

Original Paper

# Word Frequency and Content Analysis Approach to Identify Demand Patterns in a Virtual Community of Carriers of Hepatitis C

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## Abstract

**Background:** Orkut, a Brazilian virtual social network, is responsible for popularization of the Internet among people of low income and educational level. It's observed that rapid growth of virtual communities can be reached by low cost Internet access in community local area network houses. Orkut poses an important social resource for Brazilian patients with chronic conditions like hepatitis C virus (HCV) carriers, who face several obstacles in adapting to everyday difficulties.

**Objective:** Identify Patterns of Recurring Demands (PRD) expressed in messages posted by members of virtual communities dedicated to HCV carriers.

**Methods:** Pre-selection: we identified terms commonly associated to HCV on generic Internet searches (primary Keywords - Kps); Kps were used to identify the most representative HCV communities in a virtual community site (Orkut); all messages published along 8 years on all topics of the community were collected and tabulated; the word frequency was used to construct a "word cloud" (graphic representation of the word frequency) on which was applied a content analysis technique.

**Results:** The most cited terms expressed: search for information about medications (prescribed and "forbidden"); emphasis on counting time, which were interpreted as surviving expectations; frequent mention of God, doctors, and "husbands" (female carriers were 68%). These elements provided material for further research – they will be useful in the construction of categories in discourse analysis.

**Conclusions:** The present work is a disclosure of preliminary findings considered original and promising. The word frequency/content analysis approach expressed needs of social support and material assistance that may provide subsidies for further qualitative approach and public health policies aimed to HCV carriers. The study of PRD by word frequency may be useful in identifying demands underestimated by other means.

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**KEYWORDS**

Internet; online communities; hepatitis C virus carrier; social support; qualitative research; content analysis; social behavior

## Introduction

Psychological complications and physical symptoms arising from hepatitis C are well-known and described as consequence and conditioning factor for recurrence [1]. Therefore, this combination of problems, treatment side effects, perspective of recurrence, and need for radical lifestyle changes, brings challenges to hepatitis C virus (HCV) carriers. It would be impossible to tolerate such obstacles for a long time without the social support from spouses, relatives, friends, and other HCV carriers. It is believed that the support coming from specialized virtual communities (VCs) represents an important resource for HCV patients who encounter obstacles in adapting to everyday difficulties. The Internet offers several tools for organization of virtual networks of chronic patients, which are here presented as an object of study.

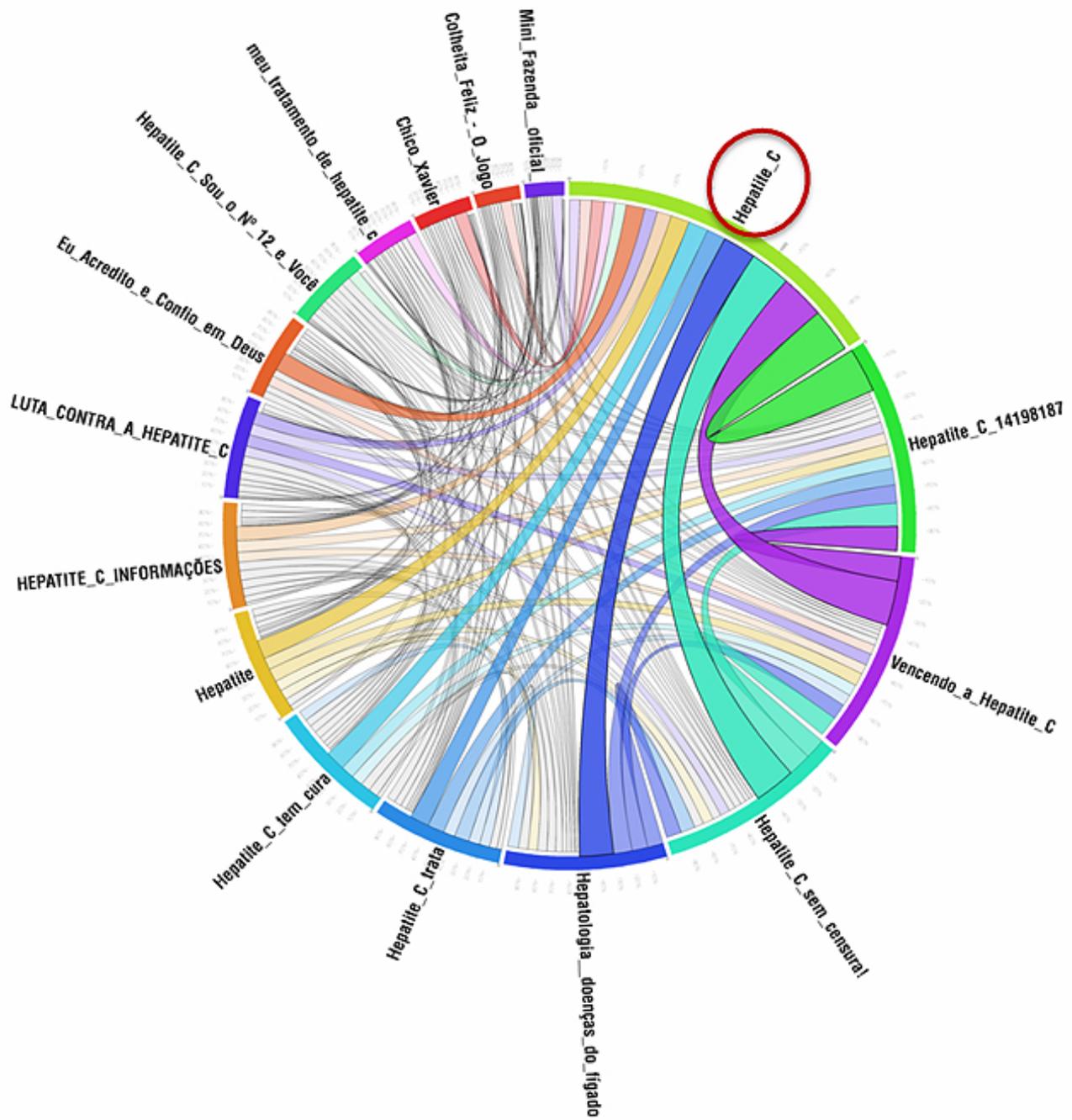
The purpose of the present research note is to identify patterns of recurring demands (PRD) posted by members of VCs organized by Brazilian HCV carriers. These preliminary results raised promising hypothesis that will be used by qualitative research experts. A broader "discourse analysis" will be organized based on VC postings and focus groups with HCV carriers in assistance environments.

