RESEARCH ARTICLE

The biopsychosocial factors associated with development of chronic musculoskeletal pain. An umbrella review and meta-analysis of observational systematic reviews

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Abstract

Aim

The aim of this umbrella review was to establish which biopsychosocial factors are associated with development of chronic musculoskeletal pain.

Methods

Ovid Medline, Embase, Web of Science Core Collection, Cochrane Database of Systematic Reviews, Database of Abstracts of Reviews of Effects, PsycINFO, CINAHL, PEDro, PROSPERO, Google Scholar and grey literature were searched from database inception to 4th April 2023. Systematic reviews of observational prospective longitudinal studies, including populations with <3 months (not chronic) musculoskeletal pain, investigating biopsychosocial factors that contribute to development of chronic (>3 months) musculoskeletal pain. Two reviewers searched the literature, assessed risk of bias (Assessing the Methodological Quality of Systematic Reviews-2), and evaluated quality (Grading of Recommendations, Assessment, Development and Evaluation) to provide an overall statement on the certainty of evidence for each biopsychosocial factor. Data analysis was performed through random effects meta-analysis (including meta-analysis of meta-analyses where possible) and descriptive synthesis.

Results

13 systematic reviews were included comprising 185 original research studies (n = 489,644 participants). Thirty-four biopsychosocial factors are associated with development of chronic musculoskeletal pain. Meta-analyses of odds and/or likelihood ratios were possible for 25 biopsychosocial factors. There is moderate certainty evidence that smoking (OR 1.24 [95%CI, 1.14–1.34), fear avoidance (LR+ 2.11 [95%CI, 1.59–2.8]; LR- 0.5 [95%CI, 0.35–

0.71]) poorer support networks (OR 1.21 [95%CI, 1.14–1.29]), lower socioeconomic status (OR 2.0 [95%CI, 1.64–2.42]), and high levels of pain (OR 5.61 [95%CI, 3.74–8.43]) are associated with development of chronic musculoskeletal pain (all P<0.001). Remaining factors are of low or very low certainty evidence.

Conclusions and relevance

There is moderate certainty evidence that smoking, fear avoidance, poorer support networks, lower socioeconomic status, and high levels of pain are associated with development of chronic musculoskeletal pain. High risk of bias was evident in most included reviews; this highlights the need for higher quality systematic reviews.

Introduction

The International Classification of Diseases describes chronic musculoskeletal pain (CMP) as pain arising from bones, joints, muscle or related soft tissues lasting longer than three months [1]. The burden of CMP to individuals and societies is substantial being the greatest cause of disability worldwide affecting approximately 22% of the global population [2]. Once CMP is established it is hard to treat with 79–92% of people still experiencing CMP up to 12 years later [3–5]. Consequently, CMP is the most common cause of sickness absence from work (after common minor illnesses) [6] and only 59% of the working age population are in work [7]. The personal burden of CMP is also substantial with many individuals experiencing moderate to severe disability [8], poorer quality of life [9], and higher risk of chronic diseases including cardiovascular disease, diabetes and cancer [10]. Despite the United Kingdom (UK) National Health Service spending £5 billion every year on treating musculoskeletal (MSK) pain [6], the prevalence of CMP is rising [11]. These points illustrate the huge burden on individuals and society and suggest that current healthcare management of CMP may benefit from a refined approach.

Acute episodes of MSK pain are a common experience across individuals where pain and dysfunction typically subsides within three months coinciding with healing of injured or irritated MSK structures [12]. The mechanisms of CMP are different to acute pain in that pain exists despite there no longer being evidence of ongoing healing, but rather due to a sensitised nervous system that creates a continued or repeated experience of pain despite no evidence of actual or potential tissue damage [13, 14]. This transition from acute to chronic MSK pain is associated with the presence of many biopsychosocial factors such as fear avoidance, low mood, and work satisfaction or strain [15–17]. Despite this, healthcare services conventionally utilise approaches to treat CMP based on understandings of acute MSK pain, with focus often on identifying and treating perceived injured or irritated MSK structures. This does not take into account the complexity of CMP; rather, these approaches are grounded in simple mechanistic theories (e.g., debridement of degenerative joints) and traditional observational evidence [18]. However, contemporary higher quality research, such as randomised placebo-controlled trials, demonstrates that many approaches based on treating MSK structures in CMP are no better than placebo with many common orthopaedic surgeries now known to be only equally as efficacious as sham surgery [19, 20]. Furthermore, many of the changes observed through radiographic imaging previously thought to explain CMP are now known to be highly prevalent in people with no history of pain [21, 22]. These points demonstrate that purely structural based approaches to managing CMP are simplistic.

Despite these advancing understandings, many clinicians still employ MSK structural based approaches to treating CMP [23] with biopsychosocial approaches typically only endorsed after these have been unsuccessful [24]. But CMP is difficult to treat once it is established and therefore biopsychosocial approaches used at this late stage may be of limited benefit. However, if utilised during acute MSK pain, it is possible that biopsychosocial approaches could prevent development of CMP. This theory is informed by many prospective longitudinal studies summarised by systematic reviews which identifies a number of biopsychosocial factors that are present during acute MSK pain and associated with transition to CMP [16, 25, 26]. Early identification of these factors would provide the opportunity for proactive, preventative healthcare approaches; a strategy that works well for other chronic diseases such as heart disease [27] and diabetes [28].

To inform proactive biopsychosocial management aimed at preventing CMP, a clear understanding of the biopsychosocial factors that contribute to its development is needed. There are a number of systematic reviews which have investigated this for specific MSK conditions (e.g., back pain), however many of the biopsychosocial factors identified are not related to a condition but rather are characteristics of the person and/or their experience of pain (e.g., fear avoidance, severe pain etc). It is therefore possible that these biopsychosocial factors transcend specific forms of MSK pain (e.g., back pain) and are relevant for all types of MSK pain, but this is not clear from existing evidence. It is therefore timely to perform an umbrella review to aggregate findings of systematic reviews of biopsychosocial factors associated with development of CMP that are relevant for all MSK conditions.

Methods

Aim

The aim of this umbrella review was to identify which biopsychosocial factors are associated with development of CMP.

Design

An umbrella review informed by the Joanna Briggs Institute Manual for Evidence Synthesis of Umbrella Reviews [29] and the Cochrane handbook for the conduct of systematic reviews [30], registered in PROSPERO (CRD42020193081) and protocol published *a priori* [31], is reported in adherence to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) checklist [32] (see S1 File).

Eligibility criteria

Inclusion criteria.

- **Population:** adults (>18) with <3 months of MSK pain.

- **Exposure:** individuals' experience of any biopsychosocial factors (e.g., smoking).

- **Comparator:** individuals who do not experience the biopsychosocial factor under investigation (e.g., non-smoker).

- **Outcome:** MSK pain >3 months identified through any patient reported outcome measure.

- **Study designs:** systematic reviews, with or without meta-analysis, of observational prospective longitudinal studies (the gold standard for epidemiological research [33]). Original studies included in reviews must have been at least three months in duration with no limitations on the study setting.

Exclusion criteria. Systematic reviews which include interventional studies (e.g., factors associated with successful surgery), populations with other plausible explanations for CMP (e.g., autoimmune disorders), injuries where tissue healing may be incomplete at three months (e.g., fractures), draw body region specific conclusions which are not generalisable to the wider CMP population (e.g., a bony heel spur), pool data with non-MSK chronic pain populations (e.g., cancer related pain), and systematic reviews where the full text was not available in the English language. No limitations were placed on eligibility based on review quality or that of included original studies.

Information sources

We searched MEDLINE, EMBASE, Web of Science Core Collection, PEDro, CINAHL, PsycINFO, Cochrane database for systematic reviews, the Database of Abstracts of Reviews of Effects, Google Scholar, the PROSPERO register. There was no limitation on search dates with final searches performed on 4th April 2023. Grey literature was searched using the Canadian Agency for Drugs and Technologies in Health grey literature searching tool. To ensure literature saturation, reference lists of included studies or relevant reviews identified through the search were also screened for potentially eligible systematic reviews. See S1 Table for our search strategy designed with Ovid MEDLINE.

Screening and selection

Two reviewers (MD & JM) independently performed searches and screened titles and abstracts for consideration of full text review using EndNote X9.3.3. Full texts were then sourced and discussed for eligibility of inclusion, with any disagreements referred to a third reviewer (NH). Reviewers were not blinded to the journal titles, study authors or institutions. Reasons for excluding reviews were recorded.

Data extraction

Two reviewers (MD & JM) independently extracted data. Data was extracted using a standardised proforma which was piloted *a priori* [31] and included review and population characteristics, sample size, biopsychosocial factor details, length of follow-up, and any relevant quantitative or descriptive findings. Data were not extracted from primary research studies but from included reviews only [29]. Review authors were contacted where data were unclear or missing.

