WHAT MECHANISMS OF BEHAVIOR CHANGE (MOBC) ARE READY FOR DISSEMINATION & IMPLEMENTATION (D/I)?

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OVERVIEW

- Onken et al. (2014) NIH model of the development of behavioral interventions model
- Definitions of mediator & mechanism
- ► The successful search to find mediators of SUDs treatment effects
- What to do with all the mediators of SUDs treatment effects that have been identified?
- From mediators to mechanisms and the implementation of interventions hypothesized to change them
 - Overall note about this presentation re Adolescents (Black & Chung, 2014; Meisel, Magill, et al., 2022)

ONKEN ET AL. (2014)

Fig. 1. NIH stage model: common and cautionary pathways. Note: Dotted arrow indicates the importance of using caution when considering this pathway.



Onken et al., 2014

WHAT PROVIDES "EVIDENCE" THAT A VARIABLE IS A MOBC?

- Evidence of mediation
- Evidence of mechanism
- "Mediation is to mechanism what correlation is to cause" (Tryon, 2018, p. 626)

ANSWER TO WHAT MOBC ARE READY FOR IMPLEMENTATION?: WHAT HAS SUFFICIENT EMPIRICAL SUPPORT

- "Mechanisms of change in psychotherapy: Advances, break throughs, and cutting-edge research (doesn't yet exist)" (Kazdin, 2006, chapter title)
- Are there candidates for MOBC to be found in findings of studies of mediation of treatment effects?

CAREY ET AL. (2019) SYNTHESIS OF THE LITERATURE ON "BEHAVIOR CHANGE TECHNIQUES" AND THEIR PURPORTED MECHANISMS OF ACTION

- Identified published articles reporting development or evaluation of BCTs in which authors described links between BCTs and MoAs
- List of 26 general MoAs: 14 domains from the "theoretical domains framework," and 12 of the most frequently hypothesized MoA constructs from a set of 83 theories of behavior change
- Articles identified through literature searches, requests to experts in health psychology, and reference lists of systematic reviews
- Articles published 1982-2016
- Results: Most frequently linked MoAs: "Beliefs about capabilities" & "Intention"
- Results not necessarily from an empirical study (of mediation), and if they were, not contingent on quality or integrity of research design

MAISTO & MOSKAL: METHOD

- Conducted review of systematic and narrative reviews
- Searched PsycINFO, PubMed, and Google Scholar databases from 2008-2022 using terms referencing alcohol/substance use, mechanisms/mediators, treatment, and review; occurred in two phases: searched 2008-2018 in 2019; searched 2019-2022 in 2022
- Example search parameters from PsycINFO:
 - ("alcohol" OR "drinking" OR "substance use" OR "substance abuse" OR "drug use" OR "drug abuse") AND (treatment OR intervention OR therapy OR pharmacotherapy OR program) AND ("mechanism of action" OR "mechanism of behavior change" OR "mechanism of change" OR "mechanism" OR "mediator" OR "mediat*" OR active ingredient) AND ("review of literature" OR "literature review" OR "meta-analysis" OR "systematic review" OR "narrative review")
- Eligibility criteria: (1) systematic or non-systematic review paper (2) on one or more specific SUD treatment approach(es), that (3) included information about empirically tested mechanisms (i.e., referenced findings from empirical test of true mediation effect), and (4) was tested in adult sample

RESULTS: N=4 Systematic Reviews

Review Study	Treatment	Empirical	support for Mechanisms Reviewed ¹	Findings
Kelly et al., 2009	АА	-	 Common processes (e.g., self-efficacy, commitment to abstain) AA-specific practices (e.g., 12-step behaviors/cognitions, abstinence goal) Social & spiritual processes (e.g., social support, locus of control) 	 N = 13 completed full mediational tests; N = 6 completed partial tests. "Results suggest AA helps individuals recover through common process mechanisms associated with enhancing self-efficacy, coping skills, and motivation, and by facilitating adaptive social network changes. Little research or support was found for AA's specific practices or spiritual mechanisms."
Fazzino et al., 2019	Behavioral economic (BE)	-	 Self-regulation Protective behavioral strategies 	 N = 12 studies; 2 conducted formal test of mediation between condition and outcome. "Self-regulation at 1 month follow up significantly mediated the association between condition and alcohol related problems at 6 months follow up." "Protective behavioral strategies significantly, partially mediated the relationship between BE treatment condition and alcohol-related problems at 1 month follow up."
Magill et al., 2020	CBT	• Self-efficacy ²	 Coping skills Craving	 N=15 studies, primarily between-condition analyses. "Among the mediator candidates, support for changes in coping skills was strongest, although the specificity of this process to CBT or CBT-based treatment remains unclear."
Manhapra et al., 2019 ³	Pharmaco- therapy	GenotypeCraving	• Self-efficacy	 Focus of the review was not mediation, but included the following: "Genotype (CC) moderated the effects of topiramate on craving, positive alcohol expectancies, and self-efficacy, but only changes in self-efficacy mediated treatment response."

