

Appendix A. Search Queries

- 2360 • **Google Scholar, IEEE Digital Library and Science Direct:** (*Blockchain* OR *bitcoin* OR *ethereum* OR *cryptocurrencies* OR *cryptocurrency* OR "digital currency" OR "distributed ledger" OR "DLT" OR "Merkel tree" OR "smart contract platform" OR "tokenized asset") AND (*Centralization* OR *centralisation* OR *Centralism* OR *consolidation* OR *decentralisation* OR *decentralization* OR *devolution* OR *Dominating* OR *Domination* OR *Monopolisation* OR *Monopolization* OR *monopoly* OR *oligopoly* OR *singular* OR *unipolar*)
- 2365 • **ACM Digital Library:** +(Blockchain bitcoin ethereum blockchains cryptocurrencies cryptocurrency "digital currency" "distributed ledger" DLT "Merkel tree" "smart contract platform" "tokenized asset") +(Centralization centralisation Centralism concentration consolidation Control decentralisation decentralization devolution Dominating Domination managed Monopolisation Monopolization monopoly oligopoly singular unipolar)
- 2370 • **ISI Web of Science:** (TS=((Blockchain OR bitcoin OR ethereum OR cryptocurrencies OR cryptocurrency OR "digital currency" OR "distributed ledger" OR DLT OR "merkel tree" OR "smart contract platform" OR "tokenized asset") AND (Centralization OR centralisation OR Centralism OR consolidation OR decentralisation OR decentralization OR devolution OR Dominating OR Domination OR managed OR Monopolisation OR Monopolization OR monopoly OR oligopoly OR singular OR unipolar))) AND LANGUAGE: (English)
- 2375 • **Scopus:** ((TITLE-ABS-KEY (blockchain OR bitcoin OR ethereum OR cryptocurrencies OR cryptocurrency OR "digital currency" OR "distributed ledger" OR dlt OR "merkel tree" OR "smart contract platform" OR "tokenized asset") AND (centralization OR centralisation OR centralism OR consolidation OR decentralisation OR decentralization OR devolution OR dominating OR domination OR managed OR monopolisation
- 2380

2385 *OR monopolization OR monopoly OR oligopoly OR singular OR unipolar)*
) AND PUBYEAR > 2008 AND (LIMIT-TO (LANGUAGE , "English"
))

 • **Springer Link:** *(blockchain — bitcoin — ethereum — cryptocurrencies*
 — cryptocurrency — "digital currency" — "distributed ledger" — "merkel
 2390 *tree" — "smart contract platform" — "tokenized asset") & (centraliza-*
 tion — centralisation — Centralism — consolidation — decentralisation
 — decentralization — devolution — Dominating — Domination — Mo-
 monopolisation — Monopolization — monopoly — oligopoly — singular —
 unipolar)

2395 **Appendix B. Selected Articles**

References

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Table B.11: List of Selected Articles

Centralization Factor	Selected Articles
Wallet Concentration	[R1, R2, R3, R4, R5, R6, R7, R8, R9]
Exchange Concentration	[R3, R4, R10, R11, R12, R13, R14, R5, R15, R7, R8, R16, R9]
Reference Client Concentration	[R17, R18, R19, R20, R21, R22, R6, R23]
Storage Growth Rate	[R24, R25, R26, R27, R28, R29]
Specialized Equipment Concentration	[R30, R31, R32, R33, R21, R34, R35]
Wealth Concentration	[R32, R33, R21, R34, R35, R36]
Consensus Power Distribution	[R37, R6, R38, R31, R39, R32, R40, R25, R41, R42, R43, R44, R2, R45, R46, R47, R48, R3, R49, R50, R51, R52, R53, R54, R55, R36, R56, R57, R58, R59, R60, R61, R62, R33, R63, R21, R64, R65, R66, R67, R68, R69, R70, R71, R27, R72, R73, R74, R75, R76, R77, R7, R78, R23, R79, R8, R80, R81, R9, R82, R83]
Node Discovery Protocol Control	[R84]
Geographic Distribution	[R44, R2, R50, R18, R76, R57, R8]
Bandwidth Concentration	[R43, R76]
Routing Centralization	[R58, R80, R76]
Owner Control	[R23, R85, R86, R42, R87]
Improvement Protocol	[R23, R85, R2, R17, R88, R19, R57, R22, R6, R87, R89]

