

BMJ Open

Early termination of cardiovascular trials as a consequence of poor accrual

Journal:	<i>BMJ Open</i>
Manuscript ID	bmjopen-2016-013482
Article Type:	Research
Date Submitted by the Author:	14-Jul-2016
Complete List of Authors:	Baldi, Ileana; University of Padova, Cardiac, Thoracic and Vascular Sciences Lanera, Corrado; University of Padova, Cardiac, Thoracic and Vascular Sciences Berchiolla, Paola; University of Torino, Clinical and Biological Sciences Gregori, Dario; University of Padova, Cardiac, Thoracic and Vascular Sciences
Primary Subject Heading:	Cardiovascular medicine
Secondary Subject Heading:	Epidemiology
Keywords:	Clinical trials < THERAPEUTICS, EPIDEMIOLOGY, STATISTICS & RESEARCH METHODS

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3 **Early termination of cardiovascular trials as a consequence of poor**
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6 **accrual**
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8 Ileana Baldi¹, Corrado Lanera¹, Paola Berchiolla², Dario Gregori¹

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11 ¹Unit of Biostatistics, Epidemiology and Public Health, Department of Cardiac, Thoracic and
12 Vascular Sciences, University of Padova, Padova, Italy
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17 ²Department of Clinical and Biological Sciences, University of Torino, Torino, Italy
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26 **Correspondence to:**

27 Dr. Ileana Baldi,

28
29 Unit of Biostatistics, Public Health and Epidemiology

30
31
32 Department of Cardiac, Thoracic and Vascular Sciences, University of Padova

33
34 Via Loredan, 18 - 35131 Padova, Italy

35
36 Email: ileana.baldi@unipd.it

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39 Phone: +39 049 8275403

Fax: +39 02 700445089
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Word count, excluding title page, abstract, references, figures and tables: 2268

Abstract

Objectives. To present a snapshot of experimental cardiovascular research with a focus on geographical and temporal patterns of early termination due to poor accrual.

Setting. The Aggregate Analysis of ClinicalTrials.gov (AACT) database, reflecting ClinicalTrials.gov as of March 27, 2016.

Design. The AACT database was searched for all cardiovascular clinical trials that started from January 2006 up to December 2015.

Results. Thirteen thousand seven hundred twenty-nine cardiovascular trials were identified. Of these, 8,900 (65%) were classified as closed studies. Globally, 11% of closed trials were terminated. This proportion varied from 9.6% to 14% for trials recruiting from Europe and America, respectively, and was quite stable over the study period. The most common reason for trials failing to complete was poor accrual (41%). Intercontinental trials exhibited lower figures of poor accrual (28%) as the reason for their early stopping, as compared to trials recruiting in a single continent (44%).

Conclusions. Poor accrual significantly challenges the successful completion of cardiovascular clinical trials. Findings are suggestive of a positive effect of globalization of cardiovascular clinical research on the achievement of enrolment goals within a reasonable timeframe.

Strengths and limitations of this study

- To identify cardiovascular clinical trials terminated early because of poor accrual, this study relies on the most updated release of ACCT database and on automated and replicable text mining techniques.

- By analysing early termination due to poor accrual by continent of recruitment over time, the study shows that poor accrual exhibits geographical heterogeneity with lower figures for intercontinental trials.
- In interpreting results it must be acknowledged that ClinicalTrials.gov is representative of registered trials recruiting from Europe and Americas. On the contrary, it cannot be ruled out that some selection bias occurred for trials recruiting from Asia and Oceania since they are increasingly registered at other regional registries.

Introduction

Clinical trials may terminate for a variety of reasons, some of which correctly envisaged in the study protocol [1 2] and others unforeseen and attributable to failures in the trial conduct. Examples of appropriate reasons for terminating a trial prior to completion include unequivocal evidence of futility or harm [3]. In this case early stopping may prevent additional patient exposure to ineffective or harmful treatments and limit further expenditure of resources on unsuccessful approaches. Conversely, premature termination due to poor accrual clearly reflects a failure of the trial process since trials completed with less than expected enrollment, are usually delayed and unable to meet their intended objectives meaningfully.

Clinical trials that fail to recruit successfully or in a timely manner their target number of participants pose ethical, financial and statistical issues [4]. They are a major concern in research areas where the acuity of the disease and the quickly evolving treatment paradigm render original research questions obsolete if not implemented in a timely manner. This partially explains why poor accrual and its consequences have been extensively investigated in some areas, mostly in oncology [5-7], and less in others.

Unsuccessful recruitment has been recently acknowledged [8 9] as the leading factor in cardiovascular trial failure, generating resource consuming underpowered trials which provide only inconclusive data with no or little return on investments.

Given the fast growth in cardiovascular research seen in the past decade [10], documenting to which extent poor accrual affects cardiovascular trials, also in terms of geographical and temporal trends, can provide important insights to inform future trials.

