




RESEARCH ARTICLE

# Evaluating comparative effectiveness of psychosocial interventions adjunctive to opioid agonist therapy for opioid use disorder: A systematic review with network meta-analyses

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## Abstract

### Background

Guidelines recommend that individuals with opioid use disorder (OUD) receive pharmacological and psychosocial interventions; however, the most appropriate psychosocial intervention is not known. In collaboration with people with lived experience, clinicians, and policy makers, we sought to assess the relative benefits of psychosocial interventions as an adjunct to opioid agonist therapy (OAT) among persons with OUD.

### Methods

A review protocol was registered a priori (CRD42018090761), and a comprehensive search for randomized controlled trials (RCT) was conducted from database inception to June 2020 in MEDLINE, Embase, PsycINFO and the Cochrane Central Register of Controlled Trials. Established methods for study selection and data extraction were used. Primary outcomes were treatment retention and opioid use (measured by urinalysis for opioid use and opioid

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**Competing interests:** BH has previously received honoraria from Eversana (previously Cornerstone Research Group) for the provision of methodologic advice related to systematic reviews and meta-analysis. This does not alter the adherence to PLOS Medicine policies on sharing data and materials. All other authors have no conflicts of interest to disclose. This does not alter our adherence to PLOS ONE policies on sharing data and materials.

abstinence outcomes). Odds ratios were estimated using network meta-analyses (NMA) as appropriate based on available evidence, and in remaining cases alternative approaches to synthesis were used.

## Results

Seventy-two RCTs met the inclusion criteria. Risk of bias evaluations commonly identified study limitations and poor reporting with regard to methods used for allocation concealment and selective outcome reporting. Due to inconsistency in reporting of outcome measures, only 48 RCTs (20 unique interventions, 5,404 participants) were included for NMA of treatment retention, where statistically significant differences were found when psychosocial interventions were used as an adjunct to OAT as compared to OAT-only. The addition of rewards-based interventions such as contingency management (alone or with community reinforcement approach) to OAT was superior to OAT-only. Few statistically significant differences between psychosocial interventions were identified among any other pairwise comparisons. Heterogeneity in reporting formats precluded an NMA for opioid use. A structured synthesis was undertaken for the remaining outcomes which included opioid use ( $n = 18$  studies) and opioid abstinence ( $n = 35$  studies), where the majority of studies found no significant difference between OAT plus psychosocial interventions as compared to OAT-only.

## Conclusions

This systematic review offers a comprehensive synthesis of the available evidence and the limitations of current trials of psychosocial interventions applied as an adjunct to OAT for OUD. Clinicians and health services may wish to consider integrating contingency management in addition to OAT for OUD in their settings to improve treatment retention. Aside from treatment retention, few differences were consistently found between psychosocial interventions adjunctive to OAT and OAT-only. There is a need for high-quality RCTs to establish more definitive conclusions.

## Trial registration

PROSPERO registration CRD42018090761.

## Introduction

In recent years, the illicit use of opioids has risen at alarming rates [1–3], which has contributed to substance use disorder, overdose, and increasing rates of opioid-related death [4]. COVID-19 has exacerbated this public health crisis with increasing numbers of overdoses and fatalities occurring within North America [5, 6]. Between 2016 and 2019, more than 15,000 Canadians died from apparent opioid use [7], with 78% of accidental opioid-related deaths involving fentanyl and fentanyl analogues [8]. In 2018, 67,367 deaths within the United States were attributed to an overdose involving opioids [9]. Problematic opioid use has also been prevalent in Europe, where more than 80% of drug-related deaths in 2017 were related to opioid use [10]. Similar issues exist in Asia, where two thirds of all individuals using opioids have been described as engaging in problematic opioid use [11]. Both the non-medical use of prescription opioids as well as the use of illicit opioids have contributed to the opioid crisis. An

increase in the contamination of illicit drugs with fentanyl in North America and Europe has been one contributing factor to the increasing rate of overdoses, hospitalizations and mortality from opioid use [12, 13]. These trends have prompted international actions including the development of new guidelines [14], such as the 2017 Canadian Guideline for Opioids for Chronic Non-Cancer Pain [15, 16].

Individuals with an opioid use disorder (OUD) have been found to experience increased healthcare utilization, morbidity, and mortality as compared to individuals without an OUD [17, 18]. Although individuals with any substance use disorder are at an increased risk of harm, injecting opioids has additional health risks such as the transmission of blood-borne viruses, including human immunodeficiency virus (HIV) and hepatitis C virus (HCV) [19].

There are also substantial societal implications of OUD. In Canada, over \$135 million CAD was spent in 2015 on the medical management of OUD (i.e., methadone, buprenorphine/naloxone) [20], while the total economic impact of opioid overdose, addiction, and dependence from 2001 to 2017 was estimated as exceeding \$1 trillion USD in the United States [21]. Given the significant implications of OUD on well-being, healthcare utilization and societal costs, the identification of effective management strategies is essential.

Clinical guidelines recommend opioid agonist therapy (OAT) as the first-line treatment for OUD, with psychosocial (e.g., motivational interviewing) therapy being routinely offered [16, 22, 23]. A variety of psychosocial approaches have been used to aid in OUD management, including (for example) cognitive behavioral therapy (CBT), contingency management, and supportive counselling [24, 25]. There is limited research, however, that addresses the efficacy of psychosocial interventions used in conjunction with OAT. Despite a lack of quantitative comparisons of the efficacy of various psychosocial therapies, these treatments are considered by many clinicians and patients to be a vital element of OAT treatment, given the key role that psychotherapy can have in improving treatment retention [16, 22, 26]. Previous systematic and narrative reviews [24, 25, 27] have studied the use of psychosocial interventions delivered in combination with OAT, where the overall efficacy of providing psychosocial interventions was supported; however, these reviews have not conducted quantitative comparisons of effects between psychosocial strategies.

Given the absence of meta-analyses comparing the efficacy of competing psychosocial interventions used with OAT for individuals with OUD, the most appropriate psychosocial therapy to apply as an adjunct to OAT is unknown. Network meta-analysis (NMA) allows for the comparison of multiple therapies in a unified analysis using relevant direct and indirect data [28–30]. NMA is commonly used for evidence synthesis to address research questions that involve comparisons between multiple interventions. Such an analysis would be informative for decision-making to consider the most efficacious psychosocial therapies for treating the rising rate of OUD. Therefore, the objective of this study was to conduct a systematic review incorporating NMA to compare the relative benefits and harms of psychosocial therapies among people with OUD receiving OAT.

## Methods

A protocol was published a priori [31] and registered in PROSPERO (CRD42018090761). The reporting of this review adheres to guidance from the PRISMA Statement for Network Meta-Analyses (see [S1 Text](#)) [32].

## Search strategy to identify relevant studies

Searches to identify relevant studies for this review were developed and tested by an experienced medical information specialist (B. Skidmore) in consultation with the review team. The

MEDLINE search strategies were peer reviewed by another senior information specialist using the PRESS Checklist [33] prior to execution. Using the OVID platform, we searched Ovid MEDLINE<sup>®</sup> ALL, PsycINFO, and Embase Classic + Embase. We also searched the Cochrane Library on Wiley. The study searches were conducted on June 24, 2020. Strategies utilized a combination of controlled vocabulary (e.g., “Opiate Substitution Treatment”, “Opioid-Related Disorders/dt [drug therapy]”, “Buprenorphine/tu [therapeutic use]”) and keywords (e.g., “opioid maintenance”, “methadone substitution”, “OAT”). Vocabulary and syntax were adjusted by database. Randomized controlled trial filters were used where applicable. Conference abstracts prior to 2016 were removed from Embase and CENTRAL and dissertation abstracts were removed from PsycINFO. [S2 Text](#) provides the full search strategies that were used. Reference lists of relevant systematic reviews and the set of included studies were searched for additional studies and were integrated into a PRISMA flow diagram.

### Study eligibility criteria

**Population.** The review included individuals with problematic opioid use that were receiving OAT, including those with OUD as defined by the Diagnostic and Statistical Manual of Mental Disorders (DSM-5) or diagnosed with opioid dependence as defined by the International Classification of Disease (ICD). Earlier diagnoses such as those defined by the DSM-IV were also eligible for inclusion (i.e., opioid dependence, opioid abuse). No restrictions were put in place regarding age or specialty populations (e.g., pregnant women, or incarcerated individuals).

**Interventions and comparators of interest.** Psychosocial interventions delivered with OAT (e.g., methadone, slow-release oral morphine, injectable OAT) were of interest. Studies had to include at least one arm with an eligible psychosocial intervention. Studies using control groups of either OAT-only or ‘standard medical management’ were eligible, as they were expected sources of indirect evidence [28] for NMAs. For inclusion, psychosocial interventions were required to target opioid use (e.g., a study of contingency management that provided rewards for decreased cocaine use rather than opioid use was not considered to be eligible). Studies that included the same psychosocial intervention in each group were excluded, as were studies where only the intensity of interventions, setting, or mode of delivery (e.g., online as compared to in person) differed between groups. Studies that did not include at least two arms receiving the same pharmacological interventions were excluded, given best practice guidelines which include OAT as first line treatment for OUD [16, 23].

A primary list of psychosocial interventions with descriptions was developed a priori (see [S3 Text](#)) and included interventions such as contingency management (CM), community reinforcement approach (CRA), cognitive behaviour therapy (CBT), counselling, acceptance and commitment therapy (ACT) and motivational interviewing, amongst other therapy types. Studies that applied inconsistent OATs between groups were excluded given the inability to determine the specific component that could have impacted change (i.e., psychotherapy or pharmacotherapy). In some studies, more than two groups were randomized to interventions but only two interventions were eligible. In these instances, all intervention information was extracted; however, only the eligible arms were included for data analyses (e.g., if participants were randomized to four groups but only two of these groups involved participants receiving OAT). If studies included more than two groups with different pharmacological interventions (e.g., two groups randomized to methadone and psychosocial interventions and two groups with buprenorphine and psychosocial interventions), we included we included only two study arms that applied the same pharmacological intervention based on the OAT that was most frequently reported across all studies. Similarly, if studies included multiple arms with varying

prizes in CM (e.g., two groups received vouchers and two groups received take-home medication), we included the study arms that used the prize reported most often across all studies. Any studies that involved tapering individuals off OAT were also excluded.

**Outcomes.** The co-primary outcomes of interest were treatment retention at last study timepoint and opioid use. Treatment retention could be reported as a continuous or dichotomous measure based on the individuals continuing to receive treatment in the study. Opioid use, based on urinalysis, could be reported as either abstinence from opioids or opioid use. Thresholds for opioid abstinence and opioid use varied between and within studies and were not consistently dichotomous variables. For example, some studies reported opioid abstinence as a proportion of participants that used opioids less than a specific number of times over a set of weeks. As such, opioid use and abstinence were captured separately and based on the description that each study reported.

Secondary endpoints of interest included self-reported opioid use, abstinence from illicit drug use (including but not limited to cocaine, cannabis, benzodiazepines), alcohol use, drop-outs from the psychosocial therapy portion of study (but remaining on OAT), adherence to OAT, HIV/HCV risk behaviours, mental health symptoms (e.g., depression, anxiety), measures of craving, quality of life, and adverse events (e.g., increases in substance use). Outcomes had to be reported separately for at least two eligible study groups to be included (e.g., outcomes reported for all groups combined in the study that were not presented separately by group were not extracted). We sought quantitative data from all reporting formats for the outcomes considered (e.g., mean and standard deviation, frequency, p-values). For studies that reported outcomes in multiple formats (e.g., total abstinence from opioids in weeks and abstinence for more than three weeks), we prioritized presenting the reporting format that was more consistently available across the set of included studies.

**Study designs.** Only RCTs were included because they would best assess the relative effectiveness of psychosocial interventions, while reducing confounding inherent in other study designs. All other types of studies, including observational studies, case-control studies, case series and case reports, were excluded. Systematic reviews were reviewed to inspect reference lists for additional eligible RCTs, but were not eligible for inclusion. Inclusion was limited to studies published in English or French.

## Screening for eligible studies

Citations identified from the literature searches were imported into DistillerSR Software (Evidence Partners, Inc; Ottawa, Canada). Citations were screened independently by two reviewers based on title and abstract (level 1 screening), and subsequently full-text articles (level 2 screening). Level 1 screening was performed using a liberal accelerated approach (i.e., only one reviewer needed to include a citation, while two reviewers were needed to exclude) [34]. Level 1 citations deemed potentially relevant or lacking sufficient information to exclude were reviewed at Level 2, which was performed by two reviewers independently and in duplicate. Disagreements during full-text screening were resolved by discussion or consultation with a third reviewer (KC) if necessary. Prior to conducting screening at level 1 and level 2, 100 title/abstracts and 15 full texts were piloted by the review team to establish agreement and consistency among reviewers regarding the application of eligibility criteria.

## Process of data collection

Primary data collection from the included studies was performed by two reviewers using a standardized electronic data collection form in DistillerSR. Data were independently extracted by a single reviewer and verified by a second reviewer. Data gathered from the included studies



incorporated information regarding study characteristics (authors, year of publication, journal, countries of data collection, source of funding), participant characteristics (eligibility criteria, number of individuals per group), basic participant demographics (age, sex, race), type of opioid use (prescription and/or illicit), cited rationale for opioid use (e.g., chronic pain), duration of opioid use, mode of use (intravenous versus oral), comorbidities or other unique demographic traits, interventions (names, description, including numbers and duration of sessions, setting and therapist expertise, if described), treatment setting (e.g., community, physician office, penitentiary), and outcomes reported. Type of journal models were also extracted to identify journals that were open access. All intervention names and content were reviewed by a PhD candidate in clinical psychology (DR) in consultation with a clinical expert (KC), when necessary to determine if specific arms of an included study were eligible. Interventions were reviewed and labelled based on their core components to ensure that similar interventions were being combined in quantitative analyses. Reported outcomes were extracted in all formats for all arms of a study to determine the most consistently reported format for each outcome. Study traits were summarized in tabular form to facilitate inspection and discussions with team members regarding study heterogeneity and grouping of interventions. If studies reported on the same cohort (e.g., updates of different follow-up durations), the most complete and up-to-date study information was retained.

### **Risk of bias assessments of included studies**

Risk of bias (RoB) was evaluated for all studies using the Cochrane RoB tool [35]. The Cochrane RoB tool evaluates seven domains (i.e., random sequence generation, allocation concealment, blinding of participant and personnel, blinding of outcome assessment, incomplete outcome data, selective outcome reporting and “other sources of bias”) [35]. Random sequence generation, allocation concealment, and “other sources of bias” were assessed at the study level, while blinding of participants and personnel, blinding of outcomes assessment, incomplete outcome data, and selective outcome reporting were assessed at the level of outcome. Four outcomes were selected by the research team as the “critical outcomes” to be assessed separately; these included treatment retention, opioid use, adherence to OAT and adverse events. The domain for incomplete outcome data was not considered for treatment retention given the overlapping concept of treatment retention and dropout, an approach that has been previously applied for Cochrane reviews of OUD trials [24]. The RoB for blinding of participants and personnel was considered to be high for all studies due to the inherent difficulties in blinding when delivering psychosocial interventions [36]. RoB assessments were conducted independently by two reviewers and disagreements were resolved through discussion or by a third reviewer. Results from RoB appraisals were summarized and reported on an item-by-item basis. RoB was assessed based on the details published in the study, the associated supplementary materials, and available on trial registration websites.

