

## Number 27

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If you were asked to identify the hundred most 'active' areas of research in the social sciences, how would you go about it? Indeed, I think the average scientist would find it difficult to name more than a dozen. But the question is really unfair without some criterion of 'active research.' Activity might be based on number of people involved, number or total value or grants, number of organizations represented, number of papers published on the subject, or numbers of citations.

Some time ago I describe the methodology of co-citation analysis,1 which ISI® has used to identify active areas of scientific research. Henry Small, Beta Starchild, and Louis Holmes of ISI, with help from Professor Belver Griffith of Drexel University, have used this algorithmic technique to produce some fascinating data about research in the social sciences.<sup>2</sup> Using ISI's Social Sciences Citation Index<sup>®</sup> (SSCI<sup>®</sup>) tape files they were able to identify several hundred active areas of research. Each area is represented by a group of frequently cited papers or books. They form a 'cluster' because each has been cocited, along with one or more other publications in the group, by subsequent publications.

In addition to identifying individual clusters, the method also shows linkages between clusters. This relationship between clusters can be displayed in 'cluster maps.' An example is shown in Figure 1. The make-up of a cluster, and its relation to others in such maps, is determined by statistical thresholds established for inclusion of cited documents.

My purpose here is simply to list about 100 areas of research in the social sciences that we have identified with this technique. The existence of these foci of research interest will certainly not surprise knowledgeable specialists. I do believe, however, that the size of the fields--in terms of citing publications--will be most interesting even to experts.

Figure 2 is a list of 100 clusters ranked by the frequency with which all members of the cluster were cited in the 1974 SSCI. The figure in the 'citing' column is the number of articles that cited papers in the cluster. The 'cited' figure is the number of publications that define the cluster. These cited articles will have been published in earlier years.

For further illustration, Figure 3 lists the 17 cited papers that compose the cluster on depressive disorders (item 64 in the list of Figure 2). In Figure 4, a

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map of this cluster shows the 'strength' of the linkage between each cited paper. The larger the number on the lines connecting the citations, the closer one would like to place the relevant boxes, or the thicker one would like to make the linkage lines, to indicate the strength of association.

On the other hand, the ranking by 'citing' frequency sometimes separates fields which are in fact quite closely related. Thus, *Personal Space* (item 22 in Figure 2) and *Personal Space*, *Man-Made Environments* (item 44) are obviously related. Yet they are distinct clusters because of differences of cited papers among the members of each cluster. Notice also the large differences in the number of citing and cited items in each case.

At ISI we use co-citation analysis and cluster identification for a variety of purposes. A principal use is in construction of  $ASCA^{\oplus}$  profiles. Using each item in the cluster as a citedreference question, they become rather efficient 'descriptors' in the profile, so that we can selectively disseminate the information on each topic selected.

Since research in many areas moves swiftly and often changes emphasis and direction, profiles must be modified frequently. As the research front moves forward, citation patterns change. Corresponding changes in terminology may or may not occur as well. In some cases, the 'citedreference' terms may be much more stable than the terminology. In others, a new term may be highly efficient as a retrieval key for some time. For unexplainable reasons, some phenomena are quickly and unambiguously named, eponymically or otherwise, Other concepts will show a confusion of terminology and be describable with certainty only by constant reference to primordial or other major papers on the subject.

The titles of the clusters listed in Figure 2 have been created from a scanning of terminology used in the titles of the citing works. Thus, in cluster 15, Biofeedback Training, 318 citing papers were involved. In their titles the term biofeedback clearly predominates as a description of the phenomenon. This particular cluster will be examined in much greater detail in the near future. Detailed listings of this type of cluster information will one day be incorporated in ISI's Atlas of Science.

In closing, may I point out to my colleagues in information science that these procedures are, in fact, automatic classification in the strictest sense. Classification purists, with rare exceptions, have been unable to grasp the practical significance of citation analysis for library and other classification needs. But to my knowledge, no other extant system exploits the *self*organizing capabilities of published literature in a manner required to classify it as truly 'automatic' classification.

