapy services in the United States. We will then ask you some questions to understand how valuable you find this type of service. This is not promotional material.

Have you ever heard of BetterHelp?

[Yes; No]



betterhelp.com is an online therapy service. They offer treatment for a wide range of diagnoses and life challenges, including anxiety, depression, and relationship issues, among others. You can send audio, video, or text messages to your therapist at any time in the messaging room. You can also schedule weekly live sessions (30 to 45 min) with your therapist to communicate via phone, video, or live chat. If you don't like your therapist, you can ask to be matched to a different therapist. BetterHelp has over 25,000 therapists with different qualifications and areas of expertise.



Willingness to pay

We will now ask you about the maximum amount of dollars you are willing to spend on four weeks of therapy from BetterHelp. This service is normally priced at \$320 for 4 weeks.

Please indicate the maximum dollar amount you are willing to spend, your valuation, using the slider below. The choice of 10 participants in this study will be implemented. If your choice is implemented, then you will either receive a voucher for four weeks of therapy from BetterHelp or a dollar amount, based on the payment rule we explained to you at the beginning of the survey. (Remember: After you stated your valuation, the computer will randomly pick a dollar amount between 0 and 350. If this dollar amount is larger than your valuation, then the dollar amount will be paid out to you. If the dollar amount is smaller than your valuation, then you will receive therapy from BetterHelp.) You will find out whether your choice was implemented and whether you receive money or therapy at the end of the survey.

It is not important that you understand the details of the payment rule, just remember that it is in your best interest to state your true valuation.

Your decision

What is your valuation, i.e. the maximum amount of money you would pay for the four weeks of therapy from BetterHelp?

My valuation is __

[Slider from 0 to 300]



Considerations (open-ended)

What considerations do you have on your mind when choosing how much you would be willing to spend on 4 weeks of online therapy from BetterHelp? Please write 2-3 sentences. You may mention both downsides and benefits of buying therapy (if any were on your mind).

[Open text]



Considerations (structured)

On the previous page you provided the following considerations. Please select from the list below the considerations you had in mind when you wrote this. Please tick all that apply.

Hard to make time for therapy
Easy to make time for therapy
Afraid of meeting the therapist
Looking forward to interacting with the therapist
Afraid of what other people will think of me
Happy to show others I am taking care of myself
Afraid of medication
Hopeful of receiving help in the form of medication
High financial cost of therapy
Low financial cost of therapy
High effectiveness of therapy
Low effectiveness of therapy
Negative stigma about people seeking therapy
Positive stereotypes about people seeking therapy
None of the above



Did you find the way in which you were asked to state your valuation of 4 weeks of Better-Help therapy confusing?

[Very confusing; Confusing; Slightly confusing; Not at all confusing]



Post main outcomes

Please describe in a few words what you think the aim was of the research conducted through this survey.

[Open text]



To what extent do you agree with each of the following statements about yourself?

- I am often unreliable
- I am often incompetent
- My behavior is sometimes unpredictable
- Generally speaking, I have a weak character
- I am often lazy
- I am often hard to be around

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



Imagine that you decide to seek treatment in the form of online therapy. How worried would you be about any problems caused by coworkers, friends, or family finding out about your seeking therapy.

[Not worried at all; Slightly worried; Somewhat worried; Moderately worried; Very worried]



Imagine that you decide to seek treatment in the form of online therapy. How effective do you think completing therapy would be for you in overcoming depression?

[Very effective; Effective, Somewhat effective; Ineffective; Very ineffective)]

Imagine that you decide to seek treatment in the form of online therapy. How would you feel about having to interact with the therapist?

[Very comfortable; Mostly comfortable; Neither comfortable nor uncomfortable; Moderately uncomfortable]

Imagine that you decide to seek treatment in the form of online therapy. How would you feel about sharing your identity during sessions?

[Very comfortable; Mostly comfortable; Neither comfortable nor uncomfortable; Moderately uncomfortable]



To what extent do you agree with the following statement?

"If I were to seek treatment, then that would label me as depressed, which would make me feel worse about myself."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



How painful is it for you to think about potential problems with your mental health and what they entail for your life?

[Very painful; Painful; Slightly painful; Not painful at all]



How relevant did you find the information on effectiveness provided in this survey?

[Very relevant; Relevant; Slightly relevant; Not relevant at all]



How trustworthy did you find the information on effectiveness provided in this survey?