### **Approach to evidence synthesis and sensitivity analyses**

We planned a priori to undertake NMAs of available direct and indirect evidence using a Bayesian framework for outcomes with sufficient data for analysis in cases where well-connected evidence networks existed, and the transitivity assumption was judged appropriate. Opportunities for such analysis (as well as pairwise meta-analysis) were very greatly limited due to considerable variability in the outcomes measured across trials (leading to disconnected networks of evidence for most outcomes) and the presence of few studies for most treatment comparisons. A descriptive approach to synthesis was thus necessary for most outcomes, though NMA was feasible for one outcome measure (treatment retention). For brevity, we

refer readers to [S4 Text](#) for details as to how NMA modeling was performed, including details regarding specifications, assessment of model convergence, estimation of secondary measures of effect, and software considerations. Briefly, random effects NMA was conducted in a Bayesian framework using WinBUGS Software (WinBUGS version 1.4.3, Imperial College and Medical Research Council (MRC) Biostatistics Unit, UK) and R Software (R version 3.5.2, The R Foundation for Statistical Computing). To assess potential for publication bias, comparison-adjusted funnel plots (i.e., plots of the effect estimate from each study against its effect estimate standard error) were generated in Stata (Stata/SE version 15.1, StataCorp LLC, College Station, TX) for studies included in NMAs to assess the potential bias related to the size of the trials, which could indicate possible publication bias [37]. Treatments were ordered by intensity, based on the number of therapy components delivered in addition to OAT.

To assess whether findings from analyses were sensitive to between-study differences in characteristics (e.g., related to enrolled populations or study methods), sensitivity analyses, including subgroup analyses and network meta-regression were planned where sufficient data were available. Unfortunately, the feasibility of sensitivity analyses was also low due to the variable outcome reporting formats and differences in reporting of study characteristics. Again for brevity, we present our a priori plans for secondary analyses in [S4 Text](#), along with the results of secondary analyses that were possible for the treatment retention outcome. Briefly, for this outcome we were able to explore the effects of age, study duration and control group event rate (as a proxy to consider between-study differences in multiple confounders) using meta-regression, as well as publication in potential predatory journals through exclusion from analysis (see [S5 Text](#) for a listing of protocol deviations).

### **Additional approaches to data synthesis**

A structured descriptive synthesis [38] was taken for several endpoints where data were not amenable to meta-analysis. As vote counting approaches are not recommended, summaries of findings based on intervention groups are provided below, while detailed study-by-study data have also been organized and presented in supplements; the latter information follow supplements which detail a map of outcomes reported by each study ([S6 Text](#)) and findings from risk of bias appraisals ([S7 Text](#)), and can be found within [S8](#) through [S24](#) Texts. Findings reported include the intervention and control group labels; a description of the outcome measures, grouped by similar descriptions between studies; aggregate data reported in each study; follow-up time point (reported in descending order of duration); and author conclusions.

### **Reporting of review findings**

Both graphical and numerical displays of findings are presented for outcomes, where appropriate. For the NMA performed, a network diagram was generated to display the availability of evidence for the included treatment comparisons; forest plots and league tables were also generated to present its findings. Due to the high volume of outcomes assessed to maximize the value of this review, findings in the review's main text are focused upon the co-primary outcomes of treatment retention and opioid use measured by urinalysis, and appendices have been used to provide details for the remaining outcomes.

## **Results**

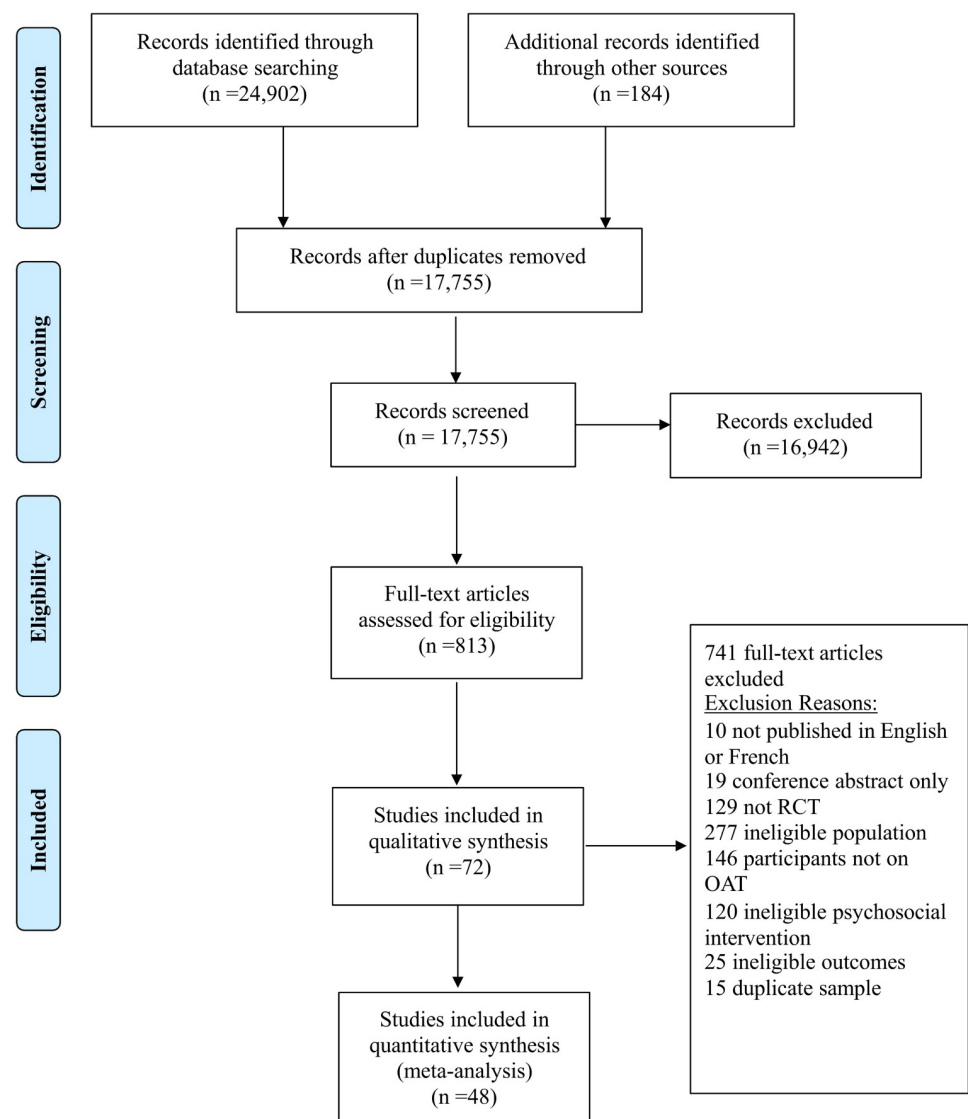
### **Extent of literature identified**

The literature search identified 17,755 unique citations across databases, and 184 unique citations were identified from hand searching of relevant reference lists. At the level of title/

abstract review, 813 abstracts were judged to be potentially relevant and their full texts were acquired. During full-text review, 72 trials (see [S25 Text](#)) met eligibility criteria and were retained for inclusion in the review (see [Fig 1](#)) [39–110]. A summary of studies excluded during full-text review, with reasons for exclusion, is provided in [S26 Text](#). [Table 1](#) provides a study-by-study account of additional information including population and key demographics and [S1 Data](#) provides detailed accounts of the study accounts of the intervention and comparator groups.

## Study characteristics

The included trials were published between 1978 and 2020 (median year 2009; mode year 2013). The median study sample size was 105 participants (range 14 to 1,015). The majority of trials were conducted in the United States ( $n = 53$ , 73.6%) [39, 44, 46, 47, 49, 51–58, 63–71, 73–80, 82–90, 92–95, 97–104, 108, 110], while the remainder were conducted in China ( $n = 7$ ,



**Fig 1. Process of study selection.** A flow diagram is shown which depicts the process of study selection.

<https://doi.org/10.1371/journal.pone.0244401.g001>



Table 1. Overview of included studies.

First Author, Year	Journal	Country	No. of Participants (Randomized)	Age of all Participants (years), (mean (SD) and/or range)	Sex/ Gender (men/ male ((%))	Majority Ethnicity/Race (%)	Type of Opioid Use	Comorbidities or Unique Patient Characteristics	DSM or ICD Diagnosis
Abbott, 1998	The American Journal of Drug and Alcohol Abuse	USA	180	37 (9.1)	Men: 69%	Hispanic: 79%	NR	NA	Yes
Abrahms, 1979	The International Journal of the Addictions	USA	15	28 (NR) / (23–37)	Male: 93%	African American: 50%	NR	NA	No
Amini-Lari, 2017	Iran Journal of Psychiatry and Behavioural Sciences	Iran	118	38.6 (NR)	Men: 95%	Persian: 100%	NR	NA	Yes
Avants, 1999	American Journal of Psychiatry	USA	291	36.8 (6.9)	Male: 70%	European Descent: 59%	Illicit	NA	Yes
Ball, 2007	Journal of Personality Disorders	USA	30	37 (6.1)	Men: 50%	European Descent: 80%	Illicit	Participants with personality disorder	No
Barry, 2019	Drug and Alcohol Dependence	USA	40	38.1 (11.3)	Male: 63%	European Descent: 85%	Prescription	Participants with back pain	Yes
Bickel, 2008	Experimental and Clinical Psychopharmacology	USA	135	28.6 (NR)	Male: 56%	European Descent: 96%	NR	NA	Yes
Bronner, 2007	Drug and Alcohol Dependence	USA	236	38.5 (7.9)	Male: 54%	European Descent: 35%	NR	NA	Yes
Carroll, 1995	The American Journal on Addictions	USA	20	27.6 (NR)	Men: 0%	Nonminority: 79%	Illicit	Participants were pregnant	No
Catalano, 1999	Addiction	USA	144	35.3 (5.8)	Male: 25%	European Descent: 77%	NR	NA	No
Chawarski, 2011	Drug and Alcohol Dependence	China	37	NR	NR	NR	NR	NA	No
Chawarski, 2008	Drug and Alcohol Dependence	Malaysia	24	36.7	Male: 81%	NR	Illicit	NA	Yes
Chen, 2013	Drug and Alcohol Dependence	China	255	38.1 (5.7)	Male: 92%	NR	Illicit	NA	Yes
Chopra, 2009	Experimental and Clinical Psychopharmacology	USA	127	31.8 (NR)	Male: 58%	European Descent: 98%	NR	NA	Yes
Christensen, 2014	Journal of Consulting and Clinical Psychology	USA	170	34.3 (NR) / (20–63)	Male: 54%	European Descent: 95%	NR	NA	Yes
Chutuape, 1999	Drug and Alcohol Dependence	USA	14	41 (NR)	Male: 79%	European Descent: 86%	Illicit	Participants with sedative/hypnotic dependence disorder	Yes
Czuchry, 2009	Journal of Psychoactive Drugs	USA	82	40.4 (8.9)	Male: 70%	Hispanic: 63%	Illicit	NA	No
Day, 2018	BMC Psychiatry	UK	83	37 (NR) / (25–61)	Male: 87%	European Descent 83%	Prescription and illicit	NA	No
Downey, 2000	Experimental and Clinical Psychopharmacology	USA	41	40.0 (NR)	Male: 61%	Non-European Descent: 66%	Illicit	NA	Yes
Epstein, 2009	Drug and Alcohol Dependence	USA	252	37.8 (7.6) / (19–57)	Men: 48%	African American: 66%	Illicit	NA	No
Fals-Stewart, 2001	Behavior Therapy	USA	43 Couples	Male partner: 38.1 (7.5) / Female partner: 36.0 (7.3)	Male: 50%	Male: European Descent: 50% / Female: European Descent: 56%	Illicit	Heterosexual couples only	No

(Continued)

Table 1. (Continued)

First Author, Year	Journal	Country	No. of Participants (Randomized)	Age of all Participants (years), (mean (SD) and/or range)	Sex/ Gender (men/ male ((%))	Majority Ethnicity/Race (%)	Type of Opioid Use	Comorbidities or Unique Patient Characteristics	DSM or ICD Diagnosis
Fiellin, 2013	American Journal of Medicine	USA	141	33.7 (NR)	Male: 74%	European Descent: 90%	Prescription and illicit	NA	No
Fiellin, 2006	The New England Journal of Medicine	USA	166	36.0 (NR)	Male: 78%	European Descent: 77%	Prescription and illicit	NA	Yes
Ghitza, 2008	Addictive Behaviors	USA	116	37.0 (8.4)	Male: 56%	African American: 47%	Illicit	Participants were cocaine users	Yes
Groß (Gross), 2006	Experimental and Clinical Psychopharmacology	Germany	60	32.5 (9.8)	Male: 55%	European Descent: 92%	Illicit	NA	Yes
Gu, 2013	AIDS Behavior	China	288	NR	Male: 92%	Han Chinese: 99%	NR	NA	No
Hosseinzadeh, 2014	Archives of Psychiatric Nursing	Iran	35	29.5 (NR) / (17–43)	Male: 100%	NR	NR	Participants with depression	No
Hser, 2011	Addiction	China	320	38	Male: 77%	NR	Illicit	NA	NR
Iguchi, 1997	Journal of Consulting and Clinical Psychology	USA	103	36.3 (6.9)	Male: 63%	European Descent: 85%	Illicit	NA	No
Jaffray, 2014	International Journal of Pharmacy Practice	Scotland	542	32 (NR)	Male: 64%	NR	NR	NA	No
Jiang, 2012	Shanghai Archives of Psychiatry	China	160	38.9 (8.9)	Male: 78%	Han Chinese: 98%	Illicit	NA	Yes
Joe, 1997	The Journal of Nervous and Mental Disease	USA	454	36 (NR)	Men: 68%	Mexican American: 44%	NR	NA	No
Karow, 2010	Drug and Alcohol Dependence	Germany	1015	36.4 (6.7)	Male: 80%	NR	Illicit	Participants were in poor physical and/or mental health*	Yes
Kelly, 2012	Journal of Addiction Medicine	USA	244	43.2 (8.0)	Male: 70%	African American: 77%	Illicit	NA	No
Kidorf, 2018	Drug and Alcohol Dependence	USA	212	39.8 (NR)	Male: 55%	European Descent: 37%	NR	NA	No
Kosten, 2003	Drug and Alcohol Dependence	USA	160	36.9 (NR)	Male: 66%	European Descent: 56%	Illicit	Participants were cocaine users	Yes
Linehan, 2002	Drug and Alcohol Dependence	USA	24	36.1 (7.3)	Men: 0%	European Descent: 66%	Illicit	Participants with borderline personality disorder	Yes
Ling, 2013	Addiction	USA	202	37.0 (NR)	Male: 69%	European Descent: 52%	NR	NA	Yes
Liu, 2018	Frontiers in Psychiatry	China	125	43.9 (6.6)	Male: 74%	NR	NR	NA	No
Marsch, 2014	Journal of Substance Abuse Treatment	USA	160	40.7 (9.8)	Male: 75%	European Descent: 44%	NR	NA	Yes
McLellan, 1993	The Journal of the American Medical Association	USA	102	41 (NR)	Male: 100%	African American: 74%	Illicit	Participants were all male veterans	Yes
Milby, 1978	Addictive Behaviors	USA	75	NR (NR)/(21–54)	Male: 83%	African American: 52%	NR	NA	No
Miotto, 2012	Journal of Addiction Medicine	USA	104	35.4 (NR)	Male: 58%	European Descent: 58%	Prescription and illicit	NA	Yes

(Continued)

Table 1. (Continued)

