
Online Discourse and Network Structures of Yuseong-gu Public Libraries: Big-Data Text Mining and Topic Modeling for Evidence-Based Policy Design

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ABSTRACT

This study investigates how digital discourse surrounding Yuseong-gu public libraries is structured and how it informs evidence-based policy architecture. Online text data were collected from major Korean portals (Naver and Daum) between July 2022 and June 2025 using “Yuseong-gu public libraries” as the core search query. The corpus was analyzed using text mining, keyword network analysis, and latent Dirichlet allocation (LDA) topic modeling. Word frequency and TF-IDF results indicate that place-anchored identifiers (e.g., Yuseong-gu, Daejeon) and culture-related vocabulary constitute the discourse backbone, while managerial and operational terms such as integration, support, and homepage signal demand for coordinated governance and enhanced digital accessibility. N-gram analysis further emphasizes the demand for an integrated information and participation portal, most clearly reflected in the recurrent sequence “Yuseong-gu-integrated-library-homepage.” Network analysis reveals a high-density structure with a short average path length, confirming strong thematic interconnectedness; the node “library” functions as the primary hub and is directly linked to “culture,” indicating the library’s discursive positioning as a cultural platform. The findings support strategic policy directions, including a hub-satellite spatial system embedded across neighborhood life zones, cross-sectional programming integrating education, culture, and community participation, a mobile-first integrated digital portal, and institutionalized partnerships with schools and local cultural institutions.

1. Introduction

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Situated within contemporary debates that aim to rearticulate the publicness, accessibility, and right to learn embodied by local public libraries, this study begins with a central premise: everyday language produced and accumulated across the web and media can be transformed into a meaningful source of policy knowledge. Public libraries increasingly position themselves as local hubs for information, culture, and civic participation, operating in alignment with internationally shared principles that emphasize evidence-informed decision-making and community capacity building. Yet in a digital platform environment, citizens' lived experiences are difficult to capture through post hoc user satisfaction surveys or a limited number of interviews alone. Instead, they must be reconstructed from large-scale, unstructured textual flows—which can be modeled as semantic networks, affective patterns and relational configurations among actors. This calls for an analytical framework that moves beyond single indicators or event-centered assessments and instead integrates the interpretation of discourse structures (what is being said) with network structures (who is connected to whom).

To this end, the present research conducts an integrated quantitative–qualitative text-mining analysis of big-data materials collected from major Korean online platforms, including Naver and Daum, using “Yuseong-gu public libraries” as the focal search term. The dataset spans from July 1, 2022 through June 30, 2025. Using TEXTOM, the study operationalizes a multi-method design: it measures the salience and relative importance of key terms through word frequency and TF–IDF metrics; derives patterns of semantic co-occurrence and sequential linkage through N-gram analysis and keyword network modeling; and identifies latent thematic structures through latent Dirichlet allocation (LDA) topic modeling to delineate topics of policy relevance. The overall research design, as well as the scope of the data, channels, and procedural steps, are documented in detail in the project documentation and methodological records.

The objectives of this study can be summarized as follows. First, it identifies the structural characteristics of online discourse surrounding Yuseong-gu public libraries and specifies the core keywords that organize that discourse. Second, it synthesizes insights from multiple text-analytic techniques to provide an integrated account of the thematic architecture and relational dynamics that shape the Yuseong-gu public-library discourse. Third, it proposes strategic directions for public library operations, space, and services—explicitly grounded in empirical evidence.

Academically, this study aims to clarify the interface between the structuring of large-scale online discourse and policy design, thereby offering a methodological contribution that complements library research traditionally centered on satisfaction-based evaluation or case-study approaches. From a policy perspective, it seeks to provide a scientifically grounded basis for mid- to long-term master planning by leveraging topic and network indicators, in direct response to field-level demands for data-driven policy formulation and stronger integration between planning processes and evaluative metrics.

2. Literature Review

Research on data-driven decision-making and service innovation in public libraries has developed

along two main trajectories in both domestic and international scholarship. The first focuses on analyzing internally generated data—such as system logs, collection and circulation records, and website access traces—to model user behavior and to inform service and platform design. The second examines externally produced big data from news and social media to interpret the discourses and relational structures surrounding libraries, thereby supporting public communication and policy design. The “discourse–network integrated analysis” underpinning the policy architecture proposed in this study represents an attempt to connect these two streams and to operationalize governance and implementation frameworks for a local public library system (Yuseong-gu) at the municipal scale.

2.1 Big-data platforms, log analytics, and service modeling

In Korea, discussions on platformization of and service –enablement us library big data began to gain traction in the mid-2010s. Pyo et al. (2015) proposed a big-data service model centered on public libraries, articulating a staged structure of collection–analysis–service delivery. Building on this line of inquiry, On and Park (2020) empirically examined the applicability of a public library big-data platform through a case study of the Daejeon Hanbat Library. Yoon (2022) further advanced user-oriented platform design by proposing an integrated approach that links information on cultural programs and community services, thereby specifying design challenges at the interface between internal data and user-facing touchpoints. Earlier conceptual groundwork was also laid by Lee (2013), who systematized the concept of big data and articulated its potential integration into library information service system.

On the empirical side, domestic studies have analyzed internal indicators across multiple dimensions—including collection and circulation data (Lee & Lee, 2021), usage logs (Kim, Baek, & Oh, 2018), website usage patterns (Lee & Jang, 2019), and children’s and youth services (Baek et al., 2018). Collectively, these works have identified behavioral patterns such as user segmentation, seasonality, topic- and age-specific demand profiles, and linkages between programs and circulation. At the policy and planning level, Kim and Noh (2018) tracked trends in Korea’s Comprehensive Library Advancement Plan through big-data analysis, underscoring the importance of indicator design that aligns national planning with field-level implementation. This domestic research agenda has evolved alongside institutional and infrastructural supports, including the National Library of Korea’s “Library Information Naru” (2026) and public data utilization casebooks (2020), contributing to the foundations of data governance for public libraries.

2.2 Discourse analysis using news and social big data

A growing body of work has also examined social perceptions of libraries and the dynamics of public discourse. Han (2019) analyzed news big data from 1990 to 2018 to identify longitudinal patterns in library-related reporting. More recently, Song (2025) traced post-2000 cases concerning intellectual freedom through newspaper big data, reconstructing debates on freedom of expression and censorship through empirical analysis. This line of research demonstrates, in measurable terms, how libraries function as mediators and coordinators of public issues, and how media and public discourse shape the processes through which library policies and services are formulated.

2.3 Social media use and participation mechanisms in public libraries

International scholarship provides robust empirical evidence that social media can facilitate user engagement, marketing, and community building for public libraries. Aharony (2012), drawing on a content analysis of Facebook use in U.S. public and academic libraries, noted a prevailing tendency toward one-way communication centered on announcements and notices. Joo, Choi, and Baek (2018) analyzed 4,637 Facebook posts from public libraries and demonstrated the correlational structure between post types and engagement metrics (likes, comments, and shares), empirically indicating that content strategy is a key determinant of participation. Mathiasson and Jochumsen (2019) introduced an additional research pathway by leveraging Facebook event data to study public library programs, while Stvilia and Gibradze (2014) identified topical and utility-related factors associated with library tweets. Chua and Goh (2010) comparatively assessed libraries' adoption of Web 2.0 tools on library websites and showed that interactive and participatory functionalities are linked to perceived service quality. Together, these studies contribute to clarifying the policy relevance of social media data by demonstrating how discourse-level content (topics and agendas) interacts with network-level dynamics (interaction and diffusion).

2.4 E-government, public communication, and policy linkage to libraries

The policy implications of social media in the public sector are closely intertwined with the library context. Bertot, Jaeger, and Hansen (2012) argued that governmental social media use introduces new policy challenges concerning accessibility, privacy, preservation, and governance, and proposed corresponding policy responses and governance frameworks. Extending this perspective, Jaeger et al. (2012) theorized the co-evolution of e-government and public libraries, conceptualizing libraries' roles in networks, education, and partnerships within public service delivery. This strand of work underscores the need for social data strategies in libraries to be integrated with broader policy architecture—including performance indicators, accountability mechanisms, and participatory governance design—rather than being treated as standalone communication tools.

2.5 Methods and infrastructure: text mining, network analysis, and scalable processing technologies

Methodologically, both international and domestic studies have combined topic and sentiment analysis, content analysis, engagement metric modeling, and network analysis (e.g., retweets, comments, and co-tagging) to infer discourse, affect, and relational structures. For application at regional and institutional levels, however, scalable infrastructure capable of reliably processing high-volume streams and historical datasets is essential. Jeong et al. (2022) examined RDMA-based distributed processing, enabling high-throughput data transmission and low-latency computation across multiple nodes, and thereby proposed a technical architecture well suited to integrated analytical frameworks combining social media data with library usage log data.

2.6 Research gaps and the positioning of this study

In Korea, substantial progress has been made in analyzing internal data (collection, circulation, and logs) and in proposing big-data platforms and service models. However, studies that integrate social discourse and network structures to generate policy proposals at the local level remain comparatively limited. Internationally, research has accumulated on social media-based engagement and content strategies, diffusion structures, and program-related analyses, yet relatively few studies explicitly translate these insights into policy design frameworks that connect local governments and public libraries—such as indicator systems, decision-making flows, and partnership models. Against this backdrop, the present study uses Yuseong-gu as an empirical case to integrate big-data text mining (discourse) with network analysis, and to propose empirically grounded strategies for public library operations, space, and services. In doing so, it seeks to contribute to both academic scholarship and policy practice by advancing an integrated discourse-network analytical framework for local public library governance.

3. Research Methods and Procedure

3.1 Analytical Methods and Workflow

To improve methodological parsimony and interpretability, the analysis was organized into a three-module pipeline. First, lexical salience was quantified using word frequency and TF-IDF to identify backbone vocabulary and discriminative terms. Second, relational and sequential structure was examined by deriving N-gram co-occurrence chains and constructing a keyword network to assess connectivity and centrality patterns. Third, latent thematic structure was inferred via LDA topic modeling, and topic outputs were interpreted in conjunction with network evidence to support policy translation. Community detection was used as a robustness check to verify whether major discourse blocks persist across different partitioning logics.

