# Is caring for others good for our mental health? Evidence from the COVID-19 pandemic in the UK

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## Overview

### Aim:

Investigating informal caregivers' mental health during COVID-19, focusing on carers with different caregiving experiences

## Why is it important?

Informal care is crucial for the sustainability of most healthcare systems

• Alternative to formal care; £132bn saved a year (Carers UK, 2015)

Sudden disruption of formal care services due to COVID-19

 26% of UK adults now provides informal care (4.5 million started) during the pandemic) (Carers Week, 2020)

### Results:

Mental health fluctuated according to social restrictions:

 Existing caregivers seem to cope relatively well during COVID-19, while new carers were the most affected especially during lockdowns

Need to support informal caregivers at the start of their care provision Chiara Costi (Lancaster University)

## Contributions

Little research to understand caregivers' well-being during COVID-19

#### Contributions:

- Examine the role of caregiving experience (groups of existing or new informal caregivers VS never-carers)
- Employ a mixture of propensity score matching and DD models (accounting for self-selection into caregiving through observables, via statistical matching, and unobservables, via fixed effects)
- OD approaches used to obtain causal estimates:
  - Traditional two-way fixed effects (TWFE) models
  - Difference-in-differences with multiple time periods as proposed by Callaway and Sant'Anna (2021)



### Literature Review

Providing informal care is associated with a deterioration of carers' physical and mental health outcomes (*Lacey et al., 2019; Pinquart and Sorensen, 2003*).

• Problem of self-selection into caregiving (Bom et al., 2019)

Propensity score matching used to account for self-selection, matching on a wide set of pre-treatment observed variables (Bom et al., 2019; Bom and Stockel, 2021; Brenna, 2021; De Zwart et al., 2017; Lacey et al., 2019; Stockel and Bom, 2021)

- These studies only employ PSM
- Arguably, the observed bias with PSM is reduced, but there might still be some unobserved variable bias

### Literature Review

Most studies during the COVID-19 pandemic only look at associations:

• They focus on convenience samples, with limited external validity (Azevedo et al., 2021; Borelli et al., 2021; Greaney et al., 2022; Irani et al., 2021; Li et al., 2021; Lightfoot et al., 2021) and some are based on cross-sectional designs (Beach et al., 2021; Leggett et al., 2021; Ng et al., 2020; Rodrigues et al., 2021; Todorovic et al., 2020)

Some tried to account for self-selection using longitudinal datasets:

Mak et al (2021): compare mental health of informal caregivers VS non-carers through PSM

 Sample not representative; pre-COVID data not included; use only PSM

Bergmann and Wagner (2021): use two SHARE waves to analyse informal caregivers' mental health through matching and linear regressions

• Only two waves analysed; matching variables not related to care provision

### Dataset

Data from UK Household Longitudinal Study (Understanding Society):

- 3 regular mainstage questionnaire waves collected before COVID-19: Wave 8 (2016-2018), Wave 9 (2017-2019) and Wave 10 (2018-2020)
- 8 COVID-19 survey waves: COVID1 to COVID8 (April 2020 March 2021)

Final sample: 4,698 respondents interviewed for all the 11 waves, dropping

- Those who did not answer to mental health and to informal care
- Those who were already informal caregivers in Wave 8
- Home-carers and those without a continuous pattern

| Table: Informal care  | egiving patterns    | Treated                  |         | Control               |                         |  |
|---|---------------------|--------------------------|---------|-----------------------|-------------------------|--|
| Period  | Years               | Existing carers<br>(349) |         | New-carers<br>(1,655) | Never-carers<br>(2,694) |  |
|   |                     | Wave 9                   | Wave 10 |                       |                         |  |
|   | WAVE 8 (2016-2018)  | 0                        | 0       | 0                     | 0                       |  |
| Pre-COVID-19  | WAVE 9 (2017-2019)  | 1                        | 0       | 0                     | 0                       |  |
|   | WAVE 10 (2018-2020) | 1                        | 1       | 0                     | 0                       |  |
| After-COVID-19  | April 2020          | 1                        | 1       | 1                     | 0                       |  |
| Note: April 2020 is the first Wave of the COVID questionnaire, collected after the COVID-19 outbreak. |                     |                          |         |                       |                         |  |