First Author, Year	Journal	Country	No. of Participants (Randomized)	Age of all Participants (years), (mean (SD) and/or range)	Sex/ Gender (men/ male ((%))	Majority Ethnicity/Race (%)	Type of Opioid Use	Comorbidities or Unique Patient Characteristics	DSM or ICD Diagnosis
Moore, 2013	Journal of Substance Abuse Treatment	USA	36	41.3 (NR)	Male: 42%	European Descent: 59%	Prescription and illicit	NA	No
Moore, 2019	Journal of Substance Abuse Treatment	USA	82	42.4 (NR)	Male: 60%	European Descent: 67%	Prescription and illicit	NA	No
Nyamathi, 2011	Journal of Addiction Diseases	USA	256	51.2 (8.4)	Male: 59%	African American: 45%	NR	Participants with moderate-to-heavy alcohol use	No
O'Connor, 1998	The American Journal of Medicine	USA	46	33.5 (NR)	Male: 69%	European Descent: 71%	Illicit	NA	Yes
Oliveto, 2005	Addiction	USA	140	36.5 (NR)	Males: 68%	European Descent: 65%	Illicit	NA	Yes
O'Neill, 1996	Drug and Alcohol Dependence	Australia	92	26.2 (4.5)	Men: 0%	NR	NR	All participants were pregnant	No
Otto, 2014	Journal of Psychoactive Drugs	USA	78	42.3 (9.9)	Men: 55%	European Descent: 68%	Illicit	NA	Yes
Pan, 2015	PLoS ONE	China	240	40.9 (8.5)	Male: 78%	Chinese: 100%	NR	NA	Yes
Pashaei, 2013	Iranian Journal of Public Health	Iran	92	37.7 (10.9)	Male: 100%	NR	NR	NA	No
Petry, 2002	Journal of Consulting and Clinical Psychology	USA	42	38.6 (NR)	Male: 29%	Hispanic: 52%	NR	Participants were cocaine users	Yes
Poling, 2006	Archives of General Psychiatry	USA	106	34.6 (9.0)	Male: 70%	European Descent: 76%	NR	Participants were cocaine users	Yes
Pollack, 2002	Journal of Substance Abuse Treatment	USA	23	41.0 (NR)	Men: 44%	European Descent: 78%	Illicit	NA	Yes
Preston, 2002	Drug and Alcohol Dependence	USA	110	37.6 (NR)	Male: 69%	African-American: 39%	NR	NA	No
Preston, 2000	Archives of General Psychiatry	USA	120	37.7 (NR)	Male: 68%	European Descent: 58%	Illicit	NA	No
Rounsaville, 1983	Archives of General Psychiatry	USA	72	NR	Male: 61%	European Descent: 58%	NR	Participants with a psychiatric disorder or personality disorder	No
Rowan-Szal, 1997	Journal of Maintenance in the Addictions	USA	46	38 / (25–60)	Male: 91%	Mexican American: 58%, European Descent: 37%	Illicit	NA	No
Salehi, 2018	Shiraz E-Medical Journal	Iran	50	36.0 (NR)	Male: 92%	NR	Illicit	NA	Yes
Scherbaum, 2005	European Addiction Research	Germany	73	30 (6) / (19–41)	Male: 73%	German: 96%	NR	NA	Yes
Schottenfeld, 2005	American Journal of Psychiatry	USA	163	36.2 (6.3)	Male: 66%	European Descent: 52%	Illicit	NA	Yes
Schwartz, 2012	Addiction	USA	244	43.2 (8.0)	Male: 70%	African American: 77%	NR	NA	No
Shi, 2020	Substance Abuse	USA	20	40.5 (12.2)	Male: 60%	European Descent: 100%	NR	NA	Yes
Silverman, 2004	Journal of Consulting and Clinical Psychology	USA	78	39.1 (NR)	Male: 55%	African American: 69%	NR	NA	Yes

(Continued)

Table 1. (Continued)

First Author, Year	Journal	Country	No. of Participants (Randomized)	Age of all Participants (years), (mean (SD) and/or range)	Sex/Gender (men/male ((%)))	Majority Ethnicity/Race (%)	Type of Opioid Use	Comorbidities or Unique Patient Characteristics	DSM or ICD Diagnosis
Stein, 2015	Drug and Alcohol Dependence	USA	49	41.1 (11.3)	Male: 65%	European Descent: 86%	NR	NA	No
Sullivan, 2006	Clinical Infectious Diseases	USA	16	47.2 (8.5)	Male: 94%	African American: 44%	Illicit	Participants were HIV-positive	Yes
Tetraut, 2012	Journal of Substance Abuse Treatment	USA	47	46.9 (8.0)	Male: 83%	European Descent: 57%	Illicit	Participants were HIV-positive	Yes
Tuten, 2012	The American Journal of Drug and Alcohol Abuse	USA	143	30.0 (5.2)	Men: 0%	African American: 71%	Illicit	Participants were pregnant	Yes
Woody, 1995	American Journal of Psychiatry	USA	123	41 (7.0)	Men: 60%	African American: 57%	NR	Participants with mid to high levels of psychiatric symptoms.	No
Woody, 1987	American Journal of Psychiatry	USA	120	NR	Male: 100%	NR	NR	Participants were male veterans	No
Yaghubi, 2017	Addiction and Health	Iran	60	30.2 (NR)	Men: 100%	NR	NR	NA	Yes

\*Poor physical and/or mental health as defined by at least 13 symptoms on the Opiate Treatment Index Health Symptoms Scale or at least 60 points (standardized T-score) on the Global Severity Index of the Symptom Check-List (SCL-90-R).

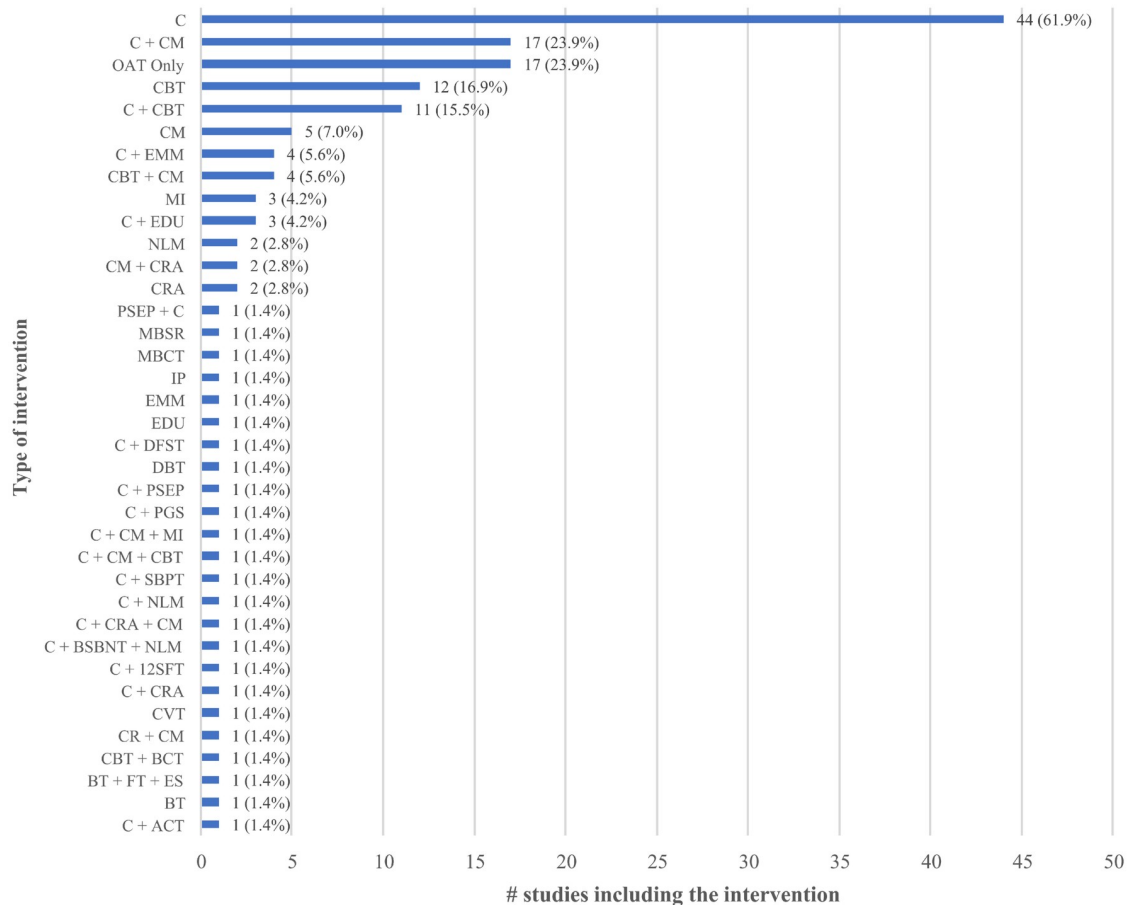
NA = Not applicable; NR = Not reported.

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9.7%) [42, 43, 48, 50, 59, 61, 105], Iran (n = 5, 6.9%) [41, 45, 96, 106, 107], Germany (n = 3, 4.2%) [62, 72, 81], the United Kingdom (n = 1, 1.4%) [40], Australia (n = 1, 1.4%) [91], Scotland (n = 1, 1.4%) [109], and Malaysia (n = 1, 1.4%) [60]. Most trials were funded by government or not-for-profit organization grants (n = 64, 88.9%) [39–44, 47–53, 55–59, 61, 62, 64–90, 92–99, 101–104, 106–110], and 11.1% (n = 8) of studies did not report a funding source [45, 46, 54, 60, 63, 91, 100, 107]. Most studies delivered interventions in the community (n = 60, 83.3%) [40–43, 45–50, 52, 54–65, 68–71, 73–80, 82, 83, 85, 86, 88–93, 95, 96, 98–111], with few studies providing interventions at a hospital (n = 4, 5.6%) [53, 72, 87, 97], a research clinic (n = 3, 4.2%) [66, 67, 81], an individual's own home (n = 2, 2.8%) [51, 84], or a Veterans' Affairs clinic (n = 1, 1.4%) [94]. The remaining studies did not report the environment in which the intervention was delivered (n = 2, 2.8%) [39, 44]. Four studies (5.6%) [41, 96, 106, 107] were published in journals that were open access but were not listed in the directory of open access journals, and were associated with characteristics of predatory journals (e.g., low fees for open access publications, spelling errors on journal websites).

## Interventions compared

Fig 2 presents the extent to which different psychosocial interventions were assessed across the set of included studies; a total of 35 different treatments among 150 study arms were eligible among the 72 included studies. The majority of studies included two eligible arms (n = 67, 93.1%) [39, 41–48, 50–89, 91, 93, 95–110], while a few studies included three (n = 4, 5.6%) [40, 90, 92, 94] or four (n = 1, 1.4%) [49] eligible arms. In line with our inclusion criteria, all eligible study arms included OAT. The most commonly reported psychosocial interventions among study arms used in addition to OAT were counselling plus CM (n = 17/150 arms, 11.3%) [49,



**Fig 2. Type of psychosocial interventions.** The number and type of different psychosocial interventions that were assessed across the set of included studies is presented.

<https://doi.org/10.1371/journal.pone.0244401.g002>

57, 58, 65, 67, 73, 75, 77, 78, 80, 81, 83, 85, 98, 101, 104, 108] and counselling plus CBT ( $n = 11/150$  arms, 7.3%) [43, 47, 49, 51, 52, 76, 86, 91, 92, 102, 107], while the most common control groups were counselling in addition to OAT ( $n = 44/72$  control groups, 62.5%) [40, 42, 46, 47, 49, 51–54, 56, 60, 63, 65, 67, 70, 72, 73, 75, 78, 80, 81, 83–93, 95, 97, 98, 101–104, 107], OAT-only ( $n = 17/74$  control groups, 23.0%) [41, 43, 45, 48, 50, 55, 57–59, 61, 94, 96, 100, 105, 106, 109]. Less common intervention characteristics were found in two studies (2.8%) that delivered a telephone-based intervention [51, 102], one study that recruited couples (1.4%) [99], and one study that randomized community pharmacies and had pharmacists deliver motivational interviewing (1.4%) [109]. Two studies (2.8%) delivered interventions through a stepped care model (see S1 Data) [69, 104].

### Study populations

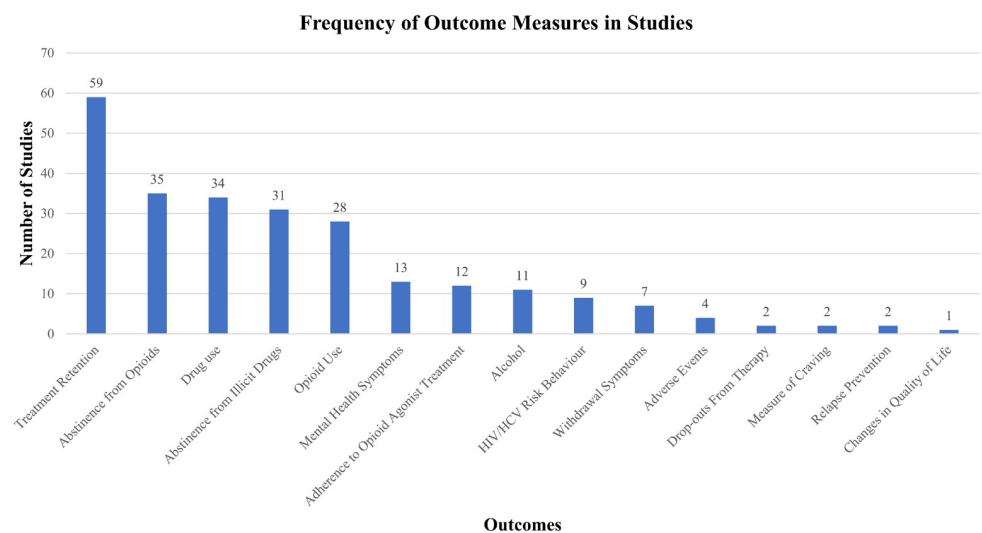
The majority of studies were comprised of more men than women (median = 69% male) [39–50, 52–54, 56–60, 62–64, 66, 67, 69–75, 78, 81–83, 85–90, 92–97, 100–110, 112], with 24 studies (32.3%) having a sample comprising more than 75% males [40–43, 45, 48, 50, 53, 54, 59, 60, 62, 70, 85, 92, 94–97, 100–102, 106, 107]. The median of mean participant ages was 37.3 years (range of mean age from 26.2 to 51.2 years). Approximately half of all studies (51.4%) reported

a focus on individuals using drugs intravenously [39, 42, 43, 48, 51–57, 59, 61–63, 65–68, 70, 73–75, 78, 80–89, 91, 94, 99, 101, 104, 108]. The duration of opioid use was inconsistently reported in studies, with reporting formats including age first using opioids, mean use of opioids in the past year, use of opioids in the past week, self-reported use in the past year, among other formats. Overall, 53 of 72 studies (73.6%) included individuals who were receiving methadone [39–43, 45–48, 50, 51, 55, 57–59, 61–63, 65, 67, 69, 71, 72, 75, 77, 78, 80, 83–86, 88–107, 109], while the remainder included individuals who were receiving buprenorphine/naloxone (n = 13, 18.1%) [44, 49, 52–54, 56, 60, 64, 66, 68, 70, 74, 82, 108], buprenorphine (n = 4, 5.6%) [76, 81, 87, 110], levacetylmethadol (LAAM; n = 2, 2.7%) [73, 79].

A subset of studies focused on sub-populations of individuals receiving OAT that (a) had an additional substance use condition [n = 6, 8.3%; these included cocaine use (n = 4, 5.6%) [67, 71, 76, 80], moderate to heavy alcohol use (n = 1, 1.4%) [39], or sedative/hypnotic dependence (n = 1, 1.4%) [85], (b) had a psychiatric disorder or prominent symptoms associated with a psychiatric disorder [n = 5, 6.9%, including a personality disorder (n = 2, 2.8%) [68, 79], personality or psychiatric disorder (n = 1, 1.4%) [95], depression (n = 1, 1.4%) [45], or mid- to high level psychiatric symptoms (n = 1, 1.4%) [93], (c) were pregnant women (n = 3, 4.2%) [55, 91, 98], (d) were veterans (n = 2, 2.8%) [92, 94], (e) were positive for HIV (n = 2, 2.8%) [54, 70], (f) had chronic low back pain (n = 1, 1.4%) [103] or (g) were described as being in poor mental or physical health based on a predetermined cutoff on the Opiate Treatment Index Health Symptoms Scale of the Global Severity Index of the Symptom Check-list (n = 1, 1.4%) [62]. One study only recruited individuals that had “failed to respond to the standard course of treatment” [46].