Note. AA = Alcoholics Anonymous. CBT = cognitive behavioral therapy. MI = motivational interviewing.

¹Empirical support constitutes any reference to true statistical test of mediation; left: no significant mediation reported; right/boldface text: ≥ 1 significant mediation reported.

²Self-efficacy was a significant mediator in within-, but not between-condition analyses.

³Paper presented in narrative format but systematic search was conducted.

RESULTS: N=5 Non-Systematic Reviews

Review Study	Treatment	Empirical su	pport for Mechanisms Reviewed ¹	Findings
Kelly & Greene, 2014	AA	 daily spiritual experiences forgiveness of others	• Private religious practices	 "In general, positive mediational findings for spiritual/religious in explaining recovery benefit attributable to AA appear to be more strongly related to changes in behavioral "practices" rather than in changes in spiritual/religious beliefs" "AA participation predicted increases in private religious practices, daily spiritual experiences, and forgiveness of others. However, only private religious practices (prayer, mediation, reading scriptures) mediated the relationship between AA and alcohol use."
Kelly, 2017	AA	 reduced selfishness/ self- centeredness reduced anger/ resentment 	 Spirituality Self-efficacy Depression symptoms Positive/ negative social networks Craving Impulsivity 	 "AA's beneficial effects seem to be carried predominantly by social, cognitive and affective mechanisms." " spirituality was a significant mediator of AA's beneficial effects."
Magill et al., 2015	CBT	-	Coping skillsSelf-efficacy	• "The acquisition of an improvement in coping skills and self-efficacy have support as mediators (and potential MOBCs) of CBT's effect on a range of treatment outcomes."
McCrady et al., 2020 ²	Female- specific CBT	-	 Coping skills Self-efficacy Autonomy Sociotropy Social support Depression symptoms 	• "Across treatments, women changed their drinking via increased coping skills, abstinence self- efficacy, and increased autonomy. For women in female-specific CBT, change in drinking also occurred through decreases in sociotropy and increases in social support for abstinence. Surprisingly. change in depression was linked to better drinking outcomes in gender-neutral CBT."
Magill & Hallgren 2019	MI	-	• Change talk	• " client change talk mediates the relationship between MI-consistent skills and client alcohol or other drug use outcomes. However, when individual paths of the technical model are considered, the story of the evidence becomes more complex."

Note. AA = Alcoholics Anonymous. CBT = cognitive behavioral therapy. MI = motivational interviewing.

¹Empirical support constitutes any reference to true statistical test of mediation; left: no significant mediation reported; right/boldface text: \geq 1 significant mediation reported. ²Mechanisms tested using network analysis rather than traditional mediation tests

Number of Systematic and Non-systematic Reviews Citing Significant Mediation Effect by SUD Treatment Mechanisms



10

tOne review cited only non-significant mediation effect

¥One review cited significant mediation effect within- but not between-conditions

Additional mediators were noted in one review but cited only as non-significant mediation effect:

- Genotype
- Reduced selfishness
- Reduced anger
- Forgiveness

Several additional ineligible reviews reference mechanisms of behavior change without explicit mediation tests

Note. CB = Cognitive behavioral, CBT = Cognitive behavioral therapy, MET = Motivational enhancement therapy *McCrady et al., 2020 also included in eligible articles (mechanisms here not statistically examined as mediators) ** See table 1 in Witkiewitz et al., 2022 for full list of mechanisms of behavior change

