Can psychological flexibility and prosociality mitigate illness perceptions toward COVID-19 on mental health? A cross-sectional study among Hong Kong adults

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Abstract

Background: The negative impact of COVID-19 pandemic on public mental health can be persistent and substantial over a long period of time, but little is known regarding what psychological factors or processes can buffer such impact. The present study aimed to examine the mediating roles of coping, psychological flexibility and prosociality in the impacts of perceived illness threats toward COVID-19 on mental health.

Method: Five-hundred and fourteen Hong Kong citizens (18 years or above) completed an online survey to measure illness perceptions toward COVID-19, coping, psychological flexibility, prosociality, and mental health, together with their socio-demographic variables. Structural equation modelling was used to explore the explanatory model that was the best-fit to illustrate the relationships between these constructs.

Results: Serial mediation structural equation model showed that only psychological flexibility (unstandardised beta coefficient, $\beta = -0.12$, 95% CI $[-0.20, -0.02]$, $p = 0.031$) and prosociality (unstandardised $\beta = 0.04$, 95% CI $[0.01, 0.08]$, $p = 0.001$) fully mediated the relationship between illness perceptions toward COVID-19 and mental health. In addition, psychological flexibility exerted a direct effect on prosociality (standardised $\beta = 0.22$, 95% CI $[0.12, 0.32]$, $p < 0.001$). This best-fit model explained 62% of the variance of mental health.

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Introduction
Ever since the declaration of the coronavirus 2019 (COVID-19) outbreak as a public health emergency, with more than 61.6 million confirmed cases and 1.4 million deaths as of November 28, 2020, there have been reports regarding the detrimental impacts of the pandemic on public mental health [1–3]. Evidence from systematic reviews has indicated that over one-third of the global populations report high levels of psychological distress [2, 3]. Since the first confirmed case of COVID-19 in Hong Kong on 23 January 2020, varied levels of anxiety and stress have been reported in the community [4–6]. The increased incidence of post-traumatic stress disorder and suicide among people in Hong Kong during the 2003 severe acute respiratory syndrome (SARS) epidemic provides clear and affirmed examples of the adverse consequences on public mental health, which may likely be mirrored or intensified during the COVID-19 pandemic [7]. The number of COVID-19 cases in Hong Kong has been exceeding 6000 which surpassed the 2003’s SARS number as of November 28, 2020 [8]. It is expected that the adverse mental health impacts of COVID-19 on the public would likely be widely affected and sustained over a longer period of time beyond the peaks of the pandemic.

Illness perceptions are defined as cognitive and emotional representations or beliefs that an individual has about an illness, which is developed through the information that the individual receives from formal and informal resources [9]. It is well known that such perceptions play important roles in influencing health behaviours and mental health outcomes [10–13]. As stated in the Leventhal’s Common Sense Model of Self-Regulation [14], an infection outbreak can activate an individual’s schema or perception of the illness. A dynamic self-regulatory process of the individual will then be initiated, attempting to use either or both adaptive and maladaptive coping responses to manage the perceived threats concerning the illness and their concomitant emotional reactions arising. The success of this coping process would affect the individual’s health outcomes [14]. Hence, putting into the context of the COVID-19 pandemic, it is plausible that how COVID-19 as perceived by the public could significantly affect their coping responses and health outcomes.

Psychological flexibility and prosociality
Recent studies have been put forth to identify various sociodemographic factors, social and job-related factors (e.g., working as health care professions, poor household income and high social media exposure) and pre-existing psychiatric illnesses, which increased the risks of anxiety and depression during the COVID-19 pandemic [1, 3, 15]. In addition, there is a growing body of evidence addressing the interrelationships between the perceived threats related to COVID-19, coping strategies and mental health outcomes [16–19]. With the more use of emotional-focused coping [18, 19], the less use of problem-focused coping [19] and the lower social support [18], people tend to exhibit more mental health symptoms, including symptoms of depression and anxiety [18, 19]. However, little is known regarding other potentially modifiable psychological distressors, apart from various types of coping strategies, which may help to mitigate the mental health impact of COVID-19. Psychological flexibility, which refers to the capacity to be open to difficult experiences while engaging in behaviours consistent with self-chosen values [20], is one of the aforementioned constructs which has been consistently associated with better mental health outcomes under different population groups and contexts [20–22]. Recent studies have also shown that psychological flexibility can alleviate the adversities or negative impacts of recent life stressors on mental health and well-being [23, 24]. When psychological flexibility and coping are concurrently examined, psychological flexibility has been shown to account for a greater proportion of psychological distress over and above an individual’s coping style alone [25–27]. This implies the need to reappraise whether psychological flexibility is an overarching psychological process on top of other adaptive/maladaptive coping processes in helping people to respond effectively to situational demands arising from the pandemic.

Prosociality is defined as a set of attitudes and/or voluntary actions, positive and friendly behaviours that an individual may adopt to help, take care of and comfort others [28]. Its role has been recently discussed in the context of epidemic containment [15, 29–32]. Recent studies have suggested that vaccinating can be interpreted and promoted as a prosocial act, in which adding prosocial messaging into influenza vaccination intervention may drive people to get vaccinated not only because of self-interest, but also for the benefits towards their families, neighbourhood and communities [29, 30]. In the COVID-19 pandemic, prosociality has been advocated as an important therapeutic target, because it has

Conclusions: Fostering psychological flexibility and prosocial behaviour may play significant roles in mitigating the adverse effects of COVID-19 and its perceived threats on public mental health.

Keywords: Psychological flexibility, Prosociality, Mental health, Coronavirus, COVID-19
been positively linked with social connections, cohesiveness [33] and better adherence to COVID-19 precautionary measures, because people consider their actions can bring societal and communal benefits (e.g., wearing a face mask to prevent COVID-19 spread) rather than benefiting the self only [15, 31, 32]. In addition, prosociality expressed as engaging in affiliating behaviours or nurturing others has been considered as an effective way of coping when experienced distress through influencing neuro-physiological systems, such as the oxytocin and reward circuitry system in the brain [34, 35]. Therefore, prosociality was hypothesised to be an effective coping strategy to the perceived threats of COVID-19 and might play a role in reducing the related psychological distress.