[Very trustworthy; Trustworthy; Neither trustworthy nor untrustworthy; Untrustworthy; Very untrustworthy]



To what extent would you say that you paid close attention to the instructions throughout the survey? The answer to this question does not affect your task approval or earnings.

[To a great extent; Somewhat; Little; Not at all]

G Instructions: mechanisms experiment

Consent

Thank you for taking part in this survey. You must be 18 or above to participate. You are not allowed to participate in this study more than once.

The survey takes just a few minutes. If you decide to participate in the survey, then we ask you to take all questions seriously. Data is collected for the purpose of research. Keep in mind that your participation is voluntary and that you can decide to withdraw from the study at any point.

Note that there will be no deception in the instructions. Everything we tell you about the tasks you face will be implemented in the exact way we tell you. Any analysis and publication will only use data in anonymous form. This study was cleared by the ethics committee of the University of Essex.

If you experience a technical error or problem, then do not try to restart or retake the study. Rather, send us an email with a description of your problem and we will get back to you. For any question or complaint, please contact Egon Tripodi (egontrpd@gmail.com). By clicking on "Yes, I consent to participate in the study" you give your consent to take part in the study.

[Yes, I consent to participate in the study; No, I would not like to participate in the study]



Attention screener

The next question is about the following problem. In questionnaires like ours, sometimes there are participants who do not carefully read the questions and just quickly click through the survey. This means that there are a lot of random answers which compromise the results of research studies. To show that you read our questions carefully, please enter 333 as your answer to the next question. Given the above, what is your favorite number?

[Number]



Demographics

What is your age?

[Dropdown list of possible ages]

What is your gender?

[Male; Female; Non-binary]

In which state do you currently reside?

[Dropdown list of possible states]



Personal health questions

Over the last 2 weeks, how often have you been bothered by any of the following problems?

- Little interest or pleasure in doing things
- Feeling down, depressed, or hopeless
- Trouble falling or staying asleep, or sleeping too much
- Feeling tired or having little energy
- Poor appetite or overeating
- Feeling bad about yourself or that you are a failure or have let yourself or your family down
- Trouble concentrating on things, such as reading the newspaper or watching television
- Moving or speaking so slowly that other people could have noticed. Or the opposite being so fidgety restless that you have been moving around a lot more than usual
- Thoughts that you would be better off dead, or of hurting yourself in some way

[Not at all; Several days; More than half of the days; Nearly every day]



The previous questions are commonly used to measure depression. By depression we mean a mental disorder that can be characterized by sadness, a lack of interest and a loss of pleasure, feelings of guilt and low self-esteem, sleep disorders, loss of appetite, tiredness and poor concentration.



We will now ask you a few additional questions about depression.

- Have you ever been diagnosed with depression?
- Have you ever overcome depression?
- Have you ever attended psychological therapy for depression?
- Are you currently undergoing any form of treatment for depression (e.g. psychological therapy)
- Do you have health insurance that covers psychological therapy?
- Would you ever consider taking part in individual online therapy for depression?

[Yes; No]



Do you want to continue participating in this study, answer additional questions for 5 more minutes, and receive a \$1.2 bonus for your participation?

[Yes, I will take part in this 5 minute survey for a \$1.2 bonus; No, I don't want to participate]



Betterhelp

On the next screen we introduce BetterHelp, one of the leading online therapy services in the United States. We will then ask you some questions to understand how valuable you find this type of service. This is not promotional material.

Have you ever heard of BetterHelp?

[Yes; No]



betterhelp.com is an online therapy service. They offer treatment for a wide range of diagnoses and life challenges, including anxiety, depression, and relationship issues, among others. You can send audio, video, or text messages to your therapist at any time in the messaging room. You can also schedule weekly live sessions (30 to 45 min) with your therapist to communicate via phone, video, or live chat. If you don't like your therapist, you can ask to be matched to a different therapist. BetterHelp has over 25,000 therapists with different qualifications and areas of expertise.



Explanation of incentives

WHAT IS YOUR BEST GUESS?

Some of the questions that follow will ask you to make estimates and will be marked with a \$ sign. One of these questions will be randomly selected for payment, regardless of whether your buying decision is implemented. If your answer in the selected question is within 3 percent of the truth, then you will receive a \$0.50 dollar bonus. Therefore, it is in your best interest to provide your best guess.