Study	Review Details	Treatments	Mechanisms
Boumans et al., 2022	 61 studies (qualitative and quantitative) Conducted in Western high-income countries, published after 2000, with adult outpatients that focused on interventions for outpatients to prevent or reduce (problematic) alcohol consumption and that mentioned effective elements 	 Range of interventions (e.g., CBT, 12-step facilitation, MET, personalized feedback, alcohol behavioral couple therapy); focus is on intervention elements rather than specific intervention types 	 Several mechanisms (without explicit reference to statistical tests of mediation) are noted, e.g.,: therapeutic alliance decreased attention to drinking improved partner relationship quality decreased exposure to alcohol cues
McCrady et al., 2020*	 Narrative review Describe barriers to treatment entry, unique characteristics, and current knowledge about effective treatments in women with AUD 	 Women's Recovery Group (CB and relapse prevention elements) Female-specific CBT 	 "Research on mechanisms of change has suggested the importance of targeting": anxiety and depression affiliative statements in treatment abstinence self-efficacy coping skills autonomy social support for abstinence
Witkiewitz, 2022**	 Narrative review Review scientific literature that examined how individuals make changes to substance use behavior and recover from SUD; focuses on the processes of behavior change with and without formal treatment 	 CBT Contingency management Motivational interviewing Mindfulness-based interventions Mutual help/12-step facilitation Pharmacological treatments 	Several mechanisms discussed that are proposed/statistically examined in individual paths of mediation model, e.g.,: coping skill utilization change talk sustain talk craving self-compassion self-regulation mindfulness spirituality

CONCLUSIONS FROM THE REVIEWS

- Health-related behavior change researchers have been engaged in identifying M(ediators) OBC
- Same holds for MOBC of SUD treatment effects
- Little empirical support for treatment-specific mediators
- Exception: MI and proportion of change talk and motivation to change as empirically supported mediator
 - Investigated in the context of delivery of MI but has implications for delivery of all alcohol treatment
- Mediators common to several treatments (CBT, MI, AA, pharmacotherapy [topiramate], e.g.) show consistent empirical support: coping skills, social support for abstinence, and self-efficacy to manage substance use

WHAT TO DO WITH ALL OF THE DATA ON MEDIATORS OF SUDS TREATMENT EFFECTS

- Several candidates for further exploration as possible MOBC of SUDs treatment, e.g., self-efficacy, coping skills, social support
 - ► A way to begin the search for empirically supported MOBC

WHY SEARCH FOR MOBC?

- Implementation shifts attention from mediators to mechanisms of BC:
 - Because you've homed in on what drives treatment effects, you're likely to find clinically significant effects of a treatment, which in turn makes practitioners more likely to implement it
 - Advantages in treatment adaptation: You have the knowledge to implement what's essential
 - Overall, "optimizes" treatment
- Advances knowledge about treatment and behavior change

HOW DO WE PROCEED?

- The first step is to advance theory of health behavior change in general, and SUD treatment specifically
 - MOBC are constructs, theory specifies how a set of constructs inter-relate to predict and explain phenomena and thus offers direction and structure to the search for MOBC
 - ▶ Wealth of theories of health behavior change (see Michie et al., 2014, e.g.)
 - ▶ SUD EBTs (e.g., CBT, MI/MET, TSF) do well in specifying their theoretical bases
 - ▶ Important for theories to specify links between behavior change components and MOBC
 - ▶ Important for the field to continually revise and refine its theories as empirical findings emerge
- Roles of treatment approach-specific and "common factor" theories as productive guides
 - In the health behaviors area, Carey et al., and Michie & colleagues' research program in general, are "common factors" approaches to studying MOBC that may be treatment- or non-treatment related
 - Case can be made to pursue both at this point

USE OF HEALTH BEHAVIOR THEORY, LITERATURE SYNTHESIS, AND EXPERT CONSENSUS TO IDENTIFY MOBC: Michie et al.(2018) PROTOCOL

- Use literature synthesis and expert consensus to identify how MOBC are linked to theory-based BCTs
- Produce an online integrated matrix of "behavior change techniques" and MOBC links that note strength of links
- Designed for world-wide dissemination and implementation
- Still needs systematic research for empirical validation of matrix links

DO RESEARCH—WHAT HAS THE SEARCH FOR TREATMENT-RELATED MOBC (Mediators) LOOKED LIKE?

- SOBC/MOBC published research dominated by clinical trials, quantitative (as opposed to qualitative) research and "efficient causes" vs. "final causes" paradigm
 - Also dominated by emphasis of theory and analysis on the individual level, as opposed to the interpersonal, group, community, or cultural level
 - Influence of moderators often neglected
- As evident from multiple sources, has not been successful in identifying true treatment-related MOBC
- Has been successful in identifying predominantly individual level mediators of treatment effects

WHAT MIGHT A SUCCESSFUL MOBC RESEARCH PROGRAM LOOK LIKE?

- Several excellent published discussions of desirable characteristics of SUD treatment MOBC research design: Byrne et al. (2020); Kazdin (e.g., 2007, 2014); Magill et al. (2020); Witkiewitz et al. (2022)
 - Research goal is to accrue evidence that a variable is a MOBC, by the technical definition of a MOBC, as opposed to a mediator
 - Papers address some of the gaps identified earlier, e.g., going beyond the clinical trial in research design, importance of moderators, and consideration of one mechanism -> multiple outcomes, multiple mechanisms -> one outcome, and different outcomes may be determined by different mechanisms

HOW MIGHT ATTENTION TO IMPLEMENTATION INFLUENCE FUTURE MOBC RESEARCH?