Hypothetical model
In the present study, we followed the hypotheses based on the Leventhal’s Common Sense Model of Self-Regulation, which posits that perceptions of an illness threat (i.e., COVID-19) will motivate various coping strategies, including avoidance, positive thinking, seeking social support and problem solving, to mitigate the threat and affect mental health of an individual [14]. Furthermore, we additionally included psychological flexibility and prosociality to see whether they demonstrate mediating roles in the model in the presence of the above coping factors (see Fig. 1). Identifying the specific pathways of these relations is important not only to acquire a further understanding on how the public psychologically responds to the COVID-19 pandemic but also, more importantly, inform the development of mechanism- or model-based psychological interventions adopting specific coping factors accounting for the plausible adverse effects of COVID-19 and its perceived threats on mental health [33].

Methods
Participants and procedures
The present cross-sectional survey was part of the international COVID-IMPACT study (see https://ucy.ac.cy/acthealthy/en/covid-19-impact-survey) and the methodological description of the study conducted in one of 78 study sites (Hong Kong) has been previously reported [36]. Briefly, between April and June 2020, a total of 514 Chinese-speaking Hong Kong residents aged 18 years were conveniently recruited through the highly accessed and commonly used social media platforms (e.g., Facebook, Instagram, Twitter, and WeChat), and the participating universities’ mass emailing. Participants who self-selected and enrolled into the cross-sectional study completed a 20-min online survey via a secured Google platform in which an informed consent was secured on the first page. The ethics approvals of the study were obtained from the Cyprus National Bioethics Committee (ΕΕΒΚ ΕΠ 2020.01.60) and the University in Hong Kong (Reference Number: SBRE-19-593).

Measures
Mental health
The Mental Health Continuum Short Form for Adults (MHC-SF, 14 items, 6-point Likert scale) was used to assess the mental health of the participants, focusing on emotional, social and psychological well-being [37]. For each subscale, higher score indicates better mental health. The MHC-SF subscales possessed good

Fig. 1 A hypothesised model
convergent validity and internal consistencies (Cronbach’s \( \alpha = 0.83–0.89 \)) in both Chinese and Western samples [37, 38] and our sample (\( \alpha = 0.81–0.88 \)).

**Illness perceptions toward COVID-19**

The Brief Illness Perception Questionnaire (IPQ) items assessing the perceived consequences, timeline, concern and emotional responses toward COVID-19 (4 items, 10-point Likert scale) [9], as well as the items assessing the perceived susceptibility (3 items, 6-point Likert scale) and severity of COVID-19 (3 items, 6-point Likert scale) according to the Health Belief Model [39] were used to assess the public perceptions toward COVID-19 [36]. A higher score indicates a stronger illness perception. The Chinese version of the aforementioned question items showed adequate psychometric properties as stated in our previous report [36].

**Coping**

The Brief Coping Orientation to Problems Experienced (Brief COPE) inventory was adopted to assess the strategies used by the individuals to cope with problems and stress [40]. The instrument includes a total of 28 items, each item could be scored from one (“I haven’t been doing this at all”) to four (“I’ve been doing this a lot”) referring to the following 14 indicators of coping: venting, use of emotional support, use of instrumental support, religion, active coping, planning, behavioural disengagement, self-distraction, substance use, use of denial, self-blame, humour, positive reframing and acceptance. These coping strategies have been recently consolidated and validated as four coping dimensions which are avoidance (5 indicators), positive thinking (3 indicators), seeking social support (4 indicators) and problem solving (2 indicators) [41–43]. The Brief COPE showed adequate convergent validity [40] and has been used in Hong Kong samples [36, 40]. The indicators representing each corresponding coping dimension were demonstrated to have acceptable internal consistencies (\( \alpha = 0.73–0.82 \)) in our study sample.

**Psychological flexibility**

The PsyFlex questionnaire was used to assess all the six processes of psychological flexibility, including contacting the present moment, defusion, acceptance, self-as-context, values and committed action, of an individual (6 items, 5-point Likert scale) [44, 45]. Example item is “Even if I am somewhere else with my thoughts, in important moments I can focus on what’s going on at that time”. Each item could be score from one (“Very often”) to five (“Very seldom”). The total score was reversed so that higher score was indicative of greater psychological flexibility. The PsyFlex question items showed good internal consistency in our study sample (\( \alpha = 0.83 \)).

**Prosociality**

Six items (5-point Likert scale) adapted from the Prosociality Scale were used to assess prosociality in terms of prosocial behaviours, including sharing, helping, taking care of, and feeling empathic with others, which were carried out by the participants during the COVID-19 pandemic [46]. Example item is “I am pleased to help my friends/colleagues in their activities”. Higher total score indicates better prosociality. The items demonstrated acceptable internal consistency (\( \alpha = 0.83 \)) in our study sample.

The participants were also asked to report their socio-demographic characteristics, impacts of social isolation measures on daily activities (example item: “Since the social isolation measures began, have your financial situation changed?”) and financial situations (example item: “Since the social isolation measures began, have your financial situation changed?”), and whether they and/or their family members were infected by COVID-19.

**Statistical analyses**

Before testing the proposed model, the data were screened for univariate normality and multivariate outliers were detected by the Mahalanobis distance at \( p = 0.001 \). Inter-correlations among all the observed variables for the constructs as shown in Fig. 1 were assessed. As suggested by Anderson and Gerbing [47], confirmatory factor analyses (CFA) were first performed to establish the measurement models of the latent constructs, including illness perceptions toward COVID-19, coping (i.e., avoidance, positive thinking, seeking social support, problem solving) and mental health. A structural equation model (SEM) was then built based on the hypothesised model (see Fig. 1) and further analysed with the adjustment for potential confounders, including age, gender, educational level, employment status, having children (yes/no), living conditions, working as health care professionals (yes/no), COVID-19 status (yes/no/unknown) and family members’ COVID-19 status (yes/no/unknown). The model was trimmed by dropping insignificant confounders subsequently. Attempts were made to improve the goodness of fit of the model by adding covariance paths and/or direct paths to explore the interrelationships between the aforementioned latent constructs, psychological flexibility and prosociality, if a significant modification index (MI) coincided with a large expected parameter change (EPC) value [48] (see Fig. 2 for the final model). Biased-corrected and accelerated bootstrapping method with 5000 replications was used to estimate 95% confidence intervals for standardised direct, indirect and total effects. The SEM analyses were estimated by the maximum likelihood method, with the model fit indices [Comparative Fit Index (CFI) ≥ 0.90; Tucker-Lewis Index (TLI) ≥ 0.90; standardised root means square residual
The characteristics of the participants have been described and tabulated in our previous report [36]. In brief, the mean (SD) age of the participants was 32.8 (11.5), and 74.1% were females. The majority were graduated from university (81.9%), working as non-health care professionals (74.1%) and living with their parents or own families (79.7%). Approximately one-third of the participants reported that they had been self-isolated (33.7%) and their finance situation became worse since the imposed isolation measures (30.0%). Only one participant reported that he/she was infected by COVID-19, while a small number of the participants (n < 5) indicated that they were not sure whether they or their family members were infected by COVID-19 despite of the presence of associated symptoms.

