

Organizational interventions employing principles of complexity science have improved outcomes for patients with Type II diabetes

Luci K. Leykum, MD, MBA, Jacqueline Pugh, MD, Valerie Lawrence, MD, MSc,^{1,2}
Michael Parchman, MD, MPH, Polly H. Noel, PhD, John Cornell, PhD, Reuben
McDaniel, EdD

Corresponding Author:

Luci K. Leykum, MD, MBA
Assistant Professor of Medicine
South Texas Veterans Health Care System
University of Texas Health Science Center at San Antonio
7400 Merton Minter Blvd, Ambulatory Care 11C6
San Antonio, Texas 78229
(210) 949-3819, fax (210) 567-4423
Leykum@uthscsa.edu

Jacqueline Pugh, MD
Professor of Medicine
South Texas Veterans Health Care System
University of Texas Health Science Center at San Antonio
7400 Merton Minter Blvd, Ambulatory Care 11C6
San Antonio, Texas 78229
Pugh@uthscsa.edu

Valerie Lawrence, MD, MSc
Professor of Medicine
South Texas Veterans Health Care System
University of Texas Health Science Center at San Antonio
7400 Merton Minter Blvd, Ambulatory Care 11C6
San Antonio, Texas 78229
Vlawrence@uthscsa.edu

Michael Parchman, MD, MPH
Associate Professor of Medicine
University of Texas Health Science Center at San Antonio
Family & Community Medicine
7703 Floyd Curl Dr , Mail Code 7794
San Antonio, Texas 78229-3900
Parchman@uthscsa.edu

Polly H. Noel, PhD
Associate Professor of Medicine
South Texas Veterans Health Care System
University of Texas Health Science Center at San Antonio

7400 Merton Minter Blvd, Ambulatory Care 11C6
San Antonio, Texas 78229
Noel@uthscsa.edu
John Cornell, PhD
Professor of Medicine
South Texas Veterans Health Care System
University of Texas Health Science Center at San Antonio
7400 Merton Minter Blvd, Ambulatory Care 11C6
San Antonio, Texas 78229
Cornell@uthscsa.edu

Reuben McDaniel, EdD
The University of Texas at Austin
McCombs School of Business
Department of Management Science and Information Systems
1 University Station B6500
Austin, Texas 78712-0212
reuben.mcdaniel@mcombs.utexas.edu

Abstract

Background:

Despite the development of several models of care delivery for patients with chronic illness, consistent improvements in outcomes have not been achieved. These inconsistent results may be less related to the content of the models themselves, but to the ways they are applied to clinical settings. Complexity science, or the science of complex adaptive systems (CAS), suggests that interventions leveraging the ability of participants to learn, interact, self-organize, and co-evolve will lead to improved patient outcomes. We examined the association between the presence of these four characteristics of complex adaptive systems (CAS) in organizational interventions and outcomes of patients with Type II diabetes.

Methods:

We conducted a systematic review of the literature for organizational interventions with Type II diabetes. For each study we recorded measured process and clinical outcomes of diabetic patients. Two independent reviewers gave each study a score that reflected whether organizational interventions had 1 or more characteristics of a complex adaptive system. The effectiveness of the intervention was assessed by standardizing the scoring of the results of each study as 0 (no effect), 0.5 (mixed effect), or 1.0 (effective).

Results:

Out of 157 potentially eligible studies, 32 met our eligibility criteria. Most studies were felt to utilize at least one CAS characteristic in their intervention designs, and most reported at least mixed results. The number of CAS characteristics present in each

intervention was associated with outcome effectiveness ($p=0.002$). Two individual characteristics were associated with effectiveness: interconnections between participants and co-evolution.

Conclusion:

The significant association between CAS characteristics and effectiveness of reported outcomes for patients with Type II diabetes suggests that complexity science may provide an effective framework for conceptualizing clinical settings and designing interventions that lead to improved patient outcomes.