- 1. Garfield E. ISI is studying the structure of science through co-citation analysis. Current Contents® No. 7, 13 February 1974, p. 5-10.
- 2. Small H & Griffith B C. The structure of scientific literatures. I. Identifying and graphing specialties. *Science Studies* 4:17-40, 1974.



## Figure 2. List of 100 SSCI Clusters. The clusters are ordered by number of papers citing the clustered papers. A = item number.

B = number of citing papers. C = number of cited papers in the cluster. D = cluster title.

АВС

- 1. 892 119 Behavior modification as psychotherapy
- 2. 753 106 Human information processing: memory search

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- 3. 622 95 Desensitization in reduction of anxiety
- 4. 586 88 Equity theory: status consistency
- 5. 551 92 Hemispheric Differences in cerebral function.
- 6. 494 5 Locus of control
- 7. 472 68 Helping behavior
- 8. 444 106 Pharmacology of affective disorders: depression
- 9. 443 2 Linguistics
- 10. 412 72 Stimulus orientation in perception
- 11. 388 35 Organizational structure
- 12. 362 38 Interpersonal attraction
- 13. 353 44 Behavior therapy in obesity, homosexuality, and drug addiction
- 14. 334 46 Risky shift
- 15. 318 52 Biofeedback training
- 16. 312 36 Sentence memory
- 17. 311 54 Hyperactive children
- 18. 311 15 Free recall
- 19. 311 3 Imagery in learning
- 20. 310 5 Achievement Motivation
- 21. 308 51 Concurrent schedules of reinforcement
- 22. 303 46 Personal space
- 23. 302 33 Locus of control and alienation
- 24. 293 3 Organizational theory: management
- 25. 282 30 Urban planning: residential location models
- 26. 282 29 Impression formation
- 27. 282 18 Expectancy theory prediction
- 28. 278 40 Cognitive development: Piaget's concept of conservation
- 29. 272 28 Semantic memory
- 30. 271 22 Equal protection
- 31. 270 31 Judicial process
- 32. 259 29 Portfolio choice
- 33. 257 38 Change components of adult development
- 34. 257 2 Cognitive style and personality
- 35. 249 22 Memory: repetition effects
- 36. 246 39 Overinclusive thinking in schizophrenia
- 37. 245 20 State-trait model of anxiety
- 38. 233 38 Cooperation and competition: prisoners dilemma game
- 39. 226 2 Organizational decision making
- 40. 223 30 Hypothalamic feeding mechanisms
- 41. 212 21 Labeling and deviance
- 42. 210 8 Proactive interference in short-term memory
- 43. 208 13 Psychoanalytic theory
- 44. 208 3 Personal space: man-made environments
- 45. 206 4 Sexual behavior
- 46. 204 24 Use of health-care services
- 47. 202 21 Effects of organization on recognition memory
- 48. 202 14 Political conflict

## Figure 2. List of 100 SSCI Clusters. (con't)

A	B	C D
49.	197	4 Cognitive complexity
50.	196	4 Multidimensional scaling
51.	190	10 Family planning
52.	189	32 Psychological correlates of marijuana use
53.	185	8 Internal-external locus of control
54.	184	22 Social mobility
55.	184	2 Motivation and job satisfaction
56.	182	20 Social participation: organizational environment
57.	181	12 Cognitive balance
58.	181	4 Clustering in free recall
59.	180	15 Self-perception
60.	180	9 Teacher expectations and pupil performance
61.	179	23 Behavioral contrast
62.	176	27 Alcoholism
63.	176	2 Counselor empathy learning
64.	173	17 Depressive disorders
65.	171	3 Short-term visual memory
66.	169	3 Politics
67.	167	10 Monetary theory
68.	164	18 Attitude and Behavior
69	. 163	28 Childhood psychosis
70.	162	29 Multiple cue probability learning
71	. 160	17 Scientific literature
72	157	16 Hypnotic susceptibility
73	154	5 Imitation and television
74	. 153	19 Civil commitment of mentally ill: suicide risk
75	. 151	12 Social choice theory
76	. 149	17 Attitude change
77	. 14)	2 Partial reinforcement in conditioning
78	. 140	19 Infant attachment behavior
/9	. 140	16 Short term memory
80	1.25	20 Sleep
81 00	125	20 Steep 2 Human appression and territoriality
04	124	10 Investment
84	134	12 Factor analysis
85	134	2 Social appression
86	133	2 Education
87	. 132	15 Children's associative learning
88	. 132	12 Contrast effects in conditioning
89	. 131	2 Depression
90	. 130	16 Prognosis in schizophrenia
91	. 130	11 Paired associate learning: retroactive inhibition
92	. 129	11 Self disclosure
93	. 128	16 Inflation and unemployment
94	. 127	4 Measurement of human judgment
95	. 126	2 Avoidance learning
96	. 125	7 Retrieval cues
97	. 125	7 Political socialization
98	. 124	5 Resource allocation and liability
- 99	123	14 Psychiatric sociology

