The Challenges Involved in Establishing a Research Technique

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Abstract

Many research techniques are well-accepted within the Information Systems (IS) discipline. From time to time, however, a researcher investigates a question that requires a novel approach. It is then incumbent on the researcher to justify that approach. The IS discipline has accumulated a large corpus of published works. A project is being undertaken whose purpose is to establish the conceptual foundations for a research technique for the critical analysis of published works, and to develop methodological guidance for its application. This article discusses the challenges that have confronted that undertaking.

Keywords: Research techniques; Research methods; Research methodology; Critical analysis of published works; Article critique; Critical content analysis

1 Introduction

Since the Information Systems (IS) discipline emerged c. 1965, a substantial body of publications has accumulated. For example, in mid-2019, the AIS eLibrary contains over 16,000 refereed works, John Lamp’s directory of IS journals identifies almost 700 active venues that publish IS works, of the order of 7,500 articles have been published in the ‘Basket of 8’ journals alone, and the major five IS conferences alone publish an additional 1,500 refereed papers per annum.

The accumulated IS literature evidences two particularly strong desires. A great deal of emphasis is placed on empirical research involving the observation and measurement of some aspect of IS practice. In addition, many papers are published that seek to establish or extend theories about IS practices, which can then provide a basis for further empirical research.

Important though these approaches are, progress in the discipline depends on some further elements as well. Meta-discussions are needed, in order to clarify such aspects as the discipline’s scope, the meanings of key terms, and the suitability of particular research techniques for particular purposes. The project reported on in this article is a contribution to one such meta-discussion.

The starting-point for the project reported on here is a conviction that critical thought about the existing IS literature has a vital role to play. Criticism is, after all, central to the notion of science, in that all propositions must be in principle refutable, all propositions must be regarded as provisional, and all propositions must be subjected to testing (Popper 1963). For this reason, criticism is inherent in the review process whereby works are evaluated as a condition of publication in refereed venues.

The IS discipline has to date demonstrated considerable nervousness about works that contain criticism of prior publications, and especially about works whose specific purpose is to criticise prior publications. This project is a response to a particular instance of this nervousness. I
conducted critical analysis of the articles in a Special Issue published by a leading, research-domain-specific journal that publishes many papers relevant to the IS discipline. I submitted the paper to the same journal as published the Special Issue. It was rejected, with a key factor being that the research technique adopted in the research was regarded by the reviewers as being illegitimate. It was subsequently also rejected by an IS 'Basket of 8' journal, but with an invitation to split the work into two articles, further develop the methodological component, and re-submit the substantive article as and when the methodological article achieves acceptance.

Although the conduct and publication of critiques of prior works are vital to progress in the discipline, the research methodology literature does not appear to currently provide a sufficient basis for work of this nature. A project has accordingly been undertaken to identify the necessary conceptual foundations, and develop a research technique for the critical analysis of published works.

The present article provides an overview of the project as a whole, with a focus on the challenges that have been encountered, and the difficulties that need to be overcome in order to establish the technique. The article commences by discussing methodological considerations in the establishment of a research technique. The nature and role of criticism in research and the relevance of critical theory research are considered. The article then identifies multiple existing research techniques that have relevance to this specific purpose, in order to enable conceptualisation of the new technique. The key contribution of this article is the identification of challenges that need to be overcome in order to establish a new technique within the IS discipline.

## 2 Methodological Considerations

A research technique needs to reflect the accumulated knowledge about research methods generally, and to be applicable to some particular category of research questions. This section addresses those foundational aspects of the project.

### 2.1 Definition of Terms and Scope

The IS literature evidences considerable looseness in its use of key terms relevant to this work. The term 'research methodology' is particularly badly abused. This article uses the following terms carefully, in a manner consistent with Kaplan (1964, pp. 18-19):

- 'research technique' refers to a specific process (such as structured interview, case study or action research);
- 'research method' refers to the process adopted in a particular research project, which comprises one or more research techniques customised to the specific purpose; and
- 'research methodology' refers to the disciplined study of research methods. It is not used as a synonym for either or both of 'research technique' or 'research method'.

The first challenge in devising a new research technique is to achieve clarity about the kinds of research that it is intended to address. The objective of the present project is defined as:

the development of a research technique for the critical analysis of the content of published works relevant to the IS discipline.
The term ‘published works’ (short form ‘works’) is intended to encompass entries in a wide variety of ‘publishing venues’, including at least refereed articles in journals, refereed papers in conference proceedings, refereed chapters in academic books, refereed academic books as a whole, and completed postgraduate dissertations. The works and venues might reasonably be extended to papers in workshops and symposia, and for some purposes may include PrePrints or Working Papers published by institutions with appropriate standing. In some circumstances, a case could be made for encompassing research reports commissioned by government agencies, foundations, industry associations and perhaps individual corporations. Some other forms of publication may be relevant, depending on the specific research purpose. For example, technical media or corporate white papers might be included, if the research purpose were to, for example, assess the impact of academic work on thinking among consultancies or within industry sectors.

There are multiple forms of research question to which the proposed technique might be applied. Table 1 contains several examples, intended to provide a sense of the scope of application.

The term ‘content’ refers to the text of the published work, encompassing sentences, tables, diagrams and formulae, and taking into account the context within which the work is situated. Depending on the nature of the work, the context is likely to include aspects of the research domain, the academic discipline and cultural factors.

Which publishing venues are ‘relevant to the IS discipline’ depends on the nature of the project. Beyond mainstream IS journals and conferences, for example, venues that publish IS works may be relevant, as may venues used by particular reference and cognate disciplines, e.g. in management, social sciences, or computer sciences.