Introduction:

Although the cost of managing patients with chronic disease is high, and is predicted to rise to 80% of health care dollars spent by 2020 (1), identification of effective ways to improve care of patients with chronic disease has been difficult to achieve. While the evidence base regarding optimal medical management of these patients has grown, our ability to translate evidence into routine clinical practice across diverse clinical settings has been limited. A recent study of the number of patients who received appropriate care recommended for their chronic conditions revealed poor adherence to recommendations (2). Attempts to improve outcomes through use of practice guidelines, quality improvement, or system improvement have not led to consistently positive effects on process of care measures or outcomes, and have been disappointing (3-5). “Environmental” or organizational barriers, such as inadequate staff or support structure, are typically cited as a hindrance to guideline implementation (5).

To facilitate implementation, several models for delivery of care for patients with chronic disease have emerged. These include the “self-management” and “collaborative management” models, the “chronic care model,” and the “disease management” approach (6-9). The former two share an emphasis on encouraging patients to be more active participants in their care, while the latter focus more on improving organizational infrastructure and community resources. Recent systematic reviews of interventional studies based on the self-management, chronic care, and disease management models reveal small to moderate effects on process or outcome measures (6,10,11). These inconsistent results suggest that it is not the content of the models themselves, but instead the specific ways in which they are applied to organizations, that may improve care.

It is not clear why some interventions fail while others succeed, or why the same interventions work well in one setting and not another. One possible reason for this inconsistency is suggested by the recent application of complexity science, or the study of complex adaptive systems, to the organization of health care delivery.

Complex adaptive systems are characterized by individuals who can learn, interconnect, self-organize, and co-evolve with their environment in non-linear dynamic ways (14,17). These factors lead to patterns of relationships and interconnections in the system that influence performance of the system, but may not be fully understood or predicted as a sum of the system's parts. Like musicians in an improvisational jazz band, individuals in a complex adaptive system learn from and react to each other and their environment, leading to constant shifts in the pattern of relationships or the interpretation of the music. The natural tendency of individuals to learn, form patterns of relationships, organize and evolve suggests that interventions that suppress these activities will lead to poorer outcomes than those that facilitate them.

Complexity science suggests that inconsistent outcomes may result from implicit assumptions of linear, mechanistic relationships between cause and effect in organizational interventions. This linear viewpoint implies that a specific intervention should lead to consistent, reproducible results across clinical settings. In contrast, complexity science suggests that clinical settings are complex adaptive systems (CAS's) with non-linear characteristics, and that outcomes may be greatly affected by seemingly small differences or adjustments in the environments between or among organizations (14-16). For example, clinical reminders may be very effective in prompting providers in one setting to perform recommended care, but may not be as effective in another for

reasons that are specific to that setting (i.e., differences in the workflow of test ordering, ease of access of recommended care, patient population served, or provider beliefs).

Therefore, we hypothesize that interventions that leverage the characteristics of complex adaptive systems, intentionally or not, and regardless of the particular model of chronic care delivery on which the intervention was based, will consistently lead to improved outcomes over those that do not. The purpose of this research is to conduct a systematic review of organizational interventions for patients with Type II diabetes and examine these interventions through the lens of complexity science.

Methods:

Search strategy:

We defined organizational interventions as those that explicitly attempt to affect or change organizational structures or processes to implement evidence-based practice. We searched Medline from 1989 through December 29, 2005, after developing a search strategy based on four components: (1) the strategy developed by the Effective Practice and Organization of Care (EPOC) Group of the Cochrane Collaboration and bibliographies of relevant publications from Medline (18); (2) additional search terms for types of organizational interventions not included in EPOC, such as total quality improvement, PDSA (Plan-Do-Study-Act), and practice redesign; (3) additional search terms used by recent systematic reviews of preventive and quality improvement strategies (19,20); and (4) bibliographies and Medline indexing terms of relevant publications. To focus the search on diabetes, we added disease-specific MeSH and text word terms, ran a preliminary search, and reviewed 200 titles and abstracts (determined by saturation, until

no further new terms were identified), for additional text word terms. The search terms are available from the author upon request.