Prior stigma

We recently conducted a survey with a sample of over 100 Americans. The composition of this sample resembles the American population at large.

\$ What percentage of Americans from this survey would you say agreed or strongly agreed with the following statement?

"People with depression are lazy, hard to be around, and have weak character."

[Number from 0 to 100]



Here is a related question. How likely is it that the majority of Americans from this survey agreed or strongly agreed with the following statement?

"People with depression are lazy, hard to be around, and have weak character."

[Very unlikely; Unlikely; Neither likely nor unlikely; Likely; Very likely]

Stigma flag

You said that you believe that XX% of Americans either agree or strongly agree with the following statement:

"People with depression are lazy, hard to be around, and have weak character."

At the end of this study we will send you the correct answer to this question as a private message on Prolific.

Stigma information

You said that you believe that XX% of Americans either agree or strongly agree with the following statement:

"People with depression are lazy, hard to be around, and have weak character."

According to our survey of over 100 Americans, the actual share of Americans that either agree or strongly agree with this statement is XX%.



Post-treatment stigma beliefs

\$ We recently conducted another survey with a sample of over 100 Americans. The composition of this sample resembles the American population at large. What percentage of Americans from this survey would you say agreed or strongly agreed with the following statement?

"People with depression are often unreliable, incompetent, and have weak character."

[Number from 0 to 100]



Next, suppose that we conducted the same survey with 100 people from your neighborhood. What percentage of these people would you say would agree or strongly agree with the following statement?

"People with depression are often unreliable, incompetent, and have weak character."

[Number from 0 to 100]



How likely do you think it is that people you regularly interact with would hold negative views about you if they learned that you struggled with depression?

[Very unlikely; Unlikely; Neither likely nor unlikely; Likely; Very likely]



Emotions

To what extent do you agree with the following statement?

"Right now, I am feeling down and I don't have the motivation to do anything about it."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



To what extent do you agree with the following statement?

"Right now, I am feeling fairly good and I don't see the need to do anything about my mental health."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



Post outcomes

Do you agree with the following statement?

"At this point, I have a fairly good idea of how Americans view depressed people."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



The next couple of statements concern how society's current views of depressed individuals affect your expectations and plans. To what extent do you agree with the following statements:

• "The way others view depressed people keeps me from being optimistic about improving my future mental health by myself."

- "The way others view depressed people keeps me from seeking help from my social circle when my mental health is not good."
- "The way others view depressed people makes me feel that depression is rather common and normal and not something that needs to be treated with therapy."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



We recently conducted a survey with a sample of over 100 Americans. The composition of this sample resembles the American population at large. Participants were asked the same questions about depression symptoms you were asked at the beginning of your survey today, i.e. about negative symptoms like having little interest in doing things and having trouble concentrating etc.

What percentage of Americans from the survey would you say reported depression symptoms that are as severe as or more severe than yours?

[Number from 0 to 100]

People who report having many of the depression symptoms on several or even most days, are diagnosed as being depressed. In light of this, what percentage of Americans from the survey would be diagnosed as being depressed?

[Number from 0 to 100]

H Instructions: group therapy experiment

Consent

Thank you for taking part in this survey. You must be 18 or above, and currently reside in New York State to participate. You are not allowed to participate in this study more than once.

The survey takes just a few minutes. If you decide to participate in the survey, then we ask you to take all questions seriously. Data is collected for the purpose of research. Keep in mind that your participation is voluntary and that you can decide to withdraw from the study at any point.

At the end of the survey, we may offer you a health service to which you may enroll for 8 weeks. This service is sponsored by a research grant so that you will not have to pay anything out of pocket. The service provider may share information about your service usage with us. All information is treated as highly confidential.

Note that there will be no deception in the instructions. Everything we tell you about the tasks you face will be implemented in the exact way we tell you. Any analysis and publication will only use data in anonymous form. This study was cleared by the ethics committee of the University of Essex.

If you experience a technical error or problem, then do not try to restart or retake the study. Rather, send us an email with a description of your problem and we will get back to you. For any question or complaint, please contact Egon Tripodi (egon.tripodi@essex.ac.uk). By clicking on "Yes, I consent to participate in the study" you give your consent to take part in the study.

[Yes, I consent to participate in the study; No, I would not like to participate in the study]



Do you have an account with Prolific (a platform for online surveys)?