- Potential effect of strategy of implementing well-established mediators on advancing identification of MOBC
 - Emphasis on clinical significance
 - Onken et al. (2014) model shows Stage 5 (D&I research) results feeding back to influence Stage 0 (in our case, basic research on MOBC)

- Use of "hybrid" research designs (e.g., Bauer et al., 2015) rather than the typical efficacy or effectiveness trial
- Serious consideration of moderating (of intervention-related change in MOBC) variables (e.g., Alcantara et al., 2020) in research design
- Consider how the intervention, and its implementation process, setting & context, interact (Pfadenhauer et al., 2017)
 - Context and Implementation of Complex Interventions (CICI) framework
 - Context, implementation, and setting (of intervention delivery) interact among themselves and with the intervention
 - Multiple level moderators to consider
- Broader treatment-related behavior change models & theories that integrate implementation factors
- ▶ No longer distinguish between "MOBC" and "IS" researchers. Both are one, one is both

CONCLUSIONS

- "Understanding mediators and then mechanisms is not a matter of one study but is a matter of creeping up on the process that draws on a series of projects often seemingly unrelated or from different disciplines or types of research" (Kazdin, 2007, p. 11)
 - The Human Behavior Change Project's (HBCP) BCI Knowledge System and the use of artificial intelligence and machine learning (Michie et al., 2017)
 - HBCP: What works, compared with what how well, with what exposure, with what behaviors (for how long), for whom, in what settings, and why?

THANK YOU

REVIEW REFRENCES

Boumans, J., van de Mheen, D., Crutzen, R., Dupont, H., Bovens, R., & Rozema, A. (2022). Understanding how and why alcohol interventions prevent and reduce problematic alcohol consumption among older adults: A systematic review. International Journal of Environmental Research and Public Health, 19(6), 3188.

- Fazzino, T. L., Bjorlie, K., & Lejuez, C. W. (2019). A systematic review of reinforcement-based interventions for substance use: Efficacy, mechanisms of action, and moderators of treatment effects. Journal of Substance Abuse Treatment, 104, 83-96.
- Kelly, J. F. (2017). Is Alcoholics Anonymous religious, spiritual, neither? Findings from 25 years of mechanisms of behavior change research. Addiction, 112(6), 929-936.
- Kelly, J. F., & Greene, M. C. (2014). Toward an enhanced understanding of the psychological mechanisms by which spirituality aids recovery in Alcoholics Anonymous. Alcoholism Treatment Quarterly, 32(2-3), 299-318.
- Kelly, J. F., Magill, M., & Stout, R. L. (2009). How do people recover from alcohol dependence? A systematic review of the research on mechanisms of behavior change in Alcoholics Anonymous. Addiction Research & Theory, 17(3), 236-259.
- Magill, M., & Hallgren, K. A. (2019). Mechanisms of behavior change in motivational interviewing: do we understand how MI works? Current Opinion in Psychology, 30, 1-5.
- Magill, M., Kiluk, B. D., McCrady, B. S., Tonigan, J. S., & Longabaugh, R. (2015). Active ingredients of treatment and client mechanisms of change in behavioral treatments for alcohol use disorders: Progress 10 years later. Alcoholism: Clinical and Experimental Research, 39(10), 1852-1862.
- Magill, M., Tonigan, J. S., Kiluk, B., Ray, L., Walthers, J., & Carroll, K. (2020). The search for mechanisms of cognitive behavioral therapy for alcohol or other drug use disorders: a systematic review. Behaviour Research and Therapy, 131, 103648.
- Manhapra, A., Chakraborty, A., & Arias, A. J. (2019). Topiramate pharmacotherapy for alcohol use disorder and other addictions: A narrative review. Journal of Addiction Medicine, 13(1), 7-22.
- McCrady, B. S., Epstein, E. E., & Fokas, K. F. (2020). Treatment interventions for women with alcohol use disorder. Alcohol Research: Current Reviews, 40(2), 1-18.
- Witkiewitz, K., Pfund, R. A., & Tucker, J. A. (2022). Mechanisms of behavior change in substance use disorder with and without formal treatment. Annual Review of Clinical Psychology, 18, 497-525.

