




Database Notes

Leveraging a global, federated, real-world data network to optimize investigator-initiated pediatric clinical trials: the TriNetX Pediatric Collaboratory Network

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Abstract

Objective: Clinical research networks facilitate collaborative research, but data sharing remains a common barrier.

Materials and Methods: The TriNetX platform provides real-time access to electronic health record (EHR)-derived, anonymized data from 173 healthcare organizations (HCOs) and tools for queries and analysis. In 2022, 4 pediatric HCOs worked with TriNetX leadership to found the Pediatric Collaboratory Network (PCN), facilitated via a multi-institutional data-use agreement (DUA). The DUA enables collaborative study design and execution, with institutional review board-approved transfer of complete datasets for further analyses on a per-protocol basis.

Results and Discussion: Of the 41.2 million children with TriNetX records, the PCN represents nearly 10%. The PCN assisted several early-career investigators to bring study concepts from conception to an international scientific meeting presentation and journal submission.

Conclusion: The PCN facilitates EHR vendor-agnostic multicenter pediatric research on the global TriNetX platform. Continued growth of the PCN will advance knowledge in pediatric health.

Lay Summary

A pediatric focused network composed of US hospitals that contribute data to the TriNetX Global Health Research Network has been established. Many pediatric conditions are rare, making their study with adequate statistical power a challenge. The use of a uniform, intuitive data platform allows sites with limited technical resources to avoid many of the barriers to information sharing and provides self-service access to a common anonymous dataset of electronic health records from millions of patients. Healthcare organizations contributing data to the TriNetX can join the Pediatric Collaboratory Network through a simple Data Use Agreement. The Pediatric Collaboratory Network creates a community with a common interest in pediatric research able to learn from each other's experiences and recommendations. Junior investigators can participate in a consultative forum and seasoned mentors provide expertise in establishing and working in multi-site collaborations.

Key words: pediatric; electronic health record; real-world data.

Objective

Over the past 50 years, Pediatric Clinical Research Networks (PCRNs) have proliferated. Defined as “an organization of clinical sites and investigators that conducts or intends to conduct multiple collaborative research protocols,”¹ PCRNs are vital to facilitate cross-institutional collaboration and

enable sharing clinical data. Collaborative pediatric research permits rapid advancement in the treatment and management of conditions, particularly of rare diseases.

The TriNetX Pediatric Collaboratory Network (PCN) brings together healthcare organizations (HCOs) that contribute data to the TriNetX Global Health Research Network to share

knowledge and enable pediatric-focused partnerships with limited institutional information technology (IT) support.

Background and significance

PCNRNs have grown in scope, size, and volume with over 70 clinical research networks focusing on different clinical subspecialties and geographical locations to study novel treatments for childhood disease. Among the first multi-institutional PCNRNs in the United States was the National Cancer Institute's (NCI) Clinical Trials Cooperative Group established in 1955² that provided a wealth of knowledge as "...one of the first comparative studies in the chemotherapy of malignant neoplastic disease,"³ while revealing complexities and challenges associated with multi-site research. These included logistical concerns, need for meetings to establish uniformity of procedures and interpretation of protocols, and the financial costs of planning and conducting larger-scale trials. In addition, the authors emphasized the critically important mechanics of a cooperative study conducted at different sites.³ Over the next few decades, other PCNRNs were formed including the Children's Oncology Group (1955),⁴ the Pediatric Rheumatology Collaborative Study Group (1973),⁵ the Rare Diseases Clinical Research Network (2003),⁶ the Pediatric Emergency Care Applied Research Network (2009),⁷ PEDSnet (2009),⁸ the Pediatric Trials Network (2010),⁹ and the Standardized Health data and Research Exchange (2018).¹⁰

Despite widespread adoption of PCNRNs and their role in fostering collaboration and coherence, challenges remain. A survey of 70 PCNRNs compared features of PCNRNs and the perceived benefits of PCNRN membership.¹¹ Although 73% of those surveyed acknowledged "tangible benefits of such a coalition" (most notably collaboration on study proposals [60%], advocacy for networks [58%], connections with pediatric organizations [54%], and strategies for addressing institutional review board (IRB) issues [48%]), the telephone interviews revealed significant barriers to implementation and continuity. Of note, those interviewed expressed concerns related to (1) funding challenges (eg, funding core activities, individual studies, and cross-subsidization of PCNRN expenses with local funds), (2) data management (eg, data flow, standardization, and informatics), (3) governance (standardization of protocol review and implementation, management of expectations, and review of external proposals), (4) inter-network relationships, and (5) ethical issues (eg, lack of local pediatric expertise).