[Yes; No]



Attention screener

The next question is about the following problem. In questionnaires like ours, sometimes there are participants who do not carefully read the questions and just quickly click through the survey. This means that there are a lot of random answers which compromise the results of research studies. To show that you read our questions carefully, please enter 333 as your

answer to the next question. Given the above, what is your favorite number?

[Number]



Demographics

What is your age?

[Dropdown list of possible ages]

What is your gender?

[Male; Female; Non-binary]

In which state do you currently reside?

[Dropdown list of possible states]



Personal health questions

Over the last 2 weeks, how often have you been bothered by any of the following problems?

- Little interest or pleasure in doing things
- Feeling down, depressed, or hopeless
- Trouble falling or staying asleep, or sleeping too much
- Feeling tired or having little energy
- Poor appetite or overeating
- Feeling bad about yourself or that you are a failure or have let yourself or your family down
- Trouble concentrating on things, such as reading the newspaper or watching television
- Moving or speaking so slowly that other people could have noticed. Or the opposite being so fidgety restless that you have been moving around a lot more than usual

• Thoughts that you would be better off dead, or of hurting yourself in some way

[Not at all; Several days; More than half of the days; Nearly every day]



Over the last 2 weeks, how often have you been bothered by any of the following problems?

- Feeling nervous, anxious or on edge?
- Not being able to stop or control worrying?
- Worrying too much about different things?
- Trouble relaxing?
- Being so restless that it is hard to sit still?
- Becoming easily annoyed or irritable?
- Feeling afraid as if something awful might happen?

[Not at all; Several days; More than half of the days; Nearly every day]



The previous questions are commonly used to measure depression. By depression we mean a mental disorder that can be characterized by sadness, a lack of interest and a loss of pleasure, feelings of guilt and low self-esteem, sleep disorders, loss of appetite, tiredness and poor concentration.



We will now ask you a few additional questions about depression.

- Have you ever been diagnosed with depression?
- Have you ever overcome depression?
- Have you ever sought treatment for depression?

[Yes; No]

Imagine that you had a depression. What would be the main reasons not to seek depression treatment (select all that apply)?

☐ Cannot afford it

□ Afraid others will find out
□ My condition is not too serious
□ Other (please specify)
[Open text for "Other" option]

- Are you currently undergoing any form of treatment for depression (e.g. psychological therapy)?
- Would you ever consider taking part in group therapy for depression?

[Yes; No]



To what extent do you agree with the following statement?

"People with depression are lazy, hard to be around, and have weak character."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



Prior stigma

In January 2021 we conducted a survey with a sample of 500 Americans. The composition of this sample resembles the American population at large.

What percentage of Americans from this survey would you say agreed or strongly agreed with the following statement?

"People with depression are lazy, hard to be around, and have weak character."

[Number from 0 to 100]



Stigma treatment

You said that you believe that XX% of Americans either agree or strongly agree with the following statement:

"People with depression are lazy, hard to be around, and have weak character."

According to our survey of 500 Americans, the actual share of Americans that either agree or strongly agree with this statement is only XX%.



Post-treatment stigma beliefs

In November 2020 we conducted another survey with a sample of 300 Americans. The composition of this sample resembles the American population at large.

What percentage of Americans from this survey would you say agreed or strongly agreed with the following statement?

"People with depression are often unreliable, incompetent, and have weak character."

[Number from 0 to 100]



redacted-therapy-service-name

On the next screen we introduce *redacted-therapy-service-name*, one of the leading online group therapy services in the United States. We will then ask you some questions to understand how valuable you find this type of service. This is not promotional material.

Have you ever heard of *redacted-therapy-service-name*?

[Yes: No]



Public treatment

redacted-therapy-service-name redacted-url is an online group therapy service. They offer treatment for a wide range of diagnoses and life challenges, including anxiety, depression, and relationship issues, among others.

The service primarily consists of one-hour weekly sessions of group cognitive-behavioral therapy, led by a licensed therapist. An initial consultation allows new subscribers to sort into the group that best suits them.

Each group has at most twelve members that take part in the session via Zoom. As a participant, you can choose how much to interact during the session depending on how much you have to say or how comfortable you feel.

Private treatment

redacted-therapy-service-name redacted-url is an online group therapy service. They offer treatment for a wide range of diagnoses and life challenges, including anxiety, depression, and relationship issues, among others.

The service primarily consists of one-hour weekly sessions of group cognitive-behavioral therapy, led by a licensed therapist. An initial consultation allows new subscribers to sort into the group that best suits them.