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3 The development of clinical trial registries, such as ClinicalTrials.gov, affords a remarkable
4 opportunity to better understand the extent of early termination in cardiovascular trials. In the
5 beginning, ClinicalTrials.gov was set to increase public awareness of clinical trials and its
6 systematic evaluation was hindered by a lack of access to the complete, annotated data. This
7 registry now serves as a mandatory repository for information on most clinical studies run under US
8 regulations and registration with ClinicalTrials.gov is mandatory for publishing study results in
9 many peer-reviewed journals. In addition, the database for Aggregate Analysis of ClinicalTrials.gov
10 (AACT)[11], a high-quality, searchable database of the information contained in ClinicalTrials.gov
11 is now publicly available.
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22 By leveraging information available through the AACT database, reflecting ClinicalTrials.gov as of
23 March 27, 2016, we present a snapshot of the last 10 years of cardiovascular research, with a focus
24 on geographical and temporal patterns of early termination due to poor accrual.
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32 **Material and Methods**

33 AACT database, reflecting ClinicalTrials.gov as of March 27, 2016, is the data source. A
34 comprehensive dictionary for the data elements in AACT is available online[12].
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37 The MeSH code field in the AACT database was queried for at least one of the following MeSH
38 codes: A07 Cardiovascular System, C14 Cardiovascular Diseases; D27.505.954.411 Cardiovascular
39 Agents; E01.370.370 Diagnostic Techniques, Cardiovascular; E04.100 Cardiovascular Surgical
40 Procedures; E04.928.220 Cardiac Surgical Procedures; E04.936.450.475 Heart transplantation;
41 G09.330 Cardiovascular Physiological Phenomena and H02.403.429.163 Cardiology, with the aim
42 to identify all studies dealing with a cardiovascular condition. The final sample was limited to all
43 such studies, started in the past decade - from January 2006 to December 2015 - and classified as
44 “Interventional”, therein referred to as cardiovascular trials.
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3 Study characteristics that have been considered are Year of start date, Phase (available only for drug
4 and biologics trials), Type of intervention, Number of arms, Primary purpose, Endpoint
5 classification, Intervention model, Masking, Number and location of the facilities involved, Number
6 of patients enrolled.
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11 The rate of studies that have stopped recruiting or enrolling participants early and will not start
12 again, defined “terminated” studies, was estimated on studies that are no longer recruiting
13 participants because they have enough participants already, have ended, or have been stopped for
14 some reason and referred to as “closed” studies. The latter definition embraces also withdrawn
15 studies, intended as studies closed with no patients enrolled.
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23 Study duration was calculated as the difference between start date and completion date, only for
24 closed studies and “actual” completion date type.
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27 To establish the reason for stopping, text mining was applied to the narrative field of reason for
28 study termination. The following text pre-processing procedures were applied in the following
29 order: conversion to lowercase, removing numbers, removing punctuation, removing stop-words,
30 stemming words, removing stemmed uninformative terms (“studi”, “clinical”, “trial”, “patient”,
31 “subject”, “approach”, “termin”, “stop”), treating the stemmed terms “accrual” and “recruit” as
32 synonyms of “enrol”, stripping white space, and building a sequence of two adjacent words from
33 the text (bigrams).
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42 A randomly selected sample of about 10% of terminated trials was extracted to assess the accuracy
43 of automated text mining in identifying poor accrual as compared to manual review (gold standard).
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46 AACT was downloaded in pipe delimited text format and managed in R software, version 3.3.0.
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48 The location of each facility, expressed as country in AACT database, was ascribed to a region and
49 to one of the five continents through R packages “countrycode” and “rworldmap”. Text mining was
50 performed with “tm” R package.
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Results

In a 10-year time span, from 2006 to 2015, 13,729 cardiovascular trials were identified.

As shown in Figure 1, cardiovascular trials were prevalently run in Northern America (41%), followed by Eastern and Western Europe (25%) and Eastern Asia (8%). The regions that together contributed to less than 0.5% were Middle, Eastern and Western Africa and Central Asia.

Single-centre studies accounted for the majority (60%) of cardiovascular trials. Among intercontinental trials (n= 1,089), the most likely collaborations were bilateral between Americas and Europe (32%), trilateral between Americas, Asia and Europe (14%), quadrilateral between Americas, Asia, Europe and Oceania (11%), and worldwide (8%).

Overall, the most common interventional model was parallel design (60%). Of studies reporting number of arms (n=13,419), 27% were single-armed and 57% had two arms. Multi-arm studies (n= 9,735), were typically randomized (89%) and blinded (38% double-blinded and 20% single-blinded). Phase II and III trials together accounted for 4,500 studies and 5052 recorded the phase as “not applicable”. The most frequently observed intervention was drug (n= 6,334), followed by device (n= 2,736) and procedure (n= 1,405).