The paucity of reusable and reliable platforms and infrastructure to facilitate data sharing via a collaborative network is a common barrier to multi-institutional collaboration. Such initiatives rely on grant funding that limits data sharing to focused disease-relevant domains. Furthermore, few platforms include both inpatient and outpatient data generated through real-world clinical care, and participating sites must often maintain significant IT technical support. Therefore, novel approaches are needed to address operational barriers.

In 2022, the PCN founding sites, Children's National Hospital, West Virginia University Medicine Children's, Children's Health (TX), Johns Hopkins All Children's Hospital (FL), and Johns Hopkins Children's Center (MD) decided to address these challenges by leveraging their existing relationships with TriNetX (Figure 1). TriNetX was initially created

to address problems and obstacles inherent in clinical trial protocol design, cohort identification, cohort analysis, study feasibility, and site selection processes and sought to imbue a more data-driven workflow into these activities.^{12,13} HCOs join TriNetX to address 3 primary use cases: (1) access to the TriNetX query and analytic tools to explore the de-identified patient data at their own HCO, (2) the ability to receive sponsored clinical trial opportunities from life sciences companies who query a network of participating HCOs, and (3) ease of inter-organizational collaboration and data querying due to the harmonization of HCO data to a common TriNetX data model. From its start in 2015, the TriNetX Global Health Research Network has expanded to comprise EHR vendor-agnostic data from approximately 214 million unique patients (of which over 41 265 348 are pediatric patients \leq 21 years old) from across 173 HCOs worldwide.

Methods

TriNetX platform

The TriNetX platform is a global, federated network where users can access continuously updated, anonymized electronic health records (EHR) data, including demographics, encounters, diagnoses, procedures, medications, laboratory values, vitals, and genomics. Healthcare organizations with limited IT and data resources benefit from the data harmonization and TriNetX's EHR-agnostic infrastructure, which simplifies secure access to information shared from their data warehouses and EHRs. The TriNetX platform includes self-service tools that allow patient data to be aggregated and queried based on the inclusion/exclusion criteria for a given research project. Users can perform cohort comparison and analysis across clinical profiles and longitudinal measures. Publications drawing on TriNetX have demonstrated utility in answering research questions and gaining access to representative cohorts across diverse care settings.

PCN framework and infrastructure

The PCN, founded in 2022, permits federated pediatric queries across sites in TriNetX to facilitate collaboration between investigators and subject-matter experts with similar interests. As active contributors to the network, each PCN member applies a data-driven approach to their work, repurposing EHR data for clinical investigation. Although aggregated data from member sites is visible in the TriNetX Global Health Research Network, the "added value" of the PCN master data-use agreement (DUA) is to improve collaborations by making it simpler for investigators to meet experts at other PCN member sites. The PCN is visible in the global TriNetX portal as a selectable network, and results are returned immediately with patient counts and abundant clinical data for each participating site (Figure 2 and Table 1). A key feature is that no additional IRB reviews are needed to participate in or query the PCN. However, if a specific collaboration requires collection and sharing of additional data not already provided to TriNetX, IRB approval or a letter of exemption is necessary. A steering committee of institutionally designated representatives, including biostatistics experts, from the 4 core sites and 2 TriNetX representatives meets monthly to discuss data governance, coordination efforts, and new site engagement. To mitigate barriers to entry, the steering committee designed the membership process to be inclusive while ensuring that the structure and

