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**Citation:**

RATHOD-MISTRY, Trishna, PEAT, George, NEOGI, Tuhina and THOMAS, Martin J (2023). An Evaluation of Different Strategies for Sampling Controls in an Online Case-Crossover Study of Acute Flares in Knee Osteoarthritis. *Clinical epidemiology*, 15, 635-644. [Article]

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# An Evaluation of Different Strategies for Sampling Controls in an Online Case-Crossover Study of Acute Flares in Knee Osteoarthritis

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**Objective:** To evaluate bias and precision of exposure-outcome effect estimates from three control sampling strategies in a case-crossover study.

**Methods:** Online case-crossover study investigating eight physical activity-related triggers for acute flares in knee osteoarthritis. Exposures were measured in hazard periods ( $\leq 24$  hours before self-declared flare onset). Control period exposure was measured in three ways: (1) four scheduled questionnaires over 13-weeks, (2) “usual” physical activity levels ascertained at baseline, (3) over three days before flare onset. Derived odds ratios, 95% confidence intervals and standard errors were compared.

**Results:** Of 744 participants (mean age 62.1 [SD 10.2] years; 61% female), 493 reported 714 flares. Selecting controls from scheduled questionnaires, independent of hazard periods, yielded predominantly odds ratios in the expected direction (exposure “a lot” versus exposure “not at all”, range: 0.57–3.22). When controls were sampled at baseline (range: 0.01–1.42) or immediately before a flare (range: 0.30–1.27) most odds ratio estimates were inverted. Standard errors of the log odds ratios were smallest when controls were sampled from scheduled questionnaires (range: 0.264–0.473) compared to controls sampled at baseline (range: 0.267–0.589) or immediately before a flare (range: 0.319–0.621).

**Conclusion:** Our findings are sensitive to control sample selection. Under certain conditions, different patterns could be attributed to over reporting and social desirability bias, where people may want to present themselves more positively about their “usual” physical activity levels, at baseline. Exposure measurement at the time of a flare may be less precise and more susceptible to recall bias due to systematically reporting exposures differently during a flare, compared to control measurement independent of flares.

**Keywords:** osteoarthritis, flare, pain, case-crossover, sampling, knee

## Introduction

The case-crossover is an efficient study design to estimate the effect of transient exposure on acute outcome. This self-controlled design has key advantages including no time-invariant confounding and no requirement of unexposed individuals. This is achieved by measuring exposure over a set period prior to the outcome (hazard), and then comparing this exposure measurement at other periods (controls) when the outcome did not occur, within the same individual.<sup>1</sup>

Differential information bias may arise if recall of exposure differs within the hazard and control periods. Various control sampling strategies may be employed to ensure the exposure distribution best represents the expected exposure distribution while at risk of the outcome during the hazard periods. Exposure can be measured over a short interval of time for both control and hazard periods, or for control samples, over longer intervals by capturing data on “usual” exposure frequency.<sup>1,2</sup>

Few studies have evaluated the influence of control sampling strategy on exposure-outcome effect estimates. Studies comparing a pair-matched interval approach with the usual frequency approach<sup>3–5</sup> found that the latter approach yielded greater precision with exposure effect estimates in the same direction in both approaches. A similar finding was also observed by Bond et al<sup>6</sup> constructing 1095 six-hour control periods over the past year (usual frequency approach) which yielded greater precision in estimates and mostly smaller exposure effect estimates than using a single control (pair-matched interval approach). Mittleman et al<sup>3</sup> also found increasing the number of control periods (multiple intervals matched approach) led to greater precision in exposure effect estimates than using a single control in the pair-matched interval approach. Similarly, Möller et al<sup>7</sup> observed that sampling controls 24–48 hours prior to the hazard period in a pair-matched interval approach yielded larger exposure effect estimates and standard errors than multiple controls sampled independently of the hazard period.

We sought to contribute new empirical evidence to this sparse evidence base using data from an online case-crossover study of triggers for acute flares in knee osteoarthritis. The ACT-FLARE study<sup>8</sup> was intentionally designed to incorporate several control sampling strategies. In this analysis, we compare the direction, magnitude, and precision of exposure effects for eight self-reported physical exposures obtained from three control sampling strategies: (i) usual frequency measurement at baseline, (ii) scheduled measurement, and (iii) event-driven measurement, and critically reflect on implications for bias and efficient use of resources in the future design of similar studies.