Eight thousand nine hundred cardiovascular trials (65%) were classified as closed studies. Of these, 11% were terminated. The reason for termination was missing for 141 studies.

The single stemmed term “enrol” occurred in 404 reasons for study termination and it was most associated with the adjectives “poor”, “low” and “slow”, making poor accrual the most common reason for trials failing to complete. The second most common substantive was “fund”, with 85 occurrences and it was associated with the term “lack”, followed by “sponsor”, with 70 occurrences, and associated with the term “decis”. Table 1 reports the most frequently used bigrams in the reason for termination field.

Table 1. Stemmed bigrams occurring in the reason for stopping field at least 10 times. Terminated cardiovascular trials, 2006-2015.

Bigrams	N
slow enrol	78
low enrol	69
lack enrol	41
poor enrol	36
difficult enrol	25
enrol rate	25
interim analysi	23
lack fund	23
safeti concern	23
insuffici enrol	22
sponsor decis	20
left institut	15
busi decis	14
inabl enrol	14
unabl enrol	14
detail descript	11
safeti issu	10

Furthermore, the term “enrol” occurred as the reason for stopping of 90 withdrawn trials and 18 suspended trials. Table 2 reports the proportion of trials terminated for poor accrual over terminated trials by study characteristic.

Table 2. Characteristics of closed cardiovascular interventional trials - 2005-2015. Proportion of terminated trials (% terminated) and proportion of trials terminated because of lack of accrual (% poor) by study characteristics.

		N	% terminated	% poor
Year	2006-2007	1078	7.0	42.3
	2008-2009	1893	6.6	43.0
	2010-2011	1955	6.0	43.3
	2012-2013	1596	4.9	32.8
	2014-2015	624	4.2	44.2
Facility location (#)	Africa	32	3.2	100.0
	Americas	3769	14.0	46.3
	Americas Asia Europe	129	13.2	17.6
	Americas Asia Europe Oceania	89	7.9	14.3
	Americas Europe	256	18.0	34.7
	Asia	1079	5.6	33.3
	Europe	2454	9.6	40.4
	Oceania	71	18.3	30.8
	Other	374	4.2	50.8
	Missing	647	5.9	23.7
Phase	Phase 0	1479	8.6	14.3
	Phase 1	81	9.9	32.9

	Phase 1/Phase 2	736	11.3	29.8
	Phase 2	415	15.1	36.5
	Phase 2/Phase 3	1542	11.7	44.4
	Phase 3	231	13.2	36.9
	Phase 4	1419	11.0	51.5
	N/A	2997	8.2	46.6
Intervention type	Behavioral	603	4.5	1.8
	Biological	294	10.2	33.3
	Device	1679	11.9	42.7
	Dietary Supplement	266	5.3	50.0
	Drug	4309	13.4	39.8
	Genetic	26	7.7	0.0
	Procedure	44	13.6	45.1
	Radiation	784	10.5	83.3
	Other	895	5.4	47.9
Number of arms	1	2474	11.2	42.0
	2	4725	11.7	43.5
	>2	1466	8.5	29.8
	Missing	235	13.6	34.4
Primary purpose	Basic Science	250	4.8	25.0
	Diagnostic	491	11.0	50.0
	Health Services Research	197	4.1	37.5
	Prevention	1008	9.5	37.5
	Screening	46	4.3	0.0
	Supportive Care	280	10.3	75.0
	Treatment	6264	12.1	39.7
	Missing	364	8.0	48.3
Allocation	Non-Randomized	1052	11.0	31.0
	Randomized	6039	11.0	41.9
	Missing	1809	11.2	44.1
Endpoint classification	Bio-availability	18	5.6	0.0
	Bio-equivalence	38	7.9	66.7
	Efficacy	2668	10.7	47.2
	Pharmacodynamics	121	11.6	35.7
	Pharmacokinetics	124	4.0	0.0
	Pharmacokinetics/Dynamics	111	12.6	28.6
	Safety	625	9.1	36.8
	Safety/Efficacy	3811	12.8	37.2
	Missing	1384	8.5	47.5
Masking	Double Blind	2775	12.6	36.7
	Open Label	4798	11.2	43.1
	Single Blind	1287	7.1	46.2
	Missing	40	15.0	33.3
Intervention model	Crossover	713	7.4	39.6
	Factorial	156	8.3	38.5
	Parallel	5246	11.4	41.5
	Single Group	2727	11.4	40.8
	Missing	58	15.5	33.3
N. enrolled	(0,100]	5521	14.0	45.3
	(100,1000]	2832	6.3	27.4
	(1000,20000]	467	5.6	10.7
	>20000	53	3.8	0.0
	Missing	27	19.2	40.0
N. facilities (per study)	1	4934	10.3	44.4
	(1,10]	1876	14.4	44.1
	(10,50]	1047	11.5	35.0
	(50,100]	204	14.2	17.2
	>100	191	9.4	16.7
	Missing	648	5.9	23.7
N. Conditions (per study)	1	6703	11.8	41.3
	2	1584	8.2	44.0
	>2	613	13.8	32.9
Conditions (*)	Acute Coronary Syndrome	205	12.2	48.3
	Atrial Fibrillation	380	13.4	37.2

