Original Article

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The landscape of decentralized clinical trials (DCTs): focusing on the FDA and EMA guidance

Jiyeon Park 💿, Ki Young Huh 💿, Woo Kyung Chung 💿, and Kyung-Sang Yu 💿

Department of Clinical Pharmacology and Therapeutics, Seoul National University College of Medicine and Seoul National University Hospital, Seoul 03080, Korea

ABSTRACT

Decentralized clinical trials (DCTs) consist of off-site trial-related procedures referred to as decentralized elements. We aimed to provide an overview of the landscape of DCTs by comparing regulatory guidance reports and analyzing decentralized elements from clinical trial registries. Two guidance reports on DCTs published by the U.S. Food and Drug Administration and the European Medicines Agencies were summarized and analyzed. Both guidance publications commonly emphasized an assessment of the appropriateness of decentralized elements along 2 axes: patient safety and data integrity. DCT cases were identified from ClinicalTrials.gov by searching with 6 keywords: decentralized, remote, mobile, digital, virtual, and hybrid. Cases where the keyword was used in a non-DCT context, such as digital flexor tendon, were excluded by means of natural language processing. A total of 4,874 trials were identified as DCT cases, with annual increases, especially after 2020. The most common keywords were 'mobile' and 'digital' (36.2% and 24.8%, respectively). Interventions in the DCT cases were analyzed by means of a network analysis. Behavioral and technological tokens were frequently combined, such as 'rehabilitation' and 'app.' Drugs were used in only 1.8% of the DCT cases. Of these, most drugs had been approved previously (96.8%) and were in oral formulation (67.2%). Most of the DCT cases identified in this study involved simple interventions and low-risk drugs. These characteristics were in accordance with the common recommendations in the DCT guidance publications.

Keywords: Clinical Trial; Remote Consultation; Mobile Applications; Guideline; Natural Language Processing

INTRODUCTION

Decentralized clinical trials (DCTs) involve decentralized elements, trial-related procedures performed outside of trial centers. Depending on the extent and how decentralized elements are implemented, a DCT can range from a hybrid DCT to a fully DCT [1]. Conventional clinical trials also include several decentralized elements, such as telephone-based monitoring [2]. However, fully DCTs became available with the widespread use of digital technologies [3].

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*Correspondence to

Kyung-Sang Yu

Department of Clinical Pharmacology and Therapeutics, Seoul National University College of Medicine and Seoul National University Hospital, 101 Daehak-ro, Jongno-gu, Seoul 03080, Korea. Email: ksyu@snu.ac.kr

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ORCID iDs

Jiyeon Park https://orcid.org/0000-0003-1317-2891 Ki Young Huh https://orcid.org/0000-0002-1872-9954 Woo Kyung Chung https://orcid.org/0000-0002-3411-7421 Kyung-Sang Yu https://orcid.org/0000-0003-0921-7225

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Conceptualization: Park J; Data curation: Park J; Formal analysis: Park J; Funding acquisition: Yu KS; Investigation: Park J; Methodology: Park J; Project administration: Park J; Resources: Yu KS; Software: Park J; Supervision: Yu KS, Huh KY, Chung WK; Validation: Yu KS, Huh KY, Chung WK; Visualization: Park J; Writing - original draft: Park J; Writing - review & editing: Yu KS, Huh KY, Chung WK. The DCT has many advantages in terms of accessibility to clinical trials. The long distance from patients' homes to the trial center has been a barrier preventing patients from participate in clinical trials [4,5]. However, decentralized elements allow participants to maintain their daily lives during the trial [6]. In addition, researchers can recruit participants from diverse backgrounds and obtain real-world data more quickly and cost-effectively [7,8]. These benefits are in line with the recent paradigm of patient-centric clinical trials, emphasizing diversity, equity and inclusion [9].

In response, regulatory agencies have issued guidance on DCTs. Public authorities such as the Danish Medicines Agency [10] or the Swiss Agency for Therapeutic Products (Swissmedic) [11] published guidance on DCTs in 2021. The European Medicines Agency (EMA) issued a recommendation paper in 2022 [12]. The U.S. Food and Drug Administration (FDA) [1] and Clinical Research Malaysia [13] published guidance in 2023. Recommendations from industry were also published; the quality-by-design manual for DCT by the Association of Clinical Research Organizations [14] influenced the EMA guidance [12].