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Appendix C. Interview Data collection and Analysis

We conducted semi-structured interviews following the guiding interview script²³. This script served as the interview protocol to ensure coverage of all aspects of our study. These semi-structured interviews were transcribed in
2660 anonymized form. In some instances, the interview was recorded in the form of contemporaneous notes when the interviewee preferred not to be recorded. The note-taking process was primarily focused on capturing the views relevant to our research questions.

The transcripts and notes were analyzed by using qualitative methods, as
2665 described by Seaman (1999). The first step was to read the text and identify relevant content. This process was repetitive as analyzing more text revealed a pattern that iteratively refined the coding in the first step. To ease the process of text-analysis, we employed the Nvivo tool. This tool enabled us to organize code (annotations) into hierarchies.

2670 In the second step, we assigned codes to the relevant content. The focus of this step was the adoption of terms used by interviewees rather than the interpretation of semantics. For example, we coded “Decentralization” and “Centralization” separately despite frequent use in the same context.

During the coding process, we grouped similar codes into clusters where
2675 possible. This process was aided by the Nvivo tool; the hierarchy view in the tool is shown in Figure C.14. Figure C.14 outlines the code clusters and individual codes with colors used in the data extraction process for interviews.

²³Interview script is available at www.github.com/ashishrsai/centralization.

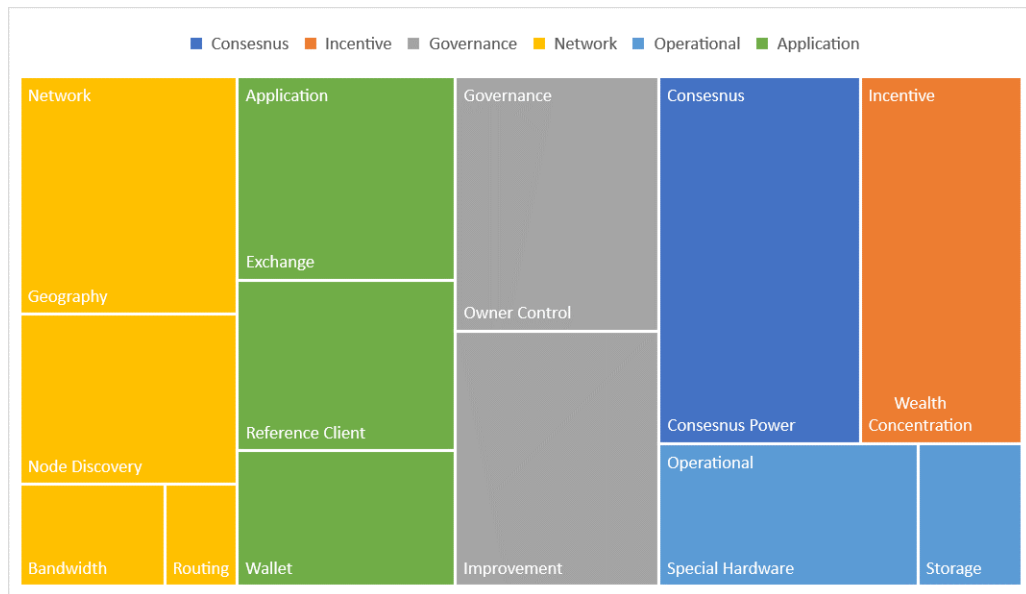


Figure C.14: Hierarchy View of Interview Coding