Stage	Research Component	Specific Tasks
Stage 1 Literature Review	Review of relevant literature	<ul style="list-style-type: none"> Review and analyze literature related to big-data driven research on Yuseong-gu public libraries
Stage 2 Data Collection	Data acquisition	<ul style="list-style-type: none"> Collect Yuseong-gu public library-related big data using TEXTOM
Stage 3 Data Analysis	Keyword analysis via text mining	<ul style="list-style-type: none"> Identify core keywords related to Yuseong-gu public libraries through word-frequency analysis Derive term salience and relative importance using TF-IDF metrics Generate sequential co-occurrence (chain-word) networks using N-gram analysis

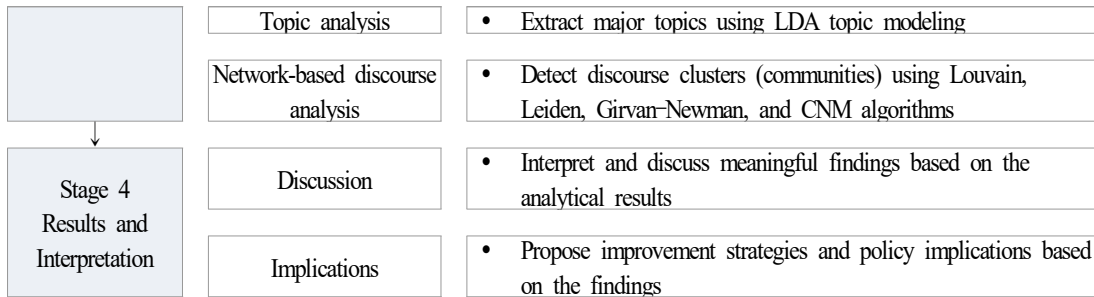


Fig. 1. Data Analysis Procedure

3.2 Data and Analytical Techniques

To develop a fine-grained understanding of recent trends regarding Yuseong-gu public libraries, this study collected big data and applied a suite of text-mining techniques. Data collection was restricted to Korea’s major portal platforms, Naver and Daum. Naver and Daum were selected because they are the two most widely used portal ecosystems in Korea and provide heterogeneous public-facing channels (e.g., news, blogs, and online communities) through which both institutional narratives and citizens’ everyday language are continuously produced and archived. In addition, these platforms allow consistent and replicable data acquisition within a single collection environment (TEXTOM), thereby reducing platform-induced measurement heterogeneity that can arise when combining sources with different access policies, indexing rules, or API constraints. While this restriction improves comparability and reproducibility, it may under-represent discourse circulating in closed or highly platform-specific environments; this limitation is therefore acknowledged in the limitations section. The core search keyword was set to “Yuseong-gu public libraries,” and the collection period was defined as July 1, 2022 to June 30, 2025 to comprehensively capture online discourse generated during the three-year window. The three-year observation window was chosen to balance recency and analytic stability. A shorter window risks insufficient volume and unstable topic estimation, whereas a substantially longer window increases the likelihood of concept drift and policy-context discontinuities. The selected period is long enough to capture multiple annual cycles and recurring program/usage signals, while remaining sufficiently recent to support policy-relevant interpretation for mid- to long-term planning. After compiling the corpus, the study sequentially applied word frequency analysis, TF-IDF, N-gram analysis, named entity recognition, network analysis, and LDA topic modeling to provide a comprehensive account of salient issues and structural patterns and thematic dynamics associated with Yuseong-gu public libraries.

Table 1. Analytical Dataset Information

Category	Details
Data collection tool	TEXTOM
Data sources (scope)	Naver (blogs, news, cafes, Knowledge iN, web documents) & Daum (blogs, news, cafes, web documents)
Collected fields	Title, body text, URL

Collection period	2022-07-01 to 2025-06-30
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3.3 Analytical Architecture and Issue Identification

The analytical architecture was designed as a chained pipeline: “collection → preprocessing → feature extraction → module-based analyses → integrated interpretation → issue identification.” Using TEXTOM, data related to “Yuseong-gu public libraries” were collected from Naver and Daum for the period July 1, 2022 through June 30, 2025, yielding a total corpus size of 720.43 KB. To minimize analytical noise and reduce error, duplicate entries and promotional/advertising posts were removed. The corpus was then preprocessed by applying a stopwords dictionary and conducting morpheme-level normalization to construct an analytically valid dataset.

Subsequently, word frequency and TF-IDF metrics were computed to estimate the salience of key terms. A keyword network was visualized based on N-gram co-occurrence patterns to identify discourse hubs and connectivity patterns. Finally, LDA topic modeling was implemented to infer latent thematic structures, and its outputs were cross-validated against the preceding results to assess the coherence between topic structures and relational patterns.

Key issues were derived from the principal results of the analyses. Specifically, the study integrated: (i) high-ranking TF-IDF terms, (ii) N-gram association strength, (iii) network centrality measures (e.g., degree and betweenness), and (iv) LDA topic probabilities. The resulting issue set was consolidated into policy-relevant categories—services, programs, space/facilities, operations/governance, and communication—thereby confirming a coherent bundle of core issues that explain prevailing trends related to Yuseong-gu public libraries.

The research questions guiding this study are as follows:

RQ1. How is online discourse concerning Yuseong-gu public libraries structurally constituted, and how are its core keywords organized?

RQ2. What evidence-based operational and policy strategies can be driven from the results of the data analysis?

4. Results

This section highlights three core findings. First, place-anchored and culture-related terms constitute the discourse backbone, indicating that Yuseong-gu public libraries are primarily discussed as locally embedded cultural infrastructure. Second, sequential co-occurrence and network structure converge on a hub-centered configuration in which “library” functions as the dominant node, with strong linkages to “culture” and place markers, underscoring a platform-like role rather than a single-purpose facility. Third, topic modeling consolidates these signals into policy-relevant thematic bundles that jointly support spatial reconfiguration, integrated digital access, and user-group-tailored services.

4.1 Keyword Analysis of Yuseong-gu Public Libraries Based on Text Mining

Within the study corpus, the terms “library” (396 occurrences; 4.037%), “Daejeon” (274; 2.793%), and “Yuseong-gu” (264; 2.691%) appeared with overwhelmingly high frequency. This pattern confirms that the core semantic axis directly specifying the analytic object and scope occupies the central position of the online discourse. At the same time, the distribution of terms such as “culture” (74), “region” (60), “center” (53), and “Daejeon Metropolitan City” (53) suggests that the library is widely perceived not merely as an information facility but as a component of local cultural infrastructure that is tightly interwoven with broader community networks. In addition, the presence of “book” (48), “reading” (34), and “education” (34) indicates that libraries continue to be strongly associated with their foundational functions—information provision and educational support.

At the level of space and facilities, terms including “facility” (36), “operation” (30), “scheduled” (27), “homepage” (26), and “visit” (26) were salient. This implies substantial public attention to administrative and service-related attributes such as the quality of the user environment, accessibility, and operational timelines. Moreover, the prominence of “apartment” (31) and “road/street” (31) reflects user expectations regarding neighborhood-level accessibility, spatial proximity, and the integration of library services into everyday residential environments.

In terms of user groups and service demand, “children” (26), “kids” (21), “students” (24), and “study” (21) accounted for a comparatively large share, indicating strong demand concentrated among school-age users—from early childhood through adolescence. Furthermore, the appearance of “daily life” (23), “event” (23), “recommendation” (21), and “information” (20) points to an evolving role for libraries that extends beyond reading and lending toward facilitating access to practical, everyday information and serving as platforms for community-level cultural exchange.

Three policy implications emerge from these findings. First, signals such as “culture,” “center,” “event,” and “integration” support the need to reposition libraries from conventional reading and lending sites toward community-embedded, multifunctional cultural hubs. Second, given the thematic clustering around “children,” “kids,” “study,” and “information,” there is a clear rationale for strengthening life-course and user-tailored services—expanding family-oriented programming and reinforcing educational support functions that can contribute to reducing learning disparities. Third, the frequency of “homepage,” “location,” and “visit” indicates that both digital accessibility and physical convenience must be improved in tandem; accordingly, upgrades to online access pathways should be pursued alongside systematic enhancements to on-site circulation routes and user guidance and signage systems.

Table 2. Top 50 Keywords Related to Yuseong-gu Public Libraries (Word-Frequency Analysis)

No.	Keyword	N	%	No.	Keyword	N	%
1	Library	396	4.037	26	Homepage/Website	26	0.265
2	Daejeon	274	2.793	27	In progress/Proceeding	26	0.265
3	Yuseong-gu	264	2.691	28	Location	26	0.265
4	Yuseong	111	1.131	29	City	26	0.265
5	Culture	74	0.754	30	Visit	26	0.265
6	Region	60	0.612	31	Integration	25	0.255
7	Center	53	0.54	32	News/Updates	24	0.245

8	Daejeon Metropolitan City	53	0.54	33	Time	24	0.245
9	Book	48	0.489	34	School	24	0.245
10	Wonsinhung	42	0.428	35	Peoseutelhwa	23	0.234
11	Bookstore	39	0.398	36	Daily life	23	0.234
12	Facilities	36	0.367	37	Event	23	0.234
13	Reading	34	0.347	38	Seoul	23	0.234
14	Education	34	0.347	39	Studio apartment (one-room)	23	0.234
15	Application/Registration	33	0.336	40	Presale (real estate)	22	0.224
16	Available	31	0.316	41	Rental/Lease	22	0.224
17	Apartment	31	0.316	42	Complex/Multifunctional	21	0.214
18	Road/Street	31	0.316	43	Kids/Child	21	0.214
19	Support	31	0.316	44	Program	21	0.214
20	Operations/Management	29	0.296	45	Study	21	0.214
21	Author/Writer	29	0.296	46	Recommendation	20	0.204
22	Book loan/reading)	28	0.285	47	Information	20	0.204
23	Project/Initiative	28	0.285	48	Park	20	0.204
24	Scheduled/Planned	27	0.275	49	Café	20	0.204
25	Children	26	0.265	50	Roundtable meeting	20	0.204

4.2 Identifying Core Keywords for Yuseong-gu Public Libraries Through TF-IDF Analysis

The TF-IDF results indicate that certain terms function as highly discriminative signals. Although their overall frequencies are relatively modest, elevated IDF values indicate strong contextual specificity and a greater capacity to delineate distinct thematic domains. Representative examples include “center” (TF-IDF 112,796; IDF 2.128), “hwa” (111,234; 2.396), “studio apartment/one-room” (95,522; 4.143), and “homepage” (63,998; 4.396). In contrast, terms such as “region” (123,822; 2.307), “culture” (134,373; 1.946), and “Yuseong” (118,051; 1.064) operate as foundational vocabulary that anchors the corpus, foregrounding spatiality, localness, and linkages with municipal governance within the broader library discourse.

Taken together, this lexical landscape suggests that the library is increasingly perceived not merely as a reading facility, but as a multifunctional cultural platform and a locally embedded support node for residents. This interpretation is reinforced by the semantic cluster around “center,” “support,” “service,” “operation,” “integration,” “program,” and “information.” In particular, “integration” (IDF 2.854), “operation” (2.311), and “support” (2.485) function as managerial and governance indicators directly associated with organizational and policy implementation efficiency. Their prominence points to priority agenda items for governance design, including service integration, operational standardization, and the enhancement of support systems.

From a user-demand perspective, terms such as “child/kid” (IDF 2.856), “daily life” (2.689), “study” (2.594), “class” (2.656), and “school” (2.659) signal strong needs concentrated among early

childhood through adolescent cohorts and underscore the imperative to strengthen the library's role as an educational support platform. Meanwhile, "science" (2.439), "café" (2.269), and "visit" (2.534) reflect growing expectations for a community-embedded spatial configuration in which experiential learning, leisure, and cultural activity converge.