However, the landscape of DCTs has not been suitably evaluated. First, it is difficult to identify DCT cases due to the broad range of terms used. The term 'decentralized' has only recently been standardized, with virtual trials [15], remote trials [16], and digital trials [17] being used previously. Due to the lack of a unified keyword or a typical method of searching for DCTs, the number of DCTs is only vaguely estimated.

Additionally, a systematic analysis of decentralized elements is difficult due to the heterogeneous DCT guidance. To date, different recommendation papers have emphasized various aspects of decentralized elements. In order to categorize and analyze them structurally, commonly highlighted recommendations should be analyzed. However, to the best of our knowledge, there is little research on these issues.

Hence, we sought to provide an overview of the landscape of DCTs by comparing the regulatory guidance and analyzing the decentralized elements from clinical trial registries. We attempted to evaluate how decentralized elements have been implemented in real-world trials and whether they were in accordance with the DCT guidance.

METHODS

Comparison of DCT guidance publications

We compared 2 regulatory guidance publications on DCTs: 'Decentralized Clinical Trials for Drugs, Biological Products, and Devices' published by the FDA [1] and 'Recommendation Paper on Decentralized Elements in Clinical Trials' issued by the EMA [12].

We summarized the 2 guidance publications into topic sentences and grouped them according to the following 3 categories: 1) assessing the appropriateness of using decentralized elements, 2) additional roles and responsibilities in DCTs, and 3) implementation strategies tailored to decentralized elements. In each category, we matched the topic sentences in sequence between the 2 guidance publications to find commonalities. The similarities and differences between the guidance were listed in tables as 3 categories. In addition, we set the commonly suggested recommendations as criteria to be used to evaluate whether the decentralized elements were in consistent with the DCT guidance.

Identification of DCT cases

We searched for DCT cases in the ClinicalTrials.gov registry that were initiated before October of 2023. We selected the following 6 keywords commonly used in DCTs in the intervention/ treatment field of the registry: decentralized, remote, mobile, digital, virtual and hybrid. We excluded results where these keywords were used in a non-DCT context. In other words, if a keyword was used in conjunction with words from the pre-defined exception list, the case was excluded. Examples of the keywords used in a non-DCT context were as follows: remote ischemic preconditioning, intraoperative mobile gamma camera, dorsal digital flap, volumetric virtual histology intravascular ultrasound, and hybrid immunotherapy.

The exception list was determined by means of natural language processing [18,19]. The non-DCT context was initially manually explored in the preliminary set. This set was randomly sampled at 10% from the results of the keyword-based searches. The sentences in the preliminary set were tokenized after removing stopwords and special characters. Three tokens before and after the keyword were collected with a unique trial identifier (ClinicalTrials.gov NCT number). Tokens used in more than 3 trials in a non-DCT context were included on the exception list. Finally, the remaining cases (90%) were inspected as to whether they contained any keywords from the exception list. All procedures were performed using the *nltk* library in Python version 3.10.7 (Python Software Foundation, Wilmington, DE, USA).

Interventions used in the identified DCT cases

A network analysis was conducted to analyze the types of interventions used in the identified DCT cases [20,21]. We visualized how tokens, meaningful units of text, were connected within a sentence. The nodes represented tokens and the edges connected the tokens reflecting co-occurrences. The size of each node was proportional to the frequency of the corresponding token. The thresholds for displaying connections among the tokens in the figure were adjusted to avoid over-complexity. The process was performed using the *tidytext*, *tidyr*, *widyr*, *tidygraph* libraries in R version 4.3.1 (R Foundation, Vienna, Austria) and with the *nltk* library in Python version 3.10.7 (Python Software Foundation).

Interventions used in the identified DCT cases were analyzed according to the registry's own classification system of 8 categories: behavioral, device, diagnostic test, dietary supplement, drug, genetic, procedural, and other. If an identified DCT case included interventions from more than one category, the interventions were counted separately. DCT cases with an intervention classified as 'drug' were defined as drug-related DCT cases and were subjected to an additional analysis. The drug-related DCT cases were descriptively summarized for the indication, name, and the route of administration of the drugs.