Table 1 presents the descriptive statistics and correlation matrix of the study variables. Significant correlations with medium effect sizes in terms of absolute r > .30 found when all indicators assessing mental health (i.e., emotional, social and psychological well-being) correlated with psychological flexibility (rs = .49–.60, all ps < 0.01) and positive reframing (rs = .30–.41, all ps < 0.01), respectively. In addition, psychological flexibility significantly correlated with all indicators assessing problem solving (rs = .34–.37, all ps < 0.01), behavioural disengagement (r = −.30, p < 0.01), acceptance (r = .36, p < 0.01) and prosociality (r = .35, p < 0.01). The results of the CFA indicated that the measuring items corresponding to the latent constructs were all adequately fit (see Table 2).

Table 3 shows the progression of model modifications and model fit indices. In view of the fairly fitted model (see Model 1 in Table 3) and the purpose of exploratory analyses in identifying the interrelationships between coping, psychological flexibility and prosociality, we followed the suggestions based on the modification indices and expected parameter changes by adding in two direct paths, which were (1) from problem solving to prosociality (MI = 108.74, EPC = 1.74) and (2) from psychological flexibility to prosociality (MI = 16.63, EPC = 0.52), to improve the model fit. After the inclusion of the direct paths, the final SEM (see Model 3 in Table 3) was tested and demonstrated a reasonable good fit with the data (χ² = 878.0, df = 294, CFI = 0.92, TLI = 0.90, SRMR = 0.07, RMSEA = 0.06).

Figure 2 illustrates the final SEM adjusted for significant confounders, including gender and working as health care professionals. Illness perceptions toward COVID-19 was significantly associated with avoidance (standardised beta coefficient, β = 0.24, 95% CI [0.09, 0.42], p = 0.002), seeking social support (β = 0.19, 95% CI [0.08, 0.30], p = 0.002), prosociality (β = 0.18, 95% CI [0.09, 0.28], p = 0.001) and psychological flexibility (β = −0.24, 95% CI [−0.33, −0.15], p < 0.001). Also, psychological flexibility (β = 0.30, 95% CI [0.05, 0.51], p = 0.04) and prosociality (β = 0.16, 95% CI [0.06, 0.24], p = 0.001) were both significantly associated with mental health, while the rest of the coping factors remained non-significant (all ps = 0.072–0.415).
| Variable (No.) | Mean (SD) [range] | Variable, correlation |
|----------------|-----------------|-------------------|
| **Mental health** | | |
| Emotional well-being (1) | 8.73 (3.06) [0–15] | 1 |
| Social well-being (2) | 8.35 (5.05) [0–25] | .517** 1 |
| Psychological well-being (3) | 17.15 (6.46) [0–30] | .662** .591** 1 |
| **Illness perceptions toward COVID-19** | | |
| HBM - Perceived severity (4) | 14.55 (3.02) [3–18] | −0.055 −1.189** −0.024 1 |
| HBM - Perceived susceptibility (5) | 9.23 (2.99) [3–17] | −1.134** −1.147** −1.122** 0.404** 1 |
| IPQ – Concern (6) | 6.63 (2.03) [1–10] | −0.136 −1.156 −0.087 0.485** 0.591** 1 |
| IPQ – Consequences (7) | 6.29 (2.09) [1–10] | −0.078 −0.037 −0.040 0.166** 0.741** 0.200** 0.147** 1 |
| IPQ – Emotional response (8) | 7.09 (1.64) [1–16] | −0.051 −1.148** −0.040 0.145** 0.192** 0.274** 0.267** 0.164** 1 |
| **Seeking social support** | | |
| Use of emotional support (10) | 4.75 (1.59) [2–8] | 0.024 0.079 0.113** 0.119** 0.107** 0.093** 0.094** −0.011 0.025 1 |
| Use of instrumental support (11) | 5.28 (1.52) [2–8] | 0.109 0.151** 0.190** 0.122** 0.074 0.084 0.071 −0.002 −0.043 0.768** 1 |
| Venting (12) | 5.23 (1.45) [2–8] | 0.013 0.027 0.146** 0.110** 0.083 0.049 0.088** 0.025 −0.045 0.566** 0.570** 1 |
| Religion (13) | 4.06 (1.92) [2–8] | 0.130 0.221** 0.156** −0.034 0.037 −0.071 −0.049 0.042 0.010 0.230** 0.253** 0.122** 1 |
| **Problem solving** | | |
| Active coping (14) | 5.78 (1.44) [2–8] | 0.256 0.064** 0.383** 0.061 −0.055 −0.053 −0.055 −0.012 −0.070 0.333** 0.376** 0.320** 0.191** 1 |
| Planning (15) | 5.90 (10.34) [2–8] | 0.185 0.199** 0.351** 0.124** 0.003 −0.060 −0.008 0.020 −0.023 0.341** 0.399** 0.351** 0.206** 0.641** 1 |
| **Avoidance** | | |
| Self-distraction (16) | 5.19 (1.54) [2–8] | −0.016 0.026 0.087** 0.115** 0.054 0.149** 0.141** 0.003 0.006 0.417** 0.407** 0.362** 0.098 0.388** 0.282** 1 |
| Denial (17) | 2.84 (1.16) [2–7] | −1.112 0.046 −1.136** −0.026 0.094** 0.146** 0.090** 0.033** 0.023 0.115** 0.097** 0.089** 0.021 −0.029 −0.033 0.165** 1 |
| Substance use (18) | 2.69 (1.34) [2–8] | −0.077 −0.001 −0.026 −0.019 0.097** 0.054 0.150** 0.105** 0.092** 0.115** 0.136** 0.026 0.061 0.038 0.052 −0.066 0.115** 1 |
| Behavioural | 3.40 (1.26) | −2.227 −0.087 −2.263** −0.073 0.074 −0.015 0.045 0.023 0.009 0.237** 0.152** 0.159** 0.032 −0.095 −0.039 0.106** 0.391** 0.119** 1 |
Table 1 Means, standard deviations, ranges and correlations for all study variables (Continued)