Overall, the top TF-IDF keywords capture not just frequency but also strategic relevance; accordingly, terms with higher IDF values should be treated as policy-relevant priorities in future service planning, spatial programming, and educational content development. Consistent with the signals implied by "center," "integration," "program," "daily life," and "homepage," the findings support a strategic shift toward multifunctional, hybridized community spaces alongside a strengthened digitally enabled operating model. In addition, to respond to the demand profile articulated by "child/kid," "school," "study," and "class," the library should expand learning-support and career exploration programs for children, adolescents, and families, while institutionalizing partnership models with local education offices and schools. Finally, as implied by terms such as "pastel-hwa," "daily life," "café," "science," and "visit," reinforcing locally tailored, everyday-life-oriented content offers a viable pathway for evolving the library into an integrated community hub where culture, leisure, and learning coexist.

Table 3. Top 50 Keywords for Yuseong-gu Public Libraries Identified via TF-IDF Analysis

Keyword	TF-IDF	DF	IDF	Keyword	TF-IDF	DF	IDF
Daejeon	151.439	145	0.553	City	67.21	19	2.585
Culture	134.373	41	1.816	Operations/Management	67.006	25	2.311
Region	123.822	32	2.064	Visit	65.876	20	2.534
Yuseong	118.051	87	1.064	Scheduled/Planned	64.636	23	2.394
Bookstore	115.615	13	2.964	Children	64.608	21	2.485
Center	112.796	30	2.128	Multifunctional/Complex	63.935	12	3.045
Pastelization	111.234	2	4.836	Homepage/Website	63.398	22	2.438
Wonsinhung	108.57	19	2.585	Location	63.398	22	2.438
Yuseong-gu	100.831	172	0.382	News/Updates	63.337	18	2.639
Daejeon Metropolitan City	98.891	39	1.866	School	63.337	18	2.639
Studio apartment (one-room)	95.292	4	4.143	Study	62.254	13	2.964
Book	94.756	35	1.974	Integration	62.123	21	2.485
Book (loanword "buk")	90.352	10	3.227	Presale (real estate)	62.07	15	2.821
Library	89.545	201	0.226	Time	62.04	19	2.585
Application/Registration	88.975	17	2.696	In progress/Proceeding	61.136	24	2.351
Author/Writer	83.821	14	2.89	Class/Lesson	60.92	7	3.584
Support	81.811	18	2.639	Daily life	60.698	18	2.639

Reading	81.394	23	2.394	Lease/Rental	59.317	17	2.696
Apartment	80.135	19	2.585	Seoul	58.275	20	2.534
Facilities	77.837	29	2.162	Park	57.807	14	2.89
Education	77.225	26	2.271	Program	56.621	17	2.696
Event	76.641	9	3.332	Child/Kid	55.42	18	2.639
Road/Street	75.59	22	2.438	Public	54.917	14	2.89
Available	70.411	26	2.271	Science	54.801	12	3.045
Project/Initiative	69.577	21	2.485	Café	53.924	17	2.696

4.3 Keyword Influence Relationships Identified Through N-gram Analysis

The bigram analysis shows that Daejeon–Yuseong-gu (93), Yuseong-gu–Library (59), and Daejeon Metropolitan City–Yuseong-gu (44) occur most frequently, indicating that Yuseong-gu’s local identity is repeatedly articulated in conjunction with the institutional context of a public service system. Collocations such as Library–Homepage, Yuseong–Reading, and Library–Center suggest sustained attention to service accessibility, programmatic linkage, and functional expansion. In addition, combinations including Project–Linkage, Library–Operations, and Library–Program imply that social expectations extend beyond facility use to the strategic and policy-relevant organization of library operations. Taken together, these bigram patterns indicate that Yuseong-gu public libraries are predominantly recognized as place-based public institutions for which the perceived quality of operational delivery—particularly in relation to programs and digital access points (e.g., the homepage)—constitutes a central evaluative dimension.

At the trigram level, Yuseong-gu–Integrated–Library (19) and Daejeon–Yuseong-gu–Library (18) rank highest, underscoring the salience of an integrated operational framework and municipality-to-local institutional connectivity within the discourse. Sequences such as Integrated–Library–Homepage (16) and other webpage-anchored chains point to the growing centrality of online information services, while terms indicating institutional linkage (e.g., references to promotion-related bodies) suggest that the library discourse is not confined to usage narratives but extends into the policy and administrative domain. Moreover, chains such as Purchase–Reading–Materials and Project–Linkage–Roundtable foreground the library’s role as an implementation arena in which resources are allocated and stakeholder engagement is coordinated. This pattern supports the interpretation that the library is increasingly expected to operate not only as a reading-and-lending facility but also as a policy-relevant institutional platform embedded within local governance arrangements.

The tetragram results provide further confirmation of this interpretive trajectory. The most frequent sequence, Yuseong-gu–Integrated–Library–Homepage (15), directly signals demand for an integrated information service anchored in a centralized digital portal infrastructure. The recurrent emergence of highly specific place-name chains, including Daejeon Metropolitan City–Yuseong-gu–Wonsinhung–Nam-ro, indicates that users reference the library through concrete locational anchors, thereby highlighting the need for node-based and sub-area-tailored service design. In parallel, execution-oriented chains such as Reading–Materials–Purchase–Books and Project–Linkage–Roundtable–Held suggest an operational logic that emphasizes implementation, coordination, and feedback rather than symbolic

planning. Overall, the N-gram structure converges on three implications: strengthening the library's role as a digital information hub through an integrated platform centered on the homepage; establishing an implementation-driven operating model aligned with policy initiatives (as reflected in repeated linkages among projects, programs, and operations); and elaborating a community-embedded hub strategy that specifies differentiated functions at the sub-district level, in line with locally marked signals such as Wonsinhung and other sub-area references.

Table 4. Top 20 N-gram Chains (Bigram/Trigram/Tetragram)

Bigram(2)			Trigram(3)				Tetragram(4)				
Word 1	Word 2	Fre q.	Word 1	Word 2	Word 3	Fre q.	Word 1	Word 2	Word 3	Word 4	Fre q.
Daejeon	Yuseong-gu	93	Yuseong-gu	Integrated	Library	19	Yuseong-gu	Integrated	Library	Homepage	15
Yuseong-gu	Library	59	Daejeon	Yuseong-gu	Library	18	Daejeon	Gwanpyeong	Yemi	Core	10
Daejeon Metropolitan City	Yuseong-gu	44	Integrated	Library	Homepage	16	Daejeon Metropolitan City	Yuseong-gu	Wonsinhung	Nam-ro	8
Local	Bookstore	36	Daejeon	Gwanpyeong	Yemi	11	Revitalization	Local	Bookstore	Books	8
Wonsinhung	Library	31	Gwanpyeong	Yemi	Core	10	Local	Bookstore	Books	Purchase	8
Integrated	Library	20	Yuseong-gu	Wonsinhung	Nam-ro	9	Bookstore	Books	Purchase	Reading	8
Yuseong-gu	Integrated	19	Held	Local	Bookstore	9	Books	Purchase	Reading	Culture	8
Library	Homepage	19	Daejeon Metropolitan City	Yuseong-gu	Wonsinhung	8	Purchase	Reading	Culture	Project	8
Yuseong	Library	19	Revitalization	Local	Bookstore	8	Reading	Culture	Project	Linkage	8
Reading	Culture	18	Local	Bookstore	Books	8	Culture	Project	Linkage	Roundtable	8
Library	News/Updates	12	Bookstore	Books	Purchase	8	Project	Linkage	Roundtable	Held	8
Culture	Center	12	Books	Purchase	Reading	8	Linkage	Roundtable	Held	Local	8
Daejeon	Yuseong	12	Purchase	Reading	Culture	8	Roundtable	Held	Local	Bookstore	8
Yuseong-gu	Wonsinhung	12	Reading	Culture	Project	8	Held	Local	Bookstore	Promotion	8
Prugio	Dia	11	Culture	Project	Linkage	8	Yuseong-gu	Library	Future	Vision	8
Private	Lease/Rental	11	Project	Linkage	Roundtable	8	Library	Future	Vision	Direction	8
Daejeon	Gwanpyeong	11	Linkage	Roundtable	Held	8	Future	Vision	Direction	Setting	8
Gwanpyeong	Yemi	11	Roundtable	Held	Local	8	Vision	Direction	Setting	Library	8
Yemi	Core	11	Local	Bookstore	Promotion	8	Direction	Setting	Library	Development	8
Library	Daejeon	10	Yuseong-gu	Library	Future	8	Setting	Library	Development	Research	8

4.4 Results of Topic Modeling: Key Topics in the Yuseong-gu Public Library Discourse

In this study, a six-topic solution was determined to be optimal. Specifically, the model with six topics achieved the highest coherence score, indicating the strongest semantic cohesion among terms and, consequently, the clearest topic boundaries. This level of structural clarity is particularly advantageous for policy interpretation and field-level application, as it supports more straightforward translation of analytic outputs into actionable policy and operational initiatives.

Importantly, adopting a six-topic structure is also practically effective for designing user-centered operational strategies and developing differentiated policy responses for distinct stakeholder groups (e.g., children, older adults, and citizen creators/entrepreneurs). By minimizing thematic overlap across topics, the six-topic configuration provides a more transparent and analytically robust set of implementation pathways and reduces ambiguity in prioritization and responsibility assignment.

Moreover, the selection of the number of topics was not based on intuition or experience alone. Rather, it was grounded in quantitative evidence produced through text-mining diagnostics (e.g., perplexity and coherence), thereby strengthening the scientific rigor and explainability of the decision-making process. In this respect, the approach offers a reusable, data-driven strategic modeling template that can be replicated in mid- to long-term development planning for local public libraries.

The six-topic framework also enables a multi-layered analytical perspective that moves beyond fragmented interpretation of single issues. It simultaneously captures intersecting policy domains—such as spatial integration, reading culture, and age-friendly services—thereby facilitating an integrated understanding of complex governance and service challenges. This, in turn, supports a reframing of the library not merely as an access point for information resources, but as a multifunctional cultural complex and a hub for everyday-life policy implementation embedded within the local community.

Finally, because the topic structure is supported by measurable coherence and boundary sharpness, it provides a principled basis for strategic consolidation and prioritization. Low-impact or redundant domains can be integrated and strengthened, while topics with higher urgency and broader spillover effects can be positioned as strategic priorities. For example, themes clustered around “local culture + reading activities” warrant early action given their potential to reinforce local identity and expand civic participation.