Risk of bias

Two reviewers (MD & JM) independently performed risk of bias assessment using the Assessing the Methodological Quality of Systematic Reviews (AMSTAR) 2 checklist [34] and based on this rated reviews as low, moderate or high risk of bias, with any disagreements referred to a third reviewer (NH). Where included review authors performed risk of bias assessments of primary studies, these were synthesised to provide an overall rating of the risk of bias of primary studies that support each biopsychosocial factor (see Table 1).

Statistical analysis and data synthesis

Meta-analysis was performed using SPSS 29.0.0.0 where at least two synthesisable sets of quantitative results were reported for the same factor. Effect sizes and 95% confidence intervals were extracted from included reviews. In line with Cochrane Handbook guidance [30], ratio effect sizes were converted to the natural log scale with standard errors computed from 95%

Table 1. Risk of bias rating of primary studies for each biopsychosocial factor.

Risk of Bias of Primary Studies	
Low	>75% of studies rated as low risk of bias, or consistent findings across studies and at least 2 low risk of bias studies
Moderate	Fails to fulfil low risk of bias criteria, and >50% of studies rated as low or moderate risk of bias
High	Fails to fulfil low risk of bias criteria, and >50% of studies rated as high risk of bias, or no risk of bias assessment performed by the included review

Adapted from Burgess et al. (2020) [35]

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confidence intervals. A DerSimonian and Laird inverse variance random effects method was used to compute pooled effect sizes, 95% confidence intervals, Z-value and P-value of statistical significance. Forest plots of findings are presented on the natural log scale (where the number of null effect is 0 rather than 1) to ensure symmetrical representation of 95% confidence intervals [30]. Effect sizes presented in text, tables, and other figures are not presented on the natural log scale to ensure ease of understanding and interpretation for all stakeholders. Where possible, meta-analysis of meta-analyses was performed. Some reviews did not perform meta-analyses but did present synthesisable quantitative findings from primary studies. In this case, a meta-analysis of these findings was performed. Where reviews present both unadjusted and adjusted effect sizes (e.g., for publication bias), the adjusted effect size was used. If there was only one meta-analysis finding and therefore further meta-analysis was not possible, we presented the meta-analysis performed by the primary review in text, figures and tables. A descriptive synthesis was also performed for all findings incorporating findings from all reviews including those not included in meta-analysis.

Grading of Recommendations Assessment, Development and Evaluation (GRADE)

GRADE is a well-established tool commonly used within systematic reviews to determine certainty of findings, and has been recommended for use with umbrella reviews [36]. To the best of the authors knowledge there is no published guidance for application of GRADE in umbrella reviews, therefore, existing guidance for assessing the five domains of GRADE in reporting the certainty of evidence of prognostic factors were adapted for the purpose of umbrella reviews in collaboration with the lead author of existing GRADE guidance [37]. See S2 File for an overview of GRADE methods used. It was not possible to perform GRADE assessment in instances where factors were supported by only one included review.

Assessment of publication bias was planned with Egger's regression test and visual inspection of a funnel plot, however this was not appropriate due to the number of effect sizes included in each meta-analysis falling below the recommended 10 required for this method [30]. Publication bias was therefore assessed for each included review and biopsychosocial factor in line with Cochrane guidance for umbrella reviews [38] (see S2 File).

Results

A total of 10,374 studies were screened, with 209 full text articles evaluated for eligibility and 13 systematic reviews included [39–51] summarising 185 primary studies. The number of studies retrieved from each database and the number excluded at each phase of screening and reasons for exclusion are shown in Fig 1. The study characteristics of included reviews are provided in S2 Table.
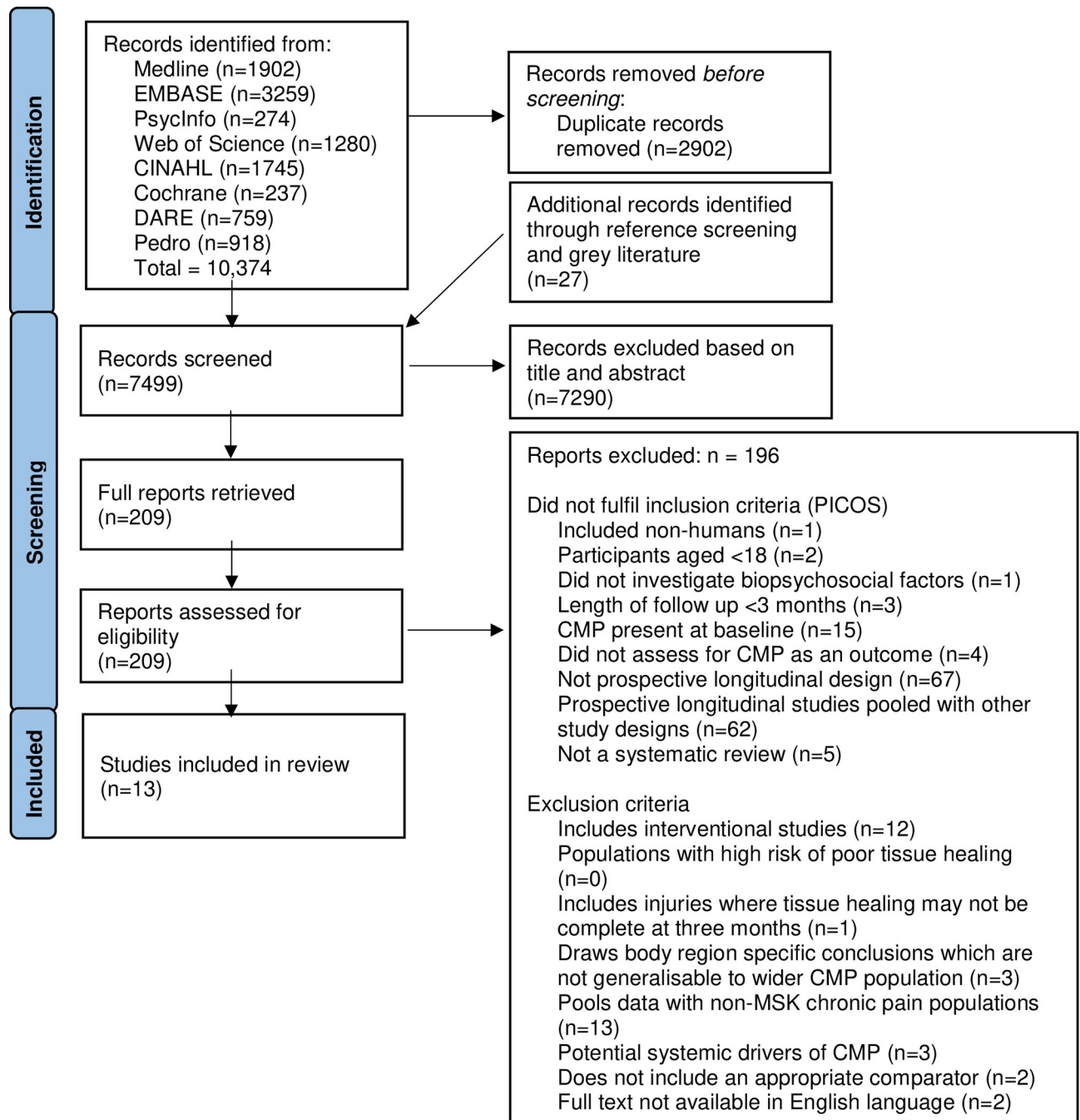
Fig 1. PRISMA flow diagram.

The biopsychosocial factors associated with development of CMP

A total of 92 biopsychosocial items were identified and grouped into 35 biopsychosocial factors. Thirty-four biopsychosocial factors identified are associated with development of CMP, with high body mass index the only factor not associated with development of CMP. The findings have been situated within five overarching domains which can be screened and targeted for intervention in clinical practice: physical health (3 factors), psychological (10 factors),

psychosocial (10 factors), symptoms or experiences at or near onset (9 factors), and demographics (2 factors). Domains and factors were identified by co-authors who are practicing primary care clinicians in the UK NHS (MD & JM). To ensure ease of applicability of findings, a definition for each biopsychosocial domain and factor has been provided based on a synthesis of definitions/descriptions or outcome measures used by included reviews, available in S3 Table.

Data synthesis

Meta-analysis was possible for 25 factors with odds ratios and/or likelihood ratios. Full details are available in Table 2 and a forest plot representation is available in Fig 2. Of these, 13 odds ratios and 13 likelihood ratios demonstrate statistical significance (P<0.05). A summary of findings including GRADE assessment is available in Table 3. A descriptive synthesis of

Table 2. Meta-analyses findings.