## Methods

### Data Source

The ACT-FLARE case-crossover study recruited adults aged  $\geq 40$  years with knee pain and/or knee osteoarthritis from 15 general practices, local communities, and social media advertisement in England. Ethical approval was obtained from Yorkshire & The Humber-Leeds East Research Ethics Committee (REC reference number: 18/YH/0075). After consenting, participants completed a Baseline questionnaire including questions on descriptive characteristics and “usual” levels of physical activity exposures. Participants were then invited to complete four Scheduled follow-up questionnaires at 1-, 5-, 9- and 13-weeks. This included questions on physical activity exposures on the day of completion and three days prior. At any point over the 13-week study, participants could report an acute flare and complete an Event-Driven questionnaire capturing information on the flare and physical activity exposures on the day of flare and three days prior.<sup>8</sup>

### Exposures

Our focus was on nine physical activities that were well-completed across the three questionnaire types and for which there is consensus on the anticipated direction of association. Exposure to one physical activity, going up and down ladders, was rare (4%) and dropped from further analysis leaving eight physical activity exposures. The question on exposure frequency differed slightly across the three questionnaires but response options were consistent (Figure 1).

### Outcome Definition

A self-reported flare was defined as a sudden onset of worsening signs and symptoms, lasting for at least 24 hours.<sup>8,9</sup>

### Selection of Hazard Periods

In the Event-Driven questionnaires, exposures measured on the day of the flare represented the hazard period. Participants could report  $\geq 1$  flare during the study and therefore potentially contribute multiple hazard periods.

### Selection of Control Periods

Exposures measured in the hazard period were compared with exposures measured during the control periods (when no flare occurred). Three control strategies were considered:

Strategy 1: Four Scheduled questionnaires, with exposures measured on day of questionnaire completion.

Strategy 2: Baseline questionnaire, measuring “usual” frequency of exposure.

Control sampling strategy and exposure frequency question
<b>Baseline questionnaire:</b> <i>On a normal day for you, how much do you do each of the below activities?</i>
<b>Scheduled questionnaire:</b> <i>How much of the following activities did you do today, day before, 2 days earlier, and 3 days earlier?</i>
<b>Event-Driven questionnaire:</b> <i>How much of the following activities did you do on the day of the flare, day before, 2 days earlier, and 3 days earlier?</i>
Exposure
Walking outside without a rest Standing for long periods without a rest Sitting for long periods without a break Moderate-to-vigorous physical activity Going up and down stairs Driving Squatting or kneeling Lifting or moving heavy objects
Response options
Not at all A little A lot

**Figure 1** Exposure measurement in the ACT-FLARE study.<sup>8</sup> The exposure frequency question wording was slightly different across the Baseline, Scheduled and Event-Driven questionnaires. The response options for each of the exposures measured were consistent.