| Variable (No.) | Mean (SD) | 1   | 2   | 3   | 4   | 5   | 6   | 7   | 8   | 9   | 10  | 11  | 12  | 13  | 14  | 15  | 16  | 17  | 18  | 19  | 20  | 21  | 22  | 23  | 24  | 25  |
|----------------|-----------|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|
| disengagement (19) [2-8] | 4.33 (1.49) | -0.253** | -0.117** | -0.215** | 0.086 | 0.098 | 0.093 | 0.019 | -0.003 | -0.056 | 0.355** | 0.291** | 0.320** | 0.124** | 0.117** | 0.212** | 0.240** | 0.240** | 0.089* | 0.483** | 1 |
| Self-blaming (20) [2-8] | 4.04 (1.54) | 0.075 | 0.005 | 0.098 | 0.221 | 0.018 | -0.084 | 0.032 | 0.057 | 0.062 | 0.163** | 0.123** | 0.269** | 0.101** | 0.073 | 0.206** | 0.113** | 0.107** | 0.058 | 0.206** | 0.211** | 1 |
| Positive thinking | | | | | | | | | | | | | | | | | | | | | | | | | | | | | |
| Humour (21) [2-8] | 5.50 (1.45) | 0.298** | 0.306** | 0.405** | -0.204 | -0.019 | -0.069 | -0.056 | 0.049 | -1.003 | 0.216** | 0.320** | 0.297** | 0.267** | 0.554** | 0.540** | 0.291** | -0.013 | -0.010 | -0.061 | 0.047 | 0.163** | 1 |
| Positive reframing (22) [2-8] | 6.17 (1.34) | 0.260** | 0.117** | 0.374** | 0.142** | 0.055 | -0.084 | 0.065 | 0.046 | -0.019 | 0.150** | 0.271** | 0.326** | 0.114** | 0.469** | 0.552** | 0.219** | -0.162** | -0.030 | -0.136** | 0.021 | 0.211** | 0.484** | 1 |
| Acceptance (23) [2-8] | 19.40 (4.02) | 0.489** | 0.407** | 0.602** | -0.084 | -1.181** | -0.153** | -0.111** | -0.054 | -0.101** | -0.002 | 0.088** | 0.025 | 0.152** | 0.369** | 0.336** | 0.077 | -0.102** | -0.092** | -0.301** | -0.203** | 0.043 | 0.394** | 0.363** | 1 |
| Psychological flexibility | | | | | | | | | | | | | | | | | | | | | | | | | | | | | |
| Total score (24) [6-30] | 20.72 (3.92) | 0.222** | 0.270** | 0.379** | 0.060 | -0.083 | 0.030 | 0.093 | -0.069 | 0.003 | 0.345** | 0.345** | 0.271** | 0.144** | 0.341** | 0.389** | 0.222** | -0.019 | -0.011 | -0.050 | 0.114** | 0.107** | 0.306** | 0.301** | 0.347** | 1 |
| Prosociality | | | | | | | | | | | | | | | | | | | | | | | | | | | | | |
| Total score (25) [6-30] | | | | | | | | | | | | | | | | | | | | | | | | | | | | | |

COVID-19 coronavirus disease 2019, HBM Health Belief Model, IPQ Illness Perception Questionnaire. For each variable, a high score indicates a greater extent of the underlying trait being measured

* P < .05, calculated using 2-tailed bivariate correlations

** P < .01, calculated using 2-tailed bivariate correlations
addition, psychological flexibility was significantly associated with prosociality ($\beta = 0.22$, 95% CI [0.12, 0.32], $p < 0.001$). Table 4 summarises the direct, indirect and total effects of illness perceptions toward COVID-19 on mental health based on the final trimmed SEM. This model showed that only psychological flexibility (unstandardised beta coefficient, $\beta = -0.12$, 95% CI [-0.20, -0.02], $p = 0.031$) and prosociality (unstandardised $\beta = 0.04$, 95% CI [0.01, 0.08], $p = 0.001$) fully mediated the relationship between illness perceptions toward COVID-19 and mental health, other coping factors did not demonstrate their mediating effects (all $p_s = 0.053–0.381$). In overall, the model explained 62% of the variance of mental health.

**Discussion**

This study sought to examine the roles of coping styles, psychological flexibility and prosociality in mitigating the impact of illness perceptions toward COVID-19 on mental health among a sample of Hong Kong adults. Our analysis showed the significant but weak correlations between illness perceptions toward COVID-19 and mental health. Nevertheless, prosociality and psychological flexibility showed the full mediation effects on the relationship between the two aforementioned constructs. These findings are congruent with the theoretical underpinning of the Leventhal’s Common Sense Model of Self-Regulation [14], showing that the psychological impact of health-related stressful events, such as the outbreaks of infectious diseases, is influenced not solely by the specific beliefs about the illness, but also based on the selection of various coping responses to manage the threat in order to restore emotional equilibrium and maintain well-being. More importantly, we found that psychological flexibility and prosociality accounted for significant mediating roles over and above the contributions of other known coping-style variables as found in the framework (i.e., avoidance, positive thinking, seeking social support and problem solving). As shown in our study, the role of psychological flexibility as a protective psychological resource is consistent with the growing body of evidence indicating positive relationship between psychological flexibility and mental health among individuals when experiencing major life stressors [23] and facing outbreaks of infectious diseases like COVID-19 [50–52]. By definition, psychological flexibility refers to an ability to respond effectively to situational demands for pursuing longer-term goal driven by values [20], which requires an individual to have an openness to difficult psychological experiences and an awareness of engaging behavioural changes that are necessary to achieve a valued outcome [20]. Hence, psychological flexibility has been conceptualised as a higher-order response style, which may facilitate the selection of adaptive coping responses and related behaviours when facing challenges. This echoes with recent mediational analyses by Dawson and Golijani-Moghaddam (2020) highlighting the role of psychological flexibility in mental health among the people in the United Kingdom [50], and our findings further support that psychological flexibility is independent of, but overlapping with other coping responses [25, 53]. In addition, in view of the unfamiliar contexts of COVID-19 outbreaks, people may not be able to successfully