## Outcomes reported

Fig 3 presents the extent to which the outcomes of a priori interest were reported for each eligible treatment arm across the set of included studies. The most commonly reported outcome measures were treatment retention (81.9% of studies) [40, 42–44, 46–60, 64–66, 68–83, 86, 87, 89–91, 93, 95–99, 101–105, 107–110], abstinence from opioids (48.6%) [40, 42–44, 47–49, 51–56, 59, 60, 64, 65, 69, 71, 73–76, 78–80, 82, 83, 86–88, 94, 103, 105, 110], drug use (47.2%) [39,



**Fig 3. Outcomes reported in included studies.** The extent to which the outcomes of a priori interest were reported for each eligible treatment arm across the set of included studies are presented.

<https://doi.org/10.1371/journal.pone.0244401.g003>



42, 46, 49, 53, 58, 63, 64, 68, 71, 72, 75, 77, 79–82, 84, 85, 87–89, 91–95, 97–99, 101, 104, 108, 109], abstinence from illicit drugs (43.1%) [51–55, 64–67, 69, 71, 73–83, 85, 86, 90, 94, 100, 102, 107, 108], and opioid use [38.8%; including urinalysis (23.6%) [44, 49, 58, 61, 63, 65, 70–72, 79, 87, 89, 93, 94, 98, 99, 101, 104, 106] and self-reported use (15.3%)] [42, 51–53, 59, 78, 83, 84, 92, 96, 109], respectively. Aside from these five outcomes, all others, including mental health symptoms [40, 42, 43, 45, 68, 71, 73, 76, 77, 88, 92, 95, 97], alcohol use [42, 43, 58, 80–83, 88, 92, 95, 104], adherence to OAT [42, 43, 49, 53, 54, 61, 72, 86, 102, 110], HIV/HCV risk behavior [54, 57, 60, 61, 67, 88, 89, 91, 105], withdrawal symptoms [40, 49, 65, 73, 86, 87, 96], adverse events [49, 58, 75, 102], measure of craving [49, 83], relapse prevention [41, 106], drop-outs from therapy [46, 95], and quality of life [62] were reported in fewer than 15 studies (minimum = 1 study, maximum = 13 studies) (see [S6 Text](#)). In addition to sparse reporting of many of the outcomes of interest, considerable heterogeneity was identified in terms of how outcomes were defined and formatted for reporting (see [S8 through S24 Texts](#)). Studies also varied in follow-up timepoints with as few as four weeks [51, 76] and as many as 64 months of follow-up [79]. However, the majority of follow-up time points were 12 or 24 weeks (median = 24 weeks, interquartile range = 13).

### Risk of bias of the included evidence

Evaluations using the Cochrane RoB tool identified several limitations of the evidence base. A total of 58 studies (80.6%) [39, 41, 42, 44, 45, 47–49, 51, 53–56, 59, 60, 62–64, 66–74, 76–81, 84–102, 104–106, 109, 110] failed to provide details of the methods used for concealment of randomization allocation resulting in an unclear RoB for this item. When comparing published reports to registered protocols (where available) and methods sections, there was a high or unclear RoB for selective outcome reporting in 83.3% (n = 60) [40, 42–44, 46–51, 53–61, 63–84, 86–99, 101, 107–110] of trials for at least one critical outcome reviewed. Objective measures were used for all studies that measured treatment retention (n = 59/59, 100%) [40, 42–44, 46–60, 64–66, 68–83, 86, 87, 89–91, 93, 95–99, 101–105, 107–110], and most that measured opioid use (n = 46/51, 90.2%) [42–44, 47–49, 51–56, 58–61, 63–65, 69–76, 78–80, 82, 83, 86–89, 93, 94, 98, 99, 101, 103–105, 107, 110] and adherence to OAT (n = 10/12, 83.3%) [42, 43, 48–50, 53, 54, 61, 72, 102, 110], suggesting a low risk of detection bias for these outcomes. Of the four studies measuring adverse events, only one had a low risk of detection bias (n = 1/4, 25.0%) [58]. Given the nature of psychological interventions, however, all included studies (100.0%) [39–110] had a high risk of bias due to the inability to blind participants and clinicians to the delivery of psychological interventions. See [S7 Text](#) for a study-by-study account of the evaluations of RoB.

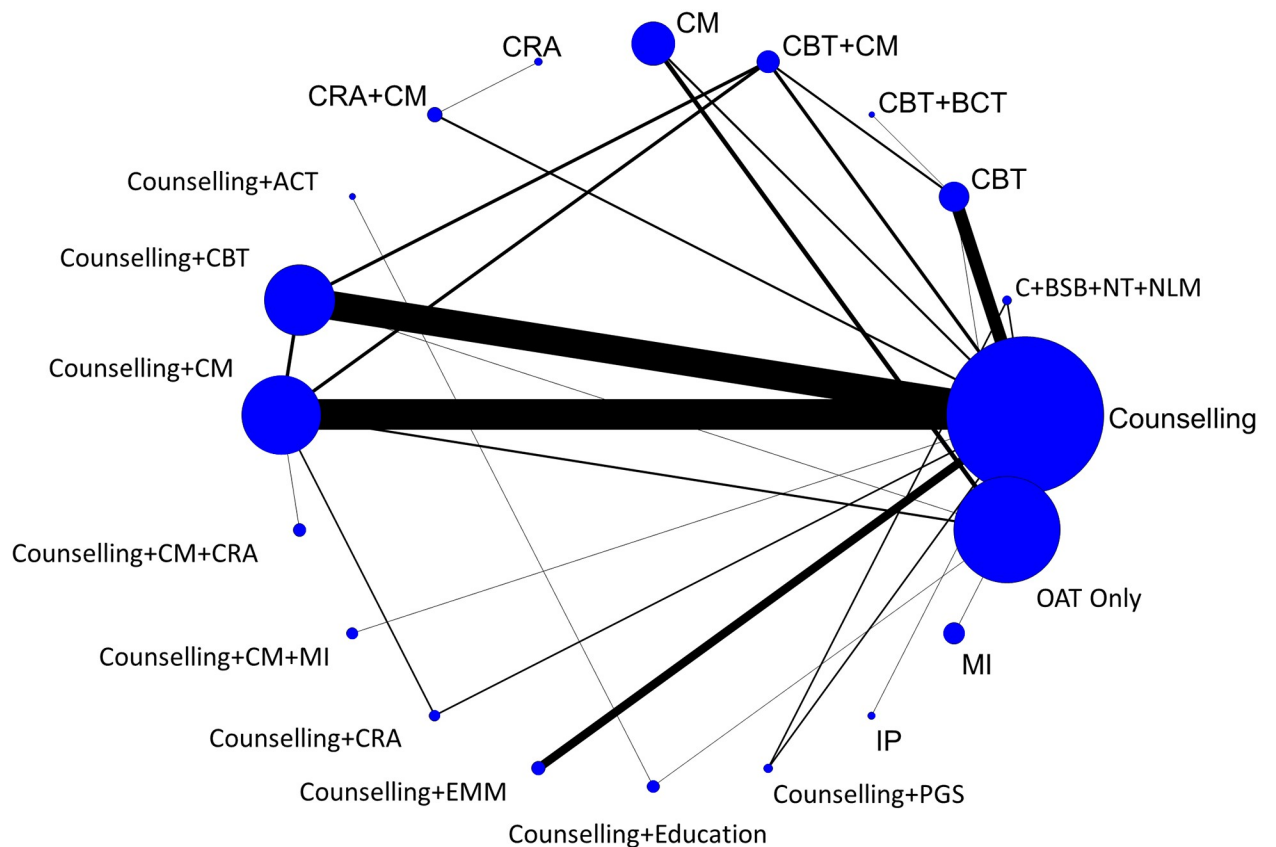
### Syntheses for primary outcomes

Following inspection of the availability of outcomes across studies, including both outcome type (e.g., ‘opioid use’, ‘opioid abstinence’, ‘retention’) and approach to measurement (e.g., numbers of days of abstinence versus abstinence beyond 90 days; number of therapy sessions attended versus number of individuals attending 80% or more of sessions); participant population characteristics and study methods, NMA was unlikely to produce reliable findings for one co-primary outcome (opioid use, including opioid abstinence) and all secondary outcomes. Only treatment retention, measured as a dichotomous endpoint, was analyzed using NMA.

**Findings, treatment retention.** Fifty-nine studies reported treatment retention data [40, 42–44, 46–60, 64–66, 68–83, 86, 87, 89–91, 93, 95–99, 101–105, 107–110]. Forty-eight of these studies, representing data from 5,404 participants and 20 unique interventions, were included in an NMA using the most universally reported format of retention data, which was the

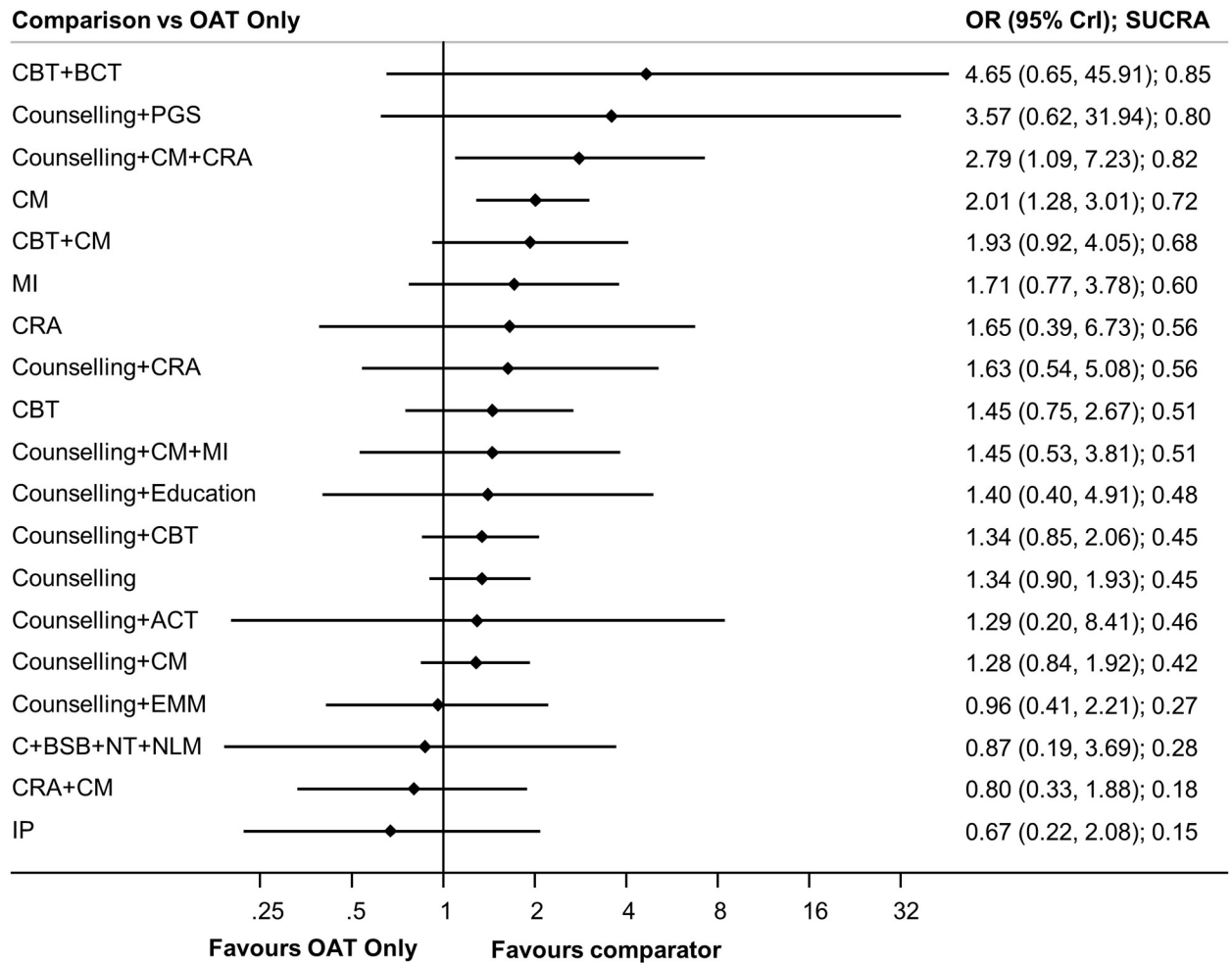
number of individuals retained in treatment at the study's latest follow-up time [40, 42–44, 46–60, 64–66, 69–75, 79–83, 86, 87, 90, 91, 95, 96, 99, 102–105, 107–109]. In addition to the 48 included studies, one additional study was eligible for inclusion in the NMA but was disconnected from the evidence network due to the interventions not being tested in any other studies (i.e., counselling plus education versus counselling plus ACT); its findings are reported descriptively in S8 Text [44]. Fig 4 presents a network diagram summarizing the available evidence used for the NMA. The primary analysis was based upon an unadjusted random effects NMA model, which fit the data well based upon assessment of model fit statistics (see S27 Text for numeric details, including evaluation of the consistency assumption and a comparison adjusted funnel plot).

CBT plus behavioural couples therapy (one study, 21 participants) was the highest ranked treatment based on a SUCRA value of 0.85. The next highest ranked interventions were counselling plus CM plus community reinforcement approach (0.82; one study, 92 participants), counselling plus personal goal setting (0.80; one study, 83 participants), CM (0.88; five studies, 414 participants), and CBT plus CM (0.63; one study, 94 participants). While SUCRA values provide insight as to differential rates of retention between psychosocial interventions, pairwise comparisons from NMA (Fig 5) suggest that counselling plus CM plus community reinforcement approach (OR 2.79, 95% CrI 1.09–7.23) and CM (OR 2.01, 95% CrI 1.28–3.01) each resulted in significantly greater treatment retention as compared to OAT-only. Statistically



**Fig 4. Network diagram of treatment retention.** The evidence network of the available studies and interventions for treatment retention as a binary outcome is shown. Joining lines denote treatment comparisons where one or more trials were available. Nodes are proportionally sized to reflect the numbers of patients studied with each intervention. Edge width reflects the number of RCTs for each comparison.

<https://doi.org/10.1371/journal.pone.0244401.g004>



**Fig 5. Forest plots of treatment retention.** Forest plots of psychosocial treatments versus the reference group, OAT only, is presented.

<https://doi.org/10.1371/journal.pone.0244401.g005>

significant differences were also found favouring counselling plus CM plus community reinforcement approach (OR 3.46, 95% CrI 1.05–11.23) and CM (OR 2.50, 95% CrI 1.00–6.30) as compared to CM plus community reinforcement approach, and when counselling plus CM plus community reinforcement approach (OR 4.19, 95% CrI 1.03–17.19) was compared to interpersonal psychotherapy. Amongst all other pairwise comparisons, no statistically significant differences were identified (see league table provided in [S28 Text](#)).

Secondary analyses involving NMA-based univariate meta-regression analyses that adjusted for cross-study variability in control group event rates, average age, sex (% males), and follow-up duration (number of weeks of follow-up per study) results remained similar to those observed in the unadjusted analysis (see [S27 Text](#)). Assessment of the comparison adjusted funnel plot identified no signs of publication bias (see [S27 Text](#)). The ten studies [[76–78, 89, 93, 97, 98, 101, 110, 113](#)] which reported a different format for treatment retention and the one study [[44](#)] that was disconnected from the NMA are described in [S8 Text](#).

**Findings, opioid abstinence.** The co-primary outcome of opioid use based on urinalysis was reported as both (1) abstinence from opioids and (2) opioid use, based on the description that authors provided of the outcome being opioid abstinence or use. A meta-analysis was not pursued for this outcome due to extensive heterogeneity in reporting formats; data are detailed next.