RESULTS

Comparison of DCT guidance publications

Both the FDA and the EMA commonly emphasized that the appropriateness of the decentralized element should be assessed along 2 axes: patient safety and data integrity. First, both regulatory agencies recommended assessing the impact of decentralized elements on patient safety based on the type of the trial, the complexity of the elements performed, and the safety information about the drug. Second, they also recommended that strategies be put in place to reduce potential errors that could compromise data integrity, such as data variability between investigators. The FDA specifically emphasized that the same

Table 1. Criteria	TOT assessing	, the appropriateness of using decentralized elements (FDA VS. El	νiΑ <i>j</i>	
Categories	Attributes	FDA	EMA	
Patients' safety	Similarities	 [Considerations for the use of decentralized elements] Consider the type of clinical trial, the trial population, the disease being treated, the condition of the trial participant, the type of medicinal product, the clarity of its safety profile, its developmental stage, and the complexity of the procedures. [Considerations for off-site drug administration] Consider the route of administration, whether an observation period is required, the need for emergency plans, the preparation of the drug administration, its stability, the storage conditions, the robustness of the shipping system, the ability to self-medicate, the shelf life and the return plan for unused drugs. 		
	Differences	 [Considerations for procedures at home] Only if the procedures do not cause an additional risk to trial participants or to the reliability of the data assessment. [Considerations for telehealth visits] If the drug does not pose a significant risk to the participants and adverse events can be properly assessed in such a setting. [Hybrid DCT as an alternative to a fully DCT] Drug administration at trial sites with remote follow-up. Specify when a telehealth visit is appropriate and when a participant should be seen in person. 	 [Considerations for the use of decentralized element] Weigh the burden of the decentralized elements transferred to the participants or investigators against the potential benefits. [Considerations for the use of electronic methods] Consider the burdens and potential benefits, the vulnerability of the trial population, the complexity of the trial design and the risks associated with the trial-specific interventions. 	
Data integrity	Similarities	[Potential error due to a decentralized element] - Variability of the data depending on the performer. [Strategies for data integrity] - Present an overview of the data flow in the protocol or data	management plan.	
	Differences	 [Strategies for data integrity: quality control] Regularly review the data entered by delegated personnel using methods tailored to its criticality and complexity. [Degree of data integrity] A non-inferiority margin may not be reasonable to be considered as equal to an on-site trial. 	 [Potential error due to decentralized element] Exclusion of digitally illiterate people. Missing data. Sample handling and storage. Complex data from multiple systems. Malfunction of the digital tool. Disrupted decentralized procedure. [Strategies for data integrity] Make a contingency plan about decentralized elements. Involve the stakeholders in advance. [Degree of data integrity] Meet the same expectations as for an on-site trial for an authorization trial. 	

FDA, Food and Drug Administration; EMA, European Medicines Agency; DCT, decentralized clinical trial.

non-inferiority margin in DCT as in the conventional trial may not be reasonable. The EMA additionally highlighted the importance of balancing the burdens of decentralized elements (Table 1).

The 2 regulatory authorities commonly defined 5 new roles of in relation to DCTs: local personnel, local laboratory, shipping system, software and regulation. Also, they commonly described newly added DCT-specific responsibilities for investigators, sponsors and participants. The FDA additionally addressed the delegation of local personnel and the centralization of shipping. The EMA described more practical details about the education of subjects and the shipping procedures of the drugs (Supplementary Table 1).

The 2 guidance publications also commonly described implementation strategies tailored to decentralized elements. For example, the 2 authorities recommended risk-based data monitoring in general. In particular, for safety data, a clear description about managing actions by whom was commonly recommended. Also, effective communication between stakeholders was emphasized by both authorities. Additionally, the EMA provided detailed strategies for remote consent interviews (Supplementary Table 2).

Overall trends of the identified DCT cases

A total of 15,474 cases were searched using the 6 DCT-specific keywords, and 4,874 DCT cases were identified. The exception list consisted of 153 tokens, of which 78 (51.0%) were for the keyword 'digital' (**Supplementary Table 3**). For example, the term 'digital,' which referred to anatomical terms for fingers and the digitization of imaging or surgical equipment, was determined as a non-DCT context.

The annual number of DCT cases increased gradually. The first DCT case was identified in 1998 (ClinicalTrials.gov No.: NCT02235389). Since the outbreak of the coronavirus disease 2019 pandemic in 2020, more than 500 DCTs were conducted annually (**Fig. 1**). The most common keywords in the DCT cases were 'mobile' 1,762 (36.2%) and 'digital' 1,211 (24.8%) (**Table 2**). The term 'decentralized' appeared in 15 cases (0.3%) and the first case was found in 2003 (ClinicalTrials.gov No.: NCT00124085). No DCT case had more than one keyword at the same time.