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**Table 2** Measurement models of the latent constructs included in the structural equation model

| Latent constructs / indicators | CFA goodness-of-fit indices |
|-------------------------------|----------------------------|
| Illness perceptions toward COVID-19 | $\chi^2 = 13.98$, RMSEA = 0.06, CFI = 0.91, SRMR = 0.06 |
| HBM - Perceived severity | |
| HBM - Perceived susceptibility | |
| IPQ – Consequences | |
| IPQ – Timeline | |
| IPQ - Concern | |
| IPQ – Emotional response | |
| Avoidance | $\chi^2 = 10.4$, RMSEA = 0.06, CFI = 0.98, SRMR = 0.04 |
| Self-distraction | |
| Denial | |
| Substance use | |
| Behavioural disengagement | |
| Self-blaming | |
| Positive thinking | $\chi^2 = 3.8$, RMSEA = 0.07, CFI = 0.98, SRMR = 0.06 |
| Humour | |
| Positive reframing | |
| Acceptance | |
| Seeking social support | $\chi^2 = 3.2$, RMSEA = 0.03, CFI = 1.00, SRMR = 0.02 |
| Use of emotional support | |
| Use of instrumental support | |
| Venting | |
| Religion | |
| Problem solving | $\chi^2 = 4.9$, RMSEA = 0.04, CFI = 0.91, SRMR = 0.06 |
| Active coping | |
| Planning | |
| Mental health | $\chi^2 = 4.9$, RMSEA = 0.04, CFI = 1.00, SRMR = 0.06 |
| Emotional well-being | |
| Social well-being | |
| Psychological well-being | |

CFI Comparative Fit Index, COVID-19 coronavirus disease 2019, HBM Health Belief Model, IPQ Illness Perception Questionnaire, RMSEA root mean square error approximation, SRMR standardized root means square residual
Table 3 Progression of the model modifications and model fit indices

| Model | Model details and modifications                                                                 | $\chi^2$ (df) | CFI   | TLI   | SRMR  | RMSEA (90% CI) |
|-------|--------------------------------------------------------------------------------------------------------------------------------|-------------|-------|-------|-------|----------------|
| 1     | 6 latent constructs (illness perceptions toward COVID-19, avoidance, positive thinking, seeking social support, problem solving and mental health), 2 observed variables (psychological flexibility, prosociality) and 2 significant confounders (gender, working as health care professionals) remained after trimming by removing insignificant confounders | 960.23 (296) | 0.83  | 0.83  | 0.09  | 0.07 (0.06, 0.08) |
| 2     | Direct path from problem solving to prosociality                                                                                             | 899.7 (295) | 0.87  | 0.86  | 0.07  | 0.06 (0.05, 0.07) |
| 3     | Direct path from psychological flexibility to prosociality                                                                                   | 878.0 (294) | 0.92  | 0.90  | 0.07  | 0.06 (0.06, 0.07) |

CFI Comparative Fit Index, COVID-19 coronavirus disease 2019, RMSEA root mean square error approximation, SRMR standardized root means square residual, TLI Tucker Lewis Index

draw their usual repertoire of coping that attenuate stress in a short-term. This may be one of the plausible reasons explaining why other coping factors in our model did not show the mediating roles between people’s illness perceptions toward COVID-19 and their mental health.

Notably, the findings of the present study highlight a significant role of prosociality in accounting for the impact of psychological flexibility on mental health. A plausible explanation may be related to the various processes of psychological flexibility (e.g., perspective-taking, acceptance and value clarifications) can increase one’s prosocial behaviour. For example, those who are more psychologically flexible may acquire better perspective-taking skills, that is better attention capacities to observe other peoples’ needs during the COVID-19 pandemic, understanding the suffering of others and responding to them by helping [15, 32]. Within a helping situation, the non-judgmental acceptance attitude of a psychologically flexible person may allow a temporarily disengagement of his/her own emotions and focus on those in need of help [54]. Furthermore, engaging in values-driven behaviours is another dimension of psychological flexibility in which the meaning and underlying purpose of carrying out such behaviours often connect with prosocial-underlying values, such as kindness, caring and empathy while putting others’ interests first with some personal cost [32]. On the other hand, it is of interesting to see that higher illness perceptions toward COVID-19 was associated with better mental health through the pathway of prosociality, highlighting a plausible phenomenon that people are generally more inclined to help and support others when possessing stronger perceptions of risk related to COVID-19, in which they themselves may gain benefit in the first place with feelings of connectedness. It has been suggested that people who perceived others as having similar shared values in times of crisis are more likely to elicit a sense of common purpose in working towards the collective goal [32, 55]. For instance, seeing others in sharing resources to vulnerable population groups (e.g. elderly) during the COVID-19 pandemic may lead individuals to perceive that others as sharing the same value of self-transcendence, and hence they are more willing to self-sacrifice for the greater

Table 4 Direct, indirect and total effects of illness perceptions toward COVID-19 on mental health

| Paths                                                                 | Unstandardised path coefficient, β Estimate (95% CI) | Standardised path coefficient, β Estimate (95% CI) | P value |
|----------------------------------------------------------------------|------------------------------------------------------|----------------------------------------------------|--------|
| Direct effect                                                        |                                                      |                                                    |        |
| IP → Mental health                                                   | −0.12 (−0.50, 0.11)                                   | −0.10 (−0.39, 0.08)                                 | 0.173  |
| Indirect effects                                                     |                                                      |                                                    |        |
| IP → Avoidance → Mental health                                       | 0.06 (−0.01, 0.17)                                   | NA                                                 | 0.053  |
| IP → Positive thinking → Mental health                               | 0.03 (−0.06, 0.86)                                   | NA                                                 | 0.381  |
| IP → Seeking social support → Mental health                          | −0.09 (−0.41, 0.09)                                  | NA                                                 | 0.124  |
| IP → Problem solving → Mental health                                 | −0.08 (−1.02, 0.05)                                  | NA                                                 | 0.194  |
| IP → Psychological flexibility → Mental health                       | −0.12 (−0.20, −0.02)                                 | NA                                                 | 0.031  |
| IP → Prosociality → Mental health                                    | 0.04 (0.01, 0.08)                                   | NA                                                 | 0.001  |
| IP → Psychological flexibility → Prosociality → Mental health        | −0.02 (−0.03, −0.01)                                 | NA                                                 | 0.014  |
| Total effect                                                         |                                                      |                                                    | <0.001 |