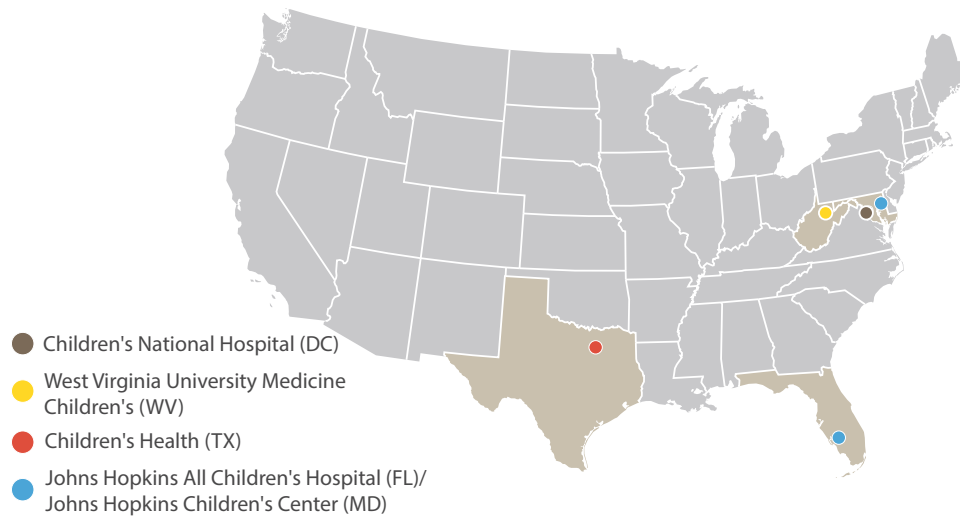


Figure 1. Map of current PCN member healthcare organizations (HCO). Tan: Children’s National Hospital; Yellow: West Virginia University Medicine Children’s; Red: Children’s Health; Blue: Johns Hopkins All Children’s Hospital/Johns Hopkins Children’s Center.

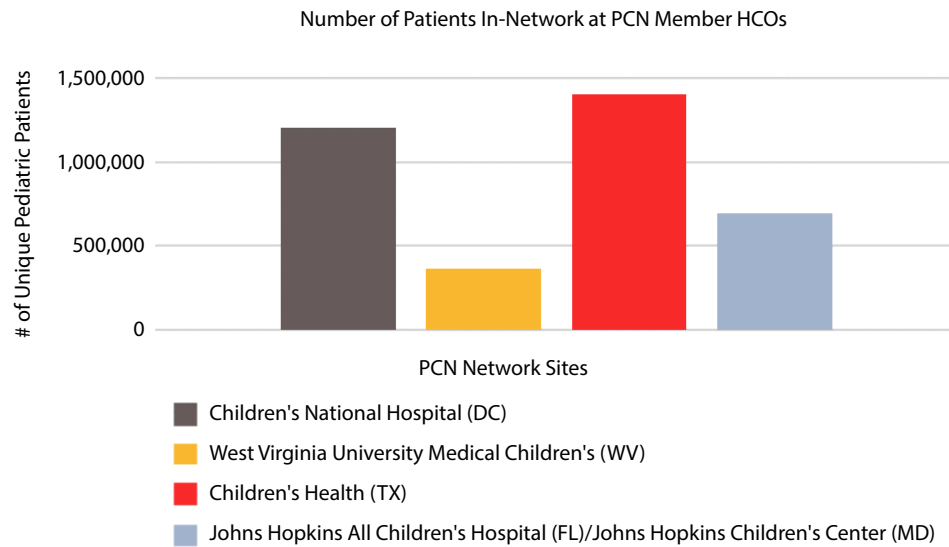


Figure 2. Number of unique pediatric patients contributing data to PCN member healthcare organizations (HCOs).

Table 1. An overview of the salient standards used in the TriNetX Pediatric Collaboratory Network, including associated sources and quantity of clinical observations (as of June 15, 2023).

Data type	Source vocabulary	Number of facts
Diagnosis	ICD-10-CM	83 000 766
Procedures	ICD-10-PCS, CPT, HCPCS	82 685 211
Medications and vaccinations	RxNorm, OMOP RxNorm Extensions, CVX	1 166 344 181
Lab results and clinical findings	LOINC	218 619 900
Vital signs	LOINC	116 212 872
Oncology and chemotherapy lines	NAACCR, ICD-O topography and morphology, AJCC, SEER, etc	94 377
Total		1 666 957 307