Chiara Costi (Lancaster University)

## **Variables**

**Outcome**: 12-item General Health Questionnaire (GHQ-12)

- GHQ-caseness (0-12)
- GHQ≥ 4 (binary), as a robustness check

### Covariates:

 Age (squared), living alone, children in household, gender, ethnicity, education, employment, household income, nation, COVID-19 cases, deaths and tests

## Pre-treatment variables used in PSM:

| Area                        | Variables                           | Values   |  |
|-----------------------------|-------------------------------------|----------|--|
|                             | Married/civil partner               | (0-1)    |  |
| Need to provide care        | Living alone                        | (0-1)    |  |
|                             | Number of children under 16         | (0-4)    |  |
|                             | Paid employment                     | (0-1)    |  |
| Willingness to provide care | Job type                            | (1-12)   |  |
|                             | Income (quintiles)                  | (0-4)    |  |
|                             | Age                                 | (16-90+) |  |
|                             | Female                              | (0-1)    |  |
|                             | White                               | (0-1)    |  |
|                             | Long standing illness or disability | (0-1)    |  |
|                             | Self-assessed health                | (1-5)    |  |
|                             | SF-12 physical                      | (0-76)   |  |
| Ability to provide care     | SF-12 mental                        | (0-76)   |  |
|                             | N functional limitations            | (0-11)   |  |
|                             | Satisfaction with health            | (1-7)    |  |
|                             | Satisfaction with income            | (1-7)    |  |
|                             | Satisfaction with life overall      | (1-7)    |  |
|                             | GHQ-12 Likert scale                 | (0-36)   |  |
|                             | GHQ-12 Caseness scale               | (0-12)   |  |

## **Analysis**

TWFE is not robust to treatment effect heterogeneity (Callaway and Sant'Anna, 2021; de Chaisemartin and D'Haultfoeuille, 2020; Goodman-Bacon, 2021; Sun and Abraham, 2021). Our approach:

- Pre-process data using propensity score matching
- Separate TWFE regressions: each treated group considered one at a time, never-carers were always the control group (Results Tab 4-5)
- Callaway and Sant'Anna (2021) framework: simultaneously estimate the average treatment effect on different treatment groups based on the time period in which units are first treated (Results Fig 3-5)

We checked critical assumptions of DD designs:

- Parallel trends: visual inspection & pre-treatment coefficients
- We conducted one-to-one PSM and Kernel PSM