Thirty-five studies (48.6%) assessed abstinence from opioids through urinalysis [40, 42–44, 47–49, 51–56, 59, 60, 64, 65, 69, 71, 73–76, 78–80, 82, 83, 86–88, 94, 103, 105, 110]. Most studies (29/35, 82.9%) [40, 42, 43, 47–49, 51–56, 59, 60, 64, 65, 69, 73, 75, 78, 80, 83, 86–88, 94, 103, 105] compared a counselling [51, 53, 60, 65, 69, 73, 75, 76, 80, 86] or OAT- only [43, 48, 55, 59, 94, 105, 110] control group to a psychosocial intervention. Reporting formats regarding this outcome were heterogeneous and included the following: mean percentage of negative urinalyses for opioids through the duration of the study ( $n = 11$ ) [48, 51, 53, 64, 69, 73, 75, 76, 80, 86, 110], mean maximum number of consecutive urine samples abstinent from opioids ( $n = 3$ ) [42, 71, 103], and consecutive urine samples abstinent from opioids ( $n = 2$ ) [87, 94], amongst other formats (see [S9 Text](#) for details). Thirty-three studies [40, 42, 43, 47–49, 51–56, 59, 60, 64, 65, 69, 71, 73–76, 78, 80, 82, 83, 86–88, 94, 103, 105, 110] included statistical significance results (i.e.,  $p$ -values). Among these 33 studies, the majority (72.7%) found no significant difference between the treatment and control groups ( $n = 24/33$ ) [40, 42, 49, 51–56, 59, 65, 69, 73, 74, 76, 78, 80, 82, 83, 86, 88, 103, 105, 110]. No patterns for interventions that consistently resulted in significant or non-significant findings as compared to control groups were found. Findings did not substantively differ due to the control group (see [S9 Text](#)).

**Findings, opioid use.** Seventeen studies (23.9%) [44, 49, 58, 61, 63, 70–72, 79, 87, 89, 93, 94, 98, 99, 101, 104] assessed opioid use through urinalysis, while an additional 11 studies [42, 51–53, 59, 78, 83, 84, 92, 96, 109] assessed opioid use through self-report methods only (see “self-reported opioid use” under secondary outcomes). Formats of reporting the use of opioids through urinalysis included the mean proportion of urine samples positive for opioids ( $n = 11$ ) [49, 58, 61, 63, 71, 72, 87, 89, 94, 98, 101], the percent and associated number of urinalyses positive for opioids ( $n = 3$ ) [44, 70, 104], and the number of participants with a positive urinalysis at final timepoint ( $n = 2$ ) [79, 93], among other formats (see [S10 Text](#) for details). Of the 17 studies reporting opioid use based on urinalysis, 11 (64.7%) [44, 49, 58, 63, 70–72, 93, 98, 101, 104] found no statistically significant difference between the treatment and control conditions for opioid use. The six remaining studies (35.3%) [61, 79, 87, 89, 94, 99] reported a significantly greater reduction in opioid use for the intervention group as compared to the control group and included significant improvements after receiving dialectical behaviour therapy [79], CBT [87], CBT plus behavioural couples therapy [99], node link mapping [89], behavioural therapy plus family therapy plus employment services [114], and enhanced medical management [115]. A non-significant difference was consistently found when intervention groups were compared to counselling control groups or active control groups; however, two [61, 94] of three studies [58, 61, 94] (66.7%) that compared a psychological intervention to OAT-only significantly favoured the intervention group (see [S10 Text](#)).

## Syntheses for secondary outcomes

Details of all secondary outcomes are presented next. Outcomes are ordered from those reported in most to the fewest studies.

**Findings, drug use.** Thirty-four studies (47.2%) [39, 42, 46, 49, 53, 58, 63, 64, 68, 71, 72, 75, 77, 79–82, 84, 85, 87–89, 91–95, 97–99, 101, 104, 108, 109] assessed the use of illicit drugs (as described by the study authors) either through urinalysis ( $n = 18/34$ , 52.9%) [53, 58, 63, 71, 72, 79, 80, 85, 87, 89, 93–95, 97, 98, 101, 104, 109] or through self-report measures ( $n = 16/34$ , 47.0%) [39, 42, 46, 49, 64, 68, 75, 77, 81, 82, 84, 88, 91, 92, 99, 108]. Most studies ( $n = 21/34$ , 61.8%) [42, 46, 49, 53, 58, 63, 64, 72, 75, 80, 81, 84, 85, 87–89, 91–95, 97, 98, 101, 104, 109] were designed with a counselling [53, 63, 72, 80, 85, 87, 89, 93–95, 97, 98, 101, 104] or OAT-only [58, 94, 109] control group. Reporting formats were heterogeneous and included addiction severity index ( $n = 14$ ) [39, 42, 46, 49, 64, 75, 77, 81, 82, 88, 92, 99, 108, 113], the mean percent of

urinalyses positive for cocaine ( $n = 5$ ) [58, 63, 72, 89, 98], and self-reported use of cocaine in the past month ( $n = 2$ ) [84, 91], among other formats (see S11 and S12 Texts for details of the specific drugs measured and detailed findings). Thirty-one studies reported only p-values associated with statistical tests to inform treatment comparisons [39, 42, 46, 49, 53, 58, 63, 64, 68, 71, 72, 75, 77, 79, 81, 82, 84, 88, 89, 91–95, 97–99, 101, 104, 108, 109] and the majority of these studies found no significant differences between treatment and control groups for drug use ( $n = 23/31$ , 74.2%) [39, 42, 46, 49, 53, 58, 63, 64, 68, 75, 77, 79, 81, 82, 89, 91, 92, 94, 95, 97, 98, 108, 109]. The remaining eight studies [71, 72, 84, 88, 93, 99, 101, 104] reported a statistically significant benefit of the intervention group as compared to the control condition ( $n = 8/31$ , 25.8%), with half (50.0%) [71, 88, 101, 104] of the significant intervention groups including a rewards-based component (i.e., CM or community reinforcement approach), while the remaining intervention groups reporting substantive improvements included counselling and psychoanalytic supportive-expressive psychotherapy, CBT, CBT plus behavioural couples therapy, and counselling plus skills-based parental training (see S11 and S12 Texts).

**Findings, abstinence from illicit drugs.** Thirty-one studies (43.1%) assessed abstinence from illicit drugs through urinalysis ( $n = 30/30$ , 100.0%) [51–55, 64–67, 69, 71, 73–83, 85, 86, 90, 94, 100, 102, 107, 108, 110]. Most studies ( $n = 24/31$ , 77.4%) [51–55, 64–66, 69, 73, 75, 77, 78, 80, 81, 83, 85, 86, 90, 94, 100, 102, 107] compared a counselling [51–54, 64–66, 69, 73, 75, 77, 78, 80, 81, 83, 85, 86, 90, 102, 107] or OAT-only control group [55, 94, 100, 110] to a psychosocial intervention, while the remaining studies compared to an active control group such as comprehensive validation therapy [79]. Reporting formats were highly heterogeneous and included the following: mean longest number of consecutive weeks abstinent from drugs ( $n = 8$ ) [52, 64–66, 74, 75, 81, 85], mean weeks of continuous abstinence ( $n = 6$ ) [53, 54, 76, 78, 79, 83], and mean percent of urinalyses negative from drugs ( $n = 6$ ) [67, 69, 77, 80, 82, 110], among other formats (see S13 Text for details). Twenty-nine studies reported p-values associated with statistical tests to inform treatment comparisons [51–55, 64–66, 69, 71, 73–78, 80–83, 85, 86, 90, 94, 100, 102, 107, 108, 110], where findings were mixed, with 51.7% ( $n = 15/29$ ) [51–55, 71, 74, 76, 78, 81, 82, 86, 90, 94, 102] of studies finding no statistically significant difference between groups for abstinence from illicit drugs and 50.0% ( $n = 14/28$ ) [64–66, 69, 73, 75, 77, 80, 83, 85, 100, 107, 108, 110] finding a significantly greater benefit among the intervention group as compared to the control group. Twelve of 14 studies with statistically significant improvements as compared to the control group included CM as an adjunct to OAT (either alone, with counselling, or with community reinforcement approach), and 61.1% ( $n = 11/18$ ) of studies that included a CM group reported significantly greater abstinence from illicit drugs as compared to an active or inactive control group. Findings were generally mixed irrespective of the type of control group. (see S13 Text).

### Additional secondary outcomes

The remaining secondary outcomes, including mental health symptoms [40, 42, 43, 45, 68, 71, 73, 76, 77, 88, 92, 95, 97], alcohol use [42, 43, 58, 80–83, 88, 92, 95, 104], adherence to OAT [42, 43, 48–50, 53, 54, 61, 72, 86, 102, 110], self-reported opioid use [42, 51–53, 59, 78, 83, 84, 92, 96, 109], HIV/HCV risk behavior [54, 57, 60, 61, 67, 88, 89, 91, 105], withdrawal symptoms [40, 49, 65, 73, 86, 87, 96], adverse events [49, 58, 75, 102], drop-outs from therapy [46, 95], measures of craving [49, 83], relapse [41, 106], and quality of life [62] were reported by fewer than 15 studies. Meta-analyses were not possible due to inconsistent reporting formats and the low frequency of studies reporting these outcomes. Table 2 provides an abbreviated summary of findings for each outcome for readers; we have also developed more detailed narrative summaries for readers (S29 Text), and study-by-study findings including intervention and control



Table 2. Overview of findings for secondary outcomes with 15 or fewer studies.

Outcome	# studies reporting	Treatments represented in 1 or more RCTs	Diversity of comparators?	Assessments differed between studies?	Studies with p-values only?	Synopsis of Clinical Findings
Mental health symptoms	13 [40, 42, 43, 45, 68, 71, 73, 76, 77, 88, 92, 95, 97] (n = 985)	C; CBT; CM; C + PSEP; C + CBT; C + CM; CM + CBT; CRA; IPT; C + CBT + CM; OAT only; MBCT; C + 12SFT; C + DFST; C + CM + MI; PGS; C + BSBNT + NLM	X	X	X	Of 13 studies that measured mental health symptoms, 9 reported on depression [71, 73, 76, 77, 92, 95, 111], 1 reported on distress [113], and 3 reported on general psychological functioning and psychiatric symptoms [43, 116, 117]. In these studies, only 2, both of which measured symptoms of depression, found a significant improvement in symptoms for CBT (alone or with counselling) [92, 111] and C+PSEP [92] as compared to C.
Alcohol use	11 [42, 43, 58, 80–83, 88, 92, 95, 104] (n = 1149)	C; CBT; CRA; IPT; C + CBT; C + CM; CBT + CM; C + PSEP; C + CM + MI; OAT only	X	X	X	Of 11 studies that measured alcohol use in terms of abstinence or alcohol-related addiction severity index, only 1 study reported a difference between groups. The study compared C + CBT and C + PSEP with C, finding reduced alcohol in both groups compared to C [92].
Adherence to OAT	12 [42, 43, 48–50, 53, 54, 61, 72, 86, 102, 110] (n = 1840)	C; CM; CBT; C + CBT; C + CM; CBT + CM; C + CM + MI; EMM; C + EMM; CM + EMM; OAT only	X	X		Of 12 studies that measured adherence to OAT, 2 studies reported differences [50, 118]. C [50] and CM [118] resulted in significantly greater adherence to OAT than OAT only control groups.
Self-reported opioid use	11 [42, 51–53, 59, 78, 83, 84, 92, 96, 109] (n = 1542)	C; CM; C + PSEP; C + CBT; MI; C + SBPT; C + CM + MI; C + EMM; OAT only	X	X	X	Of 11 studies that measured self-reported opioid use, 3 studies reported differences [78, 92, 96]. CM (with counselling) [78], CBT (alone or with counselling) [92, 96], and skills-based parental training [92] resulted in significantly less self-reported opioid use as compared to the control group.
HIV/HCV risk behavior	9 [54, 57, 60, 61, 67, 88, 89, 91, 105] (n = 1085)	C; C + CBT; C + CM; NLM; OAT only; EMM; CRA; C + EMM; C + Ed	X	X	X	In 3 studies evaluating risk behavior related to drugs [67, 89, 119], all found no important differences between groups (C vs CBT, 1 study; C vs C+CM, 1 study; C vs NLM, 1 study). In 2 studies evaluating risk behavior related to sex 1 found increased reduction in risky behavior with C +CM compared to C. In 6 studies evaluating risk behavior related to drugs and sex, reductions in risky behavior were noted by one study of EMM vs C and one study of C + EMM vs C.

(Continued)



Table 2. (Continued)

Outcome	# studies reporting	Treatments represented in 1 or more RCTs	Diversity of comparators?	Assessments differed between studies?	Studies with p-values only?	Synopsis of Clinical Findings
Withdrawal symptoms	7 [40, 49, 65, 73, 86, 87, 96] (n = 677)	C; CBT; C + CM; C + CBT; CBT + CM; PGS; C + BSBNT + NLM; OAT only	X	X	X	No study reported the presence of important differences between comparators. Study comparisons involved C vs C+CM (2 studies) [65, 73]; OAT only vs CBT (1 study) <sup>96</sup> ; C + CBT vs C + CBT + CM (1 study) [76]; C vs C + CBT vs C+CM vs CBT +CM (1 study) <sup>49</sup> ; C vs CBT (1 study) [87]; C vs PGS vs C+BSBNT+NLM (1 study). <sup>40</sup>
Adverse events	4 [49, 58, 75, 102] (n = 539)	C; OAT; C+CBT; C+CM; CBT+CM	X	X		Formal comparisons were not reported. Authors concluded no substantive differences between intervention strategies in all studies [49, 58, 75, 102].
Dropout from psychotherapy	2 [46, 95] (n = 128)	C; CBT; IP	X			IPT was associated with fewer dropouts than C (1 study) <sup>95</sup> ; no differences between C and CBT were observed (1 study). <sup>46</sup>
Cravings	2 [49, 83] (n = 259)	C; C+CBT; C+CM; CM+CBT	X	X		There was insufficient evidence to identify important differences in cravings between C, C+CBT, C+CM and CBT+CM (1 study) [49]; or between C+CM (1 study) <sup>83</sup>
Relapse	2 [41, 106] (n = 152)	CBT; MBSR; OAT only	X	X		Individuals receiving CBT (1 study) <sup>41</sup> and MBSR (1 study) relapsed less frequently than those receiving OAT only. <sup>106</sup>
Quality of life	1 [62] (n = 455)	MI; C + Psych-ed	X			No difference between MI and C + Psych-Ed was found [62].

Brief summaries of findings for outcomes with information from fewer than fifteen studies are provided. Detailed synopses for each outcome are provided in Appendix S29 Text, with study-level data provided within Appendices S14–S24 Texts. Challenges to the performance of meta-analyses are also indicated for each outcome measure. Diversity of comparators was considered a barrier when disconnected networks of evidence were present and/or treatment comparisons were largely informed by single studies. Differences between studies in assessment related to variations in endpoint definition, measurement scales used and/or timing of measurement. Studies reporting only p-values associated with findings from between-group comparisons were noted. Based upon these considerations as well as others related to clinical heterogeneity of patient populations and study methods, certain outcomes were not considered amenable to meta-analyses that would be meaningful for end users.

KEY: BSBNT = brief social behavior and network therapy; C = counselling; CBT = cognitive behavioral therapy; CM = contingency management; CRA = community reinforcement approach; EDU = education; EMM = enhanced medical management; IPT = interpersonal psychotherapy; MI = motivational interviewing; NLM = node link mapping; OAT = opioid agonist therapy; PGS = personal goal setting; 12SFT = 12-step facilitation therapy.

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group details, follow-up time, and description of outcome measures are reported in S8 through S24 Texts.

### Specialty populations

While a priori sensitivity analyses were planned for specific populations (e.g., pregnant women, youths, incarcerated individuals) and treatment levels (e.g., individual, family, couples groups), none of these additional analyses could be performed as a consequence of sparse reporting of subgroup information.

Subgroups that were reported included individuals with problematic opioid use and a comorbid substance use condition, mental health condition, or chronic low back pain. Pregnant women, veterans, and individuals positive for HIV were also captured in studies. Very few statistically significant or substantive differences were found between intervention and control groups for specialty populations on any outcomes measured, and, unfortunately, few studies focused on specialty populations.