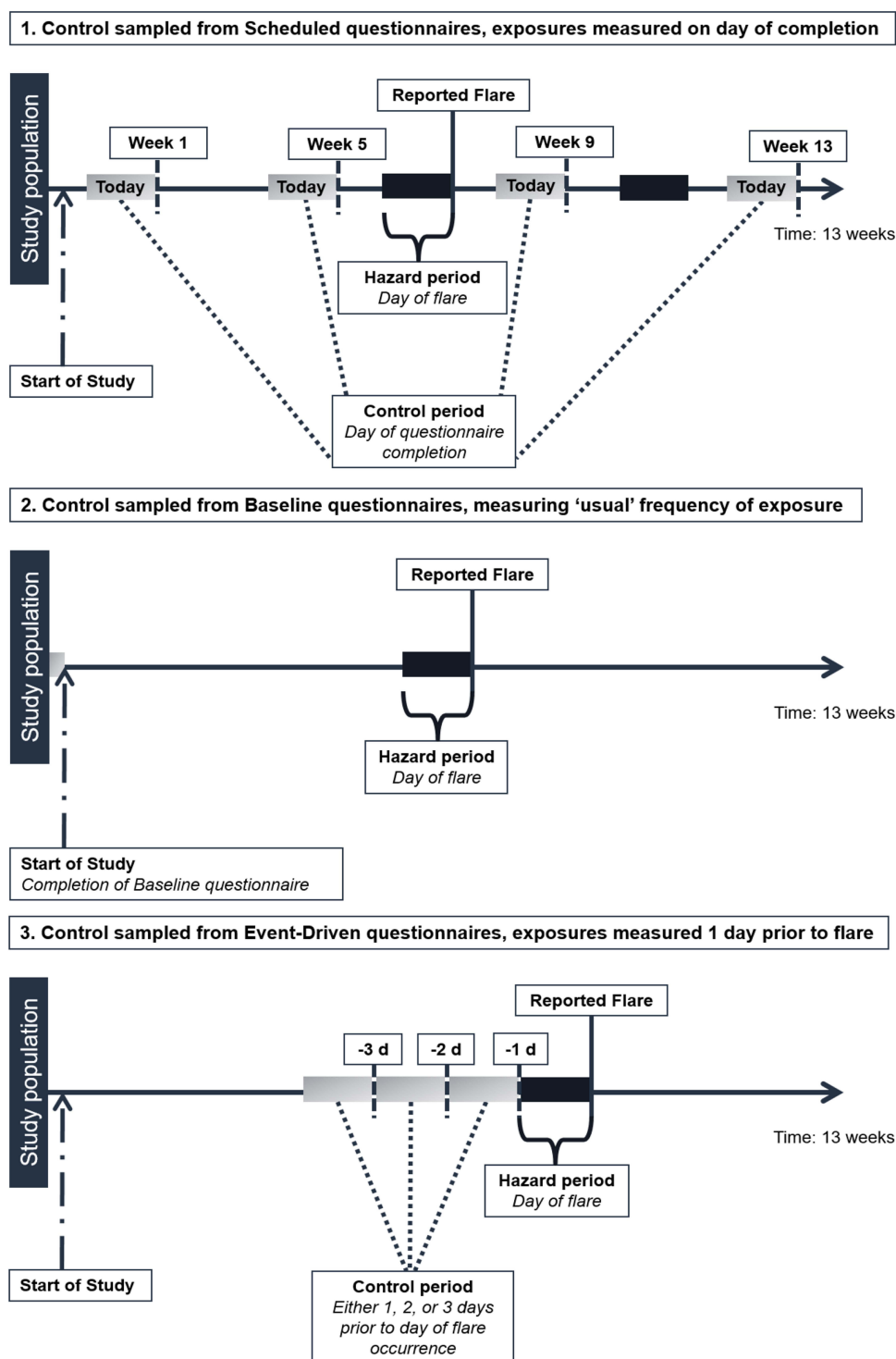
Strategy 3: Event-Driven questionnaire, with exposures measured on days one, two, and three prior to flare occurrence.

Timing of hazard and control periods are illustrated in Figure 2. The primary analysis of the ACT-FLARE study<sup>9</sup> utilised the four Scheduled questionnaires as the control sampling strategy, ie multiple intervals matched approach. This was more likely to yield greater precision due to matching on several controls compared to one control, and be independent of hazard periods compared to the “usual” frequency at Baseline and the Event-Driven questionnaires, where self-reported exposure data may be influenced whilst having a flare. Although we believed this to be the least biased strategy it is the most burdensome for researcher administration and participants. The Scheduled questionnaire was considered the referent control strategy for this analysis and was therefore reported first in the subsequent analyses.

## Statistical Analysis

For the primary analysis, one hazard period per participant was matched to one control period (1:1 matching, pair-matched interval approach), to ensure any differences observed between the three control strategies was not due to differing number of control and hazard periods across exposures. For each participant, the first reported flare was taken as the hazard period to ensure the frequency exposure distribution in the hazard period was the same across all three control sampling strategies. Whilst the Baseline questionnaire and the Event-Driven questionnaire provided one control period each, for the Scheduled questionnaire, up to four control periods were potentially available. The first completed Scheduled questionnaire was selected as the control period. This was deemed acceptable as approximately 50% of controls were assessed both before and after a hazard period across all eight physical activity exposures. For each physical activity exposure, the same hazard periods were analysed and sample size was constant across the three control strategies.

In the analysis of discordant pairs in case-crossover studies, conditional logistic regression is a standard approach that has advantages of incorporating m:n matching and modelling exposure with more than two category levels, unlike the Mantel-Haenszel estimator that is restricted to binary exposure.<sup>3,10,11</sup> Odds of exposure compared between the hazard and control periods yielded odds ratios and 95% confidence intervals. Standard errors of the log odds ratio were also estimated. Estimates were compared across the three control sampling strategies. Discordant pairs underpinning the conditional logistic regression analysis were also tabulated to examine patterns. Analyses were performed in Stata v16.0 (Stata Corporation, Texas, USA).



