#### **ORIGINAL ARTICLE**



# Genetic impact of blood C-reactive protein levels on chronic spinal & widespread pain

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#### Abstract

**Purpose** Causal mechanisms underlying systemic inflammation in spinal & widespread pain remain an intractable experimental challenge. Here we examined whether: (i) associations between blood C-reactive protein (CRP) and chronic back, neck/shoulder & widespread pain can be explained by shared underlying genetic variants; and (ii) higher CRP levels causally contribute to these conditions.

**Methods** Using genome-wide association studies (GWAS) of chronic back, neck/shoulder & widespread pain (N=6063–79,089 cases; N=239,125 controls) and GWAS summary statistics for blood CRP (Pan-UK Biobank N=400,094 & PAGE consortium N=28,520), we employed cross-trait bivariate linkage disequilibrium score regression to determine genetic correlations (rG) between these chronic pain phenotypes and CRP levels (FDR < 5%). Latent causal variable (LCV) and generalised summary data-based Mendelian randomisation (GSMR) analyses examined putative causal associations between chronic pain & CRP (FDR < 5%).

**Results** Higher CRP levels were genetically correlated with chronic back, neck/shoulder & widespread pain (*rG* range 0.26–0.36;  $P \le 8.07E$ -9; 3/6 trait pairs). Although genetic causal proportions (GCP) did not explain this finding (GCP range – 0.32–0.08;  $P \ge 0.02$ ), GSMR demonstrated putative causal effects of higher CRP levels contributing to each pain type (beta range 0.027–0.166;  $P \le 9.82E$ -03; 3 trait pairs) as well as neck/shoulder pain effects on CRP levels (beta [S.E.] 0.030 [0.021]; P = 6.97E-04).

**Conclusion** This genetic evidence for higher CRP levels in chronic spinal (back, neck/shoulder) & widespread pain warrants further large-scale multimodal & prospective longitudinal studies to accelerate the identification of novel translational targets and more effective therapeutic strategies.

**Keywords** Chronic pain  $\cdot$  C-reactive protein  $\cdot$  Inflammation biomarkers  $\cdot$  Genome-wide association study  $\cdot$  Musculoskeletal pain  $\cdot$  Genetic predisposition to disease

### Introduction

Accumulating evidence points to inflammatory mechanisms driving the development & maintenance of chronic spinal pain [1]. Systematic reviews report higher levels of blood inflammatory markers (e.g., C-reactive protein [CRP]) in back pain [2], neck pain [2, 3] and fibromyalgia [4]. Higher

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CRP is associated with worse clinical outcomes in these patients, including increased pain, disability & hyperalgesia [5, 6]. Furthermore, CRP and interleukin (IL)-6 were shown to be systemically elevated in a large cohort of individuals with early-acute back pain [5], with the levels resolving at three (IL-6) and six (CRP) months later in those that recovered best over 12 months [7, 8]. Similarly, patients with acute whiplash-associated disorder [6] show raised CRP which is normalised by 3 months in those that recover, but persists in those who do not. Despite these links between systemic inflammatory responses and clinical outcomes in spinal & widespread pain conditions, the underlying specific pathways & mechanisms remain unclear.

Trung Thanh Ngo and Gabriel Cuéllar-Partida have contributed equally to this work.

Large-scale human genome-wide association studies (GWAS) have delivered novel insights into the mechanisms underpinning chronic pain [9, 10]. Particularly promising has been the discovery of specific shared genetic variants (i.e., genetic correlations) between chronic back & neck pain, widespread pain and a range of traits such as depression, obesity & poor sleep [10]—which helps to explain these common chronic disease comorbidities. Only recently have GWAS data been used to explore the relationship between systemic inflammation & pain conditions. Kasher et al. [11] reported genetic correlations between higher circulating CRP and an increased risk of chronic back pain. Using Mendelian randomisation analyses, they also suggested that CRP had a causal influence on back pain. However, it is not known whether CRP and other spinal pain phenotypes (e.g., neck pain) and/or widespread pain have a shared genetic basis, or whether CRP has a causal effect on these conditions.

Characterising the genetic contributions to systemic inflammation in chronic spinal & widespread pain remains a significant hurdle in better understanding their pathoetiology and developing new effective treatments. Demonstrating a causal role of such systemic factors is a critical step towards improving the management & prevention chronic spinal & widespread pain. Here, we leveraged large-scale genetic data to: (i) determine whether associations between blood CRP and chronic back, neck/shoulder & widespread pain can be explained by shared underlying genetic variants (genetic correlations); and (ii) assess whether higher CRP has a causal role in these conditions.