## Discussion

### Summary of findings

The opioid crisis remains of great concern and efforts to maximize the effectiveness of treatment for individuals with OUD are urgently needed. In this study we performed a systematic review that included 72 trials that compared psychosocial interventions among individuals receiving OAT, with the goal of conducting NMAs to establish a hierarchy of treatment strategies. Unfortunately, due to variability in outcomes assessed as well as the formats of evaluation and reporting, only one outcome (treatment retention) could be analyzed using NMA methods. Rewards-based interventions, specifically CM alone or in tandem with counselling or CRA, appeared most effective for treatment retention and were significantly more effective compared to OAT-only. SUCRA rankings for interventions were also generated, however, most psychosocial interventions were administered in a single study with few included patients. This limits the ability for robust conclusions to be drawn about the superiority of other psychosocial interventions. The co-primary outcome of interest, opioid use, including studies that reported this as opioid use or opioid abstinence as measured by urinalysis, could not be meta-analyzed given the considerable diversity in reporting formats that was encountered. The majority of included studies did not find a statistically significant benefit of adding psychosocial components to standard OAT for reducing opioid use.

As a consequence of considerable between-study variability in formats of outcome evaluation and reporting, findings from our a priori secondary outcomes of interest were primarily synthesized using a descriptive approach. The majority of outcomes we assessed, including other drug use, mental health symptoms, alcohol use, adherence to OAT, self-reported opioid use, HIV/HCV risk behavior, withdrawal symptoms, adverse events, dropouts from psychotherapy, measures of craving, and quality-of-life outcomes were associated with a lack of statistically significant differences between intervention groups. Relapse prevention, reported by just two studies, was one exception wherein an added benefit of psychosocial interventions (i.e., CBT or mindfulness-based stress reduction) was observed, in that fewer individuals relapsed compared to OAT-only.

### Findings in context

To our knowledge, this is the first systematic review of psychosocial interventions used as an adjunct to OAT to quantitatively combine available evidence for treatment retention. In 2016, a systematic review of psychosocial interventions used in conjunction with OAT included 27 studies that were qualitatively synthesized [25]. The authors of the review also identified variability in the delivery of interventions and study outcomes, and concluded that considerable gaps existed in the literature. In a narrative review that studied the role of behavioural interventions along with buprenorphine treatment, the authors described a need to enhance treatment retention given the high dropout rates found in studies [27]. The authors also described some benefit from behavioural interventions, specifically CM, and recommended its application within a stepped care model. Both aforementioned reviews supported the efficacy of providing psychosocial interventions in addition to OAT, while noting variability within studies,

and did not provide quantitative syntheses. One recent umbrella review focused on the management of OUD in a primary care setting [120]. One outcome of interest was treatment retention, whereby retention improved when counselling or contingency management was added to OAT, although the comparative effectiveness of psychosocial interventions was not tested in this review [120]. A Cochrane review of psychosocial interventions and OAT for opioid dependence was conducted in 2011 and included 28 RCTs [24]. Within, 22 studies that assessed treatment retention and were meta-analyzed in this review, no statistically significant differences were found when psychosocial interventions were incorporated into treatment. Our findings provide updated evidence upon which clinically relevant recommendations related to psychosocial interventions can be made. Importantly, our review also presents an overview of the limitations of the available evidence upon which future trials should strive to improve.

### Limitations

There are limitations of the current review that should be noted, and they relate to the study populations enrolled, RoB, the treatments compared, and the outcomes measured. First, with regard to study populations, in our efforts to seek out available data within key clinical subgroups, it became apparent that studies often excluded certain types of individuals (e.g., pregnant women, individuals with comorbid mental health concerns). Less than 10% of the included evidence base specifically recruited individuals with comorbid mental health conditions, and only one study was focused on individuals with chronic pain using prescription opioids [103]. There were also no eligible trials that aimed to study individuals who were incarcerated or youths. Many of these populations are susceptible to OUD and have been highlighted as having unique needs for treatment [121, 122]. Furthermore, the effectiveness of interventions among those with OUD has also been shown to differ by sex [123]. Within our set of included trials, study populations were predominantly composed of men, with almost a third comprising at least 75% males. Merely one study stratified all analyses by sex [77]; its findings highlighted unique results by sex and reported statistically significant benefits of psychosocial interventions used adjunctive to OAT specifically amongst women. The available evidence may not generalize well to individuals that would typically present in clinical settings [124]. Trials that include individuals with comorbid conditions are urgently needed to reliably compare psychosocial therapies in real world settings.

Second, the Cochrane RoB tool identified several limitations of the included studies. For the co-primary outcome of treatment retention, the RoB for the selective outcome reporting item was rated as unclear for 54% of studies due to a lack of trial registration which precluded the comparison of registered outcomes to published results. For 37% of studies which measured treatment retention, there was a high RoB, suggesting that selective outcome reporting occurred (e.g., changing the way that treatment retention was measured). Therefore, selective outcome reporting for this outcome cannot be ruled out and may impact the results of the NMA.

Third, regarding the interventions compared, components of psychosocial interventions (such as the community reinforcement approach, or CRA) differed between studies. For example, some CRA interventions incorporated modules for skills training (e.g., assertiveness skills, self-management skills), while others focused on engaging in non-drug related activities. Variability in frequency and duration of sessions and follow-up times were present amongst studies, as was variability in the implementation of interventions. In many included studies, details necessary for an intervention to be utilized in healthcare systems (e.g., frequency of reward provided) were absent. Inconsistencies in the implementation of interventions were present whereby the (1) content of similarly labelled interventions, (2) intensity of interventions, and (3) access to supplementary psychotherapy (e.g., group therapy), varied substantively between

studies. Next control groups were often labeled as “treatment as usual” or “usual care” and consisted of weekly counselling; however, the details of the counselling support were often not reported. Similarly, some studies reported that control groups had “access to all clinic services,” but did not report the specific services that were available. This complicates comparative analyses and the interpretation of our findings, given that the intended differences between control and experimental groups were not always clear.

Next, key challenges associated with the availability of outcome data limited our ability to perform meaningful meta-analyses. There were a limited number of studies that reported many outcomes, a diversity of outcome reporting formats, and a lack of follow-up assessments. While our review included a total of 71 studies, only one outcome measure was uniformly reported in more than half of trials. Additionally, for 10 of our a priori outcome measures, fewer than 15 trials assessed and reported data of any format. Further, in the case of outcomes that were reported more frequently (i.e., between 39% and 48% of studies), such as opioid use (including opioid abstinence), illicit drug use, and abstinence from illicit drugs, inconsistency in reporting definitions (e.g., variability in what was considered abstinence from all drugs) and formats (e.g., dichotomous data and continuous data) were present more often than not. There was a lack of consistency in the outcomes reported and how they were reported across trials of OUD interventions. The follow-up for most outcomes was also relatively short, with studies measuring outcomes at 12 or 24 weeks and often immediately after the psychosocial intervention had been delivered. This limits the ability to consider the long-term effectiveness of interventions. In the context of meta-analysis and in particular NMAs, such occurrences of sparse and heterogeneous data are limiting in the types of synthesis that can be pursued.

Lastly, our work did not consider the clinical significance of findings. For instance, some studies described notable differences in outcomes, such as the proportion of urine samples that were negative for a specific drug (e.g., control group: 28% versus intervention group: 44% of urinalyses negative for cocaine), but these differences did not reach statistical significance, which may have resulted in an underestimate of the impact of psychosocial interventions as compared to control groups. Some differences found within the set of included trials may be clinically important but did not meet the threshold for statistical significance perhaps because many of the studies were of limited sample size.

Future research in this area should be designed in consideration of the aforementioned limitations of the available evidence. Future reviews may wish to include articles that are published in any language to consider whether additional eligible studies can be included. In future primary studies, enrollment criteria should be designed in consideration of ways to capture populations that increase similarities with real-world clinical practice, including individuals with chronic pain and concurrent mental health conditions. Future psychosocial studies should adhere to the template for intervention description and replication (TIDieR) reporting guideline to encourage the complete reporting of intervention details that would allow for replication of methods and facilitate integration of effective interventions into clinical practice [125]. Core outcome sets represent a necessary and valuable addition to research in this area that would increase the comparability of future clinical trials and enhance the capability for cross-study syntheses by researchers in the realm of knowledge synthesis [126].

## Conclusions and policy implications

Integrating rewards-based interventions such as CM, in addition to OAT, for OUD appears to be more efficacious than OAT-only for improving treatment retention. The current evidence, however, is associated with reporting limitations, high heterogeneity, and a potentially high RoB. Clear directions for future research among people with OUD have been identified and

include conducting robustly designed RCTs that (1) include key outcomes measured consistently between studies, (2) include individuals with comorbid psychiatric and physical disorders, and (3) are adequately reported to allow for the application of effective interventions within clinical practice. Given the urgency of the opioid crisis, clinicians and healthcare centres aiming to improve the treatment of OUD can consider implementing CM in addition to OAT to increase retention in treatment.

## Supporting information

### **S1 Data.**

(XLSX)

### **S1 Text. Completed PRISMA for network meta-analyses checklist.**

(DOCX)

### **S2 Text. Literature search strategy.**

(DOCX)

### **S3 Text. A priori list of eligible interventions.**

(DOCX)

### **S4 Text. Additional details, statistical methods for NMA.**

(DOCX)

### **S5 Text. Protocol deviations.**

(DOCX)

### **S6 Text. Outcomes reported by study.**

(DOCX)

### **S7 Text. Risk of bias evaluations.**

(DOCX)

### **S8 Text. Overview of findings by study, treatment retention (not included in network meta-analyses).**

(DOCX)

### **S9 Text. Overview of findings by study, abstinence from opioids.**

(DOCX)

### **S10 Text. Overview of findings by study, opioid use—Urinalysis.**

(DOCX)

### **S11 Text. Overview of findings by study, drug use.**

(DOCX)

### **S12 Text. Overview of findings by study, self-reported illicit drug use.**

(DOCX)

### **S13 Text. Overview of findings by study, abstinence from illicit drugs.**

(DOCX)

### **S14 Text. Overview of findings by study, mental health.**

(DOCX)

### **S15 Text. Overview of findings by study, alcohol use.**

(DOCX)

**S16 Text. Overview of findings by study, adherence to OAT.**  
(DOCX)

**S17 Text. Overview of findings by study, self-reported opioid use.**  
(DOCX)

**S18 Text. Overview of findings by study, HIV/HCV-risk taking behaviours.**  
(DOCX)

**S19 Text. Overview of findings by study, withdrawal symptoms.**  
(DOCX)

**S20 Text. Overview of Findings by study, adverse events.**  
(DOCX)

**S21 Text. Overview of findings by study, dropouts from psychotherapy.**  
(DOCX)

**S22 Text. Overview of findings by study, cravings.**  
(DOCX)

**S23 Text. Overview of findings by study, relapse.**  
(DOCX)

**S24 Text. Overview of findings by study, quality of life.**  
(DOCX)

**S25 Text. Included studies.**  
(DOCX)

**S26 Text. Excluded studies from full text screening (with reasons for exclusion).**  
(DOCX)

**S27 Text. Treatment retention NMA—Model fit statistics and findings from sensitivity analyses.**  
(DOCX)

**S28 Text. League table: Unadjusted RE NMA, treatment retention.**  
(DOCX)

**S29 Text. Narrative summary of findings for secondary outcomes with data from 15 studies or fewer.**  
(DOCX)

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## References

1. Centers for Disease Control and Prevention. Vital signs: overdoses of prescription opioid pain relievers—United States, 1999–2008. *MMWR Morb Mortal Wkly Rep.* 2011; 60(43):1487–1492.
2. Centers for Disease Control and Prevention. Opioid Overdose. Understanding the epidemic. Atlanta, Centers for Disease Control and Prevention. 2018.
3. Donroe JH, Socias ME, Marshall BD. The deepening opioid crisis in North America: historical context and current solutions. *Current Addiction Reports.* 2018; 5(4):454–463.
4. Hedegaard H, Warner M, Miniño AM. Drug overdose deaths in the United States, 1999–2015. US Department of Health and Human Services, Centers for Disease Control and Prevention, National Center for Health Statistics; 2017.
5. Becker WC, Fiellin DA. When epidemics collide: coronavirus disease 2019 (COVID-19) and the opioid crisis. In: *American College of Physicians*; 2020.
6. Sun Y, Bao Y, Kosten T, Strang J, Shi J, Lu L. Editorial: Challenges to Opioid Use Disorders During COVID-19. *The American journal on addictions.* 2020; 29(3):174–175. <https://doi.org/10.1111/ajad.13031> PMID: 32281130
7. Special Advisory Committee on the Epidemic of Opioid Overdoses. Opioid-related harms in Canada. Public Health Agency of Canada. <https://health-infobase.canada.ca/substance-related-harms/opioids/>. Published 2020. Updated June 2020. Accessed June 17, 2020.
8. Special Advisory Committee on the Epidemic of Opioid Overdoses. National report: Apparent opioid-related deaths in Canada (January 2016 to September 2018). Public Health Agency of Canada. <https://infobase.phac-aspc.gc.ca/datalab/national-surveillance-opioid-mortality.html#citation>. Published 2019. Accessed May 1, 2019.
9. Centers for Disease Control and Prevention. Drug Overdose Deaths. <https://www.cdc.gov/drugoverdose/data/statedeaths.html>. Published 2020. Accessed June 17, 2020.

10. European Monitoring Centre for Drugs and Drug Addiction. Drug-related deaths and mortality in Europe: update from the EMCDDA expert network. [https://www.emcdda.europa.eu/system/files/publications/11485/20193286\\_TD0319444ENN\\_PDF.pdf](https://www.emcdda.europa.eu/system/files/publications/11485/20193286_TD0319444ENN_PDF.pdf). Published 2019. Accessed June 17, 2020.
11. United Nations office on Drugs and Crime. World Drug Report 2015. [http://www.unodc.org/documents/wdr2015/World\\_Drug\\_Report\\_2015.pdf](http://www.unodc.org/documents/wdr2015/World_Drug_Report_2015.pdf). Published 2015. Accessed July 5, 2018.
12. European Monitoring Centre for Drugs and Drug Addiction. European drug report 2017: trends and developments. Publications Office of the European Union. Published 2017. Accessed July 5, 2018.
13. European Monitoring Centre for Drugs and Drug Addiction. European drug report 2018: trends and developments. Publications Office of the European Union. Published 2018. Accessed July 5, 2018.
14. Dowell D, Haegerich TM, Chou R. CDC guideline for prescribing opioids for chronic pain—United States, 2016. *Jama*. 2016; 315(15):1624–1645. <https://doi.org/10.1001/jama.2016.1464> PMID: 26977696
15. Busse JW, Craigie S, Juurlink DN, et al. Guideline for opioid therapy and chronic noncancer pain. *Canadian Medical Association Journal*. 2017; 189(18):E659–E666. <https://doi.org/10.1503/cmaj.170363> PMID: 28483845
16. Bruneau J, Ahamad K, Goyer M-È, et al. Management of opioid use disorders: a national clinical practice guideline. *Canadian Medical Association Journal*. 2018; 190(9):E247. <https://doi.org/10.1503/cmaj.170958> PMID: 29507156
17. Kolodny A, Courtwright DT, Hwang CS, et al. The prescription opioid and heroin crisis: a public health approach to an epidemic of addiction. *Annu Rev Public Health*. 2015; 36:559–574. <https://doi.org/10.1146/annurev-publhealth-031914-122957> PMID: 25581144
18. Grande LA, Thompson EC, Au MA, Sawyer D, Baldwin L-M, Rosenblatt R. Problem Drug-related Behavior and Discontinuation of Opioids Following the Introduction of an Opioid Management Program. *J Am Board Fam Med*. 2016; 29(6):718–726. <https://doi.org/10.3122/jabfm.2016.06.160073> PMID: 28076255
19. Center for Disease Control and Prevention. Overview: Data & Trends: U.S. Statistics. HIV.gov. HIV Basics Web site. <https://www.hiv.gov/hiv-basics/overview/data-and-trends/statistics>. Published 2019. Accessed May 3, 2019.
20. Canadian Institute for Health Information. Prescribed Drug Spending in Canada, 2016: A Focus on Public Drug Programs. In: Canadian Institute for Health Information; 2016.
21. Altarum. Economic Toll of Opioid Crisis in U.S. Exceeded \$1 Trillion Since 2001. <https://altarum.org/news/economic-toll-opioid-crisis-us-exceeded-1-trillion-2001>. Published 2018. Accessed July 1, 2019.
22. Taha S. Best Practices across the Continuum of Care for Treatment of Opioid Use Disorder. Canadian Centre on Substance Use and Addiction. Published 2018. Accessed April 4, 2019.
23. British Columbia Centre on Substance U, Health BCMo. A Guideline for the Clinical Management of Opioid Use Disorder. In:2017.
24. Amato L, Minozzi S, Davoli M, Vecchi S. Psychosocial combined with agonist maintenance treatments versus agonist maintenance treatments alone for treatment of opioid dependence. *Cochrane Database Syst Rev*. 2011(10):CD004147. <https://doi.org/10.1002/14651858.CD004147.pub4> PMID: 21975742
25. Dugosh K, Abraham A, Seymour B, McLoyd K, Chalk M, Festinger D. A Systematic Review on the Use of Psychosocial Interventions in Conjunction With Medications for the Treatment of Opioid Addiction. *Journal of Addiction Medicine*. 2016; 10(2):93–103. <https://doi.org/10.1097/ADM.000000000000193> PMID: 26808307
26. Livingston JD, Adams E, Jordan M, MacMillan Z, Hering R. Primary Care Physicians' Views about Prescribing Methadone to Treat Opioid Use Disorder. *Subst Use Misuse*. 2017;1–10. <https://doi.org/10.1080/10826084.2017.1325376> PMID: 28853970
27. Carroll KM, Weiss RD. The role of behavioral interventions in buprenorphine maintenance treatment: a review. *American journal of psychiatry*. 2016; 174(8):738–747. <https://doi.org/10.1176/appi.ajp.2016.16070792> PMID: 27978771
28. Caldwell D, Ades A, Higgins J. Simultaneous comparison of multiple treatments: combining direct and indirect evidence. *BMJ*. 2005; 331(7521):897–900. <https://doi.org/10.1136/bmj.331.7521.897> PMID: 16223826
29. Salanti G. Indirect and mixed-treatment comparison, network, or multiple-treatments meta-analysis: many names, many benefits, many concerns for the next generation evidence synthesis tool. *Research synthesis methods*. 2012; 3(2):80–97. <https://doi.org/10.1002/jrsm.1037> PMID: 26062083