These findings are not limited to Yuseong-gu. The analytical model is scalable to other municipal-level local governments (municipalities) as a framework for developing community-embedded cultural policies, and it also has strong potential to inform a broader policy research framework for public libraries nationwide through the systematic adoption of digital text mining. Ultimately, the six-topic solution reflects the multi-dimensional policy demands facing Yuseong-gu public libraries and provides sufficient explanatory power and practical utility to serve as foundational evidence for a mid- to long-term library master plan—enabling cross-cutting strategies that intersect target-group policies (children, older adults, citizen creators) with function-oriented agendas (spatial integration and digital-operational innovation).

Table 5. Semantic Topic Naming and Policy Directions Based on Keywords Across Six Topics

Topic No.	Core Keywords (Examples)	Topic Label (Semantic Naming)	Policy Interpretation and Recommendations
Topic 1	Yuseong-gu; Daejeon; locality/region; space; integration	Place-based integrated multi-purpose space strategy	- Reposition the library as a neighborhood-level cultural hub and build an integrated cultural complex platform by linking the library with existing underutilized spaces/facilities (e.g., apartment community spaces).
Topic 2	reading; reading culture; books; programs; experiential activities	Expanding everyday-reading and strengthening experiential content	- Move beyond a conventional, reading-room-centered model and expand participatory library operations centered on reading-culture events and citizen-engagement experiential programs.
Topic 3	children; families; youth; education; after-school	Life-course services for children and families	- Develop integrated content that combines care, education, and play—such as reading-and-play programs for preschool/elementary children and family reading activities involving parents.
Topic 4	authors; creation; exhibitions; arts; citizen participation	Citizen-centered cultural and arts creation platform	- Transform the library into a platform for local authors' and residents' content creation, exhibitions, and arts activities, and activate services such as invited author talks and mechanisms for sharing creative works.
Topic 5	older adults; welfare; ageing; health; leisure	Age-friendly library operating model	- Provide senior-tailored services that include access to health and welfare information, lifelong learning opportunities, and digital literacy education.
Topic 6	digital; web portal; smart; operations; information access	Digital operational innovation and strengthened information accessibility	- Enhance remote access and operational efficiency through website redesign, expanded online information services, and the introduction of smart-library functions (e.g., unattended self-checkout/return systems).

Table 6. Topic-Number Optimization Results (Perplexity and Coherence)

Number of Topics	Perplexity Score	Coherence Score	Remarks
2	-9.011171164522356	-5.616667137446529	* Perplexity and coherence were computed to determine the optimal number of topics.
3	-9.563560933816445	-5.986642258150357	
4	-10.047434038318746	-6.200615064447032	* Perplexity (complexity) is a model-fit indicator; lower values indicate better fit.
5	-10.427448645121704	-7.124067233121968	* Coherence (semantic cohesion) assesses within-topic interpretive consistency; higher values indicate stronger coherence.
6	-10.876286530057225	-7.416839192774488	* Perplexity-based selection: the lowest perplexity occurs with 10 topics (-12.457), followed by 9 topics (-12.117).
7	-11.289792095606238	-7.053158071848232	
8	-11.707588136876637	-7.12397252250328	* Coherence-based selection: the highest coherence occurs with 6 topics (-7.41), followed by 5 topics (-7.12).
9	-12.117396203871289	-7.178678211454141	
10	-12.457340897229347	-7.113857999668603	

LDA topic modeling is an algorithm that probabilistically clusters words with similar meanings across large document collections to infer latent themes. In this study, it was employed to identify salient issues emerging from Yuseong-gu public library-related data and to interpret underlying trend patterns. In the visualization, the size of each topic circle represents the topic's prevalence (i.e., its proportional weight) within the corpus; accordingly, larger circles can be interpreted as more structurally central thematic domains.

The analysis indicates that the keyword clusters yield ten strategic policy directions necessary for planning and implementation. These directions suggest that future-oriented operational models extend well beyond physical space expansion to include digitally enabled information services, science-oriented specialization, family-friendly governance models, and strengthened community linkages. In particular, the findings confirm that integrated multifunctional space development, neighborhood-scale (everyday-life) embedded strategies, and participation-driven operating models can serve as core pillars of Yuseong-gu’s future library policy.

To translate these topic groups into actionable policy, maintaining balanced provision across everyday living areas (life zones) is essential. A decentralized system that distributes library functions across key localities—such as Wonsinhung, Jeonmin, and Gujeuk—would support spatially balanced service development. In areas with dense apartment housing and clusters of educational and cultural facilities, establishing new neighborhood-based public libraries or pursuing targeted facility remodeling would be a viable policy approach. At the same time, an institutionalized cooperation framework between Daejeon Metropolitan City and Yuseong-gu is necessary to align district-level implementation with a metropolitan-scale library infrastructure planning framework. Such alignment would enable a coherent, operationally implementable policy portfolio that reflects both localized spatial conditions and differentiated user demand.

Table 7. LDA Topic Modeling Results (Top Terms and Term Probabilities by Topic)

Topic	Term	Prob.	Topic	Term	Prob.	Topic	Term	Prob.	Topic	Term	Prob.	Topic	Term	Prob.
1	Library	0.031	2	Library	0.045	3	Library	0.041	4	Library	0.049	5	Daejeon	0.022
1	Daejeon	0.028	2	Daejeon	0.033	3	Yuseong-gu	0.027	4	Yuseong-gu	0.031	5	Yuseong-gu	0.02
1	Yuseong-gu	0.021	2	Yuseong-gu	0.029	3	Daejeon	0.02	4	Daejeon	0.024	5	Library	0.019
1	Yuseong	0.016	2	Resources	0.013	3	Daejeon Metropolitan City	0.01	4	Yuseong	0.015	5	Yuseong	0.012
1	Culture	0.01	2	Yuseong	0.013	3	Culture	0.008	4	Book (buk)	0.007	5	Application	0.009
1	Apartment	0.006	2	Bookstore	0.012	3	Yuseong	0.008	4	Book	0.007	5	Available	0.006
1	Center	0.005	2	Culture	0.009	3	Center	0.007	4	Region	0.006	5	Visit	0.006
1	Education	0.005	2	Book	0.009	3	Facilities	0.007	4	Education	0.006	5	Roundtable meeting	0.005
1	Pastel tone	0.005	2	Reading	0.008	3	Daily life	0.005	4	Culture	0.006	5	Progress	0.005
1	Application	0.005	2	Center	0.005	3	Education	0.004	4	Center	0.005	5	On-site/field	0.005
1	Facilities	0.004	2	Children	0.005	3	Time	0.004	4	Author	0.005	5	Culture	0.005
1	Available	0.004	2	Project/initiative	0.005	3	Support	0.004	4	Reading	0.005	5	Seoul	0.005
1	Integration	0.004	2	Daejeon Metropolitan City	0.005	3	School	0.004	4	Bookstore	0.004	5	Candidate	0.005
1	Time	0.004	2	Support	0.005	3	Road	0.004	4	Wonsinhung	0.004	5	Lawmaker (assembly member)	0.005
1	Studio apartment (one-room)	0.004	2	Roundtable meeting	0.004	3	Wonsinhung	0.004	4	Launch/Start	0.004	5	Hot spring	0.004
1	Book (buk)	0.003	2	Jeongmong (token)	0.004	3	Songgang	0.003	4	Project/initiative	0.004	5	Daejeon Metropolitan City	0.004
1	Courses	0.003	2	District mayor	0.003	3	Region	0.003	4	Hosting (event)	0.004	5	Author	0.004
1	Updates	0.003	2	Hosting (event)	0.003	3	Car	0.003	4	Facilities	0.004	5	City	0.004
1	Daejeon Metropolitan City	0.003	2	Integration	0.003	3	Mixed-use/complex	0.003	4	Website	0.003	5	Acting (interim)	0.004
1	Work	0.003	2	Recommendation	0.003	3	Scheduled	0.003	4	Support	0.003	5	Lease	0.003
1	Progress	0.003	2	Book (buk)	0.003	3	Residential	0.003	4	Scheduled	0.003	5	National	0.003

complex													Science Museum	
1	Park	0.003	2	Updates	0.003	3	Program	0.003	4	Residents	0.003	5	Daedong Middle School	0.003
1	Support	0.003	2	People	0.003	3	Author	0.003	4	Updates	0.003	5	Capacity	0.003
1	Region	0.003	2	Author	0.003	3	Distance	0.003	4	Visit	0.003	5	Democratic Party	0.003
1	Website	0.003	2	Education	0.003	3	Operations	0.003	4	Daejeon Metropolitan City	0.003	5	Website	0.003
1	Recognition	0.003	2	Youth	0.003	3	Available	0.003	4	Cafe	0.003	5	Game	0.003
1	Study	0.003	2	Purchase	0.003	3	Community	0.003	4	Real estate	0.003	5	Recommendati on	0.003
1	Happiness	0.003	2	Pregnant women	0.003	3	Book	0.003	4	Hotel	0.003	5	Scheduled	0.003
1	Residential complex	0.003	2	Seoul	0.003	3	Progress	0.003	4	Policy	0.003	5	Citizens	0.003
1	Operations	0.003	2	Americano (abbr.)	0.003	3	Songchon-don g	0.003	4	Special lecture	0.003	5	Lee Jae-myung	0.003
Topic	Term	Prob.	Topic	Term	Prob.	Topic	Term	Prob.	Topic	Term	Prob.	Topic	Term	Prob.
6	Daejeon	0.029	7	Library	0.025	8	Library	0.058	9	Library	0.041	10	Daejeon	0.034
6	Library	0.025	7	Daejeon	0.024	8	Yuseong-gu	0.032	9	Yuseong-gu	0.029	10	Library	0.03
6	Yuseong-gu	0.021	7	Yuseong-gu	0.019	8	Daejeon	0.031	9	Daejeon	0.021	10	Yuseong-gu	0.022
6	Yuseong	0.009	7	Wondong	0.012	8	Yuseong	0.011	9	Wonsinhung	0.015	10	Book	0.009
6	Daily life	0.007	7	Culture	0.011	8	Center	0.007	9	Pastel tone	0.015	10	Text/Writing	0.007
6	Culture	0.006	7	Yuseong	0.008	8	Culture	0.007	9	Yuseong	0.009	10	Culture	0.006
6	Wondong	0.006	7	Bookstore	0.008	8	Region	0.007	9	Daejeon Metropolitan City	0.007	10	Region	0.006
6	Apartment	0.006	7	Resources	0.007	8	Operations	0.006	9	Class	0.005	10	Daejeon Metropolitan City	0.006
6	Fantasy	0.005	7	Daejeon Metropolitan City	0.007	8	Daejeon Metropolitan City	0.006	9	Road	0.005	10	Familiarization	0.005
6	Road	0.005	7	Center	0.006	8	Wonsinhung	0.006	9	Apartment	0.005	10	Available	0.005
6	Center	0.005	7	Apartment	0.006	8	Science	0.005	9	Review	0.005	10	Yuseong	0.004
6	Available	0.005	7	Road	0.006	8	Children	0.004	9	Noeun-dong	0.005	10	Application	0.004
6	Office	0.005	7	Housing sale/allocation	0.005	8	Recognition	0.004	9	Organization	0.004	10	Exploration/Inve stigation	0.004
6	Scheduled	0.005	7	Support	0.005	8	Application	0.004	9	Nam-ro	0.004	10	Event	0.004
6	Facilities	0.004	7	East	0.005	8	Gwanpyeong	0.004	9	Center	0.004	10	Progress	0.004
6	Book	0.004	7	Americano (abbr.)	0.005	8	School	0.004	9	Region	0.004	10	Deduction	0.004
6	Education	0.004	7	Streetlights	0.004	8	Website	0.004	9	Scheduled	0.004	10	City	0.003
6	Application	0.003	7	Car	0.004	8	Book	0.004	9	Operations	0.004	10	Button	0.003
6	School	0.003	7	People	0.004	8	Location	0.004	9	Facilities	0.004	10	Americano (abbr.)	0.003
6	Recognition	0.003	7	Cafe	0.004	8	Reading	0.004	9	Location	0.004	10	Bookstore	0.003
6	Population	0.003	7	Bookshop	0.004	8	Integration	0.003	9	Exhibition	0.004	10	Seoul	0.003
6	Infrastructure	0.003	7	Reading	0.004	8	Visit	0.003	9	Recommendati on	0.004	10	Car	0.003
6	Location	0.003	7	Wonsinhung	0.004	8	Yemi	0.003	9	Priority	0.004	10	Road	0.003
6	Park	0.003	7	Campus	0.004	8	Facilities	0.003	9	Performance	0.004	10	Study	0.003
6	City	0.003	7	Application	0.003	8	Core	0.003	9	Book	0.003	10	Space	0.003
6	Region	0.003	7	Older sister (eonni)	0.003	8	Management	0.003	9	Culture	0.003	10	Sharing	0.003
6	Byeong (token)	0.003	7	Author	0.003	8	Progress	0.003	9	Ramen	0.003	10	Storage	0.003
6	Residential complex	0.003	7	Event	0.003	8	City	0.003	9	Mixed-use/com plex	0.003	10	Acting (interim)	0.003
6	Illustration (dchwa)	0.003	7	City	0.003	8	Cafe	0.003	9	Daejeon City	0.003	10	Management	0.003
6	Daejeon Metropolitan City	0.003	7	Kindergarten	0.003	8	Available	0.003	9	Study	0.003	10	Municipal	0.003