Interventions used in the identified DCT cases

The network analysis demonstrated that the following tokens were frequently described in the interventions in the DCT cases: rehabilitation, exercise, education, monitoring, prevention and training. These words were combined with technology-related words such as app/application, system, platform, and game (**Figure 2**). In addition, according to the



Figure 1. Identified decentralized clinical trial cases depicted by years and keywords.

registry's own classification system, 3,152 interventions were classified as 'behavioral' (41.0%), whereas only 143 interventions were classified as 'drug' (1.8%) (**Table 3**).

Table 2. Identified DCT cases by 6 keywords

Keyword	DCT cases
Mobile	1,762 (36.2)
Digital	1,211 (24.8)
Remote	821 (16.8)
Virtual	736 (15.1)
Hybrid	329 (6.8)
Decentralized	15 (0.3)
Total	4,874 (100)

All data are expressed as a number (proportion %).

DCT, decentralized clinical trial.

Table 3. Interventions in the identified DCT cases according to the registry's own classifications

Intervention/Treatment	Interventions*	DCT cases [†]
Behavioral	3,152 (41.0)	1,950 (37.6)
Other	2,337 (30.4)	1,606 (31.0
Device	1,516 (19.7)	1,178 (22.7)
Procedure	351 (4.6)	219 (4.2)
Diagnostic test	175 (2.3)	122 (2.4)
Drug	143 (1.8)	94 (1.8)
Dietary supplement	14 (0.2)	9 (0.2)
Genetic	3 (0.0)	3 (0.1)
Total	7,691 (100)	5,181 (100)

All data are expressed as a number (proportion %).

DCT, decentralized clinical trial.

*If a trial included interventions from more than one intervention, the researchers allowed for duplicates and counted them all.

[†]If a trial included interventions from more than one category, the researchers allowed for duplicates and counted them all.



Figure 2. Network analysis by tokenizing each sentence in the intervention field in the decentralized clinical trial cases. The size of the nodes (circle) indicates the frequency of the tokens. The color of the nodes indicates the group of associations. The edges (grey solid lines) reflect the co-occurrences of the tokens. Fifteen or more used tokens are shown to avoid over-complexity. The 6 keywords are not labelled due to lack of space.

Characteristics of drug-related DCT cases

Among the 94 drug-related DCT cases excluding duplicates, there were 36 indications (**Table 4**). The most common indication was smoking cessation, with 22 DCT cases involving nicotine replacement therapy, bupropion and varenicline. This was followed by 8 DCT cases for diabetes using metformin and insulin, 7 DCT cases for asthma using albuterol and fluticasone, and 6 DCT cases for human immunodeficiency virus prophylaxis using

Table 4. Inc	dications	targeted	by drug-r	elated	DCTs
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Indications	DCT cases
Psychiatry	
Smoking cessation	2 (23.7)
Schizophrenia	3 (3.2)
Attention deficit hyperactivity disorder	3 (3.2)
Major depressive disorder	3 (3.2)
Drug abuse	2 (2.2)
Alcohol withdrawal	1 (1.1)
Cannabis use disorder	1 (1.1)
Anxiety disorder	1 (1.1)
Sleep disorder	1 (1.1)
Endocrinology	
Diabetes	8 (8.6)
Dyslipidemia	1 (1.1)
Overweight	1 (1.1)
Post-menopausal osteoporosis	1 (1.1)
Infection	
Human immunodeficiency virus prophylaxis	6 (6.5)
COVID-19	5 (5.4)
Malaria chemoprevention	1 (1.1)
Malaria infection	1 (1.1)
Pulmonology	
Asthma	7 (7.5)
Chronic obstructive pulmonary disease	3 (3.2)
Oncology	
Breast cancer	2 (2.2)
Cancer (various)	2 (2.2)
Sickle cell anemia	1 (1.1)
Cardiology	
Hypertension	2 (2.2)
Arrhythmia	1 (1.1)
Myocardial infarction	1 (1.1)
Neurology	
Spinal cord injury	2 (2.2)
Cerebral palsy	1 (1.1)
Essential tremor	1 (1.1)
Dentistry	
Cavity protection	2 (2.2)
Gingivitis	1(1.1)
Gastroenterology	
Bowel prep	1 (1.1)
Liver cirrhosis	1 (1.1)
Rheumatology	
Raynaud's disease	1 (1.1)
Dermatology	
Rosacea	1 (1.1)
Ophthalmology	
Dry eye	1 (1.1)
Pediatrics	
Respiratory syncytial virus infection	1(1,1)

All data are expressed as a number (proportion %).