COVID-19 coronavirus disease 2019, CI confidence interval, IP illness perceptions towards COVID-19, NA not applicable
societal good, leading to increased feelings of connectedness and better emotional well-being [32]. As a whole, the relationship between psychological flexibility and prosociality, and their plausible benefits to one’s mental health as found in the present study, appear to be congruent with the aforementioned theoretical expectations. However, we suggest this notion can be further examined and confirmed in future research during the process of COVID-19 pandemic, and/or other disaster-related contexts (e.g., outbreaks of novel infectious diseases).

The study findings support the notion that psychological flexibility and prosociality are promising targets in an intervention for helping the public in navigating the mental health challenges regarding the pandemic. As the psychological flexibility model underpins one of the most promising approaches to cognitive behavioural therapy - Acceptance and Commitment Therapy (ACT) [44, 56], it is suggested that ACT can be used as the cornerstone of developing public mental health interventions to combat the impacts of COVID-19, which continue to unfold. Indeed, a growing body of evidence from systematic reviews have indicated the positive effects of ACT for depression [56], anxiety [56] and subjective well-being [57] through fostering psychological flexibility among clinical and non-clinical populations with small-to-medium effect sizes (Cohen’s $d = 0.24–0.64$) [56]. On the other hand, the significant association between psychological flexibility and prosociality as shown in our model further indicates that prosociality is potentially malleable through ACT leading to better mental health outcomes. In fact, interventions that stimulate prosocial behaviours have been recently reviewed by Mariola and colleagues (2020), showing that psychological approaches which focus on emotional regulation, cultivation of empathy, perspective-taking, gratitude, and compassion increase the altruistically motivated prosocial behaviours of an individual [58]. As Mariola et al.’s work did not find the use of ACT targeting at prosociality, implying the need for future ACT studies to examine whether addressing this malleable factor can nurture people with helping attitude and behaviour as an alternative way of coping. It is likely that the practice of physical distancing in containment of COVID-19 spread is longstanding. If a prosocial-oriented ACT intervention is proposed to fight the COVID-19 pandemic, alternative modes of delivery to face-to-face sessions, such as smartphone applications, video-conferencing or even self-help ACT, are recommended [21, 59]. Apart from adopting ACT interventions, a recent study has found that even a very brief psychological flexibility training, for example using one experiential metaphorical exercise that targets at practising present-moment awareness, acceptance and values clarification, has been found to increase prosocial behaviour [60].

Limitations

Our findings need to be tempered by considering a few limitations. Although we relied on logical and theoretical basis for interpreting illness perceptions toward COVID-19 as a predictor, coping, psychological flexibility and prosociality as potential mediators and public mental health as an outcome of interest [14, 20, 34], our ability to draw robust conclusions regarding the directionality of the aforementioned constructs was restricted by the cross-sectional nature of the data. Further studies should examine our model by using longitudinal data for clarifying the relationships. Nevertheless, the significant mediating effects of psychological flexibility and prosociality acting above and beyond other coping factors may support their potential of mitigating the negative impacts of COVID-19 or other emerging infectious diseases on mental health. In this study, mental health has been assessed with the Mental Health Continuum-Short Form (MHC-SF). However, it is bear noting that mental health/well-being and mental illness/symptoms do not stand at opposite ends of the health spectrum [61], implying the need for further studies to examine whether our proposed model remains in good fit if other aspects of mental health, such as symptoms of depression and anxiety, are assessed. As indicated in one of the related reports [36], the demographic characteristics of the sample (i.e., the majority were female and attained educational level at least in college or above) and the relatively small sample size might have limited the representativeness of the study findings to Hong Kong population. Different from other cities that implement a complete/regional lock-down or massive screening, Hong Kong has been adopting a “suppress and lift” anti-pandemic strategy, in which the COVID-19 precautionary measures such as border control, physical distancing, contact tracing, and COVID-19 screening for high-risk groups are adjusted according to the incidence of infection [62]. More importantly, the strong civic unity and rapid community responses learnt from the SARS outbreak in 2003 may have contributed to the low incidence and mortality of COVID-19 in Hong Kong. In view of the large differences in terms of the COVID-19 spreading and its containment polices between Hong Kong and other regions/cities, our proposed model deserves to be further examined in other countries under the prevailing COVID-19 crisis.

Conclusions

The current study underscores what psychological processes and coping factors play the key roles in protecting public mental health in the COVID-19 crisis. Referring to the context in Hong Kong, we identified that psychological flexibility and prosociality are the
focal treatment targets, which constitute an important step toward developing mechanistically informed interventions for buffering the effects of COVID-19 and other disaster-related global stressors. The findings of our SEM imply that fostering psychological flexibility may encourage more prosocial behaviours in the communities, such as volunteering, helping others and providing caregiving beyond the family level support, for enhancing well-being amid the pandemic.

Abbreviations
ACT: Acceptance and Commitment Therapy; Brief COPE: Brief Coping Orientation to Problems Experienced; CFA: Confirmatory factor analyses; CFI: Comparative Fit Index; CI: Confidence interval; COVID-19: Coronavirus disease 2019; EPC: Expected parameter change; IPQ: Illness Perception Questionnaire; MI: Modification index; RMSEA: Root mean square error approximation; SARS: Severe acute respiratory syndrome; SEM: Structural equation model; SRMR: Standardised root mean square residual; TLI: Tucker-Lewis Index

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Authors’ contributions
YYC, WTC and HYC conceived the study. YYC, APK, MK and ATG contributed for planning and data collection. YYC performed the statistical analyses and drafted the manuscript. WTC, HYC, APK, MK and ATG contributed for preparation and critical review of the manuscript. All authors read and approved the final manuscript.