**Figure 2** Schematic representation of the three control period sampling strategies employed in the ACT-FLARE study.<sup>8</sup> Strategy 1 represents a participant who reported a flare and provided bi-directional control exposure measurements by completing 4 Scheduled questionnaires; strategy 2 represents a participant who reported a flare and provided control exposure measurement from the Baseline questionnaire; strategy 3 represents a participant who reported a flare and provided control measurement as part of the same Event-Driven questionnaire.

Four sensitivity analyses were performed following the primary analysis. First, many-to-many matching (m:n matching, multiple intervals matched approach) allows all available hazard and control periods to be included, analysing the maximum available data. Using up to four Scheduled questionnaires as controls were accounted for using m:n

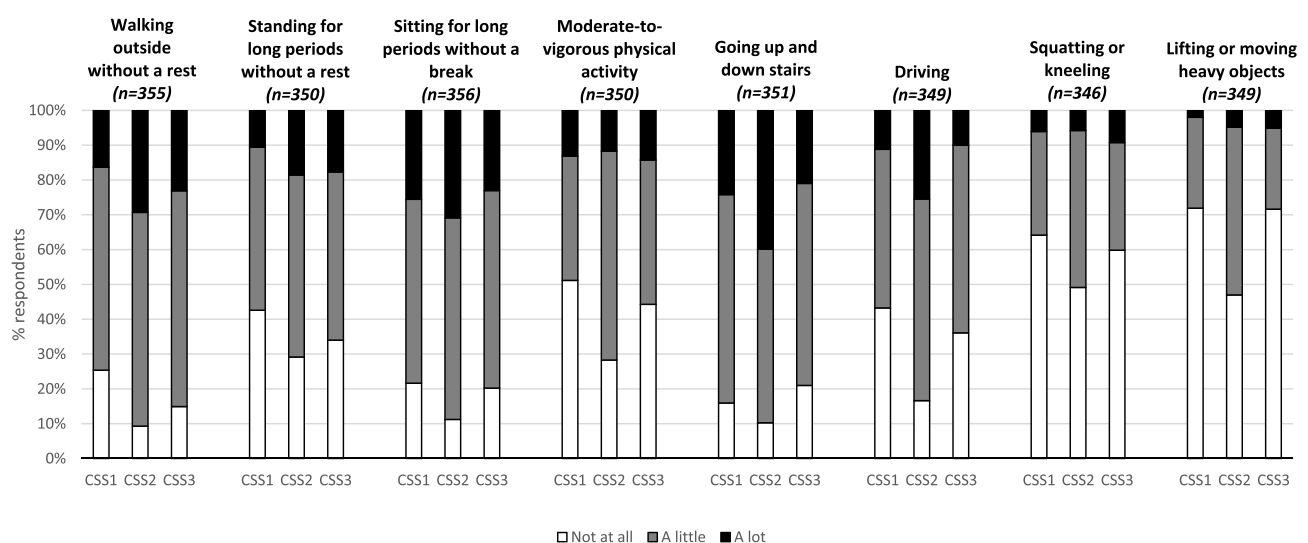
matching. When the baseline questionnaire was utilised as a single control, m:1 matching was performed. A single control measured one day prior to day of flare occurrence measured via the Event-Driven questionnaire was matched to day of flare occurrence (1:1 matching, pair-matched interval approach). Across the three control strategies, the sample size for controls naturally differed. Second, control period selection was restricted to only those measured prior to hazard periods, ie unidirectional sampling to examine time trends in exposure.<sup>2</sup> This restriction was only applicable for the analysis using Scheduled questionnaires. Third, the analysis was re-run with the exclusion of participants who reported to be experiencing a flare at Baseline, which could influence how initial questionnaires were answered. Fourth, we redefined the hazard period to one day before the day of the flare occurrence to ensure all exposures had occurred prior to flare occurrence and exposures in the control period were measured two days prior to flare occurrence. The fourth sensitivity analysis using the Event-Driven questionnaires, was extended to include two and three days prior to the day of flare occurrence to further examine induction time.

## Results

744 eligible adults consented to participate and completed the Baseline questionnaire between July 2018 and February 2019 (mean age [standard deviation (SD)] 62.1 [10.2] years; 61% female; mean body mass index 29.2 (SD: 5.7) kg/m<sup>2</sup>). Forty-four percent were employed, 43% were retired. The majority (36%) had knee pain for between 1–4 years, but pain for <1 year, 5–9 years and ≥10 years was also common, 16%, 18% and 27% respectively. Sixty-eight percent had consulted a General Practitioner for knee pain in the last 12 months and 32% had consulted a physiotherapist. Based on self-reported physical activity, 37% of the sample were “inactive”.<sup>9</sup> During the study period, 714 flares were reported from 493 participants who completed Event-Driven questionnaires. In the primary analysis, between 346 and 356 participants were analysed for each exposure. Half of scheduled control periods (48–50%) occurred prior to flare onset.