Meta-analysis of meta-analyses (OR)	Studies	Sample	OR (95% CI)	Z	P
Lower job satisfaction	39	57,794	1.43 (1.25–1.63)	5.37	<0.001
Higher job demands	77	115,148	1.25 (1.15–1.35)	5.45	<0.001
Lower job control	54	82,892	1.28 (1.20–1.37)	7.53	<0.001
Poorer support networks	69	94,954	1.21 (1.14–1.29)	6.33	<0.001
Lower socioeconomic status	8	11,293	2.00 (1.64–2.42)	6.95	<0.001
Female sex/gender	20	6762	1.43 (1.13–1.81)	3.01	0.003
History of the same MSK pain	18	4803	1.24 (0.73–2.12)	0.80	0.426
Meta-analysis (OR)					
Post-trauma stress symptoms	7	1695	1.92 (1.37–2.69)	3.776	<0.001
Catastrophising	3	277	3.99 (1.33–10.74)	2.49	0.01
Poorer recovery expectations	6	2514	2.72 (1.68–4.35)	4.09	<0.001
Lower job security	8	11,817	1.43 (1.16–1.76)	2.33	<0.01
High levels of pain at or near onset	11	2856	5.61 (3.74–8.43)	8.31	<0.001
Concomitant pain	3	637	1.83 (1.25–2.67)	3.10	<0.001
Disturbed sleep since onset	3	570	2.96 (0.97–9.04)	1.90	0.06
Cold hyperalgesia	3	315	1.36 (0.91–2.05)	1.50	0.133
Higher age	12	2347	1.00 (0.97–1.04)	0.07	0.94
Higher BMI	3	559	1.24 (0.71–2.19)	0.76	0.45
Smoking	4	38,188	1.24 (1.14–1.34)	5.120	<0.001

Meta-analysis (LR-/LR+)	Studies	Sample	LR- (95% CI)	Z	P	LR+ (95% CI)	Z	P
Fear avoidance	5	4621	0.50 (0.35–0.71)	-3.95	<0.001	2.11 (1.59–2.80)	5.20	<0.001
Poorer psychological health	7	6200	0.77 (0.70–0.85)	-5.34	<0.001	1.92 (1.67–2.18)	9.50	<0.001
Somatisation	3	2945	0.63 (0.48–0.82)	-3.37	<0.001	2.56 (1.72–3.82)	4.60	<0.001
Lower job satisfaction	5	1888	0.95 (0.90–1.01)	-1.61	0.108	1.35 (1.05–1.74)	2.32	0.020
Higher job demands	4	4059	0.86 (0.82–0.91)	-5.35	<0.001	1.30 (1.12–1.51)	3.44	<0.001
Lower socioeconomic status	10	7008	0.78 (0.68–0.90)	-3.49	<0.001	1.06 (1.02–1.10)	2.74	0.006
Financial compensation	7	2786	0.87 (0.80–0.95)	-3.23	0.001	1.48 (1.24–1.76)	4.38	<0.001
High levels of pain at or near onset	8	6260	0.51 (0.38–0.68)	-4.55	<0.001	1.69 (1.39–2.04)	5.34	<0.001
Higher levels of functional impairment	8	6888	0.40 (0.26–0.61)	-4.28	<0.001	1.88 (1.40–2.51)	4.22	<0.001
Female sex/gender	16	8470	0.92 (0.85–0.99)	-2.19	<0.029	1.14 (1.04–1.26)	2.78	0.005
Higher age	10	4899	0.94 (0.89–1.00)	-0.21	0.036	1.12 (1.01–1.24)	2.16	0.031
Poorer general health	7	5431	0.84 (0.77–0.91)	-4.22	<0.001	1.51 (1.27–1.80)	4.68	<0.001
High BMI	3	2237	1.02 (0.90–1.16)	0.31	0.754	0.91 (0.73–1.14)	-0.81	0.418
Smoking	6	3007	0.91 (0.86–0.96)	-3.40	<0.001	1.18 (1.08–1.30)	3.64	<0.001
History of the same MSK pain	9	3902	0.84 (0.72–0.98)	-2.24	0.025	1.08 (1.02–1.15)	2.45	0.014

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Meta-analysis of meta-analyses (OR)

Poorer support networks
Higher job demands
History of the same MSK pain
Lower job control
Femal sex/gender
Lower job satisfaction
Lower socioeconomic status

Meta-analysis (OR)

Higher age
Smoking
High BMI
Cold hyperalgesia
Lower job security
Concomitant pain
Post-trauma stress symptoms
Poorer recovery expectations
Disturbed sleep since onset
Catastrophising
High levels of pain at or near onset

Meta-analysis (LR-/LR+)

High BMI
Lower socioeconomic status
History of the same MSK pain
Higher age
Female sex/gender
Smoking
Higher job demands
Lower job satisfaction
Financial compensation
Poorer general health
High levels of pain at or near onset
High levels of functional impairment
Poorer psychological health
Fear avoidance
Somatisation

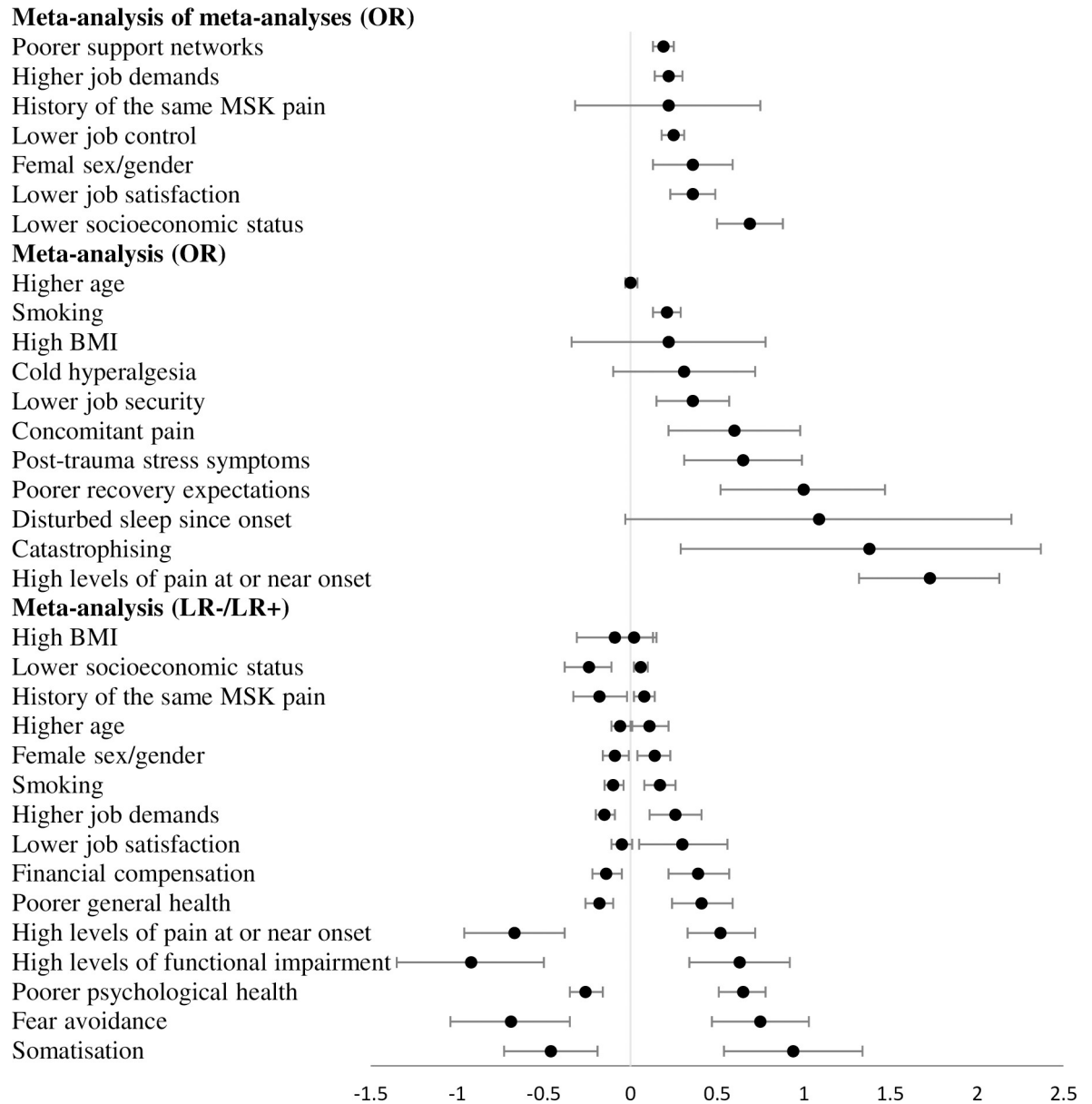-1.5   -1   -0.5   0   0.5   1   1.5   2   2.5

Fig 2. Forest plot of meta-analyses on the natural log scale. Presented on the natural log scale, where the number of null effect is 0 rather than 1, to ensure symmetrical representation of upper and lower 95% confidence intervals.