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Availability of data and materials
The datasets used and/or analysed during the current study are available from the corresponding author on reasonable request.

Ethics approval and consent to participate
The study was approved by the Cyprus National Bioethics Committee (Ethics approval and consent to participate, Reference Number: SBRE-19-593) and the Survey and Behavioral Research Ethics Committee, the School of Nursing, Faculty of Medicine, The Chinese University of Hong Kong. The study was approved by the Cyprus National Bioethics Committee (Ethics approval and consent to participate, Reference Number: SBRE-19-593) and the Survey and Behavioral Research Ethics Committee, the School of Nursing, Faculty of Medicine, The Chinese University of Hong Kong. The study was approved by the Cyprus National Bioethics Committee (Ethics approval and consent to participate, Reference Number: SBRE-19-593) and the Survey and Behavioral Research Ethics Committee, the School of Nursing, Faculty of Medicine, The Chinese University of Hong Kong.

Consent for publication
Not applicable. The survey was anonymous for all participants.

Competing interests
All authors declare no conflict of interest.

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References
1. Vindegaard N, Eriksen Renos M. COVID-19 pandemic and mental health consequences: systematic review of the current evidence. Brain Behav Immun. 2020;89:531–42. https://doi.org/10.1016/j.bbi.2020.05.048.
2. Luo M, Guo L, Yu M, Wang H. The psychological and mental impact of coronavirus disease 2019 (COVID-19) on medical staff and general public – a systematic review and meta-analysis. Psychiatry Res. 2020;213:113190. https://doi.org/10.1016/j.psychres.2020.113190.
3. Xiong J, Liptsitz O, Nasi F, Lui LM, Gill H, Phan L, et al. Impact of COVID-19 pandemic on mental health in the general population: a systematic review. J Affect Disord. 2020;277:55–64. https://doi.org/10.1016/j.jad.2020.08.001.
4. Kwok KO, Li KK, Chan HHH, Yi YY, Tang A, Wei W, et al. Community responses during early phase of COVID-19 epidemic, Hong Kong. Emerg Infect Dis. 2020;26(7):1575–9. https://doi.org/10.3201/eid2607.200500.
5. Choi EPH, Hui BPY, Wai EYP. Depression and anxiety in Hong Kong during covid-19. Int J Environ Res Public Health. 2020;17(10):3740.
6. Zhao SZ, Wong YJH, Luk TT, Wai AKC, Lam TH, Wang MP. Mental health crisis under COVID-19 pandemic in Hong Kong, China. Int J Infect Dis. 2020;100:431–3. https://doi.org/10.1016/j.ijid.2020.09.030.
7. Cheung YT, Chau PH, Yip PS. A revisit on older adults suicides and severe acute respiratory syndrome (SARS) epidemic in Hong Kong. Int J Geriatr Psychiatry. 2008;23(12):1231–8. https://doi.org/10.1002/gps.2056.
8. Centre for Health Protection. Coronavirus disease (COVID-19) in HK: Department of Health, HK SAR, 2021. https://cphp-dashboard-geodata.gov.hk/covid-19/en.html. Accessed 23 Feb 2021.
9. Broadbent E, Wilkes C, Koschwanze H, Weinman J, Norton S, Petrie KJ. A systematic review and meta-analysis of the brief illness perception questionnaire. Psychol Health. 2015;30(11):1361–85. https://doi.org/10.1080/08870446.2015.1070851.
10. Dimova ED, Ward A, Swanson V, Evans JM. Patients’ illness perceptions of type 2 diabetes: a scoping review. Curr Diabetes Rev. 2019;15(1):15–30. https://doi.org/10.2174/1573399814666171227214845.
11. Sawyer AT, Harris SL, Koenig HG. Illness perception and high readmission mental health outcomes. Health Psychol Open. 2019;6(1):2055102919844504. https://doi.org/10.1177/2055102918844504.
12. Subramaniam M, Abdin E, Jayagunarathan A, Chang S, Samari E, Shafee S, et al. Exploration of illness perception among patients with mental illness in a multi-ethnic Asian sample. Psychiatry Res. 2018;267:516–27. https://doi.org/10.1016/j.psychres.2018.06.032.
13. Chan RCH, Mak WWS. Common sense model of mental illness: understanding the impact of cognitive and emotional representations of mental illness on recovery through the mediation of self-stigma. Psychiatry Res. 2016;246:16–24. https://doi.org/10.1016/j.psychres.2016.09.013.
14. Hagger MS, Koch S, Chatzisarantis NLD, Orbell S. The common sense model of self-regulation: meta-analysis and test of a process model. Psychol Bull. 2017;143(1):111:117–54. https://doi.org/10.1037/bul0000118.
15. Van Bavel JJ, Baicker K, Boggio PS, Caprano V, Cichocka A, Cikara M, et al. Using social and behavioural science to support COVID-19 pandemic response. Nat Hum Behav. 2020;4(5):460–71. https://doi.org/10.1038/s41562-020-0884-z.
16. Skapinakis P, Bellos S, Oikonomou A, Dimitriadis G, Gkikas P, Perdikari E, et al. Depression and its relationship with coping strategies and illness perceptions during the COVID-19 lockdown in Greece: a cross-sectional survey of the population. Depress Res Treat. 2020;2020:3158954. https://doi.org/10.1155/2020/3158954.
17. Rahman MA, Hoque N, Alif SM, Salehin M, Islam SMS, Banik B, et al. Factors associated with psychological distress, fear and coping strategies during the COVID-19 pandemic in Australia. Glob Health. 2020;16:95. https://doi.org/10.1186/s12992-020-00624-w.
18. Mariani R, Renzi A, Di Trani M, Trabucchi G, Danskín K, Tambelli R. The impact of coping strategies and perceived family support on depressive and anxious symptomatology during the coronavirus pandemic (COVID-19) lockdown. Front Psychiatry. 2021;11:587724. https://doi.org/10.3389/fpsyco.2021.0587724.
19. Guo J, Feng XL, Wang XY, van Ijzendoorn MH. Coping with COVID-19: exposure to covid-19 and negative impact on livelihood predict elevated mental health problems in Chinese adults. Int J Environ Res Public Health. 2020;17(1):1–18.
20. Kashdan TB, Rottenberg J. Psychological flexibility as a fundamental aspect of health. Clin Psychol Rev. 2010;30(7):865–78. https://doi.org/10.1016/j.cpr.2010.03.001.