Table 1: Sample Research Questions
The scope-definition for particular studies will vary considerably. Some might consider the complete corpus of 'published works relevant to the IS discipline'. The resource-intensiveness of the technique is such, however, that it is far more likely that each project’s focus will be on a particular population segment, with a sampling frame and sample selected from within that segment. A segment might be defined to be a particular venue (e.g. the complete set of ICIS Proceedings), or a time-span within one or more venues (e.g. the last 10 years of the ‘Basket of 8’ IS journals), or a focussed collection (e.g. one or more journal special issues, narrowly-specialised conferences, or academic books). Other approaches would be to define the population segment on the basis of the research domain that the works address, the theoretical lens that they use, or the research technique that they apply. The smallest sample-size, a single work, would only appear likely to be appropriate under very particular circumstances, such as papers that are widely-regarded as being highly significant, in particular on the basis of citation-count or some other measure of influence, or are highly original.

2.2 Meta-Methodology

A second set of challenges arises in relation to the desirable characteristics of a method for the creation of a method – hence ‘meta-methodology’.

A research technique is a socio-technical artefact as that term is used in design science (Niedermann & March 2012, Gregor & Hevner 2013, p.337). The design science approach is accordingly applicable to the project, and the process needs to reflect Peffers’ Design Science Research Methodology (DSRM), with problem identification and definition of objectives followed by design and development (Peffers et al. 2007). However, as discussed in the later parts of this article, the later steps of DSRM – demonstration and evaluation – are challenges that the present project has not yet met.

On the other hand, a research technique is a very particular kind of socio-technical artefact, and it is desirable that the process adopted in this project be founded on generic guidance in relation to the establishment of a new research technique. Sources of the nature of meta-methodology have proven to be elusive, however. For example, scans of the large library of Sage Publications, and searches on terms such as <meta-methodology> and <research technique design> came up largely empty-handed. Within the IS literature, it is uncommon to encounter guidance. For example, a foundational article on positivist case study technique (Benbasat et al. 1987) commences with a set of assertions of ‘Key Characteristics of Case Studies’, without any explanation of their source. A corresponding authority on interpretive case studies (Walsham 1995), discusses differences in the epistemological and ontological stances of the two approaches, and the role of theory, but offers little in relation to the process adopted and appropriate criteria for assessing the quality of the methodological guidance that the article offers.

Articles that provide guidance in relation to various forms of action research (Avison 2002, Davison et al. 2004) limit the criteria for judging the quality of a research technique to rigour and relevance. Klein & Myers (1999) offers principles for conducting “interpretive research of a hermeneutic nature” and presents quality criteria for that particular category of research technique, but it does not declare the process and the quality criteria that guided the authors’ work in constructing that guidance.

In the area of systematic literature reviews, Okoli & Schabram (2010) adopt the criteria used by Fink (2005): there must be a process that is systematic, is the subject of an explicit
explanation, and is reproducible by others, and the scope of works examined must be comprehensive. Boell & Cecez-Kecmanovic (2014) adds to that list "engagement with the literature [by means of] an ongoing hermeneutic process of developing understanding" (p.259).

In IS-cognate literature, Bonoma (1985), a work cited in Benbasat et al. (1987), posited two criteria for "sound" research methods in social science. One is "data integrity" ... those characteristics of research that affect error and bias in research results. It is an amalgam of what is variously referred to as 'internal validity' ..., 'statistical conclusion validity', and 'reliability". The other is what the author calls "currency" ... the characteristics of research that affect the contextual relevance of findings across measures, methods, persons, settings, and time. It is an amalgam of what is variously termed 'external validity' ... and 'pragmatic' or 'ecological validity'" (p.200). In practice, the author notes, there are conflicts between the two sets of objectives, and trade-off is unavoidable, i.e. all research techniques are, by their nature, inevitably flawed. "Ideally, a researcher can simultaneously pursue high levels of data validity and generalizability by adopting triangulation strategies which provide replication and/or corroboration of findings across methods within a single research project" (p.201). The author concedes, however, that 'intra-project triangulation' is very challenging, and that 'inter-project triangulation' is more common. The appropriateness of particular techniques is related to the current state of knowledge in the particular field. For example, the author positions case research very low on the data integrity scale but high on the currency scale, and indicates its appropriateness where "theoretical development is scant or uncertain" (p.201).

Alvesson & Sandberg (2011) proposed a research technique for 'problematisation', the first part of which is for "identifying and challenging assumptions underlying existing literature" (p.247). They shift the conversation beyond merely identifying "gaps in the literature" (which 'underproblematises' the prior literature, by reinforcing rather than challenging existing theories). They note disadvantages of disruptive approaches that focus on what is wrong with existing knowledge (which 'overproblematises' the prior literature). In seeking a middle road, they propose a five-set typology of assumptions that can be subjected to challenge. In their terms, 'paradigmatic assumptions' encompass ontological, epistemological and methodological aspects. Political, moral- and gender-related factors are 'ideology assumptions'; 'in-house assumptions' are those of a school of thought; 'field assumptions' are shared with other schools of thought in the particular field; and 'root metaphor assumptions' are associated with the imagery common in the relevant area of research. The quality criteria that they use for their own work appear to be change without bloodshed, and the generation of interesting new research questions.