Each group has at most twelve members that take part in the session via Zoom. As a participant, you can choose how much to interact during the session depending on how much you have to say or how comfortable you feel.

Please note, you can always choose to remain anonymous to the rest of your group on Zoom by using a nickname and by keeping your camera off.



Willingness to pay

We will now ask you to make a series of choices between receiving different dollar amounts and receiving a voucher for 8 weeks of online therapy from *redacted-therapy-service-name*.

This service is normally priced at \$280 for 8 weeks, but *redacted-therapy-service-name* offers a 50% discount for the first 4 weeks; so that you could buy 8 weeks of therapy on your own for \$210.

After you have made your choices, the computer will randomly select one of your choices and, depending on the selected choice, you will either receive the dollar amount or the voucher for therapy. You will learn which of your choices the computer selected to implement a few moments after you made them. Because each of your choices may count, please make them carefully.

• Would you rather receive \$0 or a voucher for 8 weeks of therapy from *redacted-therapy-service-name*?

[\$0 - I definitely don't want group therapy; Therapy]

- Would you rather receive \$10 or a voucher for 8 weeks of therapy from *redacted-therapy-service-name*?
- Would you rather receive \$20 or a voucher for 8 weeks of therapy from *redacted-therapy-service-name*?

:

• Would you rather receive \$300 or a voucher for 8 weeks of therapy from *redacted-therapy-service-name*?

[Given \$ amount; Therapy]



Auxiliary outcomes

To what extent do you agree with each of the following statements about yourself?

- I am often unreliable
- I am often incompetent
- My behavior is sometimes unpredictable
- Generally speaking, I have a weak character
- I am often lazy
- I am often hard to be around

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



Post outcomes

Imagine that you decide to seek treatment in the form of group therapy. How worried would you be about any problems caused by coworkers, friends, or family finding out about your seeking therapy.

[Not worried at all; Slightly worried; Somewhat worried; Moderately worried; Very worried]



Imagine that you decide to seek treatment in the form of group therapy. How would you feel about having to interact with your therapist and other group members about your mental health?

[Very comfortable; Mostly comfortable; Neither comfortable nor uncomfortable; Moderately uncomfortable]



Imagine that you decide to seek treatment in the form of group therapy. How would you feel about sharing your identity with fellow group members during sessions?

[Very comfortable; Mostly comfortable; Neither comfortable nor uncomfortable; Moderately uncomfortable]



To what extent do you agree with the following statement?

"If I were to seek treatment, then that would label me as depressed, which would make me feel worse about myself."

[Strongly agree; Agree; Neither agree nor disagree; Disagree; Strongly disagree]



How painful is it for you to think about potential problems with your mental health and what they entail for your life?

[Very painful; Painful; Slightly painful; Not painful at all]

I Pre-analysis plan

Main Experiment





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Demand for therapy (#107190)

Created: 09/16/2022 09:27 AM (PT)

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1) Have any data been collected for this study already?

No, no data have been collected for this study yet.

2) What's the main question being asked or hypothesis being tested in this study?

In this paper, we provide evidence on behavioral frictions that impede the take-up of psychotherapy. Our main research question is the following: How do attention allocation and misperceptions casually shape the demand for therapy?

3) Describe the key dependent variable(s) specifying how they will be measured.

Our key dependent variable is people's willingness to pay for therapy, elicited using a BDM mechanism.

4) How many and which conditions will participants be assigned to?

5 treatment conditions of equal size:

Pure_control: no elicitation of priors or information provision or elicitation of posteriors before measuring WTP.

Stigma_flag: elicits beliefs about social stigma

Stigma info: elicits beliefs about social stigma and provides information about the actual extent of social stigma associated with depressed people.

Effectiveness_flag: elicits beliefs about the effectiveness of therapy

Effectiveness_info: elicits beliefs about the effectiveness of therapy and provides information about the actual effectiveness of stigma as documented by research.

5) Specify exactly which analyses you will conduct to examine the main question/hypothesis.

We will estimate one reduced form specification, which estimates the effects of the different treatment arms on WTP compared to a pure control group.