PRESENTATION REFRENCES

- Alcantara, C., Diaz, S. V., Cosenzo, L. G., Loucks, E. B., Penedo, F. J., & Williams, N. J. (2020). Social determinants as moderators of the effectiveness of health behavior change interventions: Scientific gaps and opportunities. *Health Psychology Review*, 14, 132-144.
- Bauer, M. S., Damschroeder, L., Hagedorn, H., Smith, J., Kilbourne, A. M. (2015). An introduction to implementation science for the non-specialist. BMC Psychology, 3, 3-32.
- Byrne, M. (2020). Gaps and priorities in advancing methods for health behavior change research. Health Psychology Review, 14, 165-175.
- Carey, R. N., Connell, L. E., Johnston, M., Rothman, A. J., du Bruin, M., Kelly, M. P., & Michie, S. (2019). Behavior change techniques and their mechanisms of actions: A synthesis of links described in published intervention literature. Annals of Behavioral Medicine, 53, 693-707.
- Kazdin, A. E. (2006). Mechanisms of change in psychotherapy: Advances, breakthroughs, and cutting-edge research (Do not yet exist). In R. R. Bootzin & P. E. McKnight (Eds.), Strengthening research and evaluation: Psychological measurement and evaluation (pp. 77-101). Washington, DC: American Psychological Association.
- Kazdin, A. E. (2007). Mediators and mechanisms of change in psychotherapy research. Annual Review of Clinical Psychology, 3, 1-27.
- Kazdin, A. E. (2014). Moderators, mediators, and mechanisms of change in psychotherapy. Quantitative and qualitative methods in psychotherapy research, 87-101.

PRESENTATION REFERENCES

- Michie, S., Carey, R. N., Johnston, M., Rothman, A. J., de Bruin, M., Kelly, M. P., & Connell, L. E. (2018). From theory-inspired to theory-based interventions: A protocol for developing and testing a methodology for linking behavior change techniques to theoretical mechanisms of action. Annals of Behavioral Medicine, 52, 501-512.
- Michie, S., Thomas, J., Johnston, M., et al. (2017). The human behavior change project: Harnessing the power of artificial intelligence and machine learning for evidence synthesis and interpretation. Implementation Science, DOI 10.1186/s1301 2-017-064 1-5..
- Michie, S., West, R., Campbell, R., Brown, R., & Gainforth, H. (2014). ABC of behavior change theories. Great Britain: Silverback Publishing.
- Onken, L. S., Carroll, K. M., Shoham, V., Cuthbert, B. N., & Riddle, M. (2014). Re-envisioning clinical science: unifying the discipline to improve the public health. *Clinical Psychological Science*, 2(1), 22-34.
- Pfadenhauer, L. M., Gerhardus, A., Mazygemba, K., et al. (2017). Making sense of complexity in context and implementation: The Context and Implementation of Complex Interventions (CCI). Implementation Science, DOI 10.11186/s1301 2-017-0552-5..
- ▶ Tryon, W. W. (2018). Mediators and mechanisms. *Clinical Psychological Science*, 6, 619-628.

Supplemental: Non-Systematic Review Aims and Treatment Focus

Study	Treatment	Review Aims
Kelly, 2017	• AA	Literature review, summary and synthesis of studies examining AA's MOBC
Kelly, 2014	• AA	Review theory and research related to AA and spirituality as a mechanism of behavior change
Magill et al., 2015	• CBT	Review state-of-the-art research on CBT, alcohol behavior couples therapy, and 12-step facilitation
McCrady et al., 2020	• Female-specific CBT	Describe the barriers to treatment entry experienced by women with AUD, the unique characteristics and presenting concerns of women with AUD who do seek treatment, and the current knowledge about effective treatments
Magill & Hallgren 2019	• MI	Review the evidence on how MI intervention may result in client change

Supplemental: Systematic Review Search Parameters and Treatment Focus

Study	Treatment	Search Parameters
Kelly et al., 2009	• AA	 Studies examining mediators of AA's effect on alcohol or other drug use outcomes English language published between 1990 and 2007 (inclusive)
Fazzino et al., 2019	• BE • BA	• Studies published through August 25, 2018 were included if they 1) tested a BA or BE intervention targeting substance use-related outcome(s), and/or 2) tested mechanisms of change in BA or BE efficacy for substance use outcome(s).
Magill et al., 2020	CBT	• Studies published in peer-reviewed journals, in English, between 1990 and 2019, examining CBT or CBT-based treatment efficacy occurring in the context of a randomized clinical trial with adults or other drug using participants where both intervention/intervention ingredient to mediator (a path) and mediator to outcome (b path) paths were reported.
Manhapra et al., 2019	• Pharmacotherapy	 Topiramate + substance use study English language medical literature search Published up to Sept. 2017