#### Methods

#### Study design & sample

An overview of the analysis pipeline is shown in Fig. 1. We performed GWAS of chronic back pain, neck/shoulder pain & widespread pain using the UK Biobank dataset (application number 25331) as described in prior studies [9, 10]. Briefly, the UK Biobank is a large-scale dataset comprising > 500,000 people aged 40–69 years in the United Kingdom. Data collected spans medical & psychosocial factors, blood markers, neuroimaging traits and genetics. UK Biobank holds research ethics approval from the North West Multi-centre Research Ethics Committee (Manchester, United Kingdom). All participants provided written informed consent.

# GWAS dataset for chronic spinal & widespread pain phenotypes

#### Chronic pain phenotypes

We selected chronic back pain & neck/shoulder pain as spinal pain phenotypes, in addition to chronic widespread pain,



**Fig. 1** Analysis pipeline examining the genetic relationship between chronic back, neck/shoulder & widespread pain phenotypes and blood C-reactive protein (CRP) concentration. CTG-VL: Complex Traits Genetics Virtual Lab; GWAS: genome-wide association study

which also encompasses pain at the back & neck (i.e., pain all over the body). In UK Biobank, neck pain & shoulder pain are pooled into one phenotype. We defined each chronic pain phenotype using self-report answers to the following questions: *Have you had [back pains/neck or shoulder pains/ pain all over the body] for more than 3 months?* (Questionnaire field IDs: 3571/3404/2956). These questions could be answered with *Yes, No, Don't know*, or *Prefer not to answer*. Participants who responded *Yes* to a question were defined as cases for that pain phenotype. We defined controls as participants who denied experiencing pain at any body site for more than three months (N=239,125). Participants who preferred not to answer were excluded from the study. Number of cases for each GWAS were as follows: back pain (N=79,089); neck/shoulder pain (N=72,216); widespread pain (N=6063) (Table 1).

#### **GWAS** analysis

GWAS analyses were undertaken using REGENIE (v1.0.6.2) [12] to assess associations between the chronic pain phenotypes & genetic variants. This method uses a logistic mixed model that accounts for cryptic relatedness by modelling a genetic relationship between individuals as a random effect. We used age, sex, genotyping array and the top 10 principal components derived from genetic data as co-variates for the GWAS analyses. Quality control procedures consisted of exclusion of variants with: (i) minor allele frequency < 0.005; (ii) imputation quality < 0.6; and (iii) deviating from Hardy–Weinberg equilibrium (P < 1E-05). We excluded individuals' data if genotype-derived principal components 1 and 2 were > 6 standard deviations from those of the 1000 Genomes European population (i.e., data were restricted to individuals with European heritage).

#### Genetic correlation analyses (pain vs CRP)

We employed cross-trait bivariate linkage disequilibrium (LD) score regression to estimate genetic correlations between the three chronic pain phenotypes & blood CRP concentration. LD-score regression estimates genetic correlations across traits through leveraging the relationship between LD & GWAS summary statistics, accounting for potential sample overlap across studies [13]. These analyses were performed with the Complex Traits Genetics Virtual Lab (CTG-VL—http://genoma.io) [14] using previously published GWAS summary statistics for CRP concentration [15, 16]. CTG-VL is a publicly available web platform compiled with > 1600 GWAS summary statistics that is used for running analyses across a comprehensive range of complex traits & disorders (mostly from UK Biobank releases).

A genetic correlation (rG) ranges from -1 to 1 and quantifies the genome-wide genetic concordance between a pair of traits. Genetic correlation estimates approaching 1 or -1 indicate (respectively) that a proportion of genetic variants have concordant or divergent effects on both traits.

 Table 1
 Sample sizes for the chronic pain phenotypes & controls used in the current genome-wide association study analyses

Chronic pain phenotypes	Males	Females	Total
Back pain	35,693	43,396	79,089
Neck/shoulder pain	29,742	42,474	72,216
Widespread pain	2244	3819	6063
Pain-free controls	115,204	123,921	239,125

Conversely, a genetic correlation that approaches 0 indicates there is little genetic concordance between the traits or that the genetic predictors of the traits are largely independent. *rG* estimates were calculated using two CRP traits from: (i) UK Biobank (Pan-UK Biobank—N=400,094 [15]); and (ii) the Population Architecture using Genomics & Epidemiology (PAGE) consortium (N=28,520 [16]). We corrected for multiple comparisons using the Benjamini–Hochberg false discovery rate (FDR < 5%) procedure, which was applied across genetic correlations for each chronic pain type GWAS.