 $Y_i = \\ alpha_0 + \\ alpha_1 Stigma_flag_i + \\ alpha_2 Stigma_info_i + \\ alpha_3 Effectiveness_flag_i + \\ alpha_4 Effectiveness_info_i + \\ varepsilon_i + \\ alpha_3 Effectiveness_flag_i + \\ alpha_4 Effectiveness_info_i + \\ alpha_6 Effectiveness_info_i + \\ alpha_6$

In all of our regressions we will include all control variables that are elicited pre-treatment, such as interest in therapy, the PHQ8 score, gender and willingness to pay for an example good. For all of our analyses, we will use robust standard errors.

To isolate the effects of attention irrespective of information, we will estimate the following specification, using respondents from the pure control group the Stigma_flag group and the Effectiveness_flag group:

 $Y_i = \alpha_0 + \alpha_1 + \alpha_1 + \alpha_1 + \alpha_2 = \alpha_i + \alpha_0 + \alpha_0$

To isolate the effects of information irrespective of attention, we will estimate specifications of the following type (in this case we only use respondents in the Stigma_flag and Stigma_info groups):

 $Y_i = \alpha_0 + \alpha_1 + \alpha_i + \alpha_i$

where belief_socialstigma_i is a continuous measure of prior beliefs about social stigma (we will also estimate this equation with a binary indicator for overestimators/underestimators).

We will estimate similar specifications for respondents in the Effectiveness_flag and Effectiveness_info groups:

 $Y_i = \alpha_0 + \alpha_0$

6) Describe exactly how outliers will be defined and handled, and your precise rule(s) for excluding observations.

All of our main outcomes are bounded above and below, so we do not need to exclude outliers.

7) How many observations will be collected or what will determine sample size? No need to justify decision, but be precise about exactly how the number will be determined.





We plan to recruit 3000 US respondents using the online platform Prolific. We only include respondents with a PHQ8 score above 18. Moreover, we only include respondents that have never tried therapy before. Finally, respondents need to pass a simple attention screener.

8) Anything else you would like to pre-register? (e.g., secondary analyses, variables collected for exploratory purposes, unusual analyses planned?) We will collect data on a set of post-treatment questions. We will also elicit the considerations that people have on their mind when deciding on their willingness to pay. This data will consist of a set of dummy variables for different kinds of topics people talk about in both an open-ended answer and a structured measure. These elicitations will be used to shed light on mechanisms.

Finally, a few days after the completion of the survey participants will get a direct message on prolific, in which they are told that there are extra spots available for therapy and that by taking a 3-question survey they qualify for entering a lottery which decides on who gets the therapy. Participation in this survey will be used as a secondary outcome to study the longer term effects of the information treatments.

Mechanism Survey





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depression stigma - summer 23 (#137055)

Created: 06/28/2023 08:53 AM (PT)

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1) Have any data been collected for this study already?

No, no data have been collected for this study yet.

2) What's the main question being asked or hypothesis being tested in this study?

We provide evidence on how attention to and information about social stigma associated with depression affects people's emotional well-being and optimism about their mental health.

3) Describe the key dependent variable(s) specifying how they will be measured.

Our key dependent variables are people's agreement or disagreement with the following statements ([5point: strongly agree, agree, neither agree nor disagree, disagree, strongly disagree]):

- Right now, I am feeling down and I don't have the motivation to do anything about it
- Right now, I am feeling fairly good and I don't see the need to do anything about my mental health
- The way others view depressed people keeps me from being optimistic about improving my future mental health by myself.

As secondary outcomes we elicit participant's agreements with the following statements as well

- The way others view depressed people keeps me from seeking help from my social circle when my mental health is not good.
- The way others view depressed people makes me feel that depression is rather common and normal and not something that needs to be treated with therapy.

4) How many and which conditions will participants be assigned to?

3 treatment conditions of equal size:

- Pure_control: no elicitation of priors or information provision before measuring main outcomes.
- Stigma_flag: elicits beliefs about social stigma
- Stigma_info: elicits beliefs about social stigma and provides information about the actual extent of social stigma associated with depressed people.

${\bf 5)} \ Specify \ exactly \ which \ analyses \ you \ will \ conduct \ to \ examine \ the \ main \ question/hypothesis.$

We will estimate one reduced form specification, which estimates the effects of the different treatment arms on the outcome of interest relative to a pure control group.

Y_i = \alpha_0 + \alpha_1 Stigma_flag_i + \alpha_2 Stigma_info_i + \varepsilon_i

In all of our regressions we will include all control variables that are elicited pre-treatment, such as interest in therapy, the PHQ8 score, and gender. For all of our analyses, we will use robust standard errors.