Across the three control sampling strategies, the most common exposures reported “a lot” were sitting for long periods without a break (23.0–30.9%), going up and down stairs (21.0–39.9%) and walking outside without a rest (16.3–29.3%) (Figure 3).

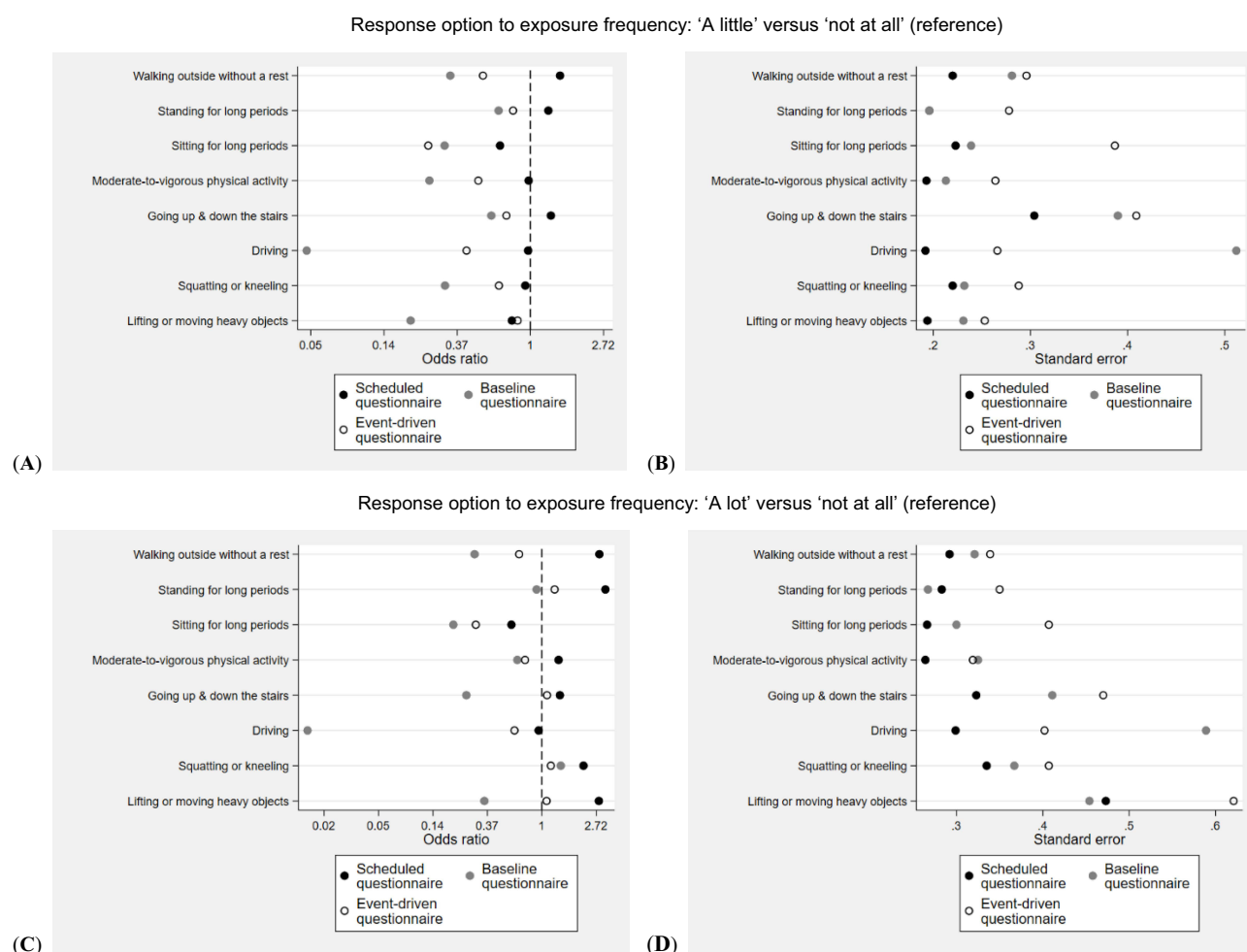
Using 1:1 matching (paired-matched interval approach) yielded sets of estimates for the eight physical activity exposures that appeared to be systematically different across the three sampling control strategies (Figure 4; Table 1; Table S1). For the sampling strategy using the Scheduled questionnaires, most odds ratio estimates were positive (>1). Conversely, when control periods were sampled from the Baseline questionnaire and from within the Event-