On the basis of these varied exemplars, I posit the following as appropriate guidance in relation to the process of developing the new research technique:

- recognise a threshold requirement of rigour, reflecting conventional characteristics of quality research, such as express statements of a systematic process and desirable characteristics of that process; controls over observer bias; traceability, auditability and to the extent feasible reproducibility; and sufficiently deep and reflective engagement with the literature
- recognise a threshold requirement of relevance to an adequately defined context and target audience
• adopt the motivation of positive or constructive challenge to prior publications, rather than of negative or destructive disruption or confrontation

As regards the product that this undertaking seeks to deliver, I posit that a body of knowledge about a research technique comprises the following elements: contextual information; conceptual foundations; guidance in relation to the process to be used; exemplars of processes that have been articulated in order to address particular kinds of research questions; and expositions of the technique in use. The body of this article addresses the first three of those elements and includes preliminary discussion of the last two.

3 Criticism

The challenge addressed in this section is to clarify key features of the category of research questions for which the new technique is being devised. The focus of this project is the critical analysis of published works. Two aspects of the notion of criticism are particularly relevant. The first is the role that criticism plays in scientific research generally and in IS research in particular. The second is the genre of critical theory research.

3.1 The Role of Criticism in Research

The purpose of undertaking content analysis may be simply exposition, that is to say the identification, extraction and summarisation of content, without any significant degree of evaluation. There are benefits in undertaking content analysis in a positive frame of mind, and in assuming that all that has to be done is to present existing information in brief and readily-accessible form (as, for example, much of the present article does).

Alternatively, the researcher may bring a questioning and even sceptical attitude to the work. A common purpose of literature reviews is to depict the current state of theory in an area. The purpose may be to draw inferences for the particular context relevant to the project. Alternatively, it may be to identify gaps in the present body of theory. Gap-identification is a gentle form of criticism in the sense in which the term is used in this article. Alvesson & Sandberg (2011) distinguishes three modes of gap-spotting: confusion-spotting (where competing explanations exist); neglect-spotting (an area that is overlooked or under-researched, or where empirical support is lacking); and application-spotting (extending and complementing existing literature by drawing further inferences that can be tested).

The notion of criticism goes further than merely identifying previously under-researched corners of theory. A critic asks hard questions that necessarily cut to the core of academic work. Is it reasonable to assume that all relevant published literature is of high quality? that the measurement instruments and research techniques have always been good, well-understood by researchers, and appropriately applied? that there have been no material changes in the relevant phenomena? and that there have been no material changes in the intellectual contexts within which research is undertaken?

The term 'criticism' is often used in a pejorative sense, implying that the critic is merely finding fault, is being destructive rather than constructive, and is failing to propose improvements to overcome the faults while sustaining the merits. The sense in which the term is used here, however, is related to 'literary criticism', and embodies both positive and negative sentiments. As the term is used in this article:
Criticism presents an analysis of relevant features of a body of work, both positive and negative, including its framing, the analysis undertaken, and the inferences drawn.

Such terms as ‘constructive criticism’ and ‘critique’ might be preferred. They have the advantages of playing down the negative aspects, of indicating that the process is systematic, and of bringing focus to bear on the contribution being made by both the works that are being subjected to analysis and the critique they are being subjected to.

The justification for applying a sceptical eye to a body of work is that criticism plays a vital role in the scientific process. The conventional Popperian position is that the criterion for recognising a scientific theory is that it deals in statements that are empirically falsifiable, and that progress depends on scrutiny of theories and attempts to demonstrate falsity of theoretical statements: "The scientific tradition ... passes on a critical attitude towards [its theories]. The theories are passed on, not as dogmas, but rather with the challenge to discuss them and improve upon them" (Popper 1963, p.50).

However, senior members of a discipline commonly behave in ways that are not consistent with the Popperian position. This might be explained by the postulates of ‘normal science’, which view the vast majority of research work as being conducted within a 'paradigm' (Kuhn 1962) or 'disciplinary matrix' (Kuhn 1977) – "the common possession of the practitioners of a professional discipline [including its] symbolic generalizations, models, and exemplars" (p.296) – and subject to its conventions. In more practical terms, the problem may arise because senior members of any discipline have strong psychic investment in the status quo, and – no matter how cogent and important the argument – react negatively against propositions perceived to be at least disruptive, and even revolutionary. Firmly-worded criticism is normal in reviewers' reports on as-yet unpublished submissions, and may be acceptable if uttered by a senior member of a discipline about a contrarian idea, whereas it commonly attracts opprobrium if made about the contemporary wisdom, by an outsider or a relative newcomer.

In an influential commentary, Webster & Watson (2002) recommended that "In contrast to specific and critical reviews of individual papers, tell the reader what patterns you are seeing in the literature ... Do not fall into the trap of being overly critical" (p.xviii). On a literal reading, the authors merely warn against unduly strong or negative expression – a recommendation that the research technique under development needs to adopt. Unfortunately, the quoted words are capable of being interpreted as valuing politeness among researchers more highly than scientific insight and progress.

Similarly, Straub (2009, p.viii) advised authors that "papers should be in apposition [the positioning of things side by side or close together] rather than in opposition". Clearly, where a new theory subsumes an old one (as was the case in the example provided, of Einsteinian relativity absorbing Newtonian physics as a special case), the dictum 'apposition rather than opposition' is appropriate. Where, on the other hand, the new theory actively contradicts or is fundamentally at odds with, existing theory, it would be intellectually dishonest to represent the contrary or disruptive theory as though it were a soul-mate to, or merely a refinement of, existing theory. Further, a reader might all-too-easily interpret the advice as expressing a moral judgement that ‘criticism is a bad thing’. My contention is that scientific behaviour demands the opposite: it is an obligation of researchers to 'think critically' and to 'apply their critical faculties'. Politeness of expression and focus on the message rather than the messenger are elements of academic discourse, but they are second-order concerns rather than fundamental to science.
3.2 Critical Theory Research

Positivism and interpretivism are well-established approaches to research in IS. They have been joined by design science. And they have an odd bedfellow, in the form of what is variously termed 'critical research' and 'critical theory research'. The term 'critical' in this context is somewhat different from the sense of 'analysis of the merits and faults of a work' discussed in the previous section.