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findings for each factor is presented in S4 Table. Eleven factors were supported by only one included review and therefore GRADE assessment and descriptive synthesis was not possible for these factors. See S5 Table for the primary data we used for all meta-analyses we performed.

Risk of bias

Risk of bias assessment with AMSTAR-2 revealed that one review was low risk of bias [42] and 12 were high risk of bias [39–41, 43–51]. See S6 Table for full rating details. The main concerns were lack of *a priori* protocol registration/design [39, 41, 43–45, 47, 48, 50, 51], no justification

Table 3. GRADE evidence profile and summary of findings.

№ of reviews (№ of studies)	GRADE certainty assessment					Summary			Meta-analysis (95% CI)	GRADE level of Certainty
	Risk of bias	Inconsistency	Indirectness	Imprecision	Publication bias	№ of participants	RoB of primary studies	Type of MSK pain/ condition		
Smoking (physical health factors)										
2 (10)	Not serious	Not serious	Not serious	Not serious	Serious	41,195	Low	Lower back, neck	OR 1.24 (1.14–1.34); LR+ 1.18 (1.08–1.3); LR- 0.91 (0.86–0.96)	⊕⊕⊕⊖ Moderate
Fear avoidance (psychological factors)										
3 (9)	Serious	Not serious	Not serious	Not serious	Not serious	5208	Low	Lower back, shoulder	LR+ 2.11 (1.59–2.8); LR- 0.5 (0.35–0.71)	⊕⊕⊕⊖ Moderate
Poorer support networks (psychosocial factors)										
3 (71)	Serious	Not serious	Not serious	Not serious	Not serious	95,738	Low	Lower back, neck and/or shoulder, upper extremity, lower extremity, shoulder	OR* 1.21 (1.14–1.29)	⊕⊕⊕⊖ Moderate
Lower socioeconomic status (psychosocial factors)										
4 (23)	Serious	Not serious	Not serious	Not serious	Not serious	44,968	Low	Neck, lower back, shoulder	OR* 2.0 (1.64–2.42); LR+ 1.06 (1.02–1.1); LR- 0.78 (0.68–0.90)	⊕⊕⊕⊖ Moderate
High levels of pain at or near onset (symptoms or experiences at or near onset)										
3 (22)	Serious	Not serious	Not serious	Not serious	Not serious	9394	Low	Lower back, whiplash associated disorder	OR 5.61 (3.74–8.43); LR+ 1.69 (1.39–2.04); LR- 0.51 (0.38–0.68)	⊕⊕⊕⊖ Moderate
Poorer general health (physical health factors)										
2 (9)	Very serious	Not serious	Not serious	Not serious	Not serious	6409	Low	Lower back	LR+ 1.51 (1.27–1.8); LR- 0.84 (0.77–0.91)	⊕⊕⊖⊖ Low
Somatisation (psychological factors)										
3 (8)	Serious	Not serious	Not serious	Not serious	Serious	4742	Low Moderate	Lower back, shoulder	LR+ 2.56 (1.72–3.82); LR- 0.63 (0.48–0.82)	⊕⊕⊖⊖ Low
Poorer psychological health (psychological factors)										
3 (14)	Very serious	Not serious	Not serious	Not serious	Not serious	9092	Low	Lower back	LR+ 1.92 (1.67–2.18); LR- 0.77 (0.7–0.85)	⊕⊕⊖⊖ Low
Stress (psychological factors)										
2 (2)	Serious	Not serious	Not serious	Serious	Not serious	110	High	Neck, lower back	N/A	⊕⊕⊖⊖ Low
Lower job satisfaction (psychosocial factors)										
3 (48)	Very serious	Not serious	Not serious	Not serious	Not serious	61,835	Low	Lower back, neck and/or shoulder, upper extremity, lower extremity	OR* 1.43 (1.25–1.63); LR+ 1.35 (1.05–1.74); LR- 0.95 (0.9–1.01)	⊕⊕⊖⊖ Low
Financial compensation (psychosocial factors)										
2 (11)	Very serious	Not serious	Not serious	Not serious	Not serious	6085	Low	Lower back	LR+ 1.48 (1.24–1.76); LR- 0.87 (0.8–0.95)	⊕⊕⊖⊖ Low
Concomitant pain (symptoms or experiences at or near onset)										

(Continued)

Table 3. (Continued)

№ of reviews (№ of studies)	GRADE certainty assessment					Summary			Meta-analysis (95% CI)	GRADE level of Certainty
	Risk of bias	Inconsistency	Indirectness	Imprecision	Publication bias	№ of participants	RoB of primary studies	Type of MSK pain/ condition		
2 (4)	Serious	Not serious	Not serious	Not serious	Serious	547	Moderate	Lower back, whiplash associated disorder	OR 1.83 (1.25–2.67)	⊕⊕⊖⊖ Low
Higher levels of functional impairment at onset (symptoms or experiences at or near onset)										
2 (16)	Very serious	Not serious	Not serious	Not serious	Not serious	11,654	Low	Lower back	LR+ 1.88 (1.4–2.51); LR- 0.4 (0.26–0.61)	⊕⊕⊖⊖ Low
Time off work (symptoms or experiences at or near onset)										
2 (7)	Serious	Not serious	Not serious	Serious	Not serious	4681	Moderate	Lower back, shoulder	N/A	⊕⊕⊖⊖ Low
History of the same MSK pain (physical health factors)										
4 (30)	Serious	Serious	Not serious	Serious	Serious	9292	Moderate	Lower back, whiplash associated disorder, shoulder	OR* 1.24 (0.73–2.12); LR+ 1.08 (1.02–1.15); LR- 0.84 (0.72–0.98)	⊕⊖⊖⊖ Very low
High BMI (not associated) (physical health factors)										
2 (7)	Serious	Not serious	Not serious	Serious	Not serious	2796	Low	Lower back, whiplash associated disorder	OR 1.24 (0.71–2.19) LR+ 0.91 (0.73–1.14); LR- 1.02 (0.9–1.16)	⊕⊖⊖⊖ Very low
Depression (psychological factors)										
2 (5)	Serious	Not serious	Serious	Serious	Not serious	917	Moderate	Lower back, shoulder	N/A	⊕⊖⊖⊖ Very low
Catastrophising (psychological factors)										
3 (7)	Serious	Not serious	Not serious	Serious	Serious	1050	Moderate	Lower back, shoulder, whiplash associated disorder	OR 3.99 (1.33–10.74)	⊕⊖⊖⊖ Very low
Poorer coping strategies (psychological factors)										
2 (7)	Serious	Not serious	Serious	Serious	Serious	1875	Moderate	Lower back, shoulder	N/A	⊕⊖⊖⊖ Very low
Higher job demands (psychosocial factors)										
4 (75)	Very serious	Not serious	Serious	Not serious	Not serious	110, 609	Low	Lower back, neck and/or shoulder, upper extremity, shoulder	OR* 1.25 (1.15–1.35); LR+ 1.3 (1.12–1.51); LR- 0.86 (0.82–0.91)	⊕⊖⊖⊖ Very low
Lower job control (psychosocial factors)										
2 (48)	Very serious	Not serious	Serious	Not serious	Not serious	74,200	High	Lower back, neck and/or shoulder, upper extremity, lower extremity, shoulder	OR* 1.28 (1.2–1.37)	⊕⊖⊖⊖ Very low
Making physical compensations (symptoms or experiences at or near onset)										
2 (5)	Serious	Serious	Serious	Serious	Not serious	167	High	Lower back, shoulder	N/A	⊕⊖⊖⊖ Very low
Female sex/gender (demographic factors)										
4 (38)	Serious	Serious	Serious	Not serious	Not serious	15,982	Moderate	Lower back, whiplash associated disorder	OR* 1.43 (1.13–1.81); LR+ 1.14 (1.04–1.26); LR- 0.92 (0.85–0.99)	⊕⊖⊖⊖ Very low
Higher age (demographic factors)										

Table 3. (Continued)