Inclusion and Exclusion Criteria:

Inclusion criteria were randomized, quasi-randomized, or controlled clinical trials published in English and conducted in economically developed countries identified as such by the International Monetary Fund or the Organization for Economic Cooperation and Development (21). We excluded non-English articles because non-English studies comprise only 1% of the EPOC registry. We excluded studies reporting only the following nonclinical outcomes: patient or provider knowledge; self-efficacy; satisfaction; or other attitudes and beliefs. We also excluded studies of: type 1 or gestational diabetes; patients <18 years old or patients younger and older than 18 but not reporting results separately for adults; work site health interventions; exercise rehabilitation or smoking cessation; and disease prevention or screening only.

Four investigators independently reviewed overlapping groups of differing halves of the citations' titles and abstracts generated by the full literature search to assess agreement regarding potentially eligible publications. Raw agreement was 94%. If eligibility was uncertain after review of the title and abstract, the full article was reviewed. Eligible studies were independently reviewed and jointly abstracted in detail by teams of two investigators. Disagreements were resolved by consensus of the group of investigators.

Outcomes abstracted:

In order to maximize ability to synthesize the available evidence across studies, we abstracted outcome data for the major broad domains of mortality, primary disease-related outcomes (e.g., glycemic control, screening for retinopathy), quality of life, functional status, evidence-based provider behavior, process measures, and health services utilization.

Assessment of Leveraging of Characteristics of Complex Adaptive Systems:

Eligible publications were independently evaluated by two raters with content expertise in complexity science to assess the extent to which the intervention utilized any of the following characteristics of a CAS: individuals' capacity/ability to learn; the interconnections between individuals; the ability of participants to self-organize; and the tendency of participants to co-evolve. The definition of each characteristic used by reviewers is shown in **Table 1**. Each study was given a point for each of the characteristics present in the study design, for a possible lowest score of 0 and highest score of 4. **Table 2** gives specific examples of interventions that met criteria for each score, with the characteristics they were felt to reflect. The raters were blinded to the outcomes of the studies. The kappa for these scores between reviewers was 0.78, with conflicts subsequently resolved by discussion.

Assessment of Reported Outcomes:

Because of the heterogeneity across study outcomes, we did not use effect size as the outcome variable. The most commonly used outcome was change in hemoglobin a1c, but this was used in only 14 studies of variable duration, 4 of which contained unit

of allocation error, or mismatch between the unit of randomization and unit of analysis. Additionally, some studies compared change in hemoglobin A1c with baseline values, rather than with controls. To overcome this, a rating scale was used to assess the efficacy of the intervention. The outcomes of each study were assessed by two independent raters on a scale of 0 (no effect), 0.5 (mixed results), and 1 (intervention effective) based on the type (process versus outcome), number, and statistical significance of outcomes reported. The specific criteria used for each rating, along with specific examples of the reported outcomes for each rating, are shown in **Table 3**. Raters were blinded to study interventions, and one was different from the intervention raters. The kappa for these scores was 0.79 with conflicts resolved by discussion.

Statistical Analysis:

Because of the small number of studies identified, we used Fisher's exact test to test the significance of the relationship between total number of characteristics of complex adaptive systems leveraging an organizational intervention and the strength of outcomes reported, as well as between each individual characteristic and the strength of outcomes. Because a mismatch between the unit of allocation and analysis may bias a study towards positive results, we divided studies into two groups based on whether a unit of analysis error was present. A second analysis using Fisher's exact test was performed including only those studies that did not contain a unit of analysis error. All statistical analysis was performed using Stata 8.0 (College Station, Texas).