Both positivism and interpretivism are concerned with description and understanding of phenomena and behaviours. Sometimes the focus is on natural phenomena, but frequently the interest is in natural phenomena that have been subjected to an intervention. Importantly for the present project, however, both positivism and interpretivism involve strenuous avoidance of moral judgements and of 'having an agenda'. Design research, in contrast, is expressly purposeful and value-laden, in that the features designed into the artefact embody judgements about what is good in the particular context, and whose interests the goodness is to serve.

Critical theory research is concerned with description and understanding of phenomena and behaviours, but, like design science, it 'has an agenda'. Chua (1986) distinguished critical research from the positivist and interpretivist perspectives on the basis that the relations among real-world objects are transformed through subjective interpretation, conflict among actors’ interests is endemic to society, interpretations reflect ideology, and theory must take ideologies into account. In addition, and most contentiously, critical research embodies an assumption that theory must strive to overcome ideological dominance. See also Alvesson & Deetz (2000). Beyond mere 'gap-spotting', Sandberg & Alvesson (2011) champions 'problematisation', a term popularised by Foucault in the 1960s. It is concerned with 'the defamiliarisation of common sense', with "a central goal ... to try to disrupt the reproduction and continuation of an institutionalized line of reasoning" (p.32). Among the four forms that the authors discuss is 'critical confrontation'.

The IS literature reflects these sources, with critical research described as recognising the effects of power and the tendency of some stakeholders' interests to dominate those of other stakeholders. It brings to light "the restrictive and alienating conditions of the status quo" and expressly sets out to "eliminate the causes of alienation and domination" (Myers 1997). "Critical IS research specifically opposes technological determinism and instrumental rationality underlying IS development and seeks emancipation from unrecognised forms of domination and control enabled or supported by information systems" (Ceeez-Kezmanovic 2005, p.19). In Myers & Klein (2011), three elements of critical research are identified:

- **insight**, which is a feature also of interpretivist research, and which requires depth of study. An important role is played by reflexivity: "By intentionally expressing, questioning, and reflecting upon their subjective experiences, beliefs, and values, critical researchers expose their ideological and political agendas" (Ceeez-Kezmanovich 2001, p.147)

- **critique**, which "goes beyond interpretation to focus the researcher on the power structures that lie behind accepted interpretations" (p.24)

- **transformation**, which is "concerned with suggesting improvements to the conditions of human existence, existing social arrangements, and social theories" (p.24)
Elements of critical theory research are relevant to the present purpose. However, the sense of 'criticism' or 'critique' adopted by critical theory researchers is strongly value-laden and partisan, and hence wilfully disruptive. That contrasts with the definition of 'criticism' adopted here, which expressly involves "analysis of relevant features of a body of work, both positive and negative".

4 Relevant Research Techniques

The previous section established the distinctive difference about the intended new research technique, and hence clarified the justification for devising a new research technique. The next challenge is to identify and evaluate prior techniques whose purposes are related to it, in order to co-opt aspects that are relevant and avoid aspects that are not.

This section outlines a series of categories of existing research techniques that have at least superficial relevance to the present purpose. Consideration is given firstly to qualitative research techniques and then to traditional and systematic literature reviews. The third group comprises techniques referred to generically as 'content analysis'. A separate section outlines a particular and rather different form of content analysis. The final category is a form of literature review compatible with critical theory research.

4.1 Qualitative Research Techniques

A significant proportion of research involves the appraisal of content previously uttered by people. Qualitative research techniques such as ethnography, grounded theory and phenomenology involve the disciplined examination of content. That content may be uttered in natural settings by people within the research domain (e.g. in emails or social media postings) or it may be generated by researchers who inject themselves into otherwise natural settings by undertaking field research. Alternatively, the content may be captured in a contrived setting (laboratory experiments), or in a partially natural and partially contrived setting (e.g. interviews conducted in the subject's workplace). The content may originate as text, or in some other form, such as communications behaviour in verbal form – possibly transcribed into pseudo-text; as natural non-verbal behaviour ('body-signals'); or as non-verbal, non-textual communications behaviour (such as ticks in boxes in structured questionnaires).

The issues arising with analysis of these kinds of content are very different from those associated with the analysis of carefully-considered, formalised content, uttered by researchers, in published works that have been at least strongly edited and in most cases subjected to peer-review.

4.2 Literature Review

A context that is more closely related to the present purpose is literature reviews that examine substantial bodies of prior research. Traditional ‘narrative’ reviews have been criticised as being insufficiently rigorous (Oakley 2003, p.23). There are now expectations of structure, transparency and replicability, and the term ‘systematic’ review is commonly applied (Webster & Watson 2002, Okoli & Schabram 2010, Bandara et al. 2011). Examples particularly relevant to the present project include Galliers & Whitley (2002, 2007), which analysed themes in the ECIS conference series, and Clarke (2012) and Clarke & Pucihar (2015), which reviewed the corpus of Bled Conference papers. Grover & Lyytinen (2015) and Tarafdar & Davison (2018) reported on meta-analyses of articles in the ‘Basket of 8’ IS journals.
Although such approaches have relevance to the present project, their focus is on exposition, application, or at most interpretation, and the research techniques used were not devised in order to support critical analysis. Relevantly, Boell & Cecez-Kecmanovic (2015) argue that the recipes provided for ‘systematic literature reviews’ are not necessarily appropriate, particularly where the research technique that is applied allows for emergent and changing understanding of the phenomena, and where even the research question itself may be emergent.