100. 123 8 Childhood language acquisition

- Figure 3. Papers Comprising the 1974 SSCI Co-Citation Cluster on Depressive Disorders (Cluster #64).
- 1. Carney M W P, Roth M & Garside R F. The diagnosis of depressive syndromes and the prediction of ECT response. Brit J. Psychiatry 111:659-74, 1965.
- Everitt B S, Gourlay A J & Kendell R E. An attempt at validation of traditional psychiatric syndromes by cluster analysis. Brit J. Psychiatry 119:399-412, 1971.
- 3. Eysenck H J. The classification of depressive illnesses. Brit. J. Psychiatry 117:241-50, 1970.
- Greenblatt M, Grosser G H & Wechsler H. Differential response of hospitalized depressed patients to somatic therapy. Amer. J. Psychiatry 120:935-43, 1964.
- 5. Hollister L E & Overall J E. Reflections on the specificity of action of antidepressants. *Psychosomatics* 6:361-65, 1965.
- Hollister L E, Overall J E, Shelton J, Pennington V, Kimbell I & Johnson M. Drug therapy of depression; amitriptyline, perphenazine, and their combination in different syndromes. Arch. Gen Psychiatry 17:486-93, 1967.
- 7. Kendell R E. The classification of depressive illnesses. London: Oxford Univ. Press, 1968, 102 pp.
- Kiloh L G, Ball J R B & Garside R F. Prognostic factors in treatment of depressive states with imipramine. Brit. Med. J. 2:225, 1962.
- Kiloh L G & Garside R F. The independence of neurotic depression and endogenous depression. Brit. J. Psychiatry 109:451-63, 1963.
- Klerman G L & Cole J O. Clinical pharmacology of imipramine and related antidepressant compounds. *Pharmacol. Rev.* 17:101-41, 1964.
- Overall J E, Hollister L E, Meyer F, Kimbell I Jr. & Shelton J. Imipramine and thioridazine in depressed and schizophrenic patients; are there specific antidepressant drugs? J. Amer. Med. Assoc. 189:605-08, 1964.
- Overall J E, Hollister L E, Johnson M & Pennington V. Nosology of depression and differential response to drugs. J. Amer. Med. Assoc. 195:946-48, 1966.
- Paykell E S, Klerman G L & Prusoff B A. Treatment setting and clinical depression. Arch. Gen. Psychiatry 22:11-21, 1970.
- 14. Paykell E S. Classification of depressed patients; a cluster analysis derived grouping. Brit. J. Psychiatry 118:275-88, 1971.
- Paykell E S, Weisman M, Prusoff B A & Tonks C M. Dimensions of social adjustment in depressed women. J. Nerv. Ment. Dis. 152:158-72, 1971.
- Raskin A, Schulterbrandt J, Reatig N & McKeon J J. Replication of factors of psychopathology in interview, ward behavior and self-report ratings of hospitalized depressives. J. Nerv. Ment. Dis. 148:87-98, 1969.
- Raskin A, Schulterbrandt J G, Reatig N & McKeon J J. Differential response to chlorpromazine, imipramine, and placebo; a study of subgroups of hospitalized depressed patients. Arch. Gen. Psychiatry 23:164-73, 1970.



Figure 4. Cluster Map on Depressive Disorders.

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