Cardiovascular Diseases	481	5.4	34.6
Coronary Artery Disease	609	8.7	50.9
Coronary Disease	341	10.0	32.3
Heart Failure	644	13.8	53.9
Hypertension	901	10.2	29.3
Multiple Myeloma	620	15.8	42.9
Myocardial Infarction	216	9.7	38.2
Myocardial Ischemia	414	10.9	20.0
Stroke	477	10.9	34.6
Overall	8900	11.1	41.1

(#): Facility location describes the study-level location of enrolling sites. It results in a single continent for single-centre trials and multi-centre multinational trials and in a combination of continents for intercontinental trials.

(*): the number of MeSH conditions sums to 13501 across the 8900 closed trials. Only the conditions exceeding an absolute frequency of 200 are listed.

On a random sample of 85 terminated trials, where the reason for termination was manually reviewed by one of the authors (I.B.), the prevalent reason was poor accrual (47%). Stopping occurred for lack of funding and sponsor decision in 8% and 6% of the sampled trials, respectively. Appropriate reasons for termination based on internal or external evidence of futility or lack of safety accounted for 26% of all reasons. The sensitivity and specificity of the stemmed term “enrol” in identifying poor accrual were 97.5% and 100%, respectively.

Terminated trials actually involved a total of 114,609 enrolled subjects (plus 44,513 scheduled) and more than 10,500 facilities worldwide. Eighteen thousand eight hundred eight patients and 2,319 facilities actually took part in trials terminated because of poor accrual.

The patterns of premature termination shown in Figure 2, varying from 14% to 9.6% among the two most contributing continents, Americas and Europe, indicated geographical heterogeneity but were quite stable over the study period.

Intercontinental trials exhibited higher figures of termination and lower figures of unsuccessful accrual as the reason for their early stopping, as compared to intracontinental trials (13% vs. 11% termination, of whom 28% vs. 44% due to poor accrual, respectively). Figure 3 shows the time trend of poor accrual for intercontinental trials.

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3 A median actual duration of 24 months was observed both on closed trials and on the subset of
4 terminated trials. Only a slight difference emerged in the third quartile, ranging from 38 to 39
5 months for closed and terminate trials, respectively. For this reason, time trends were truncated at
6 the last biennium under study.
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11 Poor accrual accounted for more than 40% of reasons for early stopping in trials recruiting from
12 Americas and Europe. This proportion was by far inferior for all other continents of recruitment,
13 although caution must be taken in interpreting these figures since they rely on small absolute
14 numbers (Table 2).
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20 21 22 23 **Conclusion**