## Propensity Score Matching (Back)

|                                     | Existing of | arers VS     | New ca  | rers VS      |  |
|-------------------------------------|-------------|--------------|---------|--------------|--|
|                                     | never-      | never-carers |         | never-carers |  |
|                                     | Before:     | After:       | Before: | After:       |  |
|                                     | t-test      | t-test       | t-test  | t-test       |  |
| Need to provide care:               |             |              |         |              |  |
| Married/civil partner               | 0.3452      | 0.753        | 0.0336  | 0.511        |  |
| Living alone                        | 0.0005      | 0.648        | 0.0050  | 0.127        |  |
| Number of children under 16         | 0.0204      | 0.602        | 0.0000  | 0.507        |  |
| Willingness to provide care:        |             |              |         |              |  |
| Paid employment                     | 0.3130      | 0.814        | 0.0000  | 0.908        |  |
| Job type                            | 0.4261      | 0.625        | 0.0389  | 0.847        |  |
| Income (quintiles)                  | 0.7268      | 0.267        | 0.0042  | 1.000        |  |
| Ability to provide care:            |             |              |         |              |  |
| Age                                 | 0.0010      | 0.495        | 0.0000  | 0.403        |  |
| Female                              | 0.0000      | 0.815        | 0.0000  | 0.885        |  |
| White                               | 0.0180      | 0.690        | 0.5379  | 0.333        |  |
| Long standing illness or disability | 0.0664      | 0.875        | 0.0071  | 0.165        |  |
| Self-assessed health                | 0.0202      | 0.593        | 0.0001  | 0.370        |  |
| SF-12 physical health               | 0.0023      | 0.507        | 0.0006  | 0.614        |  |
| SF-12 mental health                 | 0.7500      | 0.778        | 0.0912  | 0.353        |  |
| Number of functional limitations    | 0.0369      | 0.823        | 0.0012  | 0.291        |  |
| Satisfaction with health            | 0.0457      | 0.677        | 0.0114  | 0.587        |  |
| Satisfaction with income            | 0.3640      | 0.315        | 0.7616  | 0.445        |  |
| Satisfaction with life overall      | 0.9661      | 0.779        | 0.2632  | 0.772        |  |
| GHQ Likert scale                    | 0.3734      | 0.988        | 0.0054  | 0.263        |  |
| GHQ Caseness scale                  | 0.5735      | 0.795        | 0.0662  | 0.094        |  |

Note: The high-quality matching procedure is showed by insignificant t-test coefficients after matching and by the %bias <10 (not shown here)

## Descriptive statistics

Fig. 1 Existing carers and Never-carers

Descriptive statistics (Weighted mean by carer groups over time)

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First inspection of the parallel trends assumption by plotting the average of the outcome of interest



## 1) TWFE in generalised DD approach (Cunningham, 2021)

$$Y_{it} = \alpha_i + \lambda_t + \delta^{DD} D_{it} + \gamma X_{it} + \varepsilon_{it}$$
 (1)

- $\delta^{DD}$ : effect of providing informal care on  $Y_{it}$  (mental health)
- $\alpha_i$  and  $\lambda_t$ : individual and time fixed effects
- X<sub>it</sub>: observed covariates
- ullet  $arepsilon_{\mathit{it}}$ : standard errors clustered at primary sampling unit
- $D_{it}$ : treated units in treated time periods ( $TREAT_i \times POST_t$ )
  - $TREAT_i=1$  for informal carers;  $TREAT_i=0$  for never-carers
  - POST<sub>t</sub>: dummy variable for each period included in the analysis

## 2) Difference-in-difference with multiple time periods

Under parallel trends assumption on never-treated units:

$$ATT(g,t) = E[Y_t - Y_{g-1}|G = g] - E[Y_t - Y_{g-1}|C = 1]$$
 (2)