**Figure 3** Exposure frequencies across the three control sampling strategies. CSS1: Control sampling strategy 1: Four Scheduled questionnaires, with exposures measured on day of questionnaire completion. CSS2: Control sampling strategy 2: Baseline questionnaire, measuring “usual” frequency of exposure. CSS3: Control sampling strategy 3: Event-Driven questionnaire, with exposures measured one day prior to flare occurrence.

Driven questionnaire odds ratio estimates  $<1$  were most commonly observed. Difference in the precision of estimates were modest but favoured the Scheduled questionnaire due to the higher number of discordant pairs (Figure 4).

In sensitivity analyses using all available hazard periods and controls periods (m:n matching, multiple intervals matched approach) the patterns of exposure effect estimates and standard errors remained comparable although the standard errors were smaller from analysing a larger number of hazard and control periods (Table S2). When restricting the Scheduled Questionnaire analysis to control periods occurring before the hazard period (unidirectional sampling), derived point estimates were in the same direction, and were slightly larger in magnitude than in the primary analysis for most exposures (Table S3). Removing participants who reported having a flare when completing the Baseline questionnaire led to a slight systematic increase in the magnitude of odds ratio point estimates across most physical activity exposures, across all the control sampling strategies (Table S4). By moving the hazard period from the day of the flare to 1 day prior to flare occurrence, the odds ratio point estimates remained largely in the same direction as the primary analysis, however the magnitude varied slightly for some exposures (Table S5). Extending the Event-Driven questionnaire control period sampling, by using two and three days prior to the day of flare occurrence, yielded odds ratio point estimates in the same direction as the primary analysis. However, by sampling control periods further away from the day of flare occurrence, larger odds ratios with smaller standard errors were observed across most physical activity exposures (Table S6).



**Figure 4** Comparison of effect estimates across the three control sampling strategies (1:1 matching). (A) odds ratio point estimates for exposure frequency: "A little" versus "not at all" (reference), (B) standard errors for exposure frequency: "A little" versus "not at all" (reference), (C) odds ratio point estimates for exposure frequency: "A lot" versus "not at all" (reference), (D) standard errors for exposure frequency: "A lot" versus "not at all" (reference).



**Table I** Comparison of Physical Activity Exposure Odds Ratios and Standard Errors Across Each Control Sampling Strategy (1:1 Matching, Pair-Interval Matched Approach)

	First Completed Scheduled Questionnaire		Baseline Questionnaire		Event-Driven Questionnaire, 1 Day Before Flare Occurrence	
	OR (95% CI)	SE of log OR	OR (95% CI)	SE of log OR	OR (95% CI)	SE of log OR
<b>Walking outside without a rest</b>						
Not at all	I		I		I	
A little	1.50 (0.97, 2.31)	0.220	0.33 (0.19, 0.58)	0.281	0.52 (0.29, 0.93)	0.296
A lot	2.88 (1.63, 5.11)	0.292	0.29 (0.16, 0.55)	0.321	0.66 (0.34, 1.28)	0.339
<b>Standing for long periods without a rest</b>						
Not at all	I		I		I	
A little	1.28 (0.87, 1.88)	0.196	0.65 (0.44, 0.95)	0.196	0.79 (0.46, 1.36)	0.278
A lot	3.22 (1.85, 5.61)	0.283	0.91 (0.54, 1.53)	0.267	1.27 (0.64, 2.51)	0.350
<b>Sitting for long periods without a break</b>						
Not at all	I		I		I	
A little	0.66 (0.43, 1.02)	0.223	0.31 (0.19, 0.50)	0.239	0.25 (0.12, 0.53)	0.387
A lot	0.57 (0.34, 0.96)	0.266	0.20 (0.11, 0.35)	0.300	0.30 (0.13, 0.66)	0.407
<b>Moderate-to-vigorous physical activity</b>						
Not at all	I		I		I	
A little	0.98 (0.67, 1.43)	0.193	0.25 (0.17, 0.38)	0.213	0.49 (0.29, 0.82)	0.264
A lot	1.36 (0.81, 2.28)	0.264	0.64 (0.34, 1.21)	0.325	0.74 (0.39, 1.37)	0.319
<b>Going up and down stairs</b>						
Not at all	I		I		I	
A little	1.32 (0.73, 2.40)	0.304	0.59 (0.27, 1.26)	0.390	0.72 (0.32, 1.61)	0.409
A lot	1.40 (0.74, 2.63)	0.323	0.25 (0.11, 0.56)	0.411	1.10 (0.44, 2.77)	0.470
<b>Driving</b>						
Not at all	I		I		I	
A little	0.97 (0.66, 1.41)	0.192	0.05 (0.02, 0.13)	0.512	0.42 (0.25, 0.70)	0.266
A lot	0.94 (0.53, 1.70)	0.299	0.01 (0.004, 0.04)	0.589	0.61 (0.28, 1.33)	0.402
<b>Squatting or kneeling</b>						
Not at all	I		I		I	
A little	0.93 (0.61, 1.44)	0.220	0.31 (0.20, 0.49)	0.232	0.65 (0.37, 1.15)	0.288
A lot	2.15 (1.12, 4.15)	0.335	1.42 (0.69, 2.91)	0.367	1.18 (0.53, 2.62)	0.407
<b>Lifting or moving heavy objects</b>						
Not at all	I		I		I	
A little	0.78 (0.53, 1.14)	0.194	0.19 (0.12, 0.31)	0.231	0.84 (0.51, 1.38)	0.253
A lot	2.85 (1.13, 7.22)	0.473	0.35 (0.14, 0.85)	0.454	1.09 (0.32, 3.69)	0.621