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25 Clinical trials are a key step in advancing new therapeutic concepts for the management of chronic
26 cardiovascular diseases from the research setting to the clinical practice[13]. Despite this
27 achievement, the successful recruitment of the targeted number of participants in a given time frame
28 remains a significant challenge to clinical trials [14]. Delayed and abandoned trials represent a
29 waste of scarce human and economic resources which may slow the advancement of medical
30 progress or reduce its timely impact on patient health and wellbeing.
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38 Therefore, a thorough understanding of the nature of trial enrolment patterns, from an overview on
39 aggregate data through to the working of individual trials, is of paramount importance.
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42 This study contributes to a growing body of research on early termination due to poor accrual in
43 cardiovascular trials[2 3 9], providing further insights into geographical and temporal patterns.
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46 Among study findings, about 11% of all closed trials were terminated, which is consistent with
47 other cross-sectional studies using the ClinicalTrials.gov registry[9 15]. When restricted to phase II
48 and phase III trials together, the proportion of early termination (14%) was slightly inferior to that
49 reported on a recent study[4] based on the National Library of Medicine clinical trial registry
50 (19%).
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3 Consistently with existing literature [8 9], the most common reason for cardiovascular trials failing
4 to complete was poor accrual (41%). Common logistical reasons were related to lack of funds and
5 sponsor decision. Since reason for termination was automatically characterized by word patterns
6 through text mining, we may just speculate that the concepts underlying “safety concerns”, “safety
7 issue” and “interim analysis” pertain to appropriate termination because of excessive toxicity or in
8 accord with early stopping rules.
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12 Almost all trials are dependent on the willingness of patients and professionals to give their time
13 and effort to participate and we estimated that the human dimension of poor accrual involved more
14 than 8,000 patients and the staff of 2,000 sites.
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18 Not only the overall patterns of early termination but also those concerned with poor accrual
19 exhibited geographical variations. Cardiovascular trials recruiting in the two most contributing
20 continents, exhibited the highest and lowest proportion of early termination due to unsuccessful
21 accrual in Americas and Europe, respectively, across all the study period.
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25 Nevertheless, time trends should be interpreted with caution, since the decrease seen in the last
26 biennium of the evaluation may be an artifact, reflecting both a delay in updating trial status in
27 ClinicalTrials.gov and a selection of trials with a short duration and less likely to suffer from low
28 accrual. However, comparisons between continents of recruitment per year appear to be appropriate
29 and reliable.
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33 It is interesting to notice that intercontinental trials, particularly those in bilateral collaboration with
34 Americas and Europe, suffer more from early termination and less from termination due to lack of
35 accrual, as compared to studies completely run in only one of the participating continents.
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39 On the one hand, this probably allows to recognize the achievement of enrolment goals within a
40 reasonable timeframe as one of the numerous advantages of globalization of cardiovascular clinical
41 trials[16], but on the other hand it highlights that other organizational and financial issues challenge
42 this process. Intercontinental trials represent a valuable attempt to harmonize the generation of
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3 clinical evidence across continents. Their implementation is particularly promising in device
4 trials[17], where the comparison of procedural outcomes, using similar devices in different
5 environments, makes it possible to disentangle the effects of practice patterns and procedural
6 technique on clinical results.
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11 Some study limitations must be acknowledged. First the generalizability of study results. From a
12 recent investigation[18] on trends in global clinical trial registration from 2005 to 2013, based on
13 International Clinical Trials Registry Platform data, emerged that registered trials conducted in
14 Northern America and Latin America and Caribbean were almost exclusively registered in
15 ClinicalTrials.gov. Also European trials were predominantly registered in ClinicalTrials.gov rather
16 than in the EU Clinical Trials Register. Conversely, trials conducted in Oceania and Asia were
17 increasingly registered at other regional registries such as the Australian New Zealand Clinical
18 Trials Registry and the Japan Primary Registries Network, respectively.
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29 As a consequence, study results concerning Europe and Americas can be regarded as representative
30 of all registered trials recruiting from these continents. Moreover, differences in the extent of early
31 termination and of poor accrual, can be interpreted as genuine. On the contrary, it cannot be ruled
32 out that some selection bias occurred for trials recruiting from Asia and Oceania.
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38 Furthermore, the identification of trials terminated for poor accrual relied on an automated process
39 with an estimated sensitivity of 97.5%, thus the extent of poor accrual may be underestimated.
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43 Poor accrual is a significant barrier to the successful and timely completion of clinical trials and to
44 the advancement of medical knowledge. Although this issue may be addressed in a variety of ways,
45 a global collaborative perspective on the planning and conduct of some cardiovascular clinical trials
46 should be further encouraged[19].
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12 **Contributorship:** IB and PB designed the study and wrote the manuscript; CL and IB performed
13 the statistical analysis; all authors contributed to results interpretation and approved the final
14 manuscript.
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18 **Funding:** This research received no specific grant from any funding agency in the public,
19 commercial or not-for-profit sectors.
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23 **Competing interests:** All authors have completed the ICMJE uniform disclosure form at
24 www.icmje.org/coi_disclosure.pdf and declare: no support from any organisation for the submitted
25 work; no financial relationships with any organisations that might have an interest in the submitted
26 work in the previous three years; no other relationships or activities that could appear to have
27 influenced the submitted work
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34 **Data sharing:** No additional data available.
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References