6) Describe exactly how outliers will be defined and handled, and your precise rule(s) for excluding observations.

All of our main outcomes are bounded above and below, so we do not need to exclude outliers.

7) How many observations will be collected or what will determine sample size? No need to justify decision, but be precise about exactly how the number will be determined.

We plan to recruit 1000 US respondents using the online platform Prolific. We only include respondents with a PHQ8 score above 18. Moreover, we only include respondents that have never tried therapy before. Finally, respondents need to pass a simple attention screener.

8) Anything else you would like to pre-register? (e.g., secondary analyses, variables collected for exploratory purposes, unusual analyses planned?)
None

Field Experiment





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Stigma and the Demand for Group Therapy (#74868)

Created: 09/16/2021 09:20 AM (PT)

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1) Have any data been collected for this study already?

No, no data have been collected for this study yet.

2) What's the main question being asked or hypothesis being tested in this study?

Psychotherapy has been shown to be an effective tool to overcome mental illness, yet a large fraction of the population suffering from mental illness do not seek psychotherapy.

In this paper, we provide evidence on a behavioral friction that impedes the take-up of psychotherapy, the social stigma associated with depression. Our informational treatments allow us to shed light on the role of social stigma associated with depression in decreasing the demand for therapy.

We hypothesize that a simple informational intervention which corrects overly pessimistic misperceptions about high social stigma associated with depression increases people's willingness to pay for therapy and people's actual sign-up for and attendance of therapy sessions.

3) Describe the key dependent variable(s) specifying how they will be measured.

Our primary main outcome measures are the following:

- + A measure of willingness to pay for therapy elicited using a multiple price list. 2
- + A dummy taking value one for respondents who attend any therapy session with grouport

The secondary outcome measures are:

- + A dummy taking value one for respondents who sign up to receive therapy with grouport
- + The number of therapy sessions our respondents attend. This will be coded zero for respondents who never signed up for therapy to begin with.

4) How many and which conditions will participants be assigned to?

Treatment 1: No information

Treatment 2: Information about low stigma associated with depression.

We also cross-randomize whether we inform participants about the possibility to remain anonymous during the therapy sessions by keeping the camera turned off and by using a nickname.

5) Specify exactly which analyses you will conduct to examine the main question/hypothesis.

We will run OLS regressions of our main outcomes on dummies for the different treatment groups. In our main specifications, we will look at the effect of the information treatment by regressing the outcomes on a dummy for whether the respondent was randomly assigned to receive the information treatment. In our other main specifications, we will study how 'making it salient' that it is possible to remain anonymous during sessions interacts with the treatment. To do so, we regress our outcomes on a dummy for the information treatment, a dummy for having received instructions that make it salient that one can remain anonymous, and the interaction of these two dummy variables.

In all of our regressions, we will include a series of control variables in our regressions, such as interest in therapy, the PHQ8 score, gender, dummies for reasons not to take up therapy (elicited pre-treatment), prior beliefs about stigma associated with depression (coded as a continuous variable), and prior history of depression.

6) Describe exactly how outliers will be defined and handled, and your precise rule(s) for excluding observations.

There will be no outliers in our survey data as all variables are bounded above. Some outcomes are binary; others come from willingness to pay elicitations. The number of therapy sessions attended is also bounded above by the maximum number of therapy sessions available with Grouport.

7) How many observations will be collected or what will determine sample size? No need to justify decision, but be precise about exactly how the number will be determined.

We only include respondents with a PHQ8 score above 18 and those who have pessimistic beliefs about others' views on depressed people (i.e. respondents who overestimate the extent of stigma associated with depression relative to what society actually thinks). We focus on respondents who overestimate the extent of stigma associated with depression relative to what society actually thinks for ethical reasons, to avoid making depressed individuals more pessimistic about the stigma associated with depression.





We aim to achieve a sample size of 2,000-3000 respondents, in order to have at least 200 depressed people who enroll into therapy.

Our respondents will be recruited primarily in New York State using Prolific and Dynata as most of Grouport's therapists have licenses to practice therapy sessions in New York State. In case we fail to recruit sufficiently many respondents in New York State, we may recruit participants from New Jersey.

8) Anything else you would like to pre-register? (e.g., secondary analyses, variables collected for exploratory purposes, unusual analyses planned?) We also collect a set of post-treatment questions that we will use to shed light on mechanisms.