**Abbreviations:** OR, Odds ratio; CI, Confidence Intervals; SE, Standard Error; log, natural logarithm.

## Discussion

This study demonstrates how choice of control sampling strategy may qualitatively and quantitatively affect exposure effect estimates from case-crossover analyses. By examining potential triggers for acute flares, in adults with or at risk of knee osteoarthritis, broad systematic differences were observed across sets of estimates from three control sampling strategies. Eight exposures were measured and compared, representing a range of physical activities that might be



expected to vary in frequency, accuracy of recall, and strength of association. Selecting controls from Scheduled questionnaires, independent of hazard periods, yielded predominantly positive odds ratio point estimates, compared with contrasting inverse estimates when control samples were based on questions about “usual” physical activities in the cohort Baseline questionnaire, or on the day before the flare within an Event-Driven questionnaire completed at the time of the flare.

Relative to the Scheduled questionnaire sampling strategy, the Baseline questionnaire and the Event-Driven questionnaire approaches may be subject to bias. Based on the observations of discordant pairs (Table S1), it appears participants systematically over-report their “usual” exposure frequencies at Baseline. Using self-report to examine regular physical activities is known to be vulnerable to over-reporting and social desirability bias, where respondents wish to identify themselves positively, for example as active individuals [eg<sup>12</sup>]. Consequently, use of this control sampling strategy should perhaps be avoided in circumstances where recalling answers to particular questions may be inconsistent or prone to such bias. For example, judgements around “usual” frequency of going up and down stairs may be more speculative than questions such as frequency of healthcare consultation for knee pain in the last year. Support for this interpretation in the current data is the exposure to squatting or kneeling. This question yielded positive odds ratio point estimates across all three sampling strategies. It is possible that judgements about general frequency of exposure to these provocative movements is memorable (or largely avoided) for people with knee pain and therefore more robust to question format and timing.

In the Event-Driven questionnaires reporting exposures on the day of flare onset and the three days prior whilst in the midst of a flare, where being more active is a potentially plausible explanation for flare onset, physical activity questioning is likely more vulnerable to recall bias. Similarly, during Scheduled questionnaires, completed during non-flare episodes, participants may have plausibly answered these questions when they have more time on less busy or less active days. This could also render these responses vulnerable to recall bias. However, when we observed the estimates for the Scheduled questionnaire, taking into account day of the week, overall interpretation of the pattern of estimates remained comparable (data not shown). The assumption of independence between control and hazard periods,<sup>2</sup> is more likely to be met using Scheduled questionnaires than measuring controls over three days prior to flare onset and at baseline where some participants were known to be experiencing a flare at that time, especially when an exposure may act over a longer period of time to result in the flare.