#### Latent causal variable analyses (pain vs CRP)

In instances of non-zero rG estimates (FDR < 5%), latent causal variable (LCV) analyses were employed to quantify the genetic causal proportion (GCP) [17, 18], which enabled determination of whether a genetic correlation may reflect horizontal or vertical pleiotropy. That is, whether chronic pain and CRP concentrations are independently affected by the same set of genetic variants (horizontal pleiotropy) or by causal pathways (vertical pleiotropy) [19]. LCV analyses assume a latent 'causal' variable mediates the genetic correlation between two traits. This method quantifies the degree to which one trait is correlated with the latent 'causal' variable, using mixed fourth moments of the bivariate effect size distribution across all SNPs in both GWAS to estimate the posterior mean for GCP. It accounts for overlapping samples (i.e., GWAS data for chronic pain & CRP levels were both from UK Biobank). A GCP estimate ranges from -1 to 1, whereby GCP > 0.6 indicates greater partial genetic causality for Trait A (chronic pain) on Trait B (CRP) (i.e., chronic pain has a causal effect on CRP level). A GCP < -0.6 indicates greater partial genetic causality for Trait B on Trait A (i.e., CRP level has a causal effect on chronic pain). We applied a Benjamini–Hochberg false discovery rate (FDR < 5%) across GCPs for each chronic pain phenotype.

# Generalised summary-data-based Mendelian randomisation (pain vs CRP)

As LCV analyses are unable to detect bidirectional causal relationships, we performed Mendelian randomisation analyses with the Generalised Summary-data-based Mendelian Randomisation (GSMR) method [20] implemented in CTG-VL using GWAS summary statistics of chronic pain (back, neck/shoulder, widespread pain) and that of CRP (UK Biobank & PAGE studies). GSMR was performed in a bidirectional way (i.e., to test whether chronic pain affects CRP or vice versa). For each analysis, we selected SNPs with P < 5E-08 and minor allele frequency > 1% as instrumental variables.

#### Results

#### Genetic correlation analyses (pain vs CRP)

Cross-trait bivariate LD-score regression revealed 3 out of 6 significant genetic correlations (Table 2; Figs. 2 and 3). These were between each chronic pain type and CRP from the UK Biobank. The significant *rG* estimates were all positive (range: 0.26–0.36;  $P \le 8.07E-09$ ), suggesting that genetic variants associated with higher CRP concentrations were also associated with an increased risk of the respective chronic pain phenotype. No significant *rG* estimates were found with traits from the PAGE consortium (range:  $0.00-0.05; P \ge 0.55$ ).

#### Latent causal variable analyses (pain vs CRP)

GCP values for the three trait pairs with significant genetic correlations are presented in Table 2. For chronic back pain (GCP [S.E.] -0.32 [0.44]; P=0.46) and widespread pain (-0.08 [0.76]; P=0.92), GCP was non-significant. For chronic neck/shoulder pain (-0.15 [0.06]; P=0.02), GCP was significant but |GCP|< 0.6. These results suggest there were no causal relationships between CRP and chronic back, neck/shoulder or widespread pain (Fig. 3).

# Generalised summary-data-based Mendelian randomisation (pain vs CRP)

Table 3 and Fig. 3 present the Mendelian randomisation results. CRP from UK Biobank showed a putative causal effect on chronic back pain (beta [S.E.] 0.077 [0.010], P = 1.32E-13), neck/shoulder pain (0.027)

#### Genetic Correlations (rG) - Chronic Pain vs CRP



**Fig. 2** Heatmap of genetic correlations (rG) between chronic back, neck/shoulder & widespread pain phenotypes and blood C-reactive protein (CRP) levels. The direction of correlation is represented by colours (i.e., red for positive rG & blue for negative rG), with the darker shading indicating stronger associations. The asterisk denotes significant rG at 5% false discovery rate. Significant positive genetic correlations were observed between UK Biobank CRP levels and each chronic pain type, which suggests that genetic variants associated with higher CRP were also associated with an increased risk of the respective chronic pain conditions

[0.011], P = 9.82E-03) and widespread pain (0.166 [0.032], P = 1.64E-07). Chronic neck/shoulder pain also had a putative causal effect on CRP (UK Biobank) (0.071 [0.021], P = 6.97E-04). The number of SNPs used in each analysis is shown in Table 3. There were insufficient SNPs to analyse chronic widespread pain *versus* CRP.