## Methods

Methodology can be summarized as an incremental Internet search in decreasing dimensions of coverage, as described in detail by Carvalho et al [2]. We employed open access

algorithms (Google insights) to identify the most common terms associated to HCV in general searches—referred here as primary Keywords (Kps) as expressions of casual and indistinct interest. Orkut was chosen because of its long existence (established in January 2004) and its popularity in Brazil. In Orkut, thematic discussions are organized into "topics" in which messages are posted. The site also has special features for searching in which Kps were applied to disclose "specialized" (carriers) VCs. The VCs that mentioned any of the Kps at least once were selected. We assessed the "relevance weight" among Orkut HCV communities by choosing the ones in which Kps were more frequent. Associations of Kps applied among the most popular and active VCs can neutralize bias caused by arbitrary choices in the pre-selection process. This criteria is based on other algorithms like "page rank" [3], which estimates the relevance of a site using the number of highest expression links directed to it. From this set of VCs, the most representative were chosen by its time of existence, number of members, and mainly by the Kps frequency in discussions. This Dominant Community was considered for study. The relationship of the Dominant Community with its peers was studied through the Community Association Map (CAM, Figure 1), which defines the interrelationships between communities [4] to portray and confirm their dominance around a core of common interests. We developed scripts to collect and tabulate all messages published on all topics over eight years of the community's existence. A "word cloud" (in which word's size is proportional to its frequency) was generated in wordle to provide a graphic representation of the word frequency (Figure 2).

**Figure 1.** The Community Association Map (CAM) shows interrelationship between communities of users with the Dominant Community and confirm their dominance around a core of common interests.