4.3 Content Analysis

The term ‘content analysis’ refers to a cluster of techniques that seek to classify content into a manageable number of categories. Two definitions are:

"a research technique for making replicable and valid inferences from texts (or other meaningful matter) to the contexts of their use" (Krippendorff 2013, p. 24)

"the semantic analysis of a body of text, to uncover the presence of strong concepts” (Indulska et al. 2012, p.4, citing Weber 1990)

Many authors have attempted to categorise the various forms that content analysis takes. (See, for example, Hsieh & Shannon 2005, Drisko & Maschi 2016). The following four-way classification scheme is suitable for the present purpose:

(1) Pre-defined (a priori) categories

A methodologically strong approach is to derive the categories from existing theory. To the extent that the declared or inferred content of the text does not fit well to the predefined categories, there may be a need to consider possible revisions of the coding scheme, or even of the theory on which the research design was based. It may be feasible to draw inferences based on counts of the occurrences of categories and/or on the intensity of the statements in the text, such as the confidence inherent in the author's choice of language (e.g. "this shows that" cf. "a possible explanation is that"). However, as with any theory-driven research, the evidence extracted from the text may have a self-fulfilling-prophecy quality about it, i.e. there is an inevitable tendency to find more evidence in support of a theory than in conflict with it, and contextual factors may be overlooked. In order to enable auditability, it is important that not only the analysis be published, but also the raw material, the coding scheme, and the coding, at a sufficiently high level of granularity.

(2) Emergent categories

This approach is particularly appropriate when there is an absence of suitable theories to guide the establishment of a priori categories; but it also has relevance where the researcher is quite specifically challenging existing theories in the area. The process of necessity involves assumptions, and hence external validity of conclusions arising from this approach is likely to be limited. Depending on the degree of generality of the conclusions claimed by the author, full disclosure of the text selection, coding and inferencing procedures may be merely desirable or vital.

(3) Summative content analysis

This involves "counting and comparisons, usually of keywords or content, followed by the interpretation of the underlying context” (Hsieh & Shannon 2005, p.1277). The first step is to
explore usage, by "identifying and quantifying certain words or content in text with the purpose of understanding the contextual use of the words or content" (p.1283).

Because of the complexity and variability of language use, and the ambiguity of a large proportion of words and phrases, a naive approach to counting words is problematic. At the very least, a starting-set of terms needs to be established and justified. A thesaurus of synonyms and perhaps antonyms and qualifiers is needed. Allowance must be made for both manifest or literal meanings, on the one hand, and latent, implied or interpreted meanings (in semiotic terms, ‘pragmatics’), on the other. Counts may be made not only of the occurrences of terms, but also of the mode of usage (e.g. active versus passive voice, dis/approval indicators, associations made).

(4) Programmatic content analysis

Automated processing enables much larger volumes of text to be analysed. The coding scheme may be defined manually, cf. directed content analysis / a priori coding. However, some techniques involve purely computational approaches to establishing the categories, cf. ‘machine-intelligent’ (rather than human-intelligent) emergent coding. The processing depends, however, on prior data selection, data scrubbing and data-formatting. In addition, interpretation of the results involves at least some degree of human activity. Debortoli et al. (2016), distinguishes three alternative approaches to programmatic coding:

- **dictionary-based text categorization**, which "relies on experts assembling lists of words and phrases that likely indicate text’s membership to a particular category", cf. a priori coding

- **supervised learning methods** "[using] predefined categories; however, one does not explicitly know the mapping between text features and categories"

- **unsupervised machine-learning methods** "for categorizing text [which] find hidden structures in texts for which no predefined categorization exists”, cf. emergent coding performed programmatically

Given that the 'big data analytics' movement is highly fashionable, vast volumes of data are available, and there is a comfort factor involved in office-based work much of which is automated, it would appear reasonable to anticipate that programmatic analysis techniques may be a growth-area in the coming few years – although that growth may be tempered as their limitations come to be better appreciated (Clarke 2016a, 2016c, 2018).

Content analysis techniques exhibit varying degrees of structure and rigour, from impressionistic to systematic, and they may involve qualitative and/or quantitative assessment elements. Qualitative data may be gathered on a nominal scale (whereby differences are distinguished, but no ordering is implied) or on an ordinal scale (such as ‘unimportant’, ‘important’, ‘very important’). Quantitative data, on the other hand, may be on an ordinal scale, or on a cardinal or interval scale (i.e. an ordinal scale but with equal distances between values, e.g. degrees Celsius), or on a ratio scale (i.e. a cardinal scale, but with the additional feature of a natural zero, e.g. degrees Kelvin). Data collected on the higher-level scales, especially on a ratio scale, is able to be subjected to more powerful inferencing techniques.