Results:

The search identified 5,590 publications; 157 were potentially eligible by review of title and abstract. After full review of these published studies, 32 met our eligibility criteria (22-53). **Figure 1** details the numbers of articles eligible and ineligible at each point. The interventions, outcomes, duration of intervention, presence of unit of allocation error, and extent to which interventions used characteristics of complex adaptive systems are summarized in **Table 4**. Half of studies reported significant improvement in most or all outcomes. Ten studies were felt to utilize self-organization; co-evolution was a component in twenty-four, learning in twenty-seven, and interconnections in thirty. Interventions that involved learning typically took the form of distribution of educational materials; interconnections were frequently changed through the addition of case managers or care coordinators. Relatively few (eight) allowed participants to self-organize.

The distribution of characteristics of complex adaptive systems utilized by a study intervention and the intervention efficacy for all studies is shown in **Table 5**. Only 50% of studies demonstrated effective results as reflected by a score of 1. All studies with an effectiveness score of 1 reported interventions whose CAS characteristic scores were at least 3, while the studies with lower effectiveness had lower CAS characteristic scores. The association between the number of CAS characteristics and effectiveness was statistically significant ($p=0.002$), and remained so after adjustment for sample size and duration of intervention. Nine studies had level of analysis error, most commonly because the unit of randomization was a clinic or physician, while the unit of analysis was the patient. The association between CAS characteristic scores and outcome

effectiveness was also statistically significant when these nine studies were excluded ($p=0.004$).

Of the four CAS characteristics assessed for each intervention, two were individually significantly associated with effectiveness. Interventions that affected interconnections in the organization or allowed participants to co-evolve were significantly associated with intervention effectiveness ($p=0.03$ and 0.001 , respectively). When studies with unit of analysis error were excluded, these associations remained significant ($p=0.05$ and 0.003). The associations between interventions affecting participants' ability to learn or self-organize were not statistically significant ($p=0.06$ and 0.58).

Discussion:

In summary, we found a significant relationship between the number of characteristics of complex adaptive systems utilized in an intervention and the intervention's effectiveness in improving process or outcome measures in patients with Type II diabetes in studies conducted across a diversity of clinical settings and reported outcomes. This finding suggests that complexity science may provide an effective lens through which to understand these clinical settings and inform the design of interventions to improve performance. Further, two individual characteristics, co-evolution (ability of participants to modify practices based on forces internal and external to the clinical setting) and interconnections (changing the pattern of communication between participants) had the strongest relationship with intervention effect. It is difficult to interpret the lack of a relationship between other individual characteristics and strength of

outcomes, as the number of studies included in this analysis was small, particularly after those with level of analysis error were excluded. However, the significant association between the overall number of characteristics of CAS and the intervention effectiveness, in the absence of a clear association for all individual characteristics, could imply that some combinations of characteristics are more effective. The number of studies was too small to allow for this analysis.

Several other limitations besides the small sample size deserve mention. All of the studies included related only to the chronic care of diabetic patients. Confirmation of these findings for patients with other chronic diseases is necessary. In addition, while we were able to address the potential bias inherent in studies with unit of allocation error, publication bias (e.g., positive studies being more likely to be published), or the possibility that studies with negative outcomes did not provide sufficient detail regarding interventions, could potentially impact these results. However, regarding the latter potential bias, the inter-rater consistency on characteristic ratings indicates that reported methods were sufficient to reliably assess the interventions.

Consistent with prior literature, this systematic review found that many studies of organizational interventions do not improve process or outcome measures for patients with the chronic illness diabetes(3-5). Only 50% of randomized or controlled clinical trials meeting criteria for this systematic review demonstrated significant improvement in most or all endpoints. Importantly, the finding that interventions incorporating features of complex adaptive systems were more effective suggests that a shift in thinking about the design of organizational interventions to improve patient outcomes may be helpful. Rather than designing one-size-fits-all initiatives that require adherence to a rigid, pre-set

course of action, allowing participants to have input and control, as well as allowing them to adapt or deviate from a set plan as results evolve, may lead to more effective change.