 Table 2
 Higher levels of blood

 C-reactive protein (CRP) are
 genetically associated with

 chronic pain back, neck/
 shoulder & widespread pain

Chronic pain phenotype (N)	CRP data source (N)	rG (S.E.) P-value	GCP (S.E.) <i>P</i> -value
Neck/shoulder pain (72,216)	UK Biobank (400,094)	0.29 (0.05) 4.85E-10	-0.15 (0.06) 0.02
	PAGE consortium (28,520)	0.05 (0.08) 0.55	_
Back pain (79,089)	UK Biobank (400,094)	0.26 (0.05) 8.07E-9	-0.32 (0.44) 0.46
	PAGE consortium (28,520)	0.00 (0.07) 0.99	-
Widespread pain (6063)	UK Biobank (400,094)	0.36 (0.05) 1.70E-13	-0.08 (0.76) 0.92
	PAGE consortium (28,520)	0.00 (0.10) 0.96	_

This table presents genetic correlation (*rG*) and genetic causal proportion (GCP) estimates for CRP traits with each chronic pain phenotype (FDR < 5%). A positive genetic correlation (rG > 0) indicates that the chronic pain phenotype is associated with higher CRP concentration. GCP indicates the likelihood of a significant *rG* being explained by a causal relationship between chronic pain & CRP (IGCPI> 0.6, FDR < 5%). The GCP values for chronic back & widespread pain and UK Biobank CRP traits were non-significant. For neck/shoulder pain, GCP was significant but did not reach the threshold of a putative causal association (i.e., IGCPI< 0.6). These results suggest that higher CRP was associated with each chronic pain phenotype, but without evidence of a causal relationship between the traits. Sample sizes are shown for each phenotype—chronic pain cases were compared to 239,125 controls

CRP C-reactive protein, rG genetic correlation, GCP genetic causal proportion, S.E. standard error

#### **KEY RESULTS**



**Fig. 3** Schematic summary of key results. Significant positive genetic correlations (rG) indicated genetic variants associated with higher C-reactive protein (CRP) were also associated with chronic neck/ shoulder, back & widespread pain. Genetic causal proportion (GCP) estimates were not consistent with causal relationships between CRP and the chronic pain conditions explaining these genetic correlations. Mendelian randomisation (MR) analyses suggested a bidirectional causal association between CRP & chronic neck/shoulder pain, and potential causal effects of CRP on chronic back & widespread pain. These findings replicate and expand upon the study by Kasher et al. [11], which reported a genetic correlation and putative causal effect between CRP & chronic back pain

### Discussion

Higher levels of blood CRP and chronic spinal (back, neck/shoulder) & widespread pain were found to have a

Table 3Mendelianrandomisation results forC-reactive protein (CRP) levelsand chronic back, neck/shoulder& widespread pain. CRP traits(UK Biobank) showed causaleffects on each chronic paintype, while chronic neck/shoulder pain also had a causaleffect on CRP (UK Biobank).The number of single nucleotidepolymorphisms (SNPs) wereinsufficient to analyse chronicwidespread pain versus CRP(S.E.—standard error)

common genetic basis, which suggests genetic variants are shared by individuals who are at risk of elevated CRP and having these pain conditions. In addition, there were genetic casual effects of CRP on back, neck/shoulder & widespread pain, and of neck/shoulder pain on CRP. These findings provide initial evidence supporting genetically driven inflammation in the development of chronic spinal & widespread pain conditions.

This study has demonstrated a genetic contribution of systemic inflammation in chronic spinal & widespread pain. It also extends upon prior studies reporting genetic correlations between CRP and back pain [11], osteoarthritis [21] & rheumatoid arthritis [21], by finding a genetic basis to higher CRP across a wider range of chronic pain phenotypes. Moreover, we have provided corroborating evidence for clinical studies showing higher CRP levels and other inflammatory markers in chronic back, neck & widespread pain [2–4]. Chronic musculoskeletal disorders (including spinal & widespread pain) are often co-morbid with many medical conditions that are also associated with higher CRP (e.g., obesity, cardiovascular disease) [22]. As such, the genetic correlations between chronic spinal/widespread pain & higher CRP could also reflect an underlying core basis that is shared across many chronic disease syndromes. For example, genetic correlations have been shown between CRP and obesity [21], cardiovascular conditions [21] & depression [23], while chronic spinal & widespread pain are also genetically correlated with these disorders [10].