1. Zannad F, Gattis Stough W, McMurray JJ, et al. When to stop a clinical trial early for benefit: lessons learned and future approaches. *Circ Heart Fail* 2012;**5**(2):294-302 doi: 10.1161/CIRCHEARTFAILURE.111.965707[published Online First: Epub Date]].
2. Sica DA. Premature termination of clinical trials--lessons learned. *J Clin Hypertens (Greenwich)* 2002;**4**(3):219-25
3. Task Force of the Working Group on Arrhythmias of the European Society of Cardiology. The early termination of clinical trials: causes, consequences, and control. With special reference to trials in the field of arrhythmias and sudden death. Task Force of the Working Group on Arrhythmias of the European Society of Cardiology. *Circulation* 1994;**89**(6):2892-907
4. Carlisle B, Kimmelman J, Ramsay T, MacKinnon N. Unsuccessful trial accrual and human subjects protections: an empirical analysis of recently closed trials. *Clin Trials* 2015;**12**(1):77-83 doi: 1740774514558307 [pii] 10.1177/1740774514558307[published Online First: Epub Date]].
5. Stensland KD, McBride RB, Latif A, et al. Adult cancer clinical trials that fail to complete: an epidemic? *J Natl Cancer Inst* 2014;**106**(9) doi: 10.1093/jnci/dju229[published Online First: Epub Date]].
6. Hirsch BR, Califf RM, Cheng SK, et al. Characteristics of oncology clinical trials: insights from a systematic analysis of ClinicalTrials.gov. *JAMA Intern Med* 2013;**173**(11):972-9 doi: 1682358 [pii] 10.1001/jamainternmed.2013.627[published Online First: Epub Date]].
7. Mitchell AP, Hirsch BR, Abernethy AP. Lack of timely accrual information in oncology clinical trials: a cross-sectional analysis. *Trials* 2014;**15**:92 doi: 10.1186/1745-6215-15-92[published Online First: Epub Date]].
8. Moye L. Clinical trials in cardiology: pinnacle or inflection point? *Circ Res* 2014;**114**(1):28-31 doi: 10.1161/CIRCRESAHA.113.302851[published Online First: Epub Date]].
9. Bernardez-Pereira S, Lopes RD, Carrion MJ, et al. Prevalence, characteristics, and predictors of early termination of cardiovascular clinical trials due to low recruitment: insights from the ClinicalTrials.gov registry. *Am Heart J* 2014;**168**(2):213-9 e1 doi: 10.1016/j.ahj.2014.04.013[published Online First: Epub Date]].
10. Huffman MD, Baldrige A, Bloomfield GS, et al. Global cardiovascular research output, citations, and collaborations: a time-trend, bibliometric analysis (1999-2008). *PLoS One* 2013;**8**(12):e83440 doi: 10.1371/journal.pone.0083440[published Online First: Epub Date]].
11. Tasneem A, Aberle L, Ananth H, et al. The database for aggregate analysis of ClinicalTrials.gov (AACT) and subsequent regrouping by clinical specialty. *PLoS One* 2012;**7**(3):e33677 doi: 10.1371/journal.pone.0033677PONE-D-11-20359 [pii][published Online First: Epub Date]].
12. Clinical Trials Transformation Initiative (CTTI). <http://www.ctti-clinicaltrials.org/what-we-do/analysis-dissemination/state-clinical-trials/aact-database>.
13. Jackson N, Atar D, Borentain M, et al. Improving clinical trials for cardiovascular diseases: a position paper from the Cardiovascular Round Table of the European Society of Cardiology. *Eur Heart J* 2016;**37**(9):747-54 doi: 10.1093/eurheartj/ehv213[published Online First: Epub Date]].
14. Bower P, Brueton V, Gamble C, et al. Interventions to improve recruitment and retention in clinical trials: a survey and workshop to assess current practice and future priorities. *Trials* 2014;**15**:399 doi: 10.1186/1745-6215-15-399[published Online First: Epub Date]].
15. Williams RJ, Tse T, DiPiazza K, Zarin DA. Terminated Trials in the ClinicalTrials.gov Results Database: Evaluation of Availability of Primary Outcome Data and Reasons for

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3 Termination. PLoS One 2015;**10**(5):e0127242 doi: 10.1371/journal.pone.0127242[published
4 Online First: Epub Date]].
- 5 16. O'Connor CM. The Globalization of Heart Failure Research. JACC Heart Fail 2015;**3**(8):657-8
6 doi: 10.1016/j.jchf.2015.06.001[published Online First: Epub Date]].
- 7 17. Saito S, Valdes-Chavarrri M, Richardt G, et al. A randomized, prospective, intercontinental
8 evaluation of a bioresorbable polymer sirolimus-eluting coronary stent system: the
9 CENTURY II (Clinical Evaluation of New Terumo Drug-Eluting Coronary Stent System in
10 the Treatment of Patients with Coronary Artery Disease) trial. Eur Heart J
11 2014;**35**(30):2021-31 doi: 10.1093/eurheartj/ehu210[published Online First: Epub Date]].
- 12 18. Viergever RF, Li K. Trends in global clinical trial registration: an analysis of numbers of
13 registered clinical trials in different parts of the world from 2004 to 2013. BMJ Open
14 2015;**5**(9):e008932 doi: 10.1136/bmjopen-2015-008932[published Online First: Epub
15 Date]].
- 16 19. Moss AJ, Francis CW, Ryan D. Collaborative clinical trials. N Engl J Med 2011;**364**(9):789-91
17 doi: 10.1056/NEJMp1013194[published Online First: Epub Date]].
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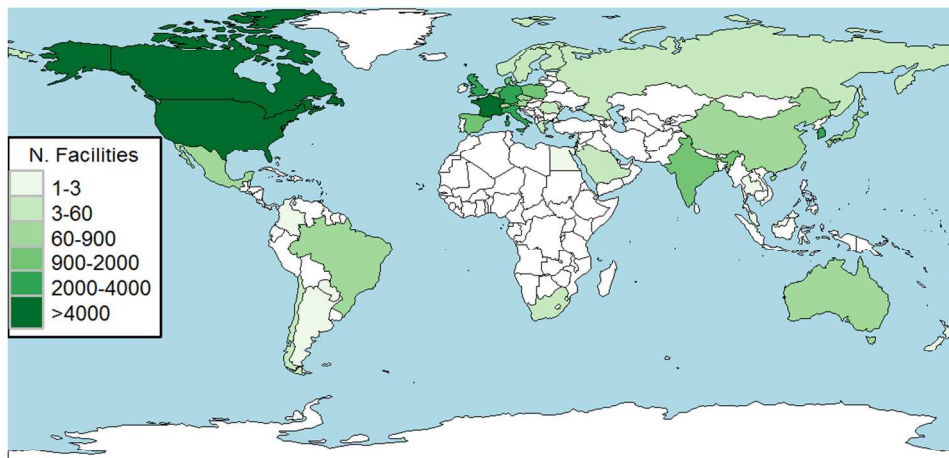
Figures