Our findings also suggest that interventions that focus on the quality and pattern of relationships between participants in a clinical setting may be superior to those that focus on trying to change the behavior of a single participant. Finally, the nonlinearity that is inherent in complex systems implies that inputs and outputs are unlikely to be proportional, particularly across clinical settings and over time. This suggests the need for the following specific approaches: involvement of more than one type of participant in both intervention design and implementation, use of more than one method of connecting agents in an organization, and continual reassessment of the effect of an intervention coupled with a willingness to make changes based on this reassessment. In fact, this may explain why multi-faceted organizational interventions may be more effective than those with a focus on a single strategy (54).

While these results may be regarded as a preliminary stepping-stone, they point to the use of complexity science as a framework for thinking about clinical settings that may allow us to better understand the inconsistencies in the health care organizational literature and to better design interventions that will lead to the greatest improvement in outcomes for our patients.

Conclusions:

Improved outcomes in Type II diabetes were significantly associated with organizational interventions that had characteristics of complex adaptive systems in their design. Those interventions incorporating a greater number of characteristics

demonstrated the greatest improvement in diabetes-related outcomes. We observed a greater effect for interventions that promoted interconnections between, and co-evolution of, individuals.

These data suggest that complexity science may provide an effective framework for conceptualizing clinical settings and designing interventions that lead to improved patient outcomes. Specifically, interventions with strategies targeting multiple CAS characteristics may be most effective in improving health outcomes. Further research should address how best to translate the theoretical constructs of complex adaptive systems into interventions that improve the outcomes of chronically ill patients.

Competing Interests: The authors declare that they have no competing interests.

Authors' Contributions:

LL conceived this analysis using the database conceived by VL, PN, and JP, rated studies, performed preliminary statistical analysis, and drafted the manuscript. JP participated in the design of the study and helped to draft the manuscript. VL conceived the systematic review and database, rated studies, and helped to draft the manuscript. MP rated studies and helped to draft the manuscript. PN conceived the systematic review and database and helped to draft the manuscript. JC performed statistical analysis and helped to draft the manuscript. RMcD participated in the design of the study, provided theoretical expertise, and helped to draft the manuscript.

All authors have read and approved the final manuscript.

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Table 1: Characteristics of Complex Adaptive Systems Abstracted

Characteristic	Definition
Agents who Learn	<ul style="list-style-type: none">● People can and will process information, as well as react to changes in information
Interconnections	<ul style="list-style-type: none">● Change in pattern of interactions, including non-verbal communication, among agents● Introducing new agents into the system
Self-organization	<ul style="list-style-type: none">● Order is created in a system without explicit hierarchical direction
Co-evolution	<ul style="list-style-type: none">● The system and the environment influence each other's development

Table 2: Examples of Interventions Utilizing Characteristics of Complex Adaptive Systems

Intervention	Characteristics Present	Score Given
1-page reminder of BP goals put on the front of the charts of all diabetics	None	0
Educational materials (articles, videotapes) sent to physicians at defined intervals	Learning	1
Decision – support system generated treatment recommendations based on current treatment and level of control. Patients seen monthly until controlled.	Interconnections Co-evolution	2
Pharmaco-evaluation and med review conducted at set intervals over 1 year. Emphasis on education, but tailored to progress of individual patients	Learning Interconnections Co-evolution	3
Usual visits replaced with group visits led by a physician and diabetes nurse educator, who were allowed to tailor the meeting frequency and content to the needs of the group. The goal of these visits was to improve compliance through education.	Learning Interconnections Self-Organization Co-evolution	4

Table 3: Criteria Used to Classify Outcomes of Studies with Organizational Interventions

Outcome Score	Criteria	Example
0	<ul style="list-style-type: none"> ● No differences between control and intervention groups, or between intervention and baseline, on process or outcome measures 	No difference in rate of medication changes between groups
0.5	<ul style="list-style-type: none"> ● Trends without significance ● Mixed outcomes (significant improvement in minority of measures) ● Significant improvement compared with baseline, but not with control 	Significant improvement in hgb a1c at 6 and 12 months when compared with baseline, but not when compared with control group
1	<ul style="list-style-type: none"> ● Significant improvement: <ul style="list-style-type: none"> - all outcomes if ≤ 3 endpoints - majority of outcomes if >3 endpoints 	Significant improvement in number of patients at a1c goal, significant decrease in hospitalizations and emergency department visits