Abbreviations: AJCC, American Joint Committee on Cancer; CPT: Current Procedural Terminology; HCPCS, Healthcare Common Procedure Coding System; ICD-10-CM, International Classification of Diseases, Tenth Revision, Clinical Modification; ICD-10-PCS, International Classification of Diseases, Tenth Revision, Procedure Coding System; ICD-O, International Classification of Disease for Oncology; LOINC, Logical Observation Identifiers Names and Codes; NAACCR, North American Association of Central Cancer Registries; OMOP, Observational Medical Outcomes Partnership; SEER, Surveillance, Epidemiology, and End Results program of the National Cancer Institute.

underlying mission of the PCN is maintained. Steering committee members can invite junior faculty to present research concepts and ongoing work that could benefit from PCN

participation and PCN-based analyses. Investigators working under the master DUA can obtain aggregated counts at each of the PCN sites and ask the established point of contact at

PCN sites for introductions to potential collaborators or learn how to share additional information unavailable through TriNetX. This might include, subject to IRB approval, obtaining de-identified data or validation of data at participating sites

Results

By relying on the Common Data Model provided by TriNetX, PCN members are able to focus efforts on data exploration and collaboration. One clear advantage is that early-career investigators can design and execute single-center and multicenter data queries and out-of-the-box analytics in support of their research aims with little to no investment (eg, research funding, personnel) (Figure 3). While members of the TriNetX Global Health Research Network can execute queries across the entire network, the community created by the PCN—which shares a common interest in pediatric research to learn from each other’s experiences and recommendations—may be of greatest utility. The PCN provides a consultative forum where junior investigators are able to optimize the design of their queries and analytic approaches as well as obtain guidance in preparing IRB protocols where warranted.

PCN case study

In an example of a project brought to the PCN steering committee, an early-career investigator with limited prior experience in large healthcare database research sought to investigate the development of venous thromboembolism (VTE) events in pediatric patients with sickle cell disease (SCD)—a low-frequency complication in a rare pediatric disease. The specific aims of the project were to investigate the frequency of recurrent VTE and to identify prognostic factors associated with VTE recurrence among children ≥ 21 years of age with a diagnosis of SCD who had suffered a first (ie, index) VTE episode.

A query identifying children with SCD was built using a previously validated algorithm that was modified to exclude patients with International Classification of Diseases 10th revision (ICD-10) diagnosis codes of sickle cell trait or thalassemia without sickle cell disease. All available SCD ICD-10 codes were included in the study population (D57.0, D57.2, D57.4, D57.8). Index and recurrent VTE cases were likewise identified using ICD-10 codes (I82, I26, I67.6). Index VTE

was defined as the first diagnosis of VTE in the patient’s EHR. The investigator presented her study design to the PCN consultative group to obtain feedback on query design and analytic considerations. To enhance the specificity of the search, recurrent VTE was defined as an acute VTE diagnosis that occurred *90 days after the index VTE and in a different anatomic location* from the index VTE. The TriNetX “Explore Cohort” feature, a browser-based, real-time analytic that provides information on the key clinical characteristics of the cohort, such as demographics and laboratory values, was used to validate that identified patients were indeed children with SCD. Once validated, the investigator obtained the de-identified dataset from the TriNetX Research Network via a request to her local institutional Clinical Research Data Acquisition Core to perform the analysis in collaboration with institution-based biostatisticians.

The study’s results were presented as a selected oral abstract at the 63rd American Society of Hematology Annual Meeting,¹⁴ contributed to preliminary data for a National Institutes of Health Mentored Research Award (K23) application, and a manuscript describing the findings is in preparation.

In the first 30 months post-launch of the PCN, over 250 queries by 19 PCN users have been issued, steering committee presentations made by 4 junior investigators, and 3 NIH Patient-Oriented Research Career Development Award grant applications submitted utilizing preliminary data from PCN-consulted projects.

Discussion

The PCN is one of the few pediatric-focused, disease-agnostic collaborative clinical data networks. It leverages the robust data harmonization available through TriNetX’s Global Health Research Network to facilitate data sharing and empower investigator-initiated collaborative research. The rarity of many childhood diseases and the difficulty obtaining anonymized real-world data associated with these patients led the PCN founding members to seek simpler ways to establish inter-organizational collaboration. Additionally, TriNetX offers services to help PCN users build queries, assists in understanding the data PCN researchers are working with, and assigns dedicated account management teams to facilitate