Figure 1. Geographical distribution of the facilities involved in cardiovascular trials, 2006-2015.

Figure 2. Proportion of early terminations by continents of recruitment over time. Cardiovascular trials, 2006-2015.

Figure 3. Proportion of early terminations due to poor accrual for trials recruiting from a single continent or from different continents over time. Cardiovascular trials, 2006-2015.

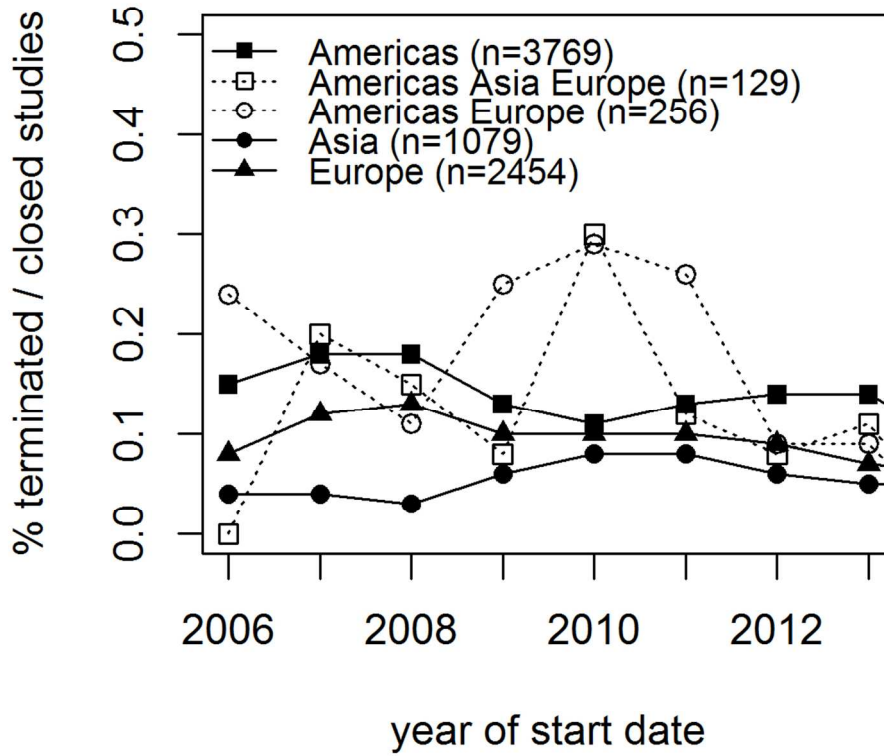
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Geographical distribution of the facilities involved in cardiovascular trials, 2006-2015.

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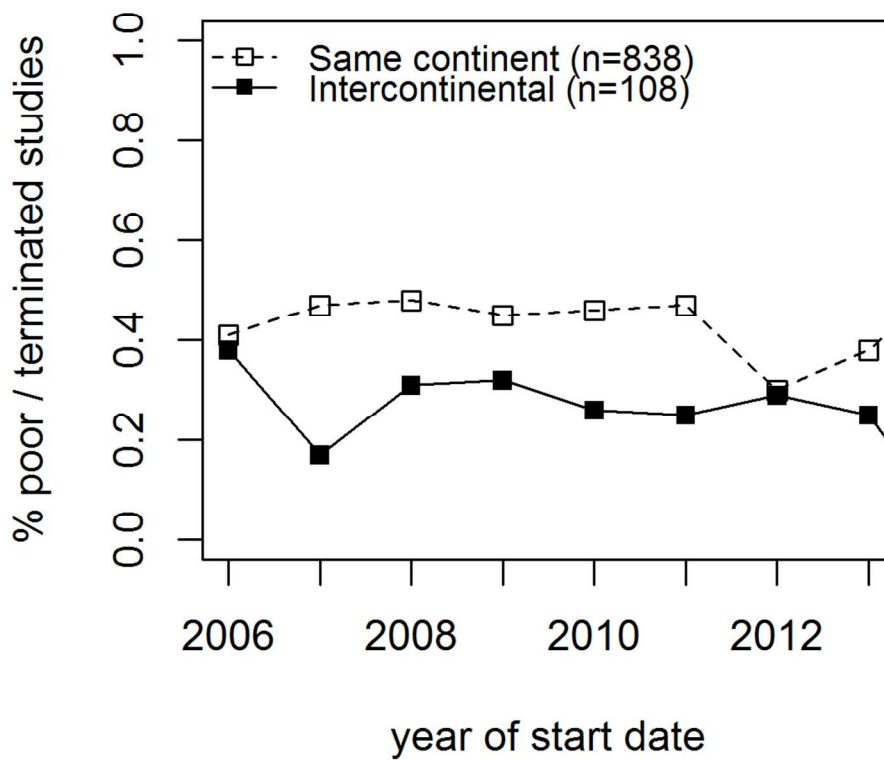