The Mendelian randomisation results suggest a putative bidirectional causal relationship between chronic neck/ shoulder pain & higher CRP, as well as a causal role of CRP in chronic back & widespread pain. These findings are consistent with a recent Mendelian randomisation study reporting a causal effect of CRP on back pain [11], while also extending upon that work by finding a causal effect on neck/shoulder & widespread pain. Together these studies

Exposure	Outcome	Beta	S.E	<i>P</i> -value	Number of SNPs used
CRP (UK Biobank)	Neck/shoulder pain	0.027	0.011	9.82E-03*	563
	Back pain	0.077	0.010	1.32E-13*	561
	Widespread pain	0.166	0.032	1.64E-07*	581
CRP (PAGE consortium)	Neck/shoulder pain	-0.018	0.015	0.24	31
	Back pain	0.002	0.017	0.88	29
	Widespread pain	-0.033	0.045	0.47	31
Neck/shoulder pain	CRP (UK Biobank)	0.071	0.021	6.97E-04*	10
Back pain		0.030	0.021	0.16	10
Widespread pain		_			
Neck/shoulder pain	CRP (PAGE consortium)	-0.004	0.062	0.95	12
Back pain		-0.054	0.064	0.40	13
Widespread pain		-			

provide genetic evidence for a causal pathway between CRP and chronic spinal & widespread pain. Other converging support comes from clinical & benchtop evidence of pathophysiological interactions between the immune & nervous systems in response to acute & chronic musculoskeletal conditions (reviewed in [1] & [24]). Higher levels of systemic inflammatory markers, including CRP, are often associated with worse clinical outcomes (e.g., higher pain intensity, hyperalgesia [5, 6]), which may reflect immune-mediated peripheral nociceptor sensitisation & central amplification of nociceptive signalling [24, 25]. While the clinical practice implications of this work require further investigation, within the context of increasing convergent evidence for immune contributions to the development & maintenance of chronic pain, our study has shed new light on the genetic causal factors in chronic spinal & widespread pain. Largescale genetic analyses [10, 11, 21] also enable the identification of genetically supported risk & protective factors to enhance the design of translationally targeted diagnostic & therapeutic trials.

In the current study, GWAS analyses of chronic pain were limited to people of European ancestry, so it is unclear whether the findings can be extrapolated to non-European populations. The LCV analyses provided estimates of the likelihood of observed genetic correlations being attributable to a genetic causal effect of one trait (pain) upon another (CRP) or vice versa [18]. A drawback of this method is it cannot identify bidirectional relationships (i.e., reciprocal relationships from pain -> CRP & CRP -> pain). While Mendelian randomisation analyses have the capacity to identify bidirectional relationships, caution is warranted in interpreting those findings as both the chronic pain & CRP GWAS data were from the UK Biobank (overlapping samples), which can bias estimates towards the confounded associations. To mitigate this issue, we also included CRP GWAS data from the PAGE consortium, although it was a comparatively much smaller sample (N = 28,520 [16]), which likely accounted for the non-significant results with this dataset. In addition, the PAGE consortium dataset comprised people with non-European ethnicities, which may have influenced the results given the European ancestry of the chronic spinal & widespread pain GWAS data.

To further advance our understanding of systemic inflammation in chronic spinal & widespread pain, major concerted investigations are needed such as: (i) large-scale GWAS of pain-specific clinical measures (e.g., pain intensity, disability) with a wider spectrum of inflammatory markers (e.g., cytokines) in both European & non-European populations; (ii) prospective longitudinal pharmacogenomics studies examining biomarkers of treatment response (e.g., antiinflammatory drugs); and (iii) expanding the application of Mendelian randomisation to other chronic pain diagnoses (e.g., whiplash-associated disorder, non-traumatic neck pain) and putative mechanistic subtypes (e.g., neuropathic, nociplastic) along with the use of multivariable approaches.

#### Conclusions

The application of statistical genetics methods to populationlevel data has enabled the elucidation of otherwise-intractable causal factors & directions in common chronic disorders, particularly over recent years. The genetic evidence demonstrated here for higher CRP in chronic pain conditions represents a promising foundation for further large-scale & translationally focussed studies to accelerate the development of novel therapeutic technologies & strategies.

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Author contributions SFF, MS, TTN & GC-P conceived the study. AIC & MER performed the GWAS. SFF & GC-P performed downstream analyses. All authors contributed to interpretation of results and manuscript preparation. TTN & GC-P co-supervised the study as part of a broader Precision Pain Medicine R&D program (led by TTN).

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Data availability statement Summary statistics for the GWAS used in this study are publicly available & can be accessed in CTG-VL (https://vl.genoma.io) and CTG-VIEW (https://view.genoma.io). Results from downstream analyses for the chronic pain phenotypes reported in this study are available at CTG-VIEW.

#### Declarations

**Conflict of interest** GC-P contributed to this study while employed at The University of Queensland and is now an employee of Gilead Sciences. The other authors have no conflict of interest to declare.

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