30. Catala-Lopez F, Tobias A, Cameron C, Moher D, Hutton B. Network meta-analysis for comparing treatment effects of multiple interventions: an introduction. *Rheumatology International*. 2014; 34(11):1489–1496. <https://doi.org/10.1007/s00296-014-2994-2> PMID: 24691560
31. Rice DB, Hutton B, Poulin P, et al. Evaluating comparative effectiveness of psychosocial interventions for persons receiving opioid agonist therapy for opioid use disorder: protocol for a systematic review. *BMJ Open*. 2018; 8(10):e023902. <https://doi.org/10.1136/bmjopen-2018-023902> PMID: 30341139
32. Hutton B, Salanti G, Caldwell D, et al. The PRISMA Extension Statement for Reporting of Systematic Reviews Incorporating Network Meta-Analyses of Healthcare Interventions: Checklist and Explanations. *Annals of Internal Medicine*. 2015; 162(11):777–784. <https://doi.org/10.7326/M14-2385> PMID: 26030634
33. Sampson M, McGowan J, Cogo E, Grimshaw J, Moher D, Lefebvre C. An evidence-based practice guideline for the peer review of electronic search strategies. *Journal of Clinical Epidemiology*. 2009; 62(9):944–952. <https://doi.org/10.1016/j.jclinepi.2008.10.012> PMID: 19230612
34. Khangura S, Konnyu K, Cushman R, Grimshaw J, Moher D. Evidence summaries: the evolution of a rapid review approach. *Syst Rev*. 2012; 1:10. <https://doi.org/10.1186/2046-4053-1-10> PMID: 22587960
35. Higgins J, Altman D, Gotzsche P, et al. The Cochrane Collaboration's tool for assessing risk of bias in randomised trials. *BMJ*. 2011; 343. <https://doi.org/10.1136/bmj.d5928> PMID: 22008217
36. Hróbjartsson A, Emanuelsson F, Skou Thomsen AS, Hilden J, Brorson S. Bias due to lack of patient blinding in clinical trials. A systematic review of trials randomizing patients to blind and nonblind sub-studies. *International journal of epidemiology*. 2014; 43(4):1272–1283. <https://doi.org/10.1093/ije/dyu115> PMID: 24881045
37. Chaimani A, Higgins JPT, Mavridis D, Spyridonos P, Salanti G. Graphical tools for network meta-analysis in STATA. *PloS One*. 2013; 8(10):e76654. <https://doi.org/10.1371/journal.pone.0076654> PMID: 24098547
38. Cochrane Effective Practice Organization of Care. EPOC Resources for review authors. [epoc.cochrane.org/resources/epoc-resources-review-authors](http://epoc.cochrane.org/resources/epoc-resources-review-authors) Published 2017. Accessed March 30, 2020.
39. Nyamathi AM, Nandy K, Greengold B, et al. Effectiveness of intervention on improvement of drug use among methadone maintained adults. *J Addict Dis*. 2011; 30(1):6–16. <https://doi.org/10.1080/10550887.2010.531669> PMID: 21218306
40. Day E, Copello A, Seddon JL, et al. A pilot feasibility randomised controlled trial of an adjunct brief social network intervention in opiate substitution treatment services. *BMC Psychiatry*. 2018; 18(1):8. <https://doi.org/10.1186/s12888-018-1600-7> PMID: 29334921
41. Pashaei T, Shojaeizadeh D, Foroushani AR, et al. Effectiveness of relapse prevention cognitive-behavioral model in opioid-dependent patients participating in the methadone maintenance treatment in Iran. *Iranian journal of public health*. 2013; 42(8):896. PMID: 26056645
42. Jiang H, Du J, Wu F, et al. Efficacy of contingency management in improving retention and compliance to methadone maintenance treatment: a random controlled study. *Shanghai Arch Psychiatry*. 2012; 24(1):11–19. <https://doi.org/10.3969/j.issn.1002-0829.2012.01.002> PMID: 25324596
43. Pan S, Jiang H, Du J, et al. Efficacy of cognitive behavioral therapy on opiate use and retention in methadone maintenance treatment in China: a randomised trial. *PloS one*. 2015; 10(6):e0127598. <https://doi.org/10.1371/journal.pone.0127598> PMID: 26107818
44. Stein MD, Herman DS, Moitra E, et al. A preliminary randomized controlled trial of a distress tolerance treatment for opioid dependent persons initiating buprenorphine. *Drug Alcohol Depend*. 2015; 147:243–250. <https://doi.org/10.1016/j.drugalcdep.2014.11.007> PMID: 25510307
45. Hosseinzadeh Asl N, Barahmand U. Effectiveness of mindfulness-based cognitive therapy for co-morbid depression in drug-dependent males. *Arch Psychiatr Nurs*. 2014; 28(5):314–318. <https://doi.org/10.1016/j.apnu.2014.05.003> PMID: 25439972
46. Otto MW, Hearon BA, McHugh RK, et al. A randomized, controlled trial of the efficacy of an interoceptive exposure-based CBT for treatment-refractory outpatients with opioid dependence. *J Psychoactive Drugs*. 2014; 46(5):402–411. <https://doi.org/10.1080/02791072.2014.960110> PMID: 25364993
47. Marsch LA, Guarino H, Acosta M, et al. Web-based behavioral treatment for substance use disorders as a partial replacement of standard methadone maintenance treatment. *J Subst Abuse Treat*. 2014; 46(1):43–51. <https://doi.org/10.1016/j.jsat.2013.08.012> PMID: 24060350
48. Chen W, Hong Y, Zou X, McLaughlin MM, Xia Y, Ling L. Effectiveness of prize-based contingency management in a methadone maintenance program in China. *Drug and alcohol dependence*. 2013; 133(1):270–274. <https://doi.org/10.1016/j.drugalcdep.2013.05.028> PMID: 23831409

49. Ling W, Hillhouse M, Ang A, Jenkins J, Fahey J. Comparison of behavioral treatment conditions in buprenorphine maintenance. *Addiction*. 2013; 108(10):1788–1798. <https://doi.org/10.1111/add.12266> PMID: 23734858
50. Gu J, Lau JT, Xu H, et al. A randomized controlled trial to evaluate the relative efficacy of the addition of a psycho-social intervention to standard-of-care services in reducing attrition and improving attendance among first-time users of methadone maintenance treatment in China. *AIDS and Behavior*. 2013; 17(6):2002–2010. <https://doi.org/10.1007/s10461-012-0393-9> PMID: 23413126
51. Moore BA, Fazzino T, Barry DT, et al. The Recovery Line: A pilot trial of automated, telephone-based treatment for continued drug use in methadone maintenance. *J Subst Abuse Treat*. 2013; 45(1):63–69. <https://doi.org/10.1016/j.jsat.2012.12.011> PMID: 23375114
52. Fiellin DA, Barry DT, Sullivan LE, et al. A randomized trial of cognitive behavioral therapy in primary care-based buprenorphine. *The American journal of medicine*. 2013; 126(1):74. e11–74. e17. <https://doi.org/10.1016/j.amjmed.2012.07.005> PMID: 23260506
53. Fiellin DA, Pantalon MV, Chawarski MC, et al. Counseling plus buprenorphine–naloxone maintenance therapy for opioid dependence. *New England Journal of Medicine*. 2006; 355(4):365–374. <https://doi.org/10.1056/NEJMoa055255> PMID: 16870915
54. Tetrault JM, Moore BA, Barry DT, et al. Brief versus extended counseling along with buprenorphine/naloxone for HIV-infected opioid dependent patients. *Journal of Substance Abuse Treatment*. 2012; 43(4):433–439. <https://doi.org/10.1016/j.jsat.2012.07.011> PMID: 22938914
55. Tuten M, Svikis DS, Keyser-Marcus L, O’Grady KE, Jones HE. Lessons learned from a randomized trial of fixed and escalating contingency management schedules in opioid-dependent pregnant women. *Am J Drug Alcohol Abuse*. 2012; 38(4):286–292. <https://doi.org/10.3109/00952990.2011.643977> PMID: 22352784
56. Miotto K, Hillhouse M, Donovick R, et al. Comparison of buprenorphine treatment for opioid dependence in three settings. *Journal of addiction medicine*. 2012; 6(1):68. <https://doi.org/10.1097/ADM.0b013e318233d621> PMID: 22105061
57. Kelly SM, Schwartz RP, O’Grady KE, Gandhi D, Jaffe JH. Impact of Methadone With v. Without Drug Abuse Counseling on HIV Risk: 4-and 12-Month Findings from a Clinical Trial. *Journal of addiction medicine*. 2012; 6(2):145. <https://doi.org/10.1097/ADM.0b013e31823ae556> PMID: 22134175
58. Schwartz RP, Kelly SM, O’Grady KE, Gandhi D, Jaffe JH. Randomized trial of standard methadone treatment compared to initiating methadone without counseling: 12-month findings. *Addiction*. 2012; 107(5):943–952. <https://doi.org/10.1111/j.1360-0443.2011.03700.x> PMID: 22029398
59. Hser Y-I, Li J, Jiang H, et al. Effects of a randomized contingency management intervention on opiate abstinence and retention in methadone maintenance treatment in China. *Addiction*. 2011; 106(10):1801–1809. <https://doi.org/10.1111/j.1360-0443.2011.03490.x> PMID: 21793958
60. Chawarski MC, Mazlan M, Schottenfeld RS. Behavioral drug and HIV risk reduction counseling (BDRC) with abstinence-contingent take-home buprenorphine: A pilot randomized clinical trial. *Drug and Alcohol Dependence*. 2008; 94(1–3):281–284. <https://doi.org/10.1016/j.drugalcdep.2007.11.008> PMID: 18164145
61. Chawarski MC, Zhou W, Schottenfeld RS. Behavioral drug and HIV risk reduction counseling (BDRC) in MMT programs in Wuhan, China: a pilot randomized clinical trial. *Drug Alcohol Depend*. 2011; 115(3):237–239. <https://doi.org/10.1016/j.drugalcdep.2010.09.024> PMID: 21159452
62. Karow A, Reimer J, Schafer I, Krausz M, Haasen C, Verthein U. Quality of life under maintenance treatment with heroin versus methadone in patients with opioid dependence. *Drug Alcohol Depend*. 2010; 112(3):209–215. <https://doi.org/10.1016/j.drugalcdep.2010.06.009> PMID: 20728288
63. Czuchry M, Newbern-McFarland D, Dansereau DF. Visual representation tools for improving addiction treatment outcomes. *J Psychoactive Drugs*. 2009; 41(2):181–187. <https://doi.org/10.1080/02791072.2009.10399911> PMID: 19705680
64. Chopra MP, Landes RD, Gatchalian KM, et al. Buprenorphine medication versus voucher contingencies in promoting abstinence from opioids and cocaine. *Experimental and clinical psychopharmacology*. 2009; 17(4):226. <https://doi.org/10.1037/a0016597> PMID: 19653788
65. Epstein DH, Schmittner J, Umbricht A, Schroeder JR, Moolchan ET, Preston KL. Promoting abstinence from cocaine and heroin with a methadone dose increase and a novel contingency. *Drug Alcohol Depend*. 2009; 101(1–2):92–100. <https://doi.org/10.1016/j.drugalcdep.2008.11.006> PMID: 19101098
66. Bickel WK, Marsch LA, Buchhalter AR, Badger GJ. Computerized behavior therapy for opioid-dependent outpatients: A randomized controlled trial. *Experimental and Clinical Psychopharmacology*. 2008; 16(2):132–143. <https://doi.org/10.1037/1064-1297.16.2.132> PMID: 18489017