For the sensitivity analysis extending the control sampling strategy in the Event-Driven questionnaire from one day prior to two and three days prior, the observed odds ratio patterns were consistent. One explanation for this could be that recall bias persists when having a flare, regardless of how many days the questions span, and some participants may have to think back over a longer period if they delayed reporting the flare on day of onset. Another explanation could be that the induction period for a flare was mis-specified and could last four or more days, therefore the whole induction period was not fully observed. Within our dataset, it cannot be ruled out that this vulnerability applies equally to the observed hazard period in the Event-Driven questionnaire, resulting in systematic overestimation of exposure frequency in the hazard period also.

Our analysis therefore, cautions against sampling control periods at the time of a flare (or equivalent transient outcome) in several circumstances; if exposure states are less well defined or if induction time between exposure and outcome is unknown or poorly understood; if exposure measurement questioning is potentially vulnerable to recall bias; or if the induction period and impact of recall bias are likely to vary differentially amongst a set of putative exposure measurements.

Under sensitivity analysis restrictions, time-trends in exposure or flare status at study entry did not overly affect the overall interpretation; this likely reflects the short 13 week study duration. Also by moving the hazard period from the day of the flare to 1 day prior to ensure temporal ordering between flare and exposure, observations were generally unchanged. For the Scheduled questionnaire control strategy, 1:1 matching (pair-interval matched approach) and m:n matching (multiple intervals matched approach) produced comparable odds ratio estimates. This indicates that sampling one control period per hazard period may be sufficient when approaches for collecting multiple control periods are impractical, problematic (eg, using electronic health records), or increase participant burden, although precision will likely be reduced.

Our observation that increasing the number of control periods reduces the standard error in the exposure effect measurement is consistent with previous studies of physical exertion and myocardial infarction<sup>3</sup> and triggers of attacks of Meniere's disease.<sup>7</sup> In contrast, irrespective of control sampling strategies (pair or multiple intervals approaches) both Mittleman et al<sup>3</sup> and Möller et al<sup>7</sup> estimated exposure effects consistently in the same direction. Another notable difference was exposure measurement at Baseline. In our study, "usual" frequency of exposure was measured on a normal day as determined by the participant whereas Mittleman et al<sup>3</sup> and Sorock et al<sup>5</sup> measured "usual" frequency of exposure by calculating the duration of time exposed by multiplying reported usual frequency of exposure by usual duration. The "usual" frequency approach yielded greater precision in exposure effect estimates than the pair interval strategy although the converse was observed in our study for the "usual" frequency approach. Möller et al<sup>7</sup> had a similar study design to our study whereby controls were sampled at set time points during study follow-up independently of the hazard period and over a short period of time prior to the hazard period; and had also found sampling controls independently of the hazard period yielded the smallest standard errors. Inconsistent observations across studies may be attributed to different study populations and exposure measurements. This suggests there may not be one optimal control sampling strategy; rather choice will depend on context.

## Conclusion

In conclusion, derived odds ratios of exposure-outcome effect estimates in this case-crossover study appear sensitive to how control samples are assembled. Our analysis suggests that compared with a control sampling strategy of repeated prospective measurement of exposure frequency, "usual" frequency control measures at baseline, or control measures ascertained at the time of flare/outcome onset may be more vulnerable to bias.

## Data Sharing Statement

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

## Ethics Approval and Informed Consent

All study procedures were compliant with the Declaration of Helsinki. Ethical approval was obtained from Yorkshire & The Humber-Leeds East Research Ethics Committee (REC reference number: 18/YH/0075). Informed consent to participate was obtained from all participants.

## Funding

Tuhina Neogi was supported by NIH K24 AR070892 and NIH P30 072571. Martin J Thomas was funded by a National Institute for Health and Care Research (NIHR) and Health Education England (HEE) Integrated Clinical Academic Programme Clinical Lectureship (ICA-CL-2016-02-014) for this project and an NIHR Development and Skills Enhancement Award (NIHR300818). This publication presents independent research funded by the NIHR. The views expressed are those of the authors and not necessarily those of the NHS, the NIHR, HEE or the Department of Health and Social Care. For the purposes of open access, the authors have applied a Creative Commons Attribution (CC BY) licence to any Author Accepted Manuscript version arising from this submission.

## Disclosure

Professor George Peat reports grants from Primary Care Centre Versus Arthritis, during the conduct of the study. Professor Tuhina Neogi reports grants, consultant for Pfizer/Lilly, Novartis, and Regeneron, outside the submitted work. Dr Martin J Thomas reports grants from National Institute for Health and Care Research/Health Education England, during the conduct of the study. The authors report no other conflicts of interest in this work.

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