ATT simultaneously estimated for each treated group at each time period

 Treated groups defined by the time period in which units are first treated

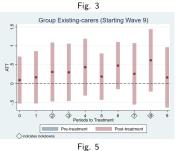
## TWFE regression models: Results

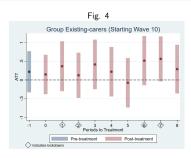
| Table 4: DD results. GHQ-caseness |                     |         |              |                |          |          |  |
|-----------------------------------|---------------------|---------|--------------|----------------|----------|----------|--|
| DD interactions                   | GHQ Existing carers |         |              | GHQ New carers |          |          |  |
| (Wave 10 as baseline)             | (1)                 | (2)     | (3)          | (1)            | (2)      | (3)      |  |
| Carer x Wave 8 (2016-2018)        | -0.312              | -0.349  | -0.349       | -0.040         | -0.024   | -0.024   |  |
|                                   | (0.358)             | (0.251) | (0.251)      | (0.104)        | (0.121)  | (0.121)  |  |
| Carer x Wave 9 (2017-2019)        | -0.428              | -0.202  | -0.202       | -0.116         | -0.069   | -0.069   |  |
|                                   | (0.347)             | (0.223) | (0.223)      | (0.099)        | (0.115)  | (0.115)  |  |
| Carer x Wave COVID 1 (April 2020) | 0.480               | 0.293   | 0.292        | 0.336***       | 0.369*** | 0.367*** |  |
|                                   | (0.414)             | (0.283) | (0.283)      | (0.119)        | (0.137)  | (0.137)  |  |
| Carer x Wave COVID 2 (May 2020)   | 0.512               | 0.125   | 0.124        | 0.270**        | 0.319**  | 0.316**  |  |
|                                   | (0.356)             | (0.243) | (0.243)      | (0.117)        | (0.136)  | (0.136)  |  |
| Carer x Wave COVID 3 (June 2020)  | 0.370               | 0.357   | 0.358        | 0.289**        | 0.387*** | 0.385*** |  |
|                                   | (0.378)             | (0.256) | (0.257)      | (0.119)        | (0.138)  | (0.138)  |  |
| Carer x Wave COVID 4 (July 2020)  | 0.107               | 0.052   | 0.048        | 0.073          | 0.180    | 0.176    |  |
|                                   | (0.342)             | (0.244) | (0.244)      | (0.113)        | (0.131)  | (0.132)  |  |
| Carer x Wave COVID 5 (Sept 2020)  | 0.225               | 0.062   | 0.061        | 0.135          | 0.193    | 0.189    |  |
|                                   | (0.331)             | (0.241) | (0.241)      | (0.114)        | (0.130)  | (0.130)  |  |
| Carer x Wave COVID 6 (Nov 2020)   | -0.007              | 0.316   | 0.311        | 0.228*         | 0.265*   | 0.261*   |  |
|                                   | (0.275)             | (0.246) | (0.246)      | (0.118)        | (0.137)  | (0.137)  |  |
| Carer x Wave COVID 7 (Jan 2021)   | 0.323               | 0.477*  | 0.472*       | 0.267**        | 0.246*   | 0.240*   |  |
|                                   | (0.309)             | (0.244) | (0.243)      | (0.123)        | (0.140)  | (0.140)  |  |
| Carer x Wave COVID 8 (Mar 2021)   | -0.034              | 0.094   | 0.091        | 0.049          | 0.092    | 0.086    |  |
|                                   | (0.354)             | (0.245) | (0.245)      | (0.121)        | (0.138)  | (0.138)  |  |
| Demographic/Socioeconomic Ch.     |                     | ✓       | ✓            |                | ✓        | ✓        |  |
| COVID variables                   |                     |         | $\checkmark$ |                |          | ✓        |  |
| Wave fixed effects                | YES                 | YES     | YES          | YES            | YES      | YES      |  |
| Individual fixed effects          | YES                 | YES     | YES          | YES            | YES      | YES      |  |
| Observations                      | 30360               | 23176   | 23176        | 47322          | 34472    | 34472    |  |
| N of respondents                  | 2760                | 2112    | 2112         | 4302           | 3143     | 3143     |  |

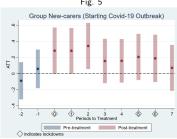
Note: In separate analyses, Carer takes value 1 if respondents are existing caregivers, or if they are new caregivers and 0 if they are never-carers. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1 ++ indicates that the variables are projected from the mainstage waves

Robust standard errors in parenthesis clustered at primary campling unit

## DD with multiple time periods: Results







## Limitations:

- Only external informal caregivers are investigated: lower bound estimates
- Q GHQ-12 is a self-assessed indicator: same results with other outcomes?
- Intensity of care is not examined: we looked at the duration of care
- Representative sample of UK adults: other countries?

#### Conclusion:

Psychological well-being fluctuated according to social restrictions, but:

- New carers were the most affected, especially during lockdowns
- Psychological support for informal caregivers is needed, especially at the start of care provision

## Thank you for listening! Any questions?