DCT, decentralized clinical trial; COVID-19, coronavirus disease 2019.

Route of administration	DCT cases*
Oral	78 (67.2)
Inhalation	14 (12.1)
Subcutaneous	7 (6.0)
Topical	7 (6.0)
Transdermal	5 (4.3)
Intramuscular	3 (2.6)
Iontophoresis	1 (0.9)
Intravenous	1 (0.9)
Total	116 (100)

Table 5. Route of administration of the drugs used in drug-related DCTs

All data are expressed as a number (proportion %).

DCT, decentralized clinical trial.

*If a trial used more than one drugs, the researchers allowed for duplicates and counted them all.

emtricitabine. There were also 2 DCT cases for spinal cord injury using buspirone and testosterone (ClinicalTrials.gov No.: NCT03576001, NCT04458324) [22].

Most of the drug-related DCT cases were in phase III trials with previously approved drugs (96.8%). Three cases involved investigational drugs, and all of them were evaluated in phase II trials (ClinicalTrials.gov No.: NCT04423757, NCT05419869, NCT04068792). Six cases were phase I trials, but all of them were repurposing studies with previously approved drugs (ClinicalTrials.gov No.: NCT02018263, NCT02932215, NCT03804840, NCT04525755, NCT05268497, NCT05962632) (**Supplementary Table 4**).

The most common routes of drug administration were oral (67.2%) and inhalation (12.1%) (**Table 5**). In only one trial, a paramedic administered intravenous alteplase in an ambulance to a patient for acute myocardial infarction with remote electrocardiogram monitoring (ClinicalTrials.gov No.: NCT02225389) (**Supplementary Table 4**).

DISCUSSION

The FDA and EMA commonly emphasized the need to assess the appropriateness of decentralized elements in terms of patient safety and data integrity. These 2 axes were the main criteria for assessing whether the decentralized elements were in accordance with the guidance. In addition, they suggested newly added roles and responsibilities in relation to DCTs. Also, they both addressed implementation strategies tailored to the decentralized elements.

We found that the keyword 'decentralized' was not suitable for searching DCT cases in the clinical trial registry. Instead, 'remote,' 'virtual' and 'hybrid' were more commonly used because they implied the meaning of off-site procedures. Other words such as 'electronic' or 'computer' were initially considered as candidates. However, these words were not chosen as keywords because doing so led to an excessive number of non-DCT context searches. A limitation of the study is that 6 keywords may not be sufficient to cover all DCT cases.

The decentralized elements used in the identified DCT cases were consistent with the patient safety and data integrity. In the identified DCT cases, most interventions showed low risk and were easy to implement [23-24]. The indications for the drug-related DCT cases were mainly chronic or prophylactic conditions that did not require urgent management [25-26]. The routes of administration of the drugs used in drug-related DCT cases were mostly available for self-administration.

There are still concerns that patient safety or data integrity could be compromised due to decentralized elements [27-28]. Security, compliance with local regulations, and delegation of the study personnel are also critical for DCTs. However, such information was limited in the registry. Further investigations of the technological robustness or capabilities of local personnel are needed.

In conclusion, the number of the DCT cases identified in this study has increased. With the benefit of off-site procedures, DCTs are in line with the current trend of patient-centered clinical trials [29-30]. DCT expands the access of clinical trials to subjects with the limited mobility [22]. Most of the decentralized elements in the identified DCTs used low-risk and simple interventions. These characteristics were consistent with patient safety and data integrity, which are commonly recommended by the FDA and EMA.

SUPPLEMENTARY MATERIALS

Supplementary Table 1

Additional roles and responsibilities in DCTs (FDA vs. EMA)

Supplementary Table 2

Implementation strategies tailored to the decentralized elements (FDA vs. EMA)

Supplementary Table 3 Exception list by keyword

Supplementary Table 4

The list of drug-related DCT cases

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