Table 4: Summary of Eligible Studies of Organizational Interventions on Outcomes of Patients with Type 2 Diabetes

Author	Sample Size	Intervention	Outcome Measures	Follow-up	Unit of Analysis Error	CAS Leveraged
Denver, EA (22)	120	Nurse-led clinic Patient education	Systolic BP, target BP Medication changes, CHD risk scores	6 mos	No	L, IC, SO, CoE
Frijling, BD (23)	1449	Physician feedback reports Outreach visits to physicians	Process measures: Foot, eye exams	21 mos	Yes	L, IC, SO, CoE
Gary, TL (24)	186	Nurse Case Managers Case Workers, or both	Hemoglobin a1c Cholesterol, BP	24 mos	No	L, IC, CoE
Glasgow, RE (25)	320	Health, diet counselor Telephone outreach Community resources	Hemoglobin A1c Lipid profile Psychosocial outcomes	12 mos	No	L, IC, CoE
Hirsh, IB (26)	185	Computerized compliance feedback Physician didactic training	Hemoglobin A1c (% change) Weight, BP, costs	14 mos	Yes	L, IC, CoE
Kim, HS (27)	50	Care booklet and log Nurse phone intervention Dietician review	Hemoglobin A1c Diet, exercise, glucose monitoring adherence	12 weeks	No	L, IC, CoE
Miller, CD (28)	597	Rapid a1c at time of visit Education	Treatment intensification Hemoglobin A1c	4-8 mos	No	L, IC, CoE
Oh, JA (29)	50	Care booklet, logs Phone calls Dietician recommendations	Hemoglobin A1c Blood glucose BMI	12 weeks	No	L, IC, SO, CoE
Sanders, K (30)	320	Colored chart reminders	Medication changes	unclear	Yes	IC
Stroebel, R (31)	1083	Searchable patient registry Team time Letters to patients	% pts with hgb A1c >8 Lipids ordered BP	6 mos	No	L, IC, SO
Greoneveld, Y (32)	288	Visits with nurse educator and dietician for 1 year	Hemoglobin A1c Specialist referral	12 mos	Yes	L, IC, CoE
McDermott, RA (33)	678	Outreach groups Recall system	Process measures: BP, weight check, eye, foot care	12 mos	No	L, IC, SO, CoE
Piette, JD (34)	292	Telemedicine system Nurse educators in VA	Hemoglobin A1c Process measures: foot exams, cholesterol, glucose monitoring	12 mos	No	L, IC, CoE
Piette, JD (35)	280	Telemedicine system Nurse educators in community health centers	Hemoglobin A1c Process measures: foot exams, cholesterol, glucose monitoring	12 mos	No	L, IC, CoE
Pritchard, DA (36)	17	Dieticians PCP focus on diet	Weight Blood pressure	12 mos	No	L, IC, CoE
Wagner, EI (37)	35	Small group visits Counseling	Hemoglobin A1c Preventive care	24 mos	Yes	L, IC, SO, CoE