Quantification generally involves measurement. This may be by counting, by comparing a real-world attribute against some standard, or by ‘sensing’ a real-world attribute and using the impulse to create one or more data-items whose contents are intended to correspond with the
state of the attribute. Although there is a common perception that quantification produces data that reliably represents the real world, many conditions need to be fulfilled for this to be so. Units of measure have arbitrary boundaries, and the configuration and calibration of measuring instruments is challenging. Moreover, some quantification techniques are justified by conventions that are poorly supported by theory. A significant example is the frequently-encountered but unjustified assumption that 'Likert-scale' data is not merely ordinal, but is on an interval scale (i.e. the spaces between the successive terms are identical), and even ratio (i.e. the scale also features a natural zero), in order to justify the application of powerful statistical techniques to the data.

Many authors, particularly those who work in the positivist tradition, implicitly equate qualitative data with subjectivity and quantification with rigour. This has the effect of deprecating qualitative analysis, or at least relegating it to pre-theoretical research, which by implication should be less common than research driven by strong theories. However, the majority of authors who make those assumptions spend only limited time considering the extent to which their own assumptions, and the processes underlying the act of quantification, may be arbitrary or themselves 'subjective'. Positivism embodies an implicit assumption that computational analysis necessarily leads to deep truth. The assumption needs to be tested in each particular circumstance, yet such testing is seldom evident.

Although quantification has advantages in terms of the scope for applying powerful analytical techniques, the degree of analytical rigour that quantification can actually deliver is heavily dependent on a number of factors. Critical among them are the text selection; the express judgements and implicit assumptions underlying the choice of terms that are analysed; the sophistication and comprehensiveness of the thesaurus applied; and the significance imputed to each term. In practice, a considerable proportion of research that uses content analysis techniques involves primarily qualitative data.

As with any research technique, all aspects need to be subject to quality controls. The coding scheme and the performance of the coding process are particularly critical (Krippendorff 1980, Weber 1990, Stemler 2001). Approaches include coding by individuals with strong experience in both the review of papers and the subject-matter, parallel coding by multiple individuals, review of individuals' coding by other parties, and publication of both the source materials and the detailed coding sheets, in order to enable audit by other parties.

The various approaches to content analysis outlined above appear to be accepted within the IS discipline, but their use has been somewhat limited. For example, in a survey of the articles published in six leading IS journals during the 1990s, Mingers (2003) found that the use of content analysis as a research technique was evident in only four of the journals, and even in those four in only 1-3% of all articles published during that time. In July 2019, of the over 16,000 refereed papers indexed in the AIS electronic library, 13 had the term 'content analysis' in the title (none published more recently than 2013, and only 5 of them in journals), and 72 in the Abstract (only 6 of them since 2013, but the most recent 12 in journals). In recently-published papers, the most common forms of text that have been subjected to content analysis are social media, consumer reviews, and other message content, with other categories including newspaper articles and corporations' 'letters to shareholders'. There appears to have been very limited application of these techniques to published works.

Many forms of content analysis are primarily descriptive, and at best interpretive. Their focus is on concepts, themes, patterns and relationships. Moreover, the semantics and pragmatics of
the source-materials may not be fully reflected, and only limited attention may be given to contextual factors. Critical analysis depends on interpretation, and it must delve deeply not only into the tenable meanings of the content, but also into the context and the assumptions inherent in the works being studied. It may also be necessary to follow trails such as cited works and terms used, in order to place the work within a genre, or within a ‘school of thought’.

4.4 Critical Discourse Analysis

A recent proposal endeavours to address these weaknesses. Wall et al. (2015) describe an approach that they say they have based on Habermasian strains of critical discourse analysis (CDA). Their starting-point is that "the information systems (IS) discipline is subject to ideological hegemony" (p.258). By ‘ideological hegemony’ the authors mean "the conscious or unconscious domination of the thought patterns and worldviews of a discipline or subdiscipline that become ingrained in the epistemological beliefs and theoretical assumptions embedded in scientific discourse (Fleck, 1979; Foucault, 1970; Kuhn, 2012)". They argue that "ideologies can be harmful to individuals who are disadvantaged or marginalized by them, and they can be problematic to scientific research because they represent blind spots" (p.258), and hence that "review papers [should] ... challenge ideological assumptions by critically assessing taken-for-granted assumptions" (p.257). The authors propose a seven-step process for critical discourse analysis (pp. 265-9).

All of the forms of content analysis outlined in this and the previous sub-section have relevance to the present purpose. However, the first four do not extend beyond exposition to critique. The fifth, on the other hand, adopts the ‘critical theory research’ tradition, and exhorts the righting of perceived wrongs to disadvantaged or marginalised individuals that arise from ideological assumptions adopted by designers. The scope of the critical analysis of published works research technique is intended to encompass not only critical theory research, but also research undertaken within the positivist and interpretivist traditions. It is therefore necessary to take care in applying the ideas embodied within critical discourse analysis, in order to avoid embedding commitment to social causes.

4.5 A Hermeneutic Approach to Literature Review

The emphasis on ‘systematic’ literature reviews (SLR) noted earlier has itself been subjected to criticism, in that it "suppresses aspects of quality in research and scholarship that are at least as important as clarity, countability and accountability – such as intertextual connectivity, critique, interest, expertise, independence, tacit knowledge, chance encounters with new ideas, and dialogic interactions between researcher, ‘literature’ and ‘data’" (MacLure 2005, p.394). More substantially, Boell & Cecez-Kecmanovic (2015) argue that the literature on the SLR technique has effectively kidnapped the term ‘systematic’. It has linked with the notion ‘systematic’ the requirements that literature review must necessarily begin with a clearly-defined research question, and that its results must evidence or must deliver rigour, objectivity, replicability, and absence of bias. Boell & Cecez-Kecmanovic contend firstly that these are not necessarily delivered by SLR, and secondly that, even if they are attainable, they are, for some forms of research, undesirable and harmful.