Table 8. Summary of LDA Topic Modeling Results (10-Topic Solution)

Topic No.	Representative Top Keywords (Examples)	Semantic Topic Label	Summary of Policy Implications
Topic 1	- Library; Daejeon; Yuseong-gu; Culture; Region; Yuseong; Space; Residents	Place-based library hub strategy	- Position the library as a district-level hub platform and develop an area-wide deployment and utilization strategy to ensure balanced coverage across Yuseong-gu.
Topic 2	- Daejeon; Yuseong-gu; Center; Residents; Region; Welfare; Space; Tradition	Library as a community welfare-culture integrated complex	- Integrate library operations into a welfare-and-culture complex model and expand resident-led programs through consolidated management and programming.
Topic 3	- Region; Residents; Space; Daily life; Nature; Environment; Park; Linkage	Everyday-life-embedded environmental public-service hub	- Strengthen neighborhood-based operations and create eco-friendly spaces (e.g., forest libraries, park-linked libraries) to align library services with daily-life environments.
Topic 4	- Reading; Programs; Authors; Education; Exhibitions; Arts; Citizen participation	Cultural/arts education and reading-culture promotion platform	- Expand hybrid services that combine creative activities with local authors, reading education, and arts experiences to deepen participation and program impact.
Topic 5	- Books; Reading; Use; Services; Smart; Web Portal; Information	Digitally enabled information access and service innovation	- Enhance smart-library functions, expand online information services, and strengthen website accessibility to improve user access and service efficiency.
Topic 6	- Library; Yuseong-gu; Daily-life; Culture; Apartments; Location; Convenience	Decentralized, life-zone-oriented operations strategy	- Establish small, distributed libraries near everyday convenience facilities to improve proximity, accessibility, and routine use within a residential neighborhood.
Topic 7	- Daejeon; Yuseong-gu; Region; Daejeon Metropolitan City; Books; Reading	Integration of administrative coordination and reading-centered agendas	- Promote integrated implementation of reading- and content-related initiatives under a metropolitan-district collaboration framework (city-gu intergovernmental coordination).
Topic 8	- Yuseong-gu; Operations; Space; Region; Science; Wonsinhung; Children	Science-specialized and child-friendly library services	- Plan science-and-culture specialized libraries linked to KAIST and the national R&D cluster, while expanding child-focused content and programming.
Topic 9	- Yuseong; Reading; Culture; Daily life; Books; Time; Operations; Space	Embedding reading-culture in everyday life and space-based operations	- Extend opening hours and configure open, flexible spaces to strengthen the everyday normalization of reading and reinforce space-centered services.
Topic 10	- Library; Yuseong-gu; Region; Daejeon Metropolitan City; Space; Citizens; Transition	Library as a future-oriented civic platform	- Strengthen the library's role as a community-centered platform for digital democracy experimentation (e.g., a public deliberation forum and community hub).

4.5 Relationship Analysis of Yuseong-gu Library Activities

The results are clearly organized into four thematic clusters. First, the space- and physical-infra-structure cluster—comprising library–operations–facilities–support–center–space—exhibits strong connectivity based on similarity coefficients, pointing to policy and management issues directly linked to expanding space-based services and strengthening the library’s physical service foundation. Second, the place-based cluster consolidated around Daejeon–Yuseong-gu–region–Yuseong underscores the need for library policy that is tightly aligned with the administrative-territorial context and local governance structure. Third, the function-oriented cluster converging on education–reading–culture–books reflects strong social expectations regarding the library’s educational and cultural roles; notably, reading and education demonstrate an exceptionally strong association (similarity = 0.2041). Fourth, the everyday-life embedded cluster linking apartment–road/street–function–center reveals the library’s practical significance within residents’ daily routines and the library’s positional embeddedness within neighborhood-scale living environments.

From a network perspective, the term “library” functions as the primary hub node, forming similarity links of 0.07 or higher with nearly all keywords. In addition, terms such as Yuseong-gu, Daejeon, operations, and education form multiple connections with core keywords, indicating that they can be treated as key structural variables in policy design and strategic planning. This suggests that the discourse hub is structurally anchored around the library itself, while place markers (Yuseong-gu, Daejeon) and the operational–educational axis provide the principal structural supports that stabilize and organize that hub within the broader semantic network.

Table 9. Analysis of High-Similarity Keyword Pairs

Key keyword pair	Similarity coefficient	Interpretation
Library – Books	0.1037	- Indicates that books remain the library’s core content, reflecting the persistence of a traditional service image.
Library – Operations	0.1087	- Suggests frequent discussion of operational dimensions, including policy, staffing, and systems.
Yuseong-gu – Daejeon	0.2011	- Reflects strong linkage in terms of geographic positioning and the administrative integration context.
Yuseong – Yuseong-gu	0.1129	- Shows a high internal correlation attributable to overlapping use of local place names referring to the same area.
Education – Reading	0.2041	- Indicates that reading is consistently discussed as directly tied to educational outcomes.
Facilities – Library	0.1017	- Shows that the library is often referenced in relation to its physical facilities and spatial accessibility.
Apartment – Road/Street	0.1202	- Indicates that mobility and accessibility are discussed together in the context of neighborhood infrastructure and everyday spatial connectivity.

Policy implications can be derived along several lines. First, because the current discourse remains strongly anchored to a conventional image centered on operations, facilities, and books, there is a need to diversify library functions by expanding digital content, hybridized spaces, and creative programming. Second, since the geographic configuration of Daejeon–Yuseong-gu–Yuseong operates

as the baseline frame through which policy narratives are articulated, policy design should foreground place-based publicness and spatial accessibility as core principles. Third, given the exceptionally strong coupling between reading and education, it is strategically sound to prioritize education-collaboration content targeting school-age children and families. Fourth, the findings support a shift toward an everyday-life embedded spatial model: by leveraging the neighborhood network implied by apartment-road/street-center, the library can develop community-oriented spaces that foster a cyclical user experience in which daily life, learning, and culture mutually reinforce one another.

Table 10. Co-occurrence Matrix (1-mode; Similarity Coefficients)

	Library	Daejeon	Yuseong-gu	Yuseong	Culture	Region	Center	Daejeon Metro City	Books	Wonsihung	Bookstore	Facilities	Reading	Education	Application	Availability	Apartment	Road	Support	Operations
Library	0	0.1186	0.1681	0.1389	0.0717	0.0564	0.0729	0.1031	0.1037	0.0427	0.0255	0.1017	0.0835	0.0862	0.0344	0.0872	0.0556	0.0671	0.0407	0.1087
Daejeon	0.1186	0	0.2011	0.1057	0.0732	0.0548	0.0628	0.0797	0.0726	0.052	0.0173	0.0872	0.0692	0.0752	0.0433	0.0863	0.0534	0.0508	0.0598	0.1126
Yuseong-gu	0.1681	0.2011	0	0.1129	0.1069	0.0917	0.0909	0.1768	0.1253	0.0585	0.045	0.0919	0.124	0.101	0.0733	0.1224	0.0478	0.0971	0.0765	0.1556
Yuseong	0.1389	0.1057	0.1129	0	0.0881	0.0557	0.0403	0.0308	0.1394	0.0559	0.0412	0.1042	0.1305	0.0954	0.0366	0.0877	0.0995	0.0309	0.0173	0.0842
Culture	0.0717	0.0732	0.1069	0.0881	0	0.0815	0.0655	0.0225	0.088	0.0182	0.0631	0.061	0.1371	0.0651	0.05	0.0534	0.0441	0.0201	0.0254	0.0939
Region	0.0564	0.0548	0.0917	0.0557	0.0815	0	0.0464	0.038	0.0889	0.0184	0.0696	0.0616	0.1188	0.0282	0.0001	0.0216	0.0089	0.0305	0.0085	0.0593
Center	0.0729	0.0628	0.0909	0.0403	0.0655	0.0464	0	0.0825	0.0195	0.0001	0.007	0.124	0.0119	0.0454	0.0349	0.0391	0.0861	0.0491	0.0413	0.0429
Daejeon Metro City	0.1031	0.0797	0.1768	0.0308	0.0225	0.038	0.0825	0	0.0671	0.0509	0.0001	0.0711	0.0137	0.0521	0.03	0.0598	0.0247	0.1691	0.0355	0.0985
Books	0.1037	0.0726	0.1253	0.1394	0.088	0.0889	0.0195	0.0671	0	0.0541	0.0598	0.0453	0.2041	0.0415	0.0212	0.0159	0.0001	0.0001	0.0001	0.0524
Wonsihung	0.0427	0.052	0.0585	0.0559	0.0182	0.0184	0.0001	0.0509	0.0541	0	0.0064	0.0229	0.0442	0.0105	0.0161	0.0362	0.0099	0.0341	0.0001	0.0265
Bookstore	0.0255	0.0173	0.045	0.0412	0.0631	0.0696	0.007	0.0001	0.0598	0.0064	0	0.0001	0.1046	0.0001	0.0001	0.0001	0.0001	0.0001	0.0001	0.0376
Facilities	0.1017	0.0872	0.0919	0.1042	0.061	0.0616	0.124	0.0711	0.0453	0.0229	0.0001	0	0.0185	0.1937	0.0001	0.1213	0.1669	0.038	0.064	0.0444
Reading	0.0835	0.0692	0.124	0.1305	0.1371	0.1188	0.0119	0.0137	0.2041	0.0442	0.1046	0.0185	0	0.0339	0.0391	0.0194	0.0001	0.0001	0.0001	0.0855
Education	0.0862	0.0752	0.101	0.0954	0.0651	0.0282	0.0454	0.0521	0.0415	0.0105	0.0001	0.1937	0.0339	0	0.0123	0.037	0.0917	0.0174	0.0879	0.1016
Application	0.0344	0.0433	0.0733	0.0366	0.05	0.0001	0.0349	0.03	0.0212	0.0161	0.0001	0.0001	0.0391	0.0123	0	0.1138	0.0001	0.0001	0.0001	0.0468
Availability	0.0872	0.0863	0.1224	0.0877	0.0534	0.0216	0.0391	0.0598	0.0159	0.0362	0.0001	0.1213	0.0194	0.037	0.1138	0	0.0702	0.1202	0.0001	0.0467
Apartment	0.0556	0.0534	0.0478	0.0995	0.0441	0.0089	0.0861	0.0247	0.0001	0.0099	0.0001	0.1669	0.0001	0.0917	0.0001	0.0702	0	0.0496	0.0278	0.0001
Road	0.0671	0.0508	0.0971	0.0309	0.0201	0.0305	0.0491	0.1691	0.0001	0.0341	0.0001	0.038	0.0001	0.0174	0.0001	0.1202	0.0496	0	0.0158	0.0219
Support	0.0407	0.0598	0.0765	0.0173	0.0254	0.0085	0.0413	0.0355	0.0001	0.0001	0.0001	0.064	0.0001	0.0879	0.0001	0.0001	0.0278	0.0158	0	0.0924
Operations	0.1087	0.1126	0.1556	0.0842	0.0939	0.0593	0.0429	0.0985	0.0524	0.0265	0.0376	0.0444	0.0855	0.1016	0.0468	0.0467	0.0001	0.0219	0.0924	0