№ of reviews (№ of studies)	GRADE certainty assessment					Summary			Meta-analysis (95% CI)	GRADE level of Certainty
	Risk of bias	Inconsistency	Indirectness	Imprecision	Publication bias	№ of participants	RoB of primary studies	Type of MSK pain/ condition		
4 (26)	Serious	Serious	Not serious	Serious	Not serious	34,802	Moderate	Lower back, shoulder, whiplash associated disorder	OR 1.0 (0.97–1.04); LR+ 1.12 (1.01–1.24); LR-0.94 (0.89–1.0)	⊕⊖⊖⊖ Very low
Post trauma stress symptoms (psychological factors)										
1 (7)	N/A	N/A	N/A	N/A	N/A	1695	Low	Whiplash associated disorder	OR 1.92 (1.37–2.69)	N/A
Stressful childhood experiences (psychological factors)										
1 (1)	N/A	N/A	N/A	N/A	N/A	9552	High	Lower back	N/A	N/A
Poorer recovery expectations (psychological factors)										
1 (6)	N/A	N/A	N/A	N/A	N/A	2514	Low	Lower back	OR 2.72 (1.68–4.35)	N/A
Lower job security (psychosocial factors)										
1 (8)	N/A	N/A	N/A	N/A	N/A	11,817	High	Lower back	OR 1.43 (1.16–1.76)	N/A
Higher domestic responsibilities (psychosocial factors)										
1 (2)	N/A	N/A	N/A	N/A	N/A	Not stated	High	Lower back	N/A	N/A
Dissatisfaction during leisure activities (psychosocial factors)										
1 (1)	N/A	N/A	N/A	N/A	N/A	Not stated	High	Lower back	N/A	N/A
Being divorced or widowed without children (psychosocial factors)										
1 (1)	N/A	N/A	N/A	N/A	N/A	Not stated	High	Lower back	N/A	N/A
Disturbed sleep since onset (symptoms or experiences at or near onset)										
1 (3)	N/A	N/A	N/A	N/A	N/A	570	Moderate	Whiplash associated disorder	OR 2.96 (0.97–9.04)	N/A
Cold hyperalgesia (symptoms or experiences at or near onset)										
1 (6)	N/A	N/A	N/A	N/A	N/A	443	High	Whiplash associated disorder	OR 1.36 (0.91–2.05)	N/A
Sudden onset (symptoms or experiences at or near onset										
1 (1)	N/A	N/A	N/A	N/A	N/A	Not stated	High	Lower back	N/A	N/A
Lack of energy (symptoms or experiences at or near onset)										
1 (1)	N/A	N/A	N/A	N/A	N/A	Not stated	High	Lower back	N/A	N/A

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for excluding studies [39, 41, 43, 47, 48], inadequate/no assessment of risk of bias of primary studies [41, 43, 45, 48] or did not consider risk of bias in interpretation of findings [41, 43, 45, 47–49]. Risk of bias assessment of the summarised primary studies revealed 40% are low risk of bias, 26% are moderate, and 34% are high risk of bias.

GRADE certainty of evidence

There is moderate certainty evidence that smoking, fear avoidance, poorer support networks, lower socioeconomic status, and high levels of pain at or near onset, are associated with development of CMP (all P<0.001). There is low certainty evidence that poorer general health, somatisation, poorer psychological health, lower job satisfaction, financial compensation, concomitant pain, and higher levels of functional impairment (all P<0.001); as well as stress and time off work (supported by descriptive synthesis only). Remaining factors are very low certainty. The main reason for downrating evidence was high risk of bias of reviews (see Table 3).
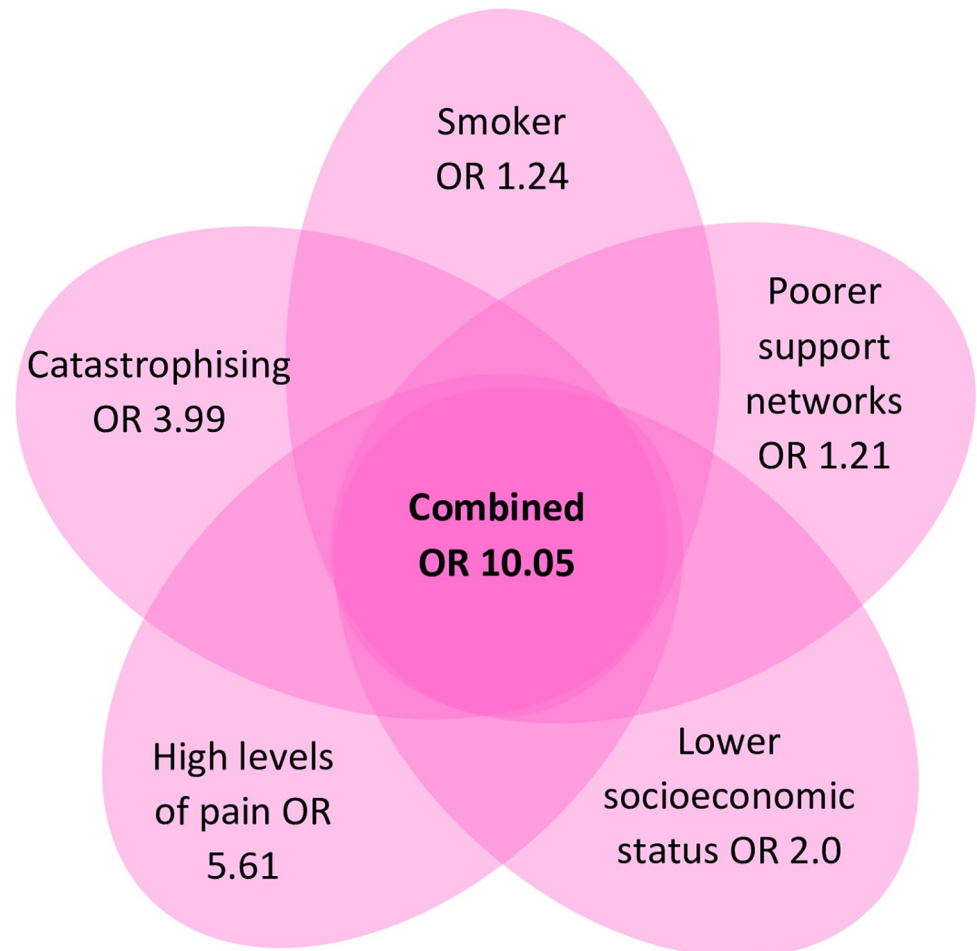
Fig 3. Theoretical combined odds ratio for development of CMP. Based on risk aggregation methods [69]. Formula: (OR) + (OR) + (OR) + (OR) + (OR)–(total number of odds ratios) + 1.0.

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Discussion

To the best of the authors knowledge, this umbrella review is the largest synthesis of research of biopsychosocial factors that contribute to development of CMP. This review also provides the first published guidance of how to apply GRADE for the purpose of an umbrella review. GRADE is widely considered as a best practice framework which provides a systematic approach to determine the quality of evidence and making clinical practice recommendations. Despite this, it has not been routinely adopted for use in umbrella reviews, likely because no clear methodological guidance exists. Our Methods for Application of GRADE for an Epidemiological Umbrella Review (S2 File) seeks to reconcile this discrepancy between systematic and umbrella reviews and may serve as guidance for future umbrella reviews.

The key findings of this umbrella review are that there is moderate level evidence that smoking, fear avoidance, poorer support networks, lower socioeconomic status, and high levels of pain at or near onset are associated with development of CMP. These findings are pertinent to a great number of stakeholders worldwide including healthcare policymakers, clinical decision makers, researchers, patients and the public. CMP is the leading cause of disability globally [52] with substantial impact on quality of life for individuals, and loss of productivity/ burden on healthcare services and society [6, 9]. The 34 biopsychosocial factors identified

within this review that contribute to development of CMP are not related to a specific MSK condition, but rather are characteristics of the person or their experience with pain. These characteristics and experiences often exist independently of any structural 'abnormality' that may have been diagnosed and targeted as part of condition-centred management approaches. This suggests that traditional understandings of mechanisms of MSK pain, its management, and its chronicity, are likely an oversimplification of an evidently complex phenomenon. This may explain why MSK condition-centred approaches conventionally utilised by healthcare services are proving inadequate, with the prevalence and burden of CMP rising [2, 11].

CMP may be explained by alterations of the nociceptive pain systems leading to continued or repeated experience of pain even with little or no evidence of potential or actual tissue damage; this is termed 'nociplastic pain' [53]. This arises due to functional and anatomical alterations within the central nervous system whereby there a shift of activity from the somatosensory cortex to the corticolimbic system [54]. This area of the brain is important for emotional contextualisation, reward anticipation, stress response, decision making, memory modulation, and movement behaviours [55–57]. These functions are utilised to scrutinise nociceptive and sensory input and establishing protective behaviours such as fear, stress, and avoidance in response [57–60]. Further to this, the body's natural pain-relieving mechanisms such as descending inhibition are diminished [61] with increased neurotransmission of nociceptive action potentials at the dorsal horn (central sensitisation) [62] and increased production of sensitising chemical mediators at both the dorsal horn and peripheral nociceptive nerve endings (peripheral sensitisation) [62, 63], thus facilitating a nervous system which is wholly sensitised and geared towards efficiently and frequently producing the experience of pain–CMP. This may explain how sham interventions work to improve CMP if, for example, this creates a positive emotional experience for patients such as hopefulness and reassurance within the corticolimbic system [64], reducing stress responses and increasing reward anticipation [65, 66]; thus re-activating descending inhibition [67] and shifting away from the increased perception of threat. Recognition of these nociplastic mechanisms and the biopsychosocial factors that perpetuate them (as identified within this review) presents an opportunity for healthcare services to better manage people with MSK pain. However, the efficacy of such approaches are likely to be highly influenced by patients beliefs about the cause of their MSK pain which, given traditional healthcare approaches, are likely to be condition-centred. A widescale shift toward patient-centred management and away from condition-centred approaches may therefore be beneficial to better managing CMP.