Further, in Boell & Cecez-Kecmanovic (2014) it is argued that a constructively loose and iterative process is needed, to avoid undue constraints and unlock insight and creativity: "Highly structured approaches downplay the importance of reading and dialogical interaction
between the literature and the researcher; continuing interpretation and questioning; critical assessment and imagination; argument development and writing – all highly intellectual and creative activities, seeking originality rather than replicability [MacLure, 2005, Hart, 1998]” (p.258).

To address these issues, Boell & Ceez-Kecmanovic “propose hermeneutic philosophy as a theoretical foundation and a methodological approach for studying literature reviews as inherently interpretive processes in which a reader engages in ever expanding and deepening understanding of a relevant body of literature. Hermeneutics does not assume that correct or ultimate understanding can be achieved, but instead is interested in the process of developing understanding” (p.259, emphasis added). Their framework, reproduced in Figure 1, comprises two intertwined cycles: a search and acquisition circle, and a wider analysis and interpretation circle (p.263). Rather than a carefully-planned and closed-ended process, this approach embodies “questioning and critical assessment … of previous research” (p.258). “Critical assessment … not only reveals but also … challenges the horizon of possible meanings and understanding of the problem and the established body of knowledge” (p.267).

Figure 1: A hermeneutic framework for the literature review process consisting of two major hermeneutic circles

The hermeneutic framework proposed is oriented towards the review of a body of literature. This will generally be selected because it has as its focus a particular body of theory, or perhaps a particular category of real-world phenomena or behaviour. Such a body of literature is within the scope of the notion of ‘published works’ that is the focus of the present project. On the other hand, the technique being devised here needs to encompass an even broader range
of 'published work' populations and sampling frames, such as publishing venue(s) or research technique(s).

5 Conceptualisation of the Critical Analysis of Published Works

Having addressed some of the preliminary challenges, the aim now is to draw from the substantial methodological resources identified above, and establish a framework for the specific category of research questions for which the critical analysis of published works is the appropriate technique.

The preceding discussion has identified structured and pre-determinable techniques relevant to some forms of ‘analysis of published works’. It has also highlighted a far more loose-limbed, adaptive and interpretive approach, which is imbued with strong, counter-cultural fervour, associated with the critical discourse analysis approach to content of Wall et al. (2015), and the hermeneutic approach to literature review of Boell & Cecez-Kecmanovic (2014). The diversity of flavour among contexts and purposes means that, in order to encompass all relevant variants, the new research technique needs to be described in a relatively abstract manner. Researchers then need to apply the abstract principles in order to customise a research method appropriate to each particular project.

Drawing on the preceding discussion, a set of strongly-desirable characteristics of the new research technique is presented in Table 2.

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**The Focus of the Research**

1. **Formal Content**
   The analysis is concerned with works that present carefully-considered textual content, in venues that generally apply formal review and editorial filters to the works that they publish

2. **Content and Method**
   The analysis is concerned with the content of the works, including methodological aspects of the content

3. **Critical Thought**
   The analysis applies critical thought to the content. This means that the analysis goes beyond exposition, description, explication, consolidation and interpretation of existing theory, and beyond mere detection of gaps in existing theory, to the drawing of implications from theory, the identification of conflicts among stakeholder interests, and consideration of the impacts of ideologies on the research domain

4. **Constructive Critique**
   The analysis is concerned with both the positive and negative features of the work, including its framing, the analysis undertaken, and the inferences drawn

5. **Content rather than Intent**
   The analysis is of the content of works. This may include the authors’ express intentions, or the author’s implied intentions where clear evidence exists, but not intentions of their authors that are inferred by the reviewer

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**The Framing of the Research**

6. **Appropriate Degree of Structuredness**
   Depending on the purpose of the research:
   - the analysis may be highly-structured, driven by a body of theory, addressing a pre-defined and specific research question, and applying a coding scheme established a priori;
   - the analysis may be lightly-structured and interpretive in nature, with an emergent coding scheme, seeking understanding, and progressively adapting the coding scheme and/or the research question;
   or
various points between the various extremes may be appropriate to the purpose, e.g. commencing with
a broad research question, a research design, and an a priori coding scheme, but remaining open to
iterative refinement and adaptation of the question, design and/or coding scheme, to reflect the
accumulated insights.

7. Designed-in Methodological Rigour
The analysis is subjected to such structuredness, consistency, comprehensiveness, transparency and auditability
constraints as are feasible and desirable in the particular context

The Research Process

8. Phased Reading
Preliminary ‘orientational reading’ is followed by deeper ‘analytical reading’, in order to provide confidence in
the appropriateness of the selection, coding and interpretation of passages. By ‘passage’ is meant a text-segment
of any length, including word, word-group, phrase, clause, sentence, paragraph or paragraphs. (For example,
the Macquarie Dictionary defines a passage as “an indefinite portion of a writing, speech, or the like ...”)