- A co-occurrence matrix was constructed based on terms that appear together within the same textual context (co-occurrence).
- A 1-mode matrix is typically used to analyze relationships among terms (word-word relationships).

4.6 Network Analysis Results

The network exhibits high density and a short average path length, indicating that information diffusion and thematic interrelatedness are strongly integrated across the discourse space. At the same time, because a subset of keywords functions as central hubs, future policy keyword selection and content curation processes are likely to be most effective if they adopt a hub-centered approach—designing derivative and diffusion strategies that radiate from these high-salience core terms. Meanwhile, overall betweenness centralization is extremely low, suggesting that the network does not depend on a single gatekeeper node and instead supports a distributed, multi-path structure. This configuration is advantageous for planning programs and cross-cutting services that flexibly combine distinct themes, as it enables multiple thematic entry points and recombination without bottleneck effects.

Table 11. Network Properties and Values

Network Measures	Value	Network Measures	Value
Nodes	20	Average Path Length	1.12105
Total Edges	167	Degree Centralization	29.08771
Diameter	2	Closeness Centralization	0.2128
Average Degree	16.7	Betweenness Centralization	0.00003

Across the full-network results, “library” recorded the highest values in both word frequency and centrality, confirming its role as the primary organizing node of the discourse. In parallel, geographic and administrative terms—such as “Daejeon,” “Yuseong-gu,” and “Wonsinhung”—also show relatively high centrality, indicating that library-related discourse and cultural policy considerations are closely tied to place-specific, locally differentiated strategies. This finding supports the need to pursue living-area-based (neighborhood-scale) library policies in tandem with customized services at the sub-district (eup-myeon-dong) level.

Moreover, the frequent co-occurrence of “culture,” “center,” and “books” with “library” highlights the growing prominence of the library as a multifunctional cultural complex and a space for creative activity. This pattern suggests that policy should more strongly prioritize content-oriented spatial innovation strategies, including cultural-arts education, digital creation spaces, and makerspaces. By contrast, keywords such as “operations,” “support,” and “application/registration” appear less often in absolute frequency, yet they provide critical leverage points along connectivity pathways for improving administrative and operational service quality. Accordingly, these terms warrant prioritized attention at the detailed design stage of the policy operational model, where implementation feasibility and service delivery mechanisms are specified.

Taken together, the results support a coherent strategic direction: establishing a library-centered, multi-issue policy agenda (positioning the library as a policy platform); designing regionally tailored libraries embedded in everyday living areas (operationalized through sub-district (eup-myeon-dong) level differentiation); expanding policy models that integrate space and content (via linkages among culture, books, and centers); and strengthening implementation capacity through systematic refinement of operational and support systems.

Table 12. Overall Network Analysis Results

Term	Frequency(n)	Percentage(%)	Term	Frequency(n)	Percentage(%)
Library	396	4.0367	Bookstore	39	0.3976
Daejeon	274	2.7931	Facilities	36	0.367
Yuseong-gu	264	2.6911	Reading	34	0.3466
Yuseong	111	1.1315	Education	34	0.3466
Culture	74	0.7543	Application/ Registration	33	0.3364
Region	60	0.6116	Availability	31	0.316
Center	53	0.5403	Apartment	31	0.316
Daejeon Metropolitan City	53	0.5403	Road/Street	31	0.316

Books	48	0.4893	Support	31	0.316
Wonsinhung	42	0.4281	Operations	29	0.2956



In the shortest-path analysis, “library” and “culture” were found to be directly connected (one step). In the visualization, the edge linking the two nodes is rendered as a thick, dark gray line, suggesting a relatively high cosine similarity and/or co-occurrence frequency. Because this relationship is established without any intermediary (bridging) node, the shortest distance is interpreted as 1 (Fig. X).

This finding indicates that the library is positioned not merely as an information-provision facility but as a cultural platform within the local discourse structure. Accordingly, it may be beneficial to integrate the design of local cultural promotion initiatives with exhibition, performance, and experiential programs, while institutionalizing collaborative governance with relevant municipal departments (e.g., the Culture and Arts Division and the Lifelong Education Division). Such coordination would enable the library to function as a cultural-content coordination hub. In the short term, expanding programming through book concerts and reading-culture festivals is appropriate; in the mid to long term, a more strategic direction is to develop the library into a sustainable node within the local cultural ecosystem by connecting and mobilizing diverse cultural actors across the community.

4.7 Clustering Analysis Results

The community structure was analyzed within the keyword network. To achieve an analysis that is both internally consistent and sufficiently discriminative, four community-detection algorithms were applied in combination: Louvain, Leiden, Girvan–Newman, and Clauset–Newman–Moore (CNM). Each algorithm contributes a distinct analytical advantage: Louvain identifies discourse blocks via modularity optimization; Leiden strengthens cluster reliability by improving intra-community connectivity; Girvan–Newman, by sequentially removing high-betweenness edges, helps reveal peripheral or weakly integrated terms; and CNM serves as a complementary validation tool, particularly useful

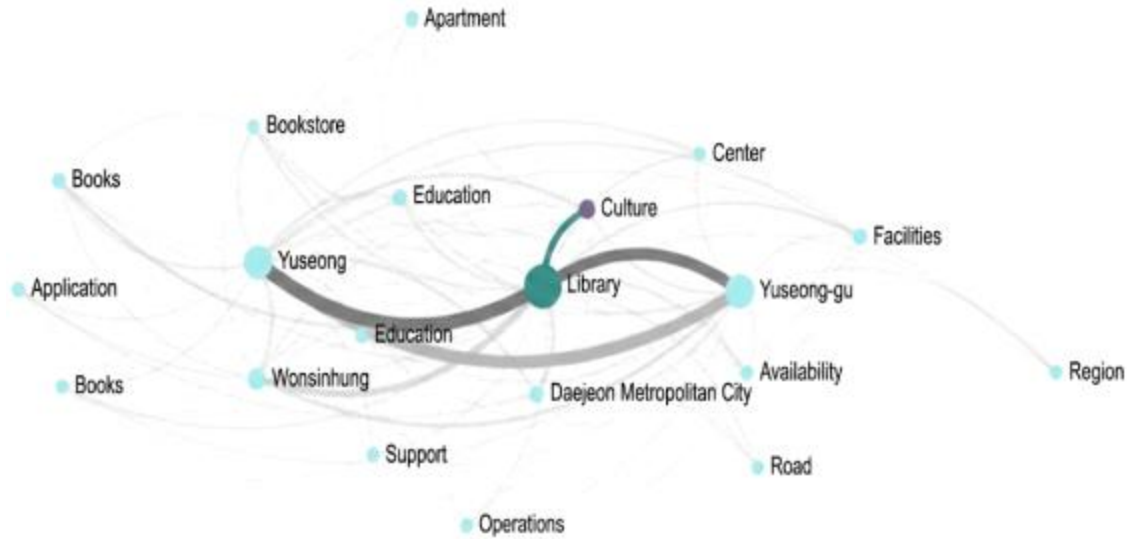


Fig. 2. Shortest Path between “Library” and “Culture”

for assessing whether the network simultaneously contains a library-centered structure and an everyday-life infrastructure-related structural axis.

4.7.1 Louvain Community Detection

The Louvain algorithm begins by assigning each node to its own cluster and then iteratively moves nodes into neighboring candidate clusters to maximize modularity. Modularity increases when within-cluster link density is high and between-cluster connectivity is relatively sparse; consequently, the algorithm is oriented toward identifying a partition that most cohesively explains the network’s community structure.

The Louvain results indicate three substantive communities. Cluster 1 (green) is centered on library–culture–Daejeon Metropolitan City–Yuseong-gu, foregrounding the library’s cultural function and its role as a place-based public hub. This configuration simultaneously highlights the structural linkage among locality, publicness, and cultural resource distribution. Cluster 2 (purple) is organized around the node set support–apartment–application/registration, capturing policy demand and accessibility dynamics associated with residential living environments and institutional support mechanisms. This cluster underscores the need for a public library operational model that is structurally integrated with neighborhood-level infrastructure. Cluster 3 (blue) consolidates center–facilities–operations–road/street, concentrating on issues related to spatial infrastructure and operational governance systems. It implies a policy agenda focused on operational optimization and stronger integration with multifunctional public facilities.