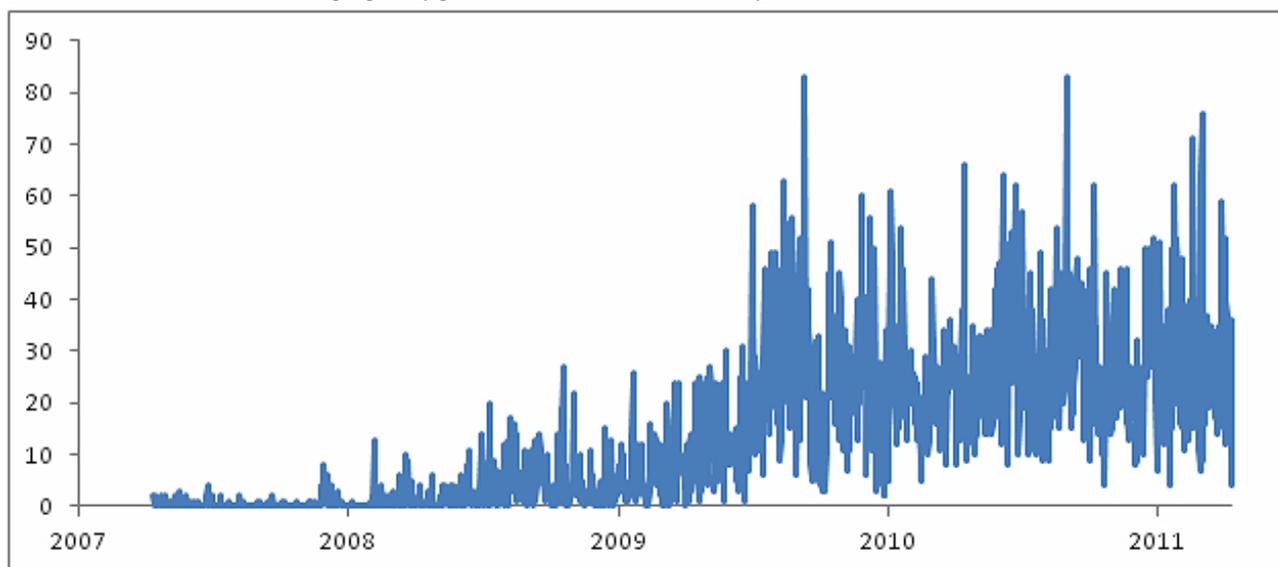




**Table 1.** Subset of prominent words from the *Dominant Community* forum (translated to English).

Words	Citations
<b>Most recurring words in frequency analysis</b>	
Treatment	9581
God	4077
Hepatitis	3329
Physician	2800
Virus	2674
Interferon	2281
Husband	971
Well	3411
Do	2822
Ribavirin	1288
Patients	1279
<b>Recurrent words related to the passage of time</b>	
Day	3156
Always	2852
Week	2285
Then	2170
Years	1771
Months	1454
During	1199
<b>Therapies for the control of HCV<sup>a</sup></b>	
Interferon	1554
Ribavirin	1048
Erythropoietin	317
PEGASYS	201
Folic acid	157
PEGINTRON	130
Filgrastim	109
Silymarin (alternative treatment)	63
<b>Potentially toxic drugs to CHCV<sup>b</sup></b>	
TYLENOL	121
Omeprazole	80

<sup>a</sup>HCV=hepatitis C virus<sup>b</sup>CHCV=chronic hepatitis C virus

**Figure 3.** Historical evolution of messages per day posted at the Dominant Community forum.

## Discussion

### Principal Findings

The PRD on the Internet are presented here as a low cost method easily applicable for guiding qualitative researchers on data collection. Hypotheses, linking concepts, and “bounding ideas” are essential for the portrayal of social support and can be easily weakened by bias and personal assumptions - which can be preventable by the PRD analysis. The HCV carriers are vulnerable to several psychological conditions and depressive symptoms that are usually identified and reported among them [7,8]. The Identification of PRD in communities with chronic diseases may expand our comprehension about their needs for social networks, presenting demands perhaps underestimated by public health policy makers. It’s interesting to notice that the results presented here support other conclusions recently reached by other methods. Sousa [6] describes carriers expressing their suffering strongly attached to expectations of obtaining medicines and healing in the context of the passage of the weeks, months, and years of survival. The elements described herein provide a basis for further, more detailed, research, in which the PRD are consolidated into central ideas for the construction of analysis categories. The primary purpose of the paper was to furnish unbiased material to a qualitative approach, which could reach findings applicable beyond the immediate boundaries of the study. According to qualitative research literature [9,10], it’s especially effective in cultural research, which deals with values, opinions, and perspectives that can be generalized in a broader view.

Another interesting aspect concerning the method refers to the study of VC through algorithms, a field underused so far despite several remarkable alternatives. In addition to reduced costs compared to conventional field research, there is an opportunity to capture discourses posted in moments of desperate need for support. Here, Internet VCs seem to transcend their merely informative context [11], and acquire a unifying force aimed at overcoming great obstacles [12]. Besides posting messages on

topics for mutual enlightenment and social support, maybe HCV carriers feel more comfortable talking about personal difficulties and living conditions when compared to conventional medical consultation environment. In general, stigmatized diseases or health conditions encourage individuals to use Internet as a main source of information and environment for sharing experiences [12-14]. Such preferences are not limited to the possibility of hiding identities in the face of uncomfortable topics, but also include the VC role of social support. Pattern analysis identified frequent use of words that suggest a need for spiritual support (God: 4077 citations) and social support (husband, 971). Words indicating the need for material support/care were extensively mentioned: *treatment* (9581), *doctor* (2800), and *interferon* (2281), and the association between *Interferon* and *Ribavirin* (also described by Sousa [6]). These results reinforce evidence that patients with chronic diseases have a distinct profile of engagement in virtual communities. We found agile dissemination of certain content and thematic consistency associated with interest in news about innovative therapies (new formulations of interferon; alternative therapies).

### Conclusion

The present work is a disclosure of preliminary findings considered original and promising. The word frequency / content analysis approach expressed needs of social support and material assistance that may provide subsidies for further qualitative approach and public health policies aimed to HCV carriers.

Research on PRD requires small resources in its development in contrast with important outcomes in terms of depiction of demands from patients with chronic diseases underestimated by other perspectives. The word frequency and content analysis can furnish hypotheses, linking concepts, and “bounding ideas,” which are essential for the portrayal of collective ideas and social support demands. The present findings describe some evidence of need for social and material support that may subside public policies aimed at carriers of HCV.

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## Conflicts of Interest

None declared.

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## Abbreviations

**CAM:** Community Association Map  
**HCV:** hepatitis C virus  
**Kps:** primary keywords  
**PRD:** patterns of recurring demands  
**VC:** virtual community

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