9. Coding Rigour
Sources of categorisations are documented, and appropriate techniques are applied, which may fall anywhere
within a wide range, from directed content analysis using a priori coding, via emergent coding, to critical
discourse analysis

10. Appropriate Quantification
• The scales on which data are collected are as strong as practicable in the circumstances (i.e. ordinal in
  preference to nominal, and ratio to cardinal or ordinal)
• The assumptions underlying quantification are critically examined, and are justifiable

11. Analytical Rigour
• The analytical techniques applied are appropriate to the scales on which the data are gathered
• The means are documented whereby reliability is achieved in selection, coding and interpretation
  activities
• Where a hermeneutic philosophy is adopted and understanding is sought, the most significant factor
  may be the transparency of evidence supporting the reasonableness of interpretations

12. Iteration
The analysis involves open-mindedness and introspective questioning by the researcher about their analysis and
assumptions, including loops back to earlier phases of the process, possibly resulting in adaptation of the
project’s framing, re-design of coding schemes, re-coding and/or reconsideration of inferences drawn, as
appropriate in the context

The Presentation of the Research

13. Declaration of the Final Form of the Research Question
• The research question is declared, and sufficient information is provided about such adaptation as
  occurred during the course of the project
• The research question evidences detail and precision consistent with the research purpose

14. Declaration of the Research Method
• Sufficient information is provided to enable the reader to understand and evaluate the appropriateness
  of the approach adopted and any adaptation that occurred during the course of the project
• Comprehensive supporting materials are made available to enable audit

15. Declaration of Researcher Perspective
The values underlying the researcher’s approach are identified, and where appropriate are compared and
contrasted with those that the researcher perceives to be embedded in the works

16. Qualitative Critique
A textual critique is presented, to the extent appropriate supported by quantitative evidence, analysing the
positive and negative aspects of the selected works, and perhaps by implication of the sampling frame or the
population
17. Inferential Rigour
- Critical comments are expressed with a degree of confidence commensurate with the nature of the evidence
- Where relevant, the text includes critical assessment of taken-for-granted assumptions by both the authors of works that are assessed, and, to the extent feasible, by the researcher undertaking the critical analysis

18. Careful Expression
The text is expressed in a measured manner, avoiding unduly strong expression, unduly positive or negative expression, and overly colourful speech

19. Avoidance of argumentum ad hominem
- Criticisms are made of the work and not of the author of the work
- Where hegemonic participation is evident, the default assumption is that the author adopted the viewpoint unconsciously
- An attribution of conscious hegemonic participation is not to be made unless reliable evidence is presented

20. Expression in Apposition Unless the Evidence Warrants Expression in Opposition
The text is no more confronting to or disruptive of existing theory than the evidence arising from the analysis warrants. In particular, where the conclusions and implications qualify, deepen or subsume existing theory, they are presented in apposition rather than in opposition

Table 2: Key Characteristics of the Critical Analysis of Published Works

6 Applications of the Technique
The process of developing the new research technique has broadly followed the first three phases of Peffers’ Design Science Research Methodology (DSRM – Peffers et al. 2007), viz. problem identification, objectives definition, and design and development. The next phase (demonstration) has been commenced but not brought to completion.

The first aspect of demonstration is the identification of specific contexts to which the technique is to be applied, and the second is the application of the framework in order to instantiate research methods appropriate to specific research questions. Four trials have been conducted and reported on, two of them published and two so far only in manuscript form. Each of them applies the theory of researcher perspective (Clarke & Davison 2019) to a particular set of published works. Of the sample research questions in Table 1, this most closely relates to item 10. The first trial, reported in Clarke (2015), considered a modest set of papers from the ACIS conference and the AJIS journal. The second, reported in Clarke (2016b), examined a larger set of papers presented at the Bled conference. The current manuscripts report on studies of Basket of 8 articles and a set of papers in the journal ‘Electronic Markets’.

The pilot projects undertaken to date attest to the practicality of the technique when articulated for, and applied in, a specific critical theory research context. The small set is not sufficiently rich to illustrate or demonstrate the usefulness of the guidance across all of the various project-types. Far less do the projects conducted to date represent Peffers’ fifth phase (evaluation), which involves observation and measurement of the new artefact’s effectiveness in addressing stated objectives.

7 Conclusions
This article has outlined the elements of a project to establish adequate conceptual foundations and guidance in relation to the implementation of a technique for critical analysis of the
content of published works relevant to the IS discipline. It has identified and drawn on a wide range of sources on techniques that bear some kind of relationship to the present purpose. It has proposed a set of key characteristics of a process of this nature, and indicated the scope of application. Articulation to apply to specific categories of critical content analysis, and application to particular sets of published works, are ongoing parts of the overall project.

The description of the process undertaken in the project to date has identified a series of challenges that are likely to confront each endeavour to create a new research technique. It is necessary to achieve clarity about the category of research questions to which the technique is intended to be applicable. It is vital to reflect and build on the accumulated knowledge about research techniques generally; but the methodology literature is less helpful in this regard than might be imagined, and the same is true of exemplars within the IS literature that are highly-cited in relation to particular research techniques.

A further challenge involves identifying the key features of the category of research questions that are in focus. In the present example, this involves the notion of (constructive) criticism and aspects of critical theory research. Armed with this level of understanding, it becomes possible to identify pre-existing techniques, and assess the extent to which elements of them do and do not provide insights relevant to the new technique.

The foundations having been laid, it becomes possible to undertake conceptualisation of the new technique, through the specification of key characteristics that it needs to have. The remaining challenges (only partly discussed in this article) are the articulation of the technique into forms that are directly relevant to particular forms of research question, application of the technique to a sufficient set of samples, and demonstration that the technique enables research questions to be satisfactorily answered.

The work reported here is limited to a single new research technique, and the trial applications relate to a single form of the many kinds of research questions that are within-scope of the technique. It is accordingly infeasible to generalise from this instance to all, or even to other individual instances of, new research techniques. This article does, however, provide researchers with a somewhat stronger starting-point for their own endeavours than has previously been available, because it identifies key considerations, points to a range of relevant sources, and provides an articulated example of their use to develop a particular kind of new research technique.

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