Proportion of early terminations by continents of recruitment over time. Cardiovascular trials, 2006-2015.

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Proportion of early terminations due to poor accrual for trials recruiting from a single continent or from different continents over time. Cardiovascular trials, 2006-2015.

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BMJ Open

Early termination of cardiovascular trials as a consequence of poor accrual: analysis of ClinicalTrials.gov 2006-2015

Journal:	<i>BMJ Open</i>
Manuscript ID	bmjopen-2016-013482.R1
Article Type:	Research
Date Submitted by the Author:	10-Apr-2017
Complete List of Authors:	Baldi, Ileana; University of Padova, Cardiac, Thoracic and Vascular Sciences Lanera, Corrado; University of Padova, Cardiac, Thoracic and Vascular Sciences Berchiolla, Paola; University of Torino, Clinical and Biological Sciences Gregori, Dario; University of Padova, Cardiac, Thoracic and Vascular Sciences
Primary Subject Heading:	Cardiovascular medicine
Secondary Subject Heading:	Epidemiology
Keywords:	Clinical trials < THERAPEUTICS, EPIDEMIOLOGY, STATISTICS & RESEARCH METHODS

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3 **Early termination of cardiovascular trials as a consequence of poor**
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5 **accrual: analysis of ClinicalTrials.gov 2006-2015**
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8 Ileana Baldi¹, Corrado Lanera¹, Paola Berchiolla², Dario Gregori¹
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10
11 ¹Unit of Biostatistics, Epidemiology and Public Health, Department of Cardiac, Thoracic and
12 Vascular Sciences, University of Padova, Padova, Italy
13
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15
16
17 ²Department of Clinical and Biological Sciences, University of Torino, Torino, Italy
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25
26 **Correspondence to:**

27 Dr. Ileana Baldi,
28

29 Unit of Biostatistics, Public Health and Epidemiology
30

31 Department of Cardiac, Thoracic and Vascular Sciences, University of Padova
32

33 Via Loredan, 18 - 35131 Padova, Italy
34

35 Email: ileana.baldi@unipd.it
36

37 Phone: +39 049 8275403
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39 Fax: +39 02 700445089
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Word count, excluding title page, abstract, references, figures and tables: 2268

Abstract

Objectives. To present a snapshot of experimental cardiovascular research with a focus on geographical and temporal patterns of early termination due to poor accrual.

Setting. The Aggregate Analysis of ClinicalTrials.gov (AACT) database, reflecting ClinicalTrials.gov as of March 27, 2016.

Design. The AACT database was searched for all cardiovascular clinical trials that started from January 2006 up to December 2015.

Results. Thirteen thousand seven hundred twenty-nine cardiovascular trials were identified. Of these, 8,900 (65%) were classified as closed studies. Globally, 11% of closed trials were terminated. This proportion varied from 9.6% to 14% for trials recruiting from Europe and America, respectively, with a slightly decreasing trend (p-value = 0.02) over the study period. The most common reason for trials failing to complete was poor accrual (41%). Intercontinental trials exhibited lower figures of poor accrual as the reason for their early stopping, as compared to trials recruiting in a single continent (28% vs. 44%, p-value = 0.002).

Conclusions. Poor accrual significantly challenges the successful completion of cardiovascular clinical trials. Findings are suggestive of a positive effect of globalization of cardiovascular clinical research on the achievement of enrolment goals within a reasonable timeframe.

Strengths and limitations of this study

- To identify cardiovascular clinical trials terminated early because of poor accrual, this study relies on the most updated release of ACCT database and on automated and replicable text mining techniques.

- By analysing early termination due to poor accrual by continent of recruitment over time, the study shows that poor accrual exhibits geographical heterogeneity with lower figures for intercontinental trials.
- In interpreting results it must be acknowledged that ClinicalTrials.gov is representative of registered trials recruiting from Europe and Americas. On the contrary, it cannot