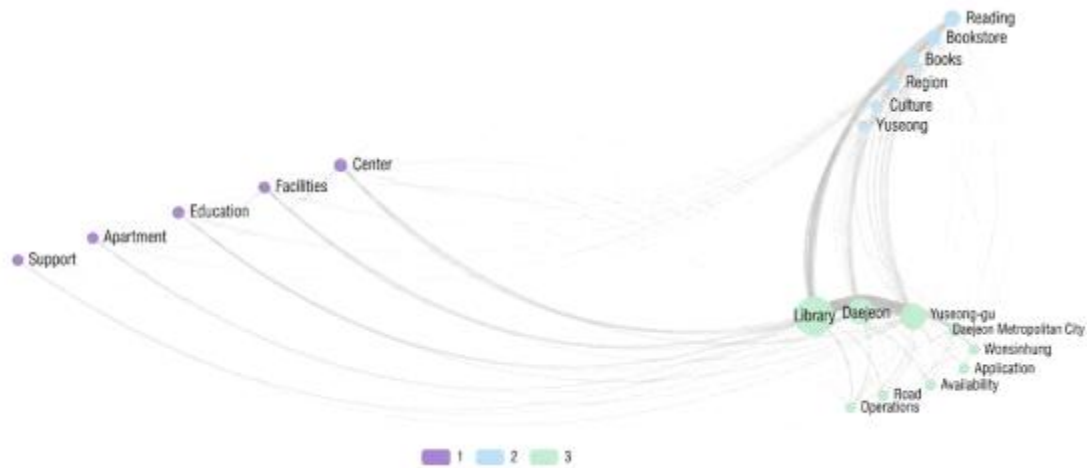


Fig. 3. Louvain Clustering Results

4.7.2 Leiden Community Detection

The Leiden algorithm improves upon Louvain by first refining nodes into smaller, better-connected communities and then gradually merging them, yielding a more stable and internally coherent community structure. In this analysis, two dominant clusters emerged.

The first cluster converges on library, reading, Yuseong, Yuseong-gu, culture, functions, books, and operations, indicating that attention is concentrated on core library services—reading activities, cultural programming, and operating functions. From a policy standpoint, this suggests the need to strengthen and upgrade the library’s functional capacity and strengthen reading-culture and content services. The second cluster groups Daejeon, Yuseong-gu, region, center, apartment, facilities, support, road/street, and education, emphasizing locational conditions, accessibility, and place-based linkage. Accordingly, it is reasonable to pursue living-area-centered redistribution (or reconfiguration) of library services, and reinforce institutional linkages with multifunctional cultural spaces.

4.7.3 Girvan–Newman Community Detection

The Girvan–Newman algorithm identifies community structure by sequentially removing edges with high betweenness, thereby hierarchically partitioning the network. When applied here, the results reveal a clear split between a core service axis and a peripheral cultural linkage structure.

The first community clusters library, Daejeon, Yuseong, reading, application/registration, facilities, and programs, confirming a central service axis in which the library’s functions, operations, and usage modalities are tightly integrated. This suggests that strengthening functional delivery and improving facility operations are essential for enhancing user experience and program execution capacity. By contrast, the second community isolates “bookstore” as a peripheral node, indicating weak structural connectivity between the library and external cultural touchpoints. This finding implies

the need to establish institutional collaboration channels with independent bookstores and the local publishing ecosystem, and to mitigate fragmentation in the cultural network through joint planning (e.g., author talks, book talks) and coordinated distribution and promotion.

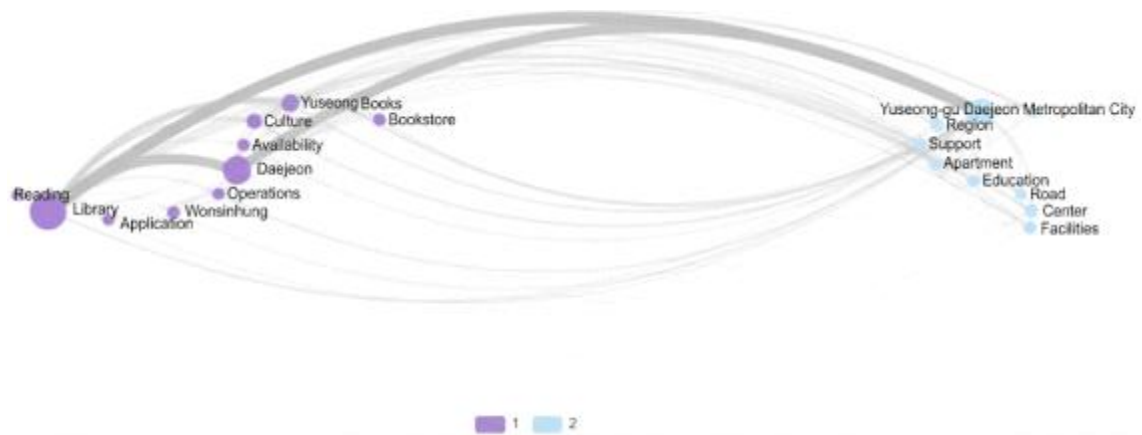


Fig. 4. Leiden Clustering Results

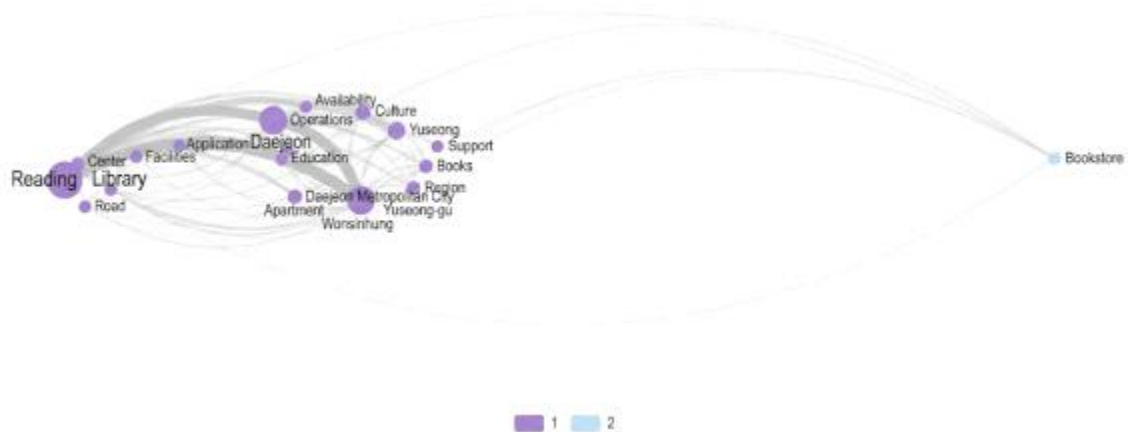


Fig. 5. Girvan-Newman Clustering Results

4.7.3 Girvan-Newman Community Detection

The Girvan-Newman algorithm identifies community structure by sequentially removing edges with high betweenness, thereby hierarchically partitioning the network. When applied here, the results reveal a clear split between a core service axis and a peripheral cultural linkage structure.

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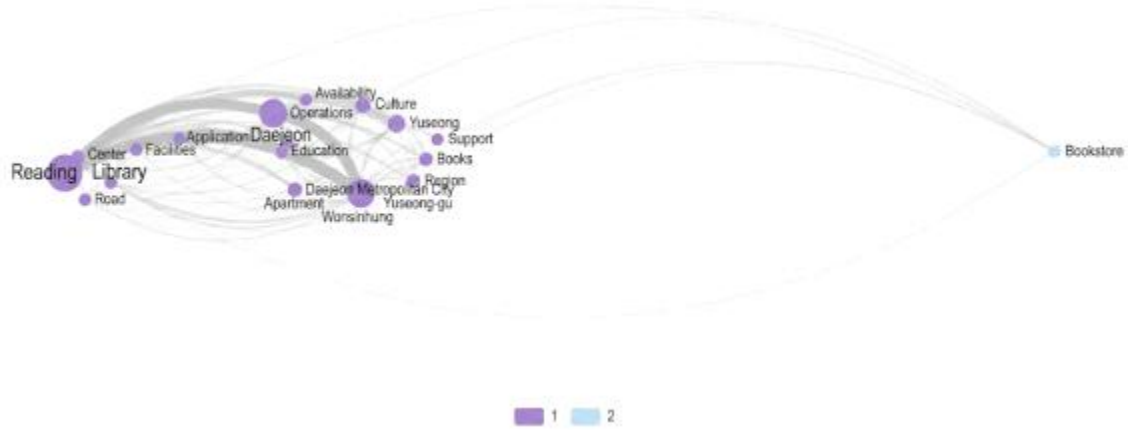


Fig. 6. Girvan-Newman Clustering Results

usage modalities are tightly integrated. This suggests that strengthening functional delivery and improving facility operations are essential for enhancing user experience and program execution capacity. By contrast, the second community isolates “bookstore” as a peripheral node, indicating weak structural connectivity between the library and external cultural touchpoints. This finding implies the need to establish institutional collaboration channels with independent bookstores and the local publishing ecosystem, and to mitigate fragmentation in the cultural network through joint planning (e.g., author talks, book talks) and coordinated distribution and promotion.

4.7.4 Clauset-Newman-Moore (CNM) Community Detection

The CNM algorithm is a modularity-based community-detection method that identifies the most cohesive partition by comparing intra-community link density against the overall graph connectivity pattern. In CNM, modularity increases when nodes within the same community are densely connected while connections between communities remain relatively sparse (Clauset, Newman, & Moore, 2004). Notably, the CNM results replicate the major structural pattern observed in the Leiden analysis, providing evidence of structural convergence and methodological robustness.

Specifically, the first cluster—including library, Yuseong-gu, culture, reading, functions, Daejeon Metropolitan City, Wonsinhung, and application/registration—forms a library-centered network in which operational and user-centered terms are tightly interwoven. This indicates that refined user-oriented service design—such as improving operational efficiency, program architecture, and application/use pathways—should be treated as a priority policy and operational priority. The second cluster—comprising facilities, road/street, education, center, region, and apartment—forms an infrastructure and living-area axis, where physical space and neighborhood concepts cohere into a single structural configuration. This pattern supports an expansion strategy premised on organic linkage with lifestyle infrastructure: improving sub-area accessibility, integrating with multifunctional cultural complexes, and strengthening connections with education and welfare infrastructure systems.

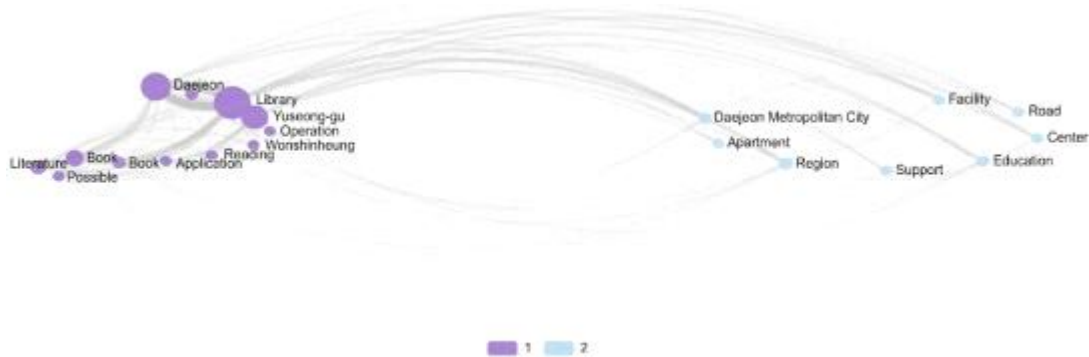


Fig. 7. Clauset-Newman-Moore analysis results

5. Discussion

This section integrates the findings from text mining, network analysis, and topic modeling to discuss strategic directions for public library policy in Yuseong-gu.