			ER visits, bed days			
Walker EA (38)	600	PCP workshops Project liaisons	Process measures: hgb A1c measurement, foot exams	12 mos	Yes	L, IC
Cagliero, E (39)	89	Hgb a1c at time of visit	Hemoglobin A1c Resource utilization	12 mos	No	IC, CoE
Vaughan, NJ (40)	218	Decision support system	# pts with normal A1c	16 mos	Yes	IC, CoE
Coffey, E (41)	96	Managed care vs. Fee for service systems	Medications, non-drug treatment Pt income spent	12 mos	No	-
Litzelman, DK (42)	396	MD guidelines re: foot care Pt ed, Behavior contract Phone/mail reminders	Foot lesions Foot care behavior	12 mos	Yes	L, IC
Newcomb, PA (43)	1082	Mobile eye exams Education, phone contact	Visual impairment Ophthalmology visits	7-9 years	No	L, IC`
Clancy, DE (44)	120	Group visits	Process indicators Hemoglobin A1c Cholesterol	6 mos	No	L, IC, SO, CoE
McClellan, W (45)	123	Physician-based QI project	Process indicators: A1c, urine testing, eye exams	6 mos	No	L
Taylor, CT (46)	69	Pharmacoevaluation Education	# pts with A1c at goal, BP Hospital utilization Quality of life	12 mos	No	L, IC, SO, CoE
Tsuyuki, RT (47)	675	Visits with pharmacist	Composite lipid panel or increase in lipid medication	16 weeks	No	L, IC, SO, CoE
Basch, CE (48)	280	Eye education, phone calls	Receipt of eye exam	6 mos	No	L, IC, CoE
McCabe, C (49)	2001	Foot-screening protocol	Ulcers, amputations	24 mos	No	L, IC, CoE
Lobach, DF (50)	1265	Computer-assisted management protocol	Guideline adherence, Compliance, time spent	6 mos	No	IC, SO, CoE
Shultz, EK (51)	20	Modem transfer of blood glucose measurements	Hemoglobin A1c (exact change not quantified)	15 mos	No	L, IC, CoE
Smith, S (52)	183	PCP education / protocols Community nurse specialist	Hemoglobin A1c, BP, BMI Satisfaction, Well-being	18 mos	Yes	L, IC, CoE
Rothman, RL (53)	217	Pharmacists Diabetes care coordinator	Hemoglobin A1c BP, cholesterol Aspirin use	12 mos	No	L, IC, CoE

L = Learning, IC = Interconnections, SO = Self-organization, CoE = Co-evolution

Table 5: Distribution of CAS and Effectiveness of Interventions

Total CAS Score	Rating of Intervention Effectiveness			Total No. Studies with each CAS Score
	0	0.5	1	
0	1	0	0	1
1	1	1	0	2
2	1	3	0	4
3	0	7	11	18
4	0	1	6	7
Total No. Studies at each Level of Effectiveness	3	12	17	32

P=0.002

Figure 1: Flowchart of Publication Inclusion

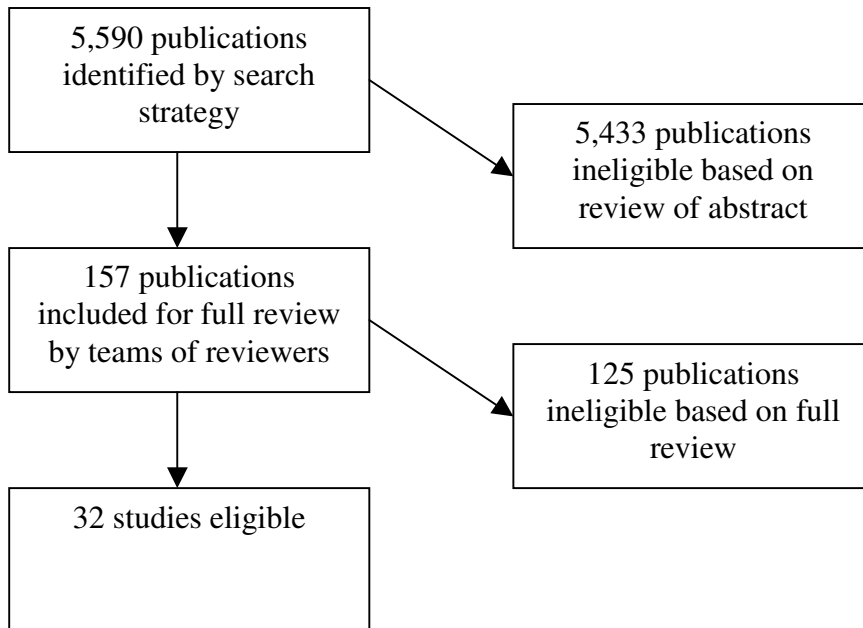


Figure 1: Flowchart of Publication Inclusion