21. French K, Golijani-Moghaddam N, Schröder T. What is the evidence for the efficacy of self-help acceptance and commitment therapy? A systematic review and meta-analysis. J Contextual Behav Sci. 2017;6(4):360–74. https://doi.org/10.1016/j.jcbs.2017.08.002.

22. Graham CD, Gouick J, Krähé C, Gillanders D A. A systematic review of the use of acceptance and commitment therapy (ACT) in chronic disease and long-term conditions. Clin Psychol Rev. 2016;46:46–58. https://doi.org/10.1016/j.cpr.2016.04.009.

23. Gloster AT, Meyer AH, Lieb R. Psychological flexibility as a malleable public health target: evidence from a representative sample. J Contextual Behav Sci. 2017;6(2):166–71. https://doi.org/10.1016/j.jcbs.2017.02.003.

24. Fonseca S, Trindade IA, Mendes AL, Ferreira C. The buffer role of psychological flexibility against the impact of major life events on depression symptoms. Clin Psychol. 2020;24(1):82–90. https://doi.org/10.1011/cp.12194.

25. Karelka M, Painayioutso G. Coping and overlapping avoidance: unique or overlapping constructs? J Behav Ther Exp Psychiatry. 2011;42(2):163–70. https://doi.org/10.1016/j.jbtep.2010.10.002.

26. Nielsen E, Sayal K, Townsend E. Exploring the relationship between psychological flexibility and self-harm. PLoS One. 2016;11(7):e0155854. https://doi.org/10.1371/journal.pone.0155854.

27. Tyndall I, Waldeck D, Pancani L, Whelan R, Roche B, Dawson DL. The role of acceptance and commitment questionnaire-II (AAQ-II) as a measure of experiential avoidance: concerns over discriminant validity. J Contextual Behav Sci. 2019;8(3):12278–84. https://doi.org/10.1016/j.jcbs.2018.09.005.

28. Eisenberg N, Spinnard TL, Kafka-Noam A. Handbook of child psychology and developmental science: socioemotional processes: Wiley; 2015.

29. Betsch C, Böhm R, Korn L, Holtmann C. On the benefits of explaining herd immunity in vaccine advocacy. Nat Hum Behav. 2017;1(3):0056. https://doi.org/10.1037/tra0000018.

30. Brewer NT, Chapman GB, Rothman AJ, Leask J, Kempe A. Increasing vaccination: putting psychological science into action. Psychol Sci Public Interest. 2017;18(3):149–207. https://doi.org/10.1177/1529100617705211.

31. PeConga EK, Gauthier GM, Holloway A, Walker RS, Rosencrans PL, Zoellner TA, et al. Resilience is spreading: mental health within the COVID-19 pandemic. Psychol Trauma. 2020;12(5):547–8. https://doi.org/10.1177/1948550620970087.

32. Wolf LJ, Haddick G, Manstead ASR, Maio GR. The importance of (shared) human values for containing the COVID-19 pandemic. Br J Soc Psychol. 2020;59(3):618–27. https://doi.org/10.1111/bjso.12401.

33. Holmes EA, O’Connor NC, Perry VH, Tracey I, Wessely S, Arsenault L, et al. Multidisciplinary research priorities for the COVID-19 pandemic: a call for action for mental health science. Lancet Psychiatry. 2020;7(6):547–60. https://doi.org/10.1016/S2215-0366(20)30168-1.

34. Raposa EB, Lawes HB, Ansell EB. Prosocial behavior mitigates the negative effects of stress in everyday life. Clin Psychol Sci. 2016;4(4):591–8. https://doi.org/10.1177/216770261661073.

35. Preston SD. The origins of altruism in offspring care. Psychol Bull. 2013;139(6):1305–41. https://doi.org/10.1037/a0031755.

36. Chong YY, Chien WT, Cheng HY, Chow KM, Kassianos A, Karekla M, et al. The role of illness perceptions, coping and self-efficacy on adherence to therapy effectiveness trial for transdiagnostic treatment-resistant patients. BMC Psychiatry. 2019;19(1):173.

37. Villanueva J, Meyer AH, Rinner MTB, Firsching VJ, Benoy C, Brogli S, et al. ‘Choose change’: design and methods of an acceptance and commitment therapy effectiveness trial for transdiagnostic treatment-resistant patients. BMC Psychiatry. 2019;19(1):173.

38. Guo C, Tomson G, Guo J, Tomson G, Guo J, Li X, Keller C, Söderqvist F. Psychometric evaluation of the mental health continuum-short form (MHC-SF) in Chinese adolescents - a methodological study. Health Qual Life Outcomes. 2015;13(1):198. https://doi.org/10.1186/s12955-015-0394-2.

39. Rosenstock IM, Strecher VJ, Becker MH. Social learning theory and the health belief model. Health Educ Q. 1988;15(2):175–83. https://doi.org/10.1177/107813698801500203.

40. Tang KN, Chan CS, Ng J, Yip C-H. Action type-based factorial structure of brief COPE among Hong Kong Chinese. J Psychopathol Behav. 2016;38(4):631–44. https://doi.org/10.1080/01658036.2016.1155140.
60. Gloster AT, Rinner MTB, Meyer AH. Increasing prosocial behavior and decreasing selfishness in the lab and everyday life. Sci Rep. 2020;10(1):21220. https://doi.org/10.1038/s41598-020-78251-z.

61. Ferentinos P, Yotsidi V, Porichi E, Douzenis A, Papageorgiou C, Stalikas A. Well-being in patients with affective disorders compared to nonclinical participants: a multi-model evaluation of the mental health continuum-short form. J Clin Psychol. 2019;75(9):1585–612. https://doi.org/10.1002/jclp.22780.

62. Han E, Tan MMJ, Turk E, Sridhar D, Leung GM, Shibuya K, et al. Lessons learnt from easing COVID-19 restrictions: an analysis of countries and regions in Asia Pacific and Europe. Lancet. 2020;396(10261):1525–34. https://doi.org/10.1016/S0140-6736(20)32007-9.

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