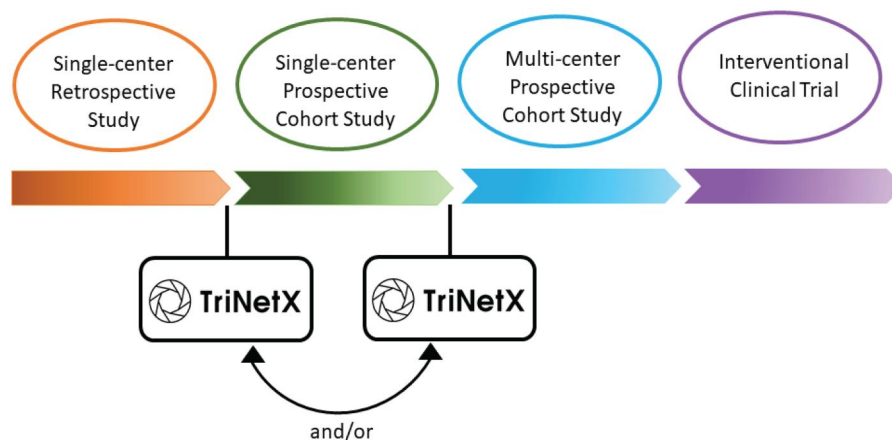


Figure 3. Representation of the investigator’s path of inquiry to inform the development of a clinical trial and the utility of TriNetX during specific stages of the research development lifecycle.

site-to-site introductions and subsequent inter-organizational discussions between researchers.

A key advantage of PCN participation is that it does not require additional data exportation from each organization but rather leverages the existing anonymized, harmonized data already shared by participating sites. The goal was to create a collaborative pediatric research community with minimal additional technical burden, with pre-established pan-network data use agreements in place, and to foster multi-institutional pediatric research collaboration. The PCN seeks to complement other well-established pediatric networks such as PEDSnet and ShaRE, to encourage collaboration in an easy-to-use common data environment, especially for users with limited data analysis experience and/or resources.

Conclusion

The PCN was established to be an accessible, robust ecosystem designed to address the unique challenges related to conducting multi-institutional, collaborative pediatric research. Providing real-time access to multi-site, anonymous EHR data for millions of patients, the PCN helps investigators answer imperative logistical research questions by supporting inclusion/exclusion criteria-based queries and providing powerful analytical tools, including the statistical power necessary for rare childhood conditions and low-frequency outcomes of interest. Additionally, the PCN has supported early-career investigators by providing access to consultation and facilitation for multicenter study planning from a seasoned community of pediatric researchers and biostatisticians. The network is open to HCOs that already contribute de-identified EHR-derived data to TriNetX's broader platform and may join by entering a pan-PCN Data Use Agreement. The PCN seeks to grow its membership over the next several years to maximize impact in generating new knowledge across a broad array of pediatric health conditions and therapeutic areas.

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Author contributions

Jurran L. Wilson wrote the initial draft of the manuscript with Marisol Betensky and Neil A. Goldenberg providing case study information. Richard Lilienthal, Matvey B. Palchuk, and Lindsay R. Stahl contributed to operationalizing the Pediatric Collaboratory within the TriNetX platform. All authors provided critical feedback for establishing operating parameters of the Pediatric Collaboratory. All authors discussed the manuscript and contributed to the editing and final draft of the manuscript. Neil A. Goldenberg and Hiroki Morizono contributed equally to this paper as co-senior authors providing oversight and leadership responsibility for planning and execution.

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Conflict of interest

A.Z. has received honoraria from Sanofi and Takeda for her role as an advisory board member for scientific advisory boards in the past 3 years. N.A.G. has received or has recently received consultancy fees from Anthos Therapeutics, Bayer, Boehringer-Ingelheim, Daiichi Sankyo, and the University of Colorado-affiliated Academic Research Organization CPC Clinical Research for roles in clinical trial planning or oversight committees (eg, advisory committee; steering committee; data and safety monitoring committee) in pharmaceutical industry-sponsored pediatric clinical trials of antithrombotics. All other authors have indicated they have no financial relationships or potential conflicts of interest relevant to this article to disclose.

Data availability

This paper describes the creation of a networked Collaboratory environment and no new data were generated or analyzed in support of this work. Access to the TriNetX environment is available from <https://trinetx.com>.

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