Meta-analysis was possible for 25 biopsychosocial factors with effect sizes/magnitude of effect possibly perceived as small for most biopsychosocial factors [68]. However, it is unlikely that one overarching factor leads to development of CMP for affected individuals, but rather the combination of multiple factors. Risk aggregation methods, whereby the overall risk is considered the sum of individual risks [69], can be utilised to demonstrate a theoretical example of the combined odds of developing CMP in the presence of multiple biopsychosocial factors (see Fig 3). In this example, five common biopsychosocial factors are combined creating an aggregated odds ratio of 10.05 for development of CMP, which is considered a very large increase in risk [68]. This combination of factors is reflective of many individuals who may present to healthcare settings with MSK pain who, based on our combined odds ratio, may be over 10 times more likely to develop CMP than an individual who does not share this presentation. The presence of many of these factors will be influenced by the unique backgrounds, experiences and beliefs of individuals. This further demonstrates the need for person-centred assessment and management approaches.

Strengths and limitations

The main strengths are that the protocol for this research was designed, peer reviewed, and published *a priori* [31], the methods used are underpinned by validated frameworks such as Cochrane/Joanna Briggs guidance and the PRISMA checklist for design and reporting research, certainty of evidence was established through GRADE; and this umbrella review fulfils 'high confidence in findings' criteria of AMSTAR-2. There are also limitations which require consideration. Many of the identified biopsychosocial factors are of low to very low certainty evidence, mostly due to risk of bias of reviews. However, this is not a reflection of the quality of included primary studies of which 66% were low to moderate risk of bias. Furthermore, 141 potentially eligible reviews retrieved for full text screening were excluded due to the inclusion of methods such as cross sectional or case control designs. These methods are ill equipped to distinguish between cause and effect [70] and therefore are not appropriate for determining factors that *contribute to* development of CMP, rather than *caused by* CMP.

Recommendations for further research

This umbrella review highlights high risk of bias within existing systematic reviews which seek to identify factors that contribute to development of CMP and therefore further systematic reviews are required to improve upon the certainty of findings presented. Future systematic reviews should be informed by validated published guidance and should use observational studies of prospective longitudinal cohorts only to ensure synthesis of reliable findings.

Conclusion

Findings identified 34 biopsychosocial factors associated with development of CMP, and one factor that was not associated. These findings are situated within five domains: physical health, psychological factors, psychosocial factors, symptoms or experiences at or near onset, and demographics. Smoking, fear avoidance, poorer support networks, lower socioeconomic status, and high levels of pain at or near onset are supported by moderate certainty evidence. Although the remaining factors identified are of low to very low certainty evidence, many of these findings are compelling due to the consistency of findings across included reviews and low to moderate risk of bias of primary studies for most factors. The factors associated with development of CMP are in keeping with nociplastic mechanisms of pain and support the need for a paradigm shift in healthcare management of CMP with less focus on MSK structures and more focus on broader biopsychosocial health. As such, it would be sensible for policymakers and clinical decision makers to incorporate these findings into clinical practice by adopting a more person-centred than condition-centred approach to assessing and treating people with MSK pain. However, further high-quality systematic reviews are recommended to increase certainty of evidence of these findings.

Supporting information

S1 File. PRISMA checklist.
(DOCX)

S2 File. GRADE guidance.
(DOCX)

S1 Table. Search strategy.
(DOCX)

S2 Table. Review characteristics.
(DOCX)

S3 Table. Definitions of domains and factors.
(DOCX)

S4 Table. Descriptive synthesis.
(DOCX)

S5 Table. Primary data used in meta-analysis.
(DOCX)

S6 Table. AMSTAR-2 risk of bias assessment.
(DOCX)

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References

1. Treede R-D, Rief W, Barke A, Aziz Q, Bennett MI, Benoliel R, et al. A classification of chronic pain for ICD-11. PAIN. 2015; 156(6):1003–7. https://doi.org/10.1097/j.pain.0000000000000160 PMID: 25844555-201506000-00006.

2. World Health Organisation. Musculoskeletal Health Fact Sheets. Available at: https://www.who.int/news-room/fact-sheets/detail/musculoskeletal-conditions (accessed 16/05/2023). 2022.

3. Andersson HI. The course of non-malignant chronic pain: a 12-year follow-up of a cohort from the general population. Eur J Pain. 2004; 8(1):47–53. Epub 2003/12/24. https://doi.org/10.1016/S1090-3801(03)00064-8 PMID: 14690674.

4. Elliott AM, Smith BH, Hannaford PC, Smith WC, Chambers WA. The course of chronic pain in the community: results of a 4-year follow-up study. PAIN. 2002; 99(1):299–307. https://doi.org/10.1016/s0304-3959(02)00138-0 PMID: 12237208-200209000-00031.

5. Landmark T, Dale O, Romundstad P, Woodhouse A, Kaasa S, Borchgrevink PC. Development and course of chronic pain over 4 years in the general population: The HUNT pain study. Eur J Pain. 2018; 22(9):1606–16. Epub 2018/05/14. https://doi.org/10.1002/ejp.1243 PMID: 29754398.

6. Office for Health Improvement & Disparities. Musculoskeletal health: applying All Our Health. Available at: https://www.gov.uk/government/publications/musculoskeletal-health-applying-all-our-health/musculoskeletal-health-applying-all-our-health#:~:text=MSK%20conditions%20account%20for%20the,%C2%A35%20billion%20each%20year.&text=The%20pain%20and%20disability%20of,family%2C%20social%20and%20working%20life (accessed 16/05/2023). 2022.

7. Department for Work and Pensions. Labour Force Survey analysis of disabled people by region and main health problem. Available at: https://assets.publishing.service.gov.uk/government/uploads/system/uploads/attachment_data/file/406369/labour-force-survey-disabled-people.pdf (accessed 16/05/2023). 2015.

8. Fayaz A, Croft P, Langford RM, Donaldson LJ, Jones GT. Prevalence of chronic pain in the UK: a systematic review and meta-analysis of population studies. BMJ Open. 2016; 6(6):e010364. https://doi.org/10.1136/bmjopen-2015-010364 PMID: 27324708

9. Garnaes KK, Mørkved S, Salvesen Ø, Tønne T, Furan L, Grønhaug G, et al. What factors are associated with health-related quality of life among patients with chronic musculoskeletal pain? A cross-sectional study in primary health care. BMC Musculoskeletal Disorders. 2021; 22(1):102. https://doi.org/10.1186/s12891-020-03914-x PMID: 33482782

10. Williams A, Kamper SJ, Wiggers JH, O'Brien KM, Lee H, Wolfenden L, et al. Musculoskeletal conditions may increase the risk of chronic disease: a systematic review and meta-analysis of cohort studies. BMC Medicine. 2018; 16(1):167. https://doi.org/10.1186/s12916-018-1151-2 PMID: 30249247

11. Vos T, Flaxman AD, Naghavi M, Lozano R, Michaud C, Ezzati M, et al. Years lived with disability (YLDs) for 1160 sequelae of 289 diseases and injuries 1990–2010: a systematic analysis for the Global Burden of Disease Study 2010. The Lancet. 2012; 380(9859):2163–96. https://doi.org/10.1016/S0140-6736(12)61729-2 PMID: 23245607

12. International Association for the Study of Pain. Pain terms: a list with definitions and notes on usage. Recommended by the IASP Subcommittee on Taxonomy. Pain. 1979; 6(3):249. Epub 1979/06/01. PMID: 460932

13. Melzack R, Katz J. Pain. WIREs Cognitive Science. 2013; 4(1):1–15. https://doi.org/10.1002/wcs.1201 PMID: 26304172

14. Puntillo F, Giglio M, Paladini A, Perchiazzi G, Viswanath O, Urits I, et al. Pathophysiology of musculoskeletal pain: a narrative review. Ther Adv Musculoskelet Dis. 2021; 13:1759720x21995067. Epub 2021/03/20. https://doi.org/10.1177/1759720X21995067 PMID: 33737965; PubMed Central PMCID: PMC7934019.

15. Macfarlane GJ, Pallewatte N, Paudyal P, Blyth FM, Coggon D, Crombez G, et al. Evaluation of work-related psychosocial factors and regional musculoskeletal pain: results from a EULAR Task Force. Annals of the Rheumatic Diseases. 2009; 68(6):885. https://doi.org/10.1136/ard.2008.090829 PMID: 18723563

16. Martinez-Calderon J, Flores-Cortes M, Morales-Asencio JM, Luque-Suarez A. Which Psychological Factors Are Involved in the Onset and/or Persistence of Musculoskeletal Pain? An Umbrella Review of Systematic Reviews and Meta-Analyses of Prospective Cohort Studies. The Clinical Journal of Pain. 2020; 36(8):626–37. https://doi.org/10.1097/AJP.0000000000000838 PMID: 32379072-202008000-00009.