67. Ghitza UE, Epstein DH, Preston KL. Contingency management reduces injection-related HIV risk behaviors in heroin and cocaine using outpatients. *Addictive behaviors*. 2008; 33(4):593–604. <https://doi.org/10.1016/j.addbeh.2007.11.009> PMID: 18068905
68. Ball SA. Comparing individual therapies for personality disordered opioid dependent patients. *Journal of personality disorders*. 2007; 21(3):305–321. <https://doi.org/10.1521/pepi.2007.21.3.305> PMID: 17536942
69. Brooner RK, Kidorf MS, King VL, Stoller KB, Neufeld KJ, Kolodner K. Comparing adaptive stepped care and monetary-based voucher interventions for opioid dependence. *Drug Alcohol Depend*. 2007; 88 Suppl 2:S14–23. <https://doi.org/10.1016/j.drugalcdep.2006.12.006> PMID: 17257782
70. Sullivan LE, Barry D, Moore BA, et al. A trial of integrated buprenorphine/naloxone and HIV clinical care. *Clinical infectious diseases: An official publication of the Infectious Diseases Society of America*. 2006; 43 Suppl 4:S184–190. <https://doi.org/10.1086/508182> PMID: 17109305
71. Poling J, Oliveto A, Petry N, et al. Six-month trial of bupropion with contingency management for cocaine dependence in a methadone-maintained population. *Archives of general psychiatry*. 2006; 63(2):219–228. <https://doi.org/10.1001/archpsyc.63.2.219> PMID: 16461866
72. Scherbaum N, Kluwig J, Specka M, et al. Group psychotherapy for opiate addicts in methadone maintenance treatment—a controlled trial. *European Addiction Research*. 2005; 11(4):163–171. <https://doi.org/10.1159/000086397> PMID: 16110222
73. Oliveto A, Poling J, Sevarino KA, et al. Efficacy of dose and contingency management procedures in LAAM-maintained cocaine-dependent patients. *Drug and alcohol dependence*. 2005; 79(2):157–165. <https://doi.org/10.1016/j.drugalcdep.2005.01.007> PMID: 16002025
74. Schottenfeld RS, Chawarski MC, Pakes JR, Pantaloni MV, Carroll KM, Kosten TR. Methadone versus buprenorphine with contingency management or performance feedback for cocaine and opioid dependence. *American Journal of Psychiatry*. 2005; 162(2):340–349. <https://doi.org/10.1176/appi.ajp.162.2.340> PMID: 15677600
75. Silverman K, Robles E, Mudric T, Bigelow GE, Stitzer ML. A randomized trial of long-term reinforcement of cocaine abstinence in methadone-maintained patients who inject drugs. *Journal of Consulting and Clinical Psychology*. 2004; 72(5):839. <https://doi.org/10.1037/0022-006X.72.5.839> PMID: 15482042
76. Kosten T, Oliveto A, Feingold A, et al. Desipramine and contingency management for cocaine and opiate dependence in buprenorphine maintained patients. *Drug and Alcohol Dependence*. 2003; 70(3):315–325. [https://doi.org/10.1016/s0376-8716\(03\)00032-2](https://doi.org/10.1016/s0376-8716(03)00032-2) PMID: 12757969
77. Pollack MH, Penava SA, Bolton E, et al. A novel cognitive-behavioral approach for treatment-resistant drug dependence. *Journal of substance abuse treatment*. 2002; 23(4):335–342. [https://doi.org/10.1016/s0740-5472\(02\)00298-2](https://doi.org/10.1016/s0740-5472(02)00298-2) PMID: 12495795
78. Preston KL, Umbricht A, Epstein DH. Abstinence reinforcement maintenance contingency and one-year follow-up. *Drug and alcohol dependence*. 2002; 67(2):125–137. [https://doi.org/10.1016/s0376-8716\(02\)00023-6](https://doi.org/10.1016/s0376-8716(02)00023-6) PMID: 12095662
79. Linehan MM, Dimeff LA, Reynolds SK, et al. Dialectical behavior therapy versus comprehensive validation therapy plus 12-step for the treatment of opioid dependent women meeting criteria for borderline personality disorder. *Drug and Alcohol Dependence*. 2002; 67(1):13–26. [https://doi.org/10.1016/s0376-8716\(02\)00011-x](https://doi.org/10.1016/s0376-8716(02)00011-x) PMID: 12062776
80. Petry NM, Martin B. Low-cost contingency management for treating cocaine-and opioid-abusing methadone patients. *Journal of consulting and clinical psychology*. 2002; 70(2):398. <https://doi.org/10.1037/0022-006x.70.2.398> PMID: 11952198
81. Gross A, Marsch LA, Badger GJ, Bickel WK. A comparison between low-magnitude voucher and buprenorphine medication contingencies in promoting abstinence from opioids and cocaine. *Exp Clin Psychopharmacol*. 2006; 14(2):148–156. <https://doi.org/10.1037/1064-1297.14.2.148> PMID: 16756418
82. Downey KK, Helmus TC, Schuster CR. Treatment of heroin-dependent poly-drug abusers with contingency management and buprenorphine maintenance. *Experimental and Clinical Psychopharmacology*. 2000; 8(2):176–184. <https://doi.org/10.1037/1064-1297.8.2.176> PMID: 10843300
83. Preston KL, Umbricht A, Epstein DH. Methadone dose increase and abstinence reinforcement for treatment of continued heroin use during methadone maintenance. *Archives of General Psychiatry*. 2000; 57(4):395–404. <https://doi.org/10.1001/archpsyc.57.4.395> PMID: 10768702
84. Catalano RF, Gainey RR, Fleming CB, Haggerty KP, Johnson NO. An experimental intervention with families of substance abusers: one-year follow-up of the focus on families project. *Addiction*. 1999; 94(2):241–254. <https://doi.org/10.1046/j.1360-0443.1999.9422418.x> PMID: 10396792



85. Chutuape MA, Silverman K, Stitzer M. Contingent reinforcement sustains post-detoxification abstinence from multiple drugs: a preliminary study with methadone patients. *Drug and Alcohol Dependence*. 1999; 54(1):69–81. [https://doi.org/10.1016/s0376-8716\(98\)00144-6](https://doi.org/10.1016/s0376-8716(98)00144-6) PMID: 10101619
86. Avants SK, Margolin A, Sindelar JL, et al. Day treatment versus enhanced standard methadone services for opioid-dependent patients: a comparison of clinical efficacy and cost. *American Journal of Psychiatry*. 1999; 156(1):27–33. <https://doi.org/10.1176/ajp.156.1.27> PMID: 9892294
87. O'Connor P, Oliveto A, Shi J, et al. A randomized trial of buprenorphine maintenance for heroin dependence in a primary care clinic for substance users versus a methadone clinic. *The American journal of medicine*. 1998; 105(2):100–105. [https://doi.org/10.1016/s0002-9343\(98\)00194-6](https://doi.org/10.1016/s0002-9343(98)00194-6) PMID: 9727815
88. Abbott PJ, Weller SB, Delaney HD, Moore BA. Community reinforcement approach in the treatment of opiate addicts. *Am J Drug Alcohol Abuse*. 1998; 24(1):17–30. <https://doi.org/10.3109/00952999809001696> PMID: 9513627
89. Joe GW, Dansereau DF, Pitre U, Simpson DD. Effectiveness of node-link mapping enhanced counseling for opiate addicts: A 12-month posttreatment follow-up. *The Journal of nervous and mental disease*. 1997; 185(5):306–313. <https://doi.org/10.1097/00005053-199705000-00004> PMID: 9171807
90. Iguchi MY, Belding MA, Morral AR, Lamb RJ, Husband SD. Reinforcing operants other than abstinence in drug abuse treatment: An effective alternative for reducing drug use. *Journal of Consulting and Clinical Psychology*. 1997; 65(3):421. <https://doi.org/10.1037//0022-006x.65.3.421> PMID: 9170765
91. O'Neill K, Baker A, Cooke M, Collins E, Heather N, Wodak A. Evaluation of a cognitive-behavioural intervention for pregnant injecting drug users at risk of HIV infection. *Addiction*. 1996; 91(8):1115–1126. <https://doi.org/10.1046/j.1360-0443.1996.91811154.x> PMID: 8828240
92. Woody GE, McLellan AT, Luborsky L, O'Brien CP. Twelve-month follow-up of psychotherapy for opiate dependence. *The American journal of psychiatry*. 1987. <https://doi.org/10.1176/ajp.144.5.590> PMID: 3578568
93. Woody GE, McLellan AT, Luborsky L, O'Brien CP. Psychotherapy in community methadone programs: a validation study. *The American journal of psychiatry*. 1995. <https://doi.org/10.1176/ajp.152.9.1302> PMID: 7653685
94. McLellan AT, Arndt IO, Metzger DS, Woody GE, O'Brien CP. The effects of psychosocial services in substance abuse treatment. *Jama*. 1993; 269(15):1953–1959. PMID: 8385230
95. Rounsaville BJ, Glazer W, Wilber CH, Weissman MM, Kleber HD. Short-term interpersonal psychotherapy in methadone-maintained opiate addicts. *Archives of general psychiatry*. 1983; 40(6):629–636. <https://doi.org/10.1001/archpsyc.1983.04390010039005> PMID: 6342563
96. Amini-Lari M, Alammehrjerdi Z, Ameli F, et al. Cognitive-Behavioral Therapy for Opiate Users in Methadone Treatment: A Multicenter Randomized Controlled Trial. *Iranian Journal of Psychiatry and Behavioral Sciences*. 2017; 11(2).
97. Abrahms JL. A cognitive-behavioral versus nondirective group treatment program for opioid-addicted persons: an adjunct to methadone maintenance. *The International journal of the addictions*. 1979; 14(4):503–511. <https://doi.org/10.3109/10826087909054598> PMID: 478698
98. Carroll KM, Chang G, Behr H, Clinton B, Kosten TR. Improving treatment outcome in pregnant, methadone-maintained women: results from a randomized clinical trial. *American Journal on Addictions*. 1995; 4(1):56–59.
99. Fals-Stewart W, O'Farrell TJ, Birchler GR. Behavioral couples therapy for male methadone maintenance patients: Effects on drug-using behavior and relationship adjustment. *Behavior Therapy*. 2001; 32(2):391–411.
100. Milby JB, Garrett C, English C, Fritschi O, Clarke C. Take-home methadone: contingency effects on drug-seeking and productivity of narcotic addicts. *Addictive behaviors*. 1978; 3(3–4):215–220. [https://doi.org/10.1016/0306-4603\(78\)90022-9](https://doi.org/10.1016/0306-4603(78)90022-9) PMID: 735908
101. Rowan-Szal GA, Joe GW, Hiller ML, Simpson DD. Increasing early engagement in methadone treatment. *Journal of Maintenance in the Addictions*. 1997; 1(1):49–61.
102. Moore BA, Buono FD, Lloyd DP, Printz DM, Fiellin DA, Barry DT. A randomized clinical trial of the Recovery Line among methadone treatment patients with ongoing illicit drug use. *Journal of substance abuse treatment*. 2019; 97:68–74. <https://doi.org/10.1016/j.jsat.2018.11.011> PMID: 30577901
103. Barry DT, Beitel M, Cutter CJ, et al. An evaluation of the feasibility, acceptability, and preliminary efficacy of cognitive-behavioral therapy for opioid use disorder and chronic pain. *Drug and alcohol dependence*. 2019; 194:460–467. <https://doi.org/10.1016/j.drugalcdep.2018.10.015> PMID: 30508769
104. Kidorf M, Brooner RK, Leoutsakos J-M, Peirce J. Treatment initiation strategies for syringe exchange referrals to methadone maintenance: A randomized clinical trial. *Drug and alcohol dependence*. 2018; 187:343–350. <https://doi.org/10.1016/j.drugalcdep.2018.03.009> PMID: 29709732



105. Liu P, Song R, Zhang Y, et al. Educational and behavioral counseling in a methadone maintenance treatment program in China: a randomized controlled trial. *Frontiers in psychiatry*. 2018; 9:113. <https://doi.org/10.3389/fpsy.2018.00113> PMID: 29670549
106. Yaghubi M, Zargar F, Akbari H. Comparing effectiveness of mindfulness-based relapse prevention with treatment as usual on impulsivity and relapse for methadone-treated patients: a randomized clinical trial. *Addiction & health*. 2017; 9(3):156. PMID: 29657696
107. Salehi L, Alizadeh L. Efficacy of a cognitive-behavioral relapse prevention model in the treatment of opioid dependence in Iran: A randomized clinical trial. *Shiraz E-Medical Journal*. 2018; 19(5).
108. Christensen DR, Landes RD, Jackson L, et al. Adding an Internet-delivered treatment to an efficacious treatment package for opioid dependence. *J Consult Clin Psychol*. 2014; 82(6):964–972. <https://doi.org/10.1037/a0037496> PMID: 25090043
109. Jaffray M, Matheson C, Bond CM, et al. Does training in motivational interviewing for community pharmacists improve outcomes for methadone patients? A cluster randomised controlled trial. *Int J Pharm Pract*. 2014; 22(1):4–12. <https://doi.org/10.1111/ijpp.12049> PMID: 23822820
110. Shi JM, Henry SP, Dwy SL, Oraziotti SA, Carroll KM. Randomized pilot trial of Web-based cognitive-behavioral therapy adapted for use in office-based buprenorphine maintenance. *Substance abuse*. 2019; 40(2):132–5. <https://doi.org/10.1080/08897077.2019.1569192> PMID: 30714880
111. Abrahms JL. A cognitive-behavioral versus nondirective group treatment program for opioid-addicted persons: An adjunct to methadone maintenance. *International Journal of the Addictions*. 1979; 14(4):503–11. <https://doi.org/10.3109/10826087909054598> PMID: 478698
112. Kosten TP, J; Oliveto A. Effects of reducing contingency management values on heroin and cocaine use for buprenorphine and desipramine-treated patients. *Addiction*. 2003; 98(5):665–71. <https://doi.org/10.1046/j.1360-0443.2003.00380.x> PMID: 12751984
113. Ball SA, Martino S, Nich C, Frankforter TL, Van Horn D, Crits-Christoph P, et al. Site matters: multisite randomized trial of motivational enhancement therapy in community drug abuse clinics. *J Consult Clin Psychol*. 2007; 75(4):556–67. <https://doi.org/10.1037/0022-006X.75.4.556> PMID: 17663610
114. McLellan AT, Arndt IO, Metzger DS, Woody GE, O'Brien CP. The effects of psychosocial services in substance abuse treatment. *Addictions Nursing Network*. 1993; 5(2):38–47. PMID: 8385230
115. Chawarski MC, Zhou W, Schottenfeld RS. Behavioral drug and HIV risk reduction counseling (BDRC) in MMT programs in Wuhan, China: a pilot randomized clinical trial. *Drug and alcohol dependence*. 2011; 115(3):237–9. <https://doi.org/10.1016/j.drugalcdep.2010.09.024> PMID: 21159452
116. Day E, Copello A, Seddon JL, Christie M, Bamber D, Powell C, et al. A pilot feasibility randomised controlled trial of an adjunct brief social network intervention in opiate substitution treatment services. *BMC psychiatry*. 2018; 18(1):8. <https://doi.org/10.1186/s12888-018-1600-7> PMID: 29334921
117. Jiang H, Du J, Wu F, Wang Z, Fan S, Li Z, et al. Efficacy of contingency management in improving retention and compliance to methadone maintenance treatment: a random controlled study. *Shanghai archives of psychiatry*. 2012; 24(1):11. <https://doi.org/10.3969/j.issn.1002-0829.2012.01.002> PMID: 25324596
118. Chen J, Liang J, Ou J, Cai W. Mental health in adults with sudden sensorineural hearing loss: an assessment of depressive symptoms and its correlates. *Journal of Psychosomatic Research*. 2013; 75(1):72–4. <https://doi.org/10.1016/j.jpsychores.2013.03.006> PMID: 23751242
119. O'Neill K, Baker A, Cooke M, Collins E, Heather N, Wodak A. Evaluation of a cognitive-behavioural intervention for pregnant injecting drug users at risk of HIV infection. *Addiction*. 1996; 91(8):1115–25. <https://doi.org/10.1046/j.1360-0443.1996.91811154.x> PMID: 8828240
120. Korownyk C, Perry D, Ton J, Kolber MR, Garrison S, Thomas B, et al. Opioid use disorder in primary care: PEER umbrella systematic review of systematic reviews. *Canadian Family Physician*. 2019; 65(5):e194–e206. PMID: 31088885
121. Haight SC, Ko JY, Tong VT, Bohm MK, Callaghan WM. Opioid use disorder documented at delivery hospitalization—United States, 1999–2014. *Morbidity and Mortality Weekly Report*. 2018; 67(31):845. <https://doi.org/10.15585/mmwr.mm6731a1> PMID: 30091969
122. Corace K, Willows M, Schubert N, Overington L, Howell G. Youth Require Tailored Treatment for Opioid Use and Mental Health Problems: A Comparison with Adults. *Canadian Journal of Addiction*. 2018; 9(4):15–24.
123. Huhn AS, Berry MS, Dunn KE. Sex-Based Differences in Treatment Outcomes for Persons With Opioid Use Disorder. *The American journal on addictions*. 2019. <https://doi.org/10.1111/ajad.12921> PMID: 31131505
124. Dennis BB, Roshanov PS, Naji L, Bawor M, Paul J, Plater C, et al. Opioid substitution and antagonist therapy trials exclude the common addiction patient: a systematic review and analysis of eligibility criteria. *Trials*. 2015; 16(1):475. <https://doi.org/10.1186/s13063-015-0942-4> PMID: 26489415

125. Hoffmann TC, Glasziou PP, Boutron I, Milne R, Perera R, Moher D, et al. Better reporting of interventions: template for intervention description and replication (TIDieR) checklist and guide. *Bmj*. 2014; 348:g1687. <https://doi.org/10.1136/bmj.g1687> PMID: 24609605
126. Tugwell P, Boers M, Brooks P, Simon L, Strand V, Idzerda L. OMERACT: an international initiative to improve outcome measurement in rheumatology. *Trials*. 2007; 8(1):38. <https://doi.org/10.1186/1745-6215-8-38> PMID: 18039364