First, with respect to whether the network structure of Yuseong-gu public libraries supports the role of a place-based public service hub, the network exhibits high density and a short average path length, indicating tightly coupled information diffusion and thematic connectivity. “Library” is identified as the central hub, ranking highest in both frequency and betweenness-centrality measures. The direct one-step linkage between “library” and “culture,” together with the strong cohesion of the “Daejeon–Yuseong-gu–region” axis, suggests that the library should be redefined not as a stand-alone facility but as a platform for an integrated culture-education complex at the local level. The fact that multiple community-detection methods—Louvain, Leiden, CNM, and Girvan–Newman—repeatedly reproduce the “library–culture–Yuseong-gu (Daejeon)” axis and the “facilities–center–operations” axis further strengthens the plausibility of a hub strategy that combines (i) a hub–satellite (branch) configuration at the neighborhood-unit level (e.g., Wonsinhung, Jeonmin, Gujeuk) with (ii) governance and program modules responsive to local agendas. Consistent with this interpretation, the 2040 Daejeon Urban Master Plan (Daejeon Metropolitan City, 2025) identifies persistent gaps in accessibility to public library services in some neighborhoods, particularly in newly developed and peripheral areas. It also points to substantial variation in library utilization across sites and a tendency for demand to concentrate in certain facilities. Against this backdrop, this study argues that policy should pursue both balanced neighborhood-based coverage and strengthened functions of integrated hub libraries, with concrete operational implications supported by the topic map and the keyword/network evidence.

Second, regarding spatial and service reconfiguration for a transition toward a multifunctional cultural platform, the LDA topics and the N-gram/keyword results jointly indicate two intertwined axes: a convergence axis of “education–culture–information–resident activities” and a management axis of “integration–operations–support–center.” The strong multi-word chain “Yuseong-gu–integrated–

library-homepage” provides particularly clear evidence for the necessity of building a digitally anchored portal that integrates information access and civic participation. At the spatial level, the “facilities-center-road/street” cluster reflects concerns regarding neighborhood accessibility and supports redesigning library space into hybrid configurations that combine functions such as makerspaces, digital creation studios, family learning lounges, and small-scale performance/exhibition areas. At the service level, the strong coupling between “reading” and “education,” together with demand signals such as “children,” “school,” and “classes,” indicates the need for cross-bundled programming that interlinks (i) education collaboration programs aligned with schools and district education offices for school-age children and families, (ii) support for citizen creators (e.g., local content production and community-history archiving), and (iii) age-friendly services (e.g., digital capacity building and health-information support). In addition, operational keywords such as “operations,” “support,” and “application/registration” carry actionable implications for the service delivery system. These findings suggest that the service journey from application to use and feedback should be standardized, while the advantages of a distributed network structure should be leveraged to flexibly assemble thematically integrated programs without bottlenecks.

Third, in designing a data-driven policy planning and evaluation system, the six-topic structure—selected on the basis of topic coherence—reduces thematic redundancy and enhances interpretability, providing a quantitative foundation for strategic prioritization. A KPI dashboard that embeds text-mining indicators across the full cycle of planning, implementation, and evaluation is therefore recommended, with three primary analytic pillars: discourse (topic probabilities and keyword centrality), sentiment (positive/negative polarity and finer-grained affect composition), and relations (network centrality and modularity). Building on these pillars, high-impact themes such as “local culture + reading activities” can be designated as lead pilot projects and monitored quarterly by linking changes in topic shares to participation rates, satisfaction, and revisit rates. Resource allocation can then be operationalized through a decision matrix combining cohesion, diffusion potential, and intervention difficulty—prioritizing high-impact/low-cost areas for initial investment while integrating or scaling down redundant or low-efficiency areas. Finally, if the same methodology is formalized into a routine protocol—collection, preprocessing, modeling, validation, and policy translation—applicable across administrative neighborhoods and other municipalities, it can ensure scalability and long-term policy and operational sustainability.

Overall, the convergent evidence from discourse analysis, network structure, and topic modeling indicates that Yuseong-gu public libraries are well positioned to evolve into a regionally anchored multifunctional cultural platform. In terms of space and infrastructure, multifunctional cultural and learning resources should be concentrated in high-centrality hub nodes, while a hub-branch distributed spatial strategy should ensure balanced accessibility across local living areas. In terms of operations and services, libraries should transition toward a service portfolio in which education, culture, information, and community engagement are integrated, and user-centered, empathy-based experiential design that fosters positive affect should be strengthened. In terms of content and programs, life-stage- and interest-specific curation should be advanced, while multi-institutional partnerships—among the local government, schools, and community organizations—should be institutionalized to build a locally driven cultural collaboration network. Finally, by establishing a data-driven decision system that

uses quantitative indicators such as cosine similarity, topic modeling outputs, and network centrality as core evidence for policy prioritization and performance evaluation, Yuseong-gu libraries can function as a sustainable public cultural infrastructure that strengthens local identity and community capacity.

6. Conclusion and Recommendations

This study integrated big-data evidence collected between July 2022 and June 2025 through text mining, network analysis, and LDA topic modeling, with the aim of translating the discourse structure, user affect, and relational patterns surrounding Yuseong-gu public library services into an actionable policy architecture. The results identify “library” as the dominant hub in both frequency and betweenness centrality, while its one-step cohesion with “culture,” “Yuseong-gu,” and “Daejeon” positions the library as a platform for locally grounded cultural and educational policy. In addition, the six-topic structure, selected to maximize interpretability while minimizing redundancy, enabled the derivation of layered strategies spanning space, services, and governance. Taken together, the findings indicate that Yuseong-gu public libraries possess strong structural potential to evolve into a regionally anchored multifunctional cultural platform.

Based on these results, the following policy recommendations are proposed. First, reconfigure space and infrastructure by designing a distributed hub-satellite (branch) system, concentrating hybrid functions—such as makerspaces, digital creation studios, and family learning lounges—within high-centrality hub library nodes, while deploying smaller, modular, accessibility-oriented facilities within neighborhood units (e.g., Wonsinhung, Jeonmin, and Gujeuk) to ensure balanced spatial coverage. Second, transform the service portfolio toward an integrated model that combines education, culture, information, and community engagement, and develop cross-bundled programming that links school-age and family-oriented initiatives with school and education-office partnerships, while simultaneously expanding support for citizen creators and age-friendly services for older adults. Third, build a digital hub by developing an integrated portal that consolidates search, reservation, participation, reviews, and data disclosure, consistent with the strong “integration-homepage-operations” chain; this should be paired with mobile-first user experience design and a standardized application-use-feedback service journey. Fourth, institutionalize local collaborative governance by establishing a standing consultative body involving the local government, schools, independent bookstores, and cultural institutions, and formalizing mechanisms for joint programming (e.g., book talks and local-history archiving) and resource sharing. Fifth, adopt affect-based experience design by scaling experiential programs that amplify positive affect, while assigning the “inconvenience” factors that generate negative sentiment—such as circulation, noise, seating, and wayfinding—as short-term operational improvement priorities to produce visible, rapid changes. Sixth, embed data-driven decision-making by building a dashboard that integrates the six-topic structure, keyword centrality, and sentiment indicators as core KPIs for quarterly monitoring, and prioritizing investment in high-impact/low-cost intervention areas. Seventh, operationalize a communication strategy by leveraging the diffusion capacity of Tistory blogs through ambassador and experiential reviewer programs, systematizing

media exposure with press-kit packages supported by quantitative indicators and infographics, and penetrating weaker café- and neighborhood-platform channels via highly localized informational content (e.g., program calendars and neighborhood-linked service offerings).

An implementation roadmap is proposed in three phases. In the short term (0–6 months), the focus should be on micro-level UX improvements, a minimum viable product (MVP) of the integrated portal, and dual-track diffusion via bloggers and traditional media channels. In the mid-term (6–18 months), priorities include designing and piloting hub–satellite spatial reallocation, branding flagship education–culture integrated programs (e.g., a “local culture + reading” pilot), and institutionalizing the consultative governance body. In the long term (18+ months), the aim should be to establish a performance-based budgeting model anchored in outcome indicators and to scale successful models to adjacent neighborhoods and other municipalities. Performance evaluation should be structured across five dimensions: discourse (topic shares and centrality), affect (positive/negative polarity and fine-grained emotion profiles), relations (network centrality and modularity), use (participation, revisits, and dwell time), and accessibility (mobile use and coverage of vulnerable user groups).

Several limitations should be acknowledged. The data sources were limited to publicly available textual data from Naver and Daum, which limits the capture of discourse contexts circulating within closed platforms (e.g., messaging apps and some SNS environments). Automated morphological processing may also introduce misclassification errors that are difficult to quantify with precision. In addition, the analytical pipeline depends on TEXTOM’s algorithmic procedures and dictionary settings, which may constrain interpretive flexibility. The restricted three-year window may further introduce distortions related to seasonal variation and policy-cycle effects. Future work should therefore broaden generalizability by incorporating multiple platforms and heterogeneous data sources, and should strengthen inference by integrating fused data collection with user journey (log) analytics and by adopting causal frameworks that link topics, affect, and behavior through experimental or quasi-experimental designs. Moreover, because this study prioritizes structural discourse analysis using conventional text-mining techniques, subsequent research should explore the use of large language models (LLMs) to enable context-sensitive representation learning and more precise investigation of latent semantic relations and inferential meaning structures.

Despite these limitations, this study provides a concrete pathway for redesigning the public library as a policy platform, grounded in quantitative evidence on local discourse, affect, and relational structure. If Yuseong-gu implements the proposed spatial, service, governance, and data systems in a staged manner, its public libraries can move beyond their conventional role as reading facilities to become everyday cultural hubs where learning, creation, and civic solidarity converge—ultimately contributing to measurable public outcomes such as stronger local identity and enhanced community capacity.

Statements and Declarations

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investigation, Y.N., J.K., and Y.S.; resources, Y.N. and I.J.; data curation, J.K. and Y.S.; writing—original draft preparation, Y.N. and J.K.; writing review and editing, Y.N., I.J., and J.S.; visualisation, J.K. and J.S.; supervision, Y.N.; project administration, Y.N. and I.J.; funding acquisition, Y.N. All authors have read and agreed to the published version of the manuscript.

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