17. Vargas-Prada S, Coggon D. Psychological and psychosocial determinants of musculoskeletal pain and associated disability. Best Practice & Research Clinical Rheumatology. 2015; 29(3):374–90. https://doi.org/10.1016/j.berh.2015.03.003 PMID: 26612236

18. Harris IA, Sidhu V, Mittal R, Adie S. Surgery for chronic musculoskeletal pain: the question of evidence. PAIN. 2020; 161. https://doi.org/10.1097/j.pain.0000000000001881 PMID: 33090742

19. Beard DJ, Rees JL, Cook JA, Rombach I, Cooper C, Merritt N, et al. Arthroscopic subacromial decompression for subacromial shoulder pain (CSAW): a multicentre, pragmatic, parallel group, placebo-controlled, three-group, randomised surgical trial. Lancet. 2018; 391(10118):329–38. Epub 2017/11/25. https://doi.org/10.1016/S0140-6736(17)32457-1 PMID: 29169668; PubMed Central PMCID: PMC5803129.

20. Louw A, Diener I, Fernández-de-Las-Peñas C, Puentedura EJ. Sham Surgery in Orthopedics: A Systematic Review of the Literature. Pain Med. 2017; 18(4):736–50. Epub 2016/07/13. https://doi.org/10.1093/pm/pnw164 PMID: 27402957.

21. Barreto RPG, Braman JP, Ludewig PM, Ribeiro LP, Camargo PR. Bilateral magnetic resonance imaging findings in individuals with unilateral shoulder pain. J Shoulder Elbow Surg. 2019; 28(9):1699–706. Epub 2019/07/08. https://doi.org/10.1016/j.jse.2019.04.001 PMID: 31279721.

22. Brinjikji W, Diehn FE, Jarvik JG, Carr CM, Kallmes DF, Murad MH, et al. MRI Findings of Disc Degeneration are More Prevalent in Adults with Low Back Pain than in Asymptomatic Controls: A Systematic Review and Meta-Analysis. AJNR Am J Neuroradiol. 2015; 36(12):2394–9. Epub 2015/09/12. https://doi.org/10.3174/ajnr.A4498 PMID: 26359154; PubMed Central PMCID: PMC7964277.

23. Ng W, Slater H, Starcevich C, Wright A, Mitchell T, Beales D. Barriers and enablers influencing healthcare professionals' adoption of a biopsychosocial approach to musculoskeletal pain: a systematic review and qualitative evidence synthesis. Pain. 2021; 162(8):2154–85. Epub 2021/02/04. https://doi.org/10.1097/j.pain.0000000000002217 PMID: 33534357.

24. National Institute for Health and Care Excellence. Low back pain and sciatica in over 16s: assessment and management. Available at: https://www.nice.org.uk/guidance/ng59/chapter/Recommendations (accessed 16/05/2023). 2020.

25. Mundal I, Gråwe RW, Bjørngaard JH, Linaker OM, Fors EA. Prevalence and long-term predictors of persistent chronic widespread pain in the general population in an 11-year prospective study: the HUNT study. BMC Musculoskeletal Disorders. 2014; 15(1):213. https://doi.org/10.1186/1471-2474-15-213 PMID: 24951013

26. Puschmann AK, Drießlein D, Beck H, Arampatzis A, Moreno Catalá M, Schiltenwolf M, et al. Stress and Self-Efficacy as Long-Term Predictors for Chronic Low Back Pain: A Prospective Longitudinal Study. J Pain Res. 2020; 13:613–21. Epub 2020/04/14. https://doi.org/10.2147/JPR.S223893 PMID: 32280264; PubMed Central PMCID: PMC7125403.

27. Puska P, Ståhl T. Health in All Policies—The Finnish Initiative: Background, Principles, and Current Issues. Annual Review of Public Health. 2010; 31(1):315–28. https://doi.org/10.1146/annurev.publhealth.012809.103658 PMID: 20070201.

28. Diabetes Prevention Program Research Group. 10-year follow-up of diabetes incidence and weight loss in the Diabetes Prevention Program Outcomes Study. The Lancet. 2009; 374(9702):1677–86. https://doi.org/10.1016/S0140-6736(09)61457-4 PMID: 19878986

29. Aromataris E, Fernandez R, Godfrey C, al e. Chapter 10: Umbrella Reviews. In: Aromataris E, Munn Z (Editors). JBI Manual for Evidence Synthesis. JBI, 2020. Available from https://synthesismanual.jbi.global. https://doi.org/10.46658/JBIMES-20-11. Accessed 19th August 2020. 2020.

30. Higgins J, Thomas J, Chandler J, Cumpston M, Li T, Page M, et al. Cochrane Handbook for Systematic reviews of Interventions version 6.3 (updated February 2022). Cochrane 2022. 2022; Available from www.training.cochrane.org/handbook.

31. Dunn M, Rushton AB, Mistry J, Soundy A, Heneghan NR. Which biopsychosocial factors are associated with the development of chronic musculoskeletal pain? Protocol for an umbrella review of systematic reviews. BMJ Open. 2021; 11(10):e053941. https://doi.org/10.1136/bmjopen-2021-053941 PMID: 34635532

32. Page MJ, McKenzie JE, Bossuyt PM, Boutron I, Hoffmann TC, Mulrow CD, et al. The PRISMA 2020 statement: An updated guideline for reporting systematic reviews. PLOS Medicine. 2021; 18(3):e1003583. https://doi.org/10.1371/journal.pmed.1003583 PMID: 33780438

33. Friis RH, Sellers T. Epidemiology for public health practice: Jones & Bartlett Learning; 2020.

34. Shea BJ, Reeves BC, Wells G, Thuku M, Hamel C, Moran J, et al. AMSTAR 2: a critical appraisal tool for systematic reviews that include randomised or non-randomised studies of healthcare interventions, or both. BMJ. 2017; 358:j4008. https://doi.org/10.1136/bmj.j4008 PMID: 28935701

35. Burgess R, Mansell G, Bishop A, Lewis M, Hill J. Predictors of functional outcome in musculoskeletal healthcare: An umbrella review. Eur J Pain. 2020; 24(1):51–70. Epub 2019/09/12. https://doi.org/10.1002/ejp.1483 PMID: 31509625.

36. Schlesinger S, Schwingshackl L, Neuenschwander M, Barbaresko J. A critical reflection on the grading of the certainty of evidence in umbrella reviews. European Journal of Epidemiology. 2019; 34(9):889–90. https://doi.org/10.1007/s10654-019-00531-4 PMID: 31222608

37. Foroutan F, Guyatt G, Zuk V, Vandvik PO, Alba AC, Mustafa R, et al. GRADE Guidelines 28: Use of GRADE for the assessment of evidence about prognostic factors: rating certainty in identification of groups of patients with different absolute risks. Journal of Clinical Epidemiology. 2020; 121:62–70. https://doi.org/10.1016/j.jclinepi.2019.12.023 PMID: 31982539

38. Pollock M, Fernandes R, Becker L, Pieper D, Hartling L. Chapter V: Overviews of Reviews. In: Higgins JPT, Thomas J, Chandler J, Cumpston M, Li T, Page MJ, et al. (editors). *Cochrane Handbook for Systematic Reviews of Interventions* version 6.3 (updated February 2022). Cochrane, 2022. Available from www.training.cochrane.org/handbook. (accessed 24/03/2022). 2022.

39. Agnello A, Brown T, Desroches S, Welling U, Walton D. Can we identify people at risk of non-recovery after acute occupational low back pain? Results of a review and higher-order analysis. Physiotherapy Canada. 2010; 62(1):9–16. https://doi.org/10.3138/physio.62.1.9 Language: English. Entry Date: 20100409. Revision Date: 20150820. Publication Type: Journal Article. PMID: 21197174

40. Buscemi V, Chang W-J, Liston MB, McAuley JH, Schabrun SM. The role of perceived stress and life stressors in the development of chronic musculoskeletal pain disorders: A systematic review: The Journal of Pain. 2019, pp. No Pagination Specified.; 2019.

41. Chou R, Shekelle P. Will this patient develop persistent disabling low back pain? Jama. 2010; 303 (13):1295–302. Epub 2010/04/08. https://doi.org/10.1001/jama.2010.344 PMID: 20371789.

42. Dai Y, Huang J, Hu Q, Huang L, Wu J, Hu J. Association of Cigarette Smoking with Risk of Chronic Musculoskeletal Pain: A Meta-Analysis. Pain Physician. 2021; 24(8):495–506. Epub 2021/11/19. PMID: 34793634.

43. Fayad F, Lefevre-Colau MM, Poiraudeau S, Fermanian J, Rannou F, Wlodyka Demaille S, et al. [Chronicity, recurrence, and return to work in low back pain: common prognostic factors]. Annales de Readaptation et de Medecine Physique. 2004; 47(4):179–89. https://doi.org/10.1016/j.annrmp.2004.01.005 PMID: 15130717.

44. Goldsmith R, Wright C, Bell SF, Rushton A. Cold hyperalgesia as a prognostic factor in whiplash associated disorders: a systematic review. Manual Therapy. 2012; 17(5):402–10. https://doi.org/10.1016/j.math.2012.02.014 PMID: 22464187.

45. Iles RA, Davidson M, Taylor NF, O'Halloran P. Systematic review of the ability of recovery expectations to predict outcomes in non-chronic non-specific low back pain. Journal of Occupational Rehabilitation. 2009; 19(1):25–40. https://doi.org/10.1007/s10926-008-9161-0 PMID: 19127345.

46. Jadhakhan F, Evans DW, Falla D. The role of post-trauma stress symptoms in the development of chronic musculoskeletal pain and disability: A systematic review. Eur J Pain. 2023; 27(2):183–200. Epub 2022/11/02. https://doi.org/10.1002/ejp.2048 PMID: 36317593.

47. Lang J, Ochsmann E, Kraus T, Lang JW. Psychosocial work stressors as antecedents of musculoskeletal problems: a systematic review and meta-analysis of stability-adjusted longitudinal studies. Soc Sci Med. 2012; 75(7):1163–74. Epub 2012/06/12. https://doi.org/10.1016/j.socscimed.2012.04.015 PMID: 22682663.

48. Pincus T, Burton AK, Vogel S, Field AP. A Systematic Review of Psychological Factors as Predictors of Chronicity/Disability in Prospective Cohorts of Low Back Pain. Spine. 2002; 27(5):E109–E20. https://doi.org/10.1097/00007632-200203010-00017 PMID: 11880847-200203010-00017.

49. Struyf F, Geraets J, Noten S, Meeus M, Nijs J. A multivariable prediction model for the chronification of non-traumatic shoulder pain: A systematic review. Pain Physician. 2016; 19(2):1–10. 608013657. PMID: 26815244

50. Walton DM, Macdermid JC, Giorgianni AA, Mascarenhas JC, West SC, Zammit CA. Risk factors for persistent problems following acute whiplash injury: update of a systematic review and meta-analysis. Journal of Orthopaedic & Sports Physical Therapy. 2013; 43(2):31–43. https://doi.org/10.2519/jospt.2013.4507 PMID: 23322093.

51. Walton DM, Pretty J, MacDermid JC, Teasel RW. Risk Factors for Persistent Problems Following Whiplash Injury: Results of a Systematic Review and Meta-analysis. Journal of Orthopaedic & Sports Physical Therapy. 2009; 39(5):334–50. https://doi.org/10.2519/jospt.2009.2765 PMID: 19411766.

52. Wu A, March L, Zheng X, Huang J, Wang X, Zhao J, et al. Global low back pain prevalence and years lived with disability from 1990 to 2017: estimates from the Global Burden of Disease Study 2017. Ann Transl Med. 2020; 8(6):299. Epub 2020/05/02. https://doi.org/10.21037/atm.2020.02.175 PMID: 32355743; PubMed Central PMCID: PMC7186678.

53. Kosek E, Cohen M, Baron R, Gebhart GF, Mico J-A, Rice ASC, et al. Do we need a third mechanistic descriptor for chronic pain states? PAIN. 2016; 157(7):1382–6. https://doi.org/10.1097/j.pain.0000000000000507 PMID: 26835783-201607000-00003.

54. Hashmi JA, Baliki MN, Huang L, Baria AT, Torbey S, Hermann KM, et al. Shape shifting pain: chronification of back pain shifts brain representation from nociceptive to emotional circuits. Brain. 2013; 136(Pt 9):2751–68. Epub 2013/08/29. https://doi.org/10.1093/brain/awt211 PMID: 23983029; PubMed Central PMCID: PMC3754458.

55. Navratilova E, Atcherley CW, Porreca F. Brain Circuits Encoding Reward from Pain Relief. Trends Neurosci. 2015; 38(11):741–50. Epub 2015/11/26. https://doi.org/10.1016/j.tins.2015.09.003 PMID: 26603560; PubMed Central PMCID: PMC4752429.

56. Neugebauer V. Amygdala pain mechanisms. Handb Exp Pharmacol. 2015; 227:261–84. Epub 2015/04/08. https://doi.org/10.1007/978-3-662-46450-2_13 PMID: 25846623; PubMed Central PMCID: PMC4701385.

57. Yang S, Chang MC. Chronic Pain: Structural and Functional Changes in Brain Structures and Associated Negative Affective States. International Journal of Molecular Sciences. 2019; 20(13):3130. https://doi.org/10.3390/ijms20133130 PMID: 31248061

58. Shin LM, Liberzon I. The neurocircuitry of fear, stress, and anxiety disorders. Neuropsychopharmacology. 2010; 35(1):169–91. Epub 2009/07/25. https://doi.org/10.1038/npp.2009.83 PMID: 19625997; PubMed Central PMCID: PMC3055419.

59. Thompson JM, Neugebauer V. Amygdala Plasticity and Pain. Pain Research and Management. 2017; 2017:8296501. https://doi.org/10.1155/2017/8296501 PMID: 29302197

60. Vachon-Presseau E. Effects of stress on the corticolimbic system: implications for chronic pain. Progress in Neuro-Psychopharmacology and Biological Psychiatry. 2018; 87:216–23. https://doi.org/10.1016/j.pnpbp.2017.10.014 PMID: 29079140

61. Yu R, Gollub RL, Spaeth R, Napadow V, Wasan A, Kong J. Disrupted functional connectivity of the periaqueductal gray in chronic low back pain. Neuroimage Clin. 2014; 6:100–8. Epub 2014/11/08. https://doi.org/10.1016/j.nicl.2014.08.019 PMID: 25379421; PubMed Central PMCID: PMC4215524.

62. Ji RR, Nackley A, Huh Y, Terrando N, Maixner W. Neuroinflammation and Central Sensitization in Chronic and Widespread Pain. Anesthesiology. 2018; 129(2):343–66. Epub 2018/02/21. https://doi.org/10.1097/ALN.0000000000002130 PMID: 29462012; PubMed Central PMCID: PMC6051899.

63. Gangadharan V, Kuner R. Pain hypersensitivity mechanisms at a glance. Dis Model Mech. 2013; 6 (4):889–95. Epub 2013/07/06. https://doi.org/10.1242/dmm.011502 PMID: 23828645; PubMed Central PMCID: PMC3701208.

64. Schmid J, Theysohn N, Ga F, Benson S, Gramsch C, Forsting M, et al. Neural mechanisms mediating positive and negative treatment expectations in visceral pain: a functional magnetic resonance imaging study on placebo and nocebo effects in healthy volunteers. Pain. 2013; 154(11):2372–80. Epub 2013/07/23. https://doi.org/10.1016/j.pain.2013.07.013 PMID: 23867733.

65. Mansour AR, Farmer MA, Baliki MN, Apkarian AV. Chronic pain: the role of learning and brain plasticity. Restor Neurol Neurosci. 2014; 32(1):129–39. Epub 2013/04/23. https://doi.org/10.3233/RNN-139003 PMID: 23603439; PubMed Central PMCID: PMC4922795.

66. McCarberg B, Peppin J. Pain Pathways and Nervous System Plasticity: Learning and Memory in Pain. Pain Med. 2019; 20(12):2421–37. Epub 2019/03/14. https://doi.org/10.1093/pm/pnz017 PMID: 30865778.

67. Heinricher MM, Tavares I, Leith JL, Lumb BM. Descending control of nociception: Specificity, recruitment and plasticity. Brain Res Rev. 2009; 60(1):214–25. Epub 2009/01/17. https://doi.org/10.1016/j.brainresrev.2008.12.009 PMID: 19146877; PubMed Central PMCID: PMC2894733.

68. Chen H, Cohen P, Chen S. How Big is a Big Odds Ratio? Interpreting the Magnitudes of Odds Ratios in Epidemiological Studies. Communications in Statistics—Simulation and Computation. 2010; 39 (4):860–4. https://doi.org/10.1080/03610911003650383

69. Cai M, Bao C, Meng Q. Overview of risk aggregation approach in different risk scenarios. Procedia Computer Science. 2022; 214:1353–60. https://doi.org/10.1016/j.procs.2022.11.316.

70. Mann CJ. Observational research methods. Research design II: cohort, cross sectional, and case-control studies. Emerg Med J. 2003; 20(1):54–60. Epub 2003/01/21. https://doi.org/10.1136/emj.20.1.54 PMID: 12533370; PubMed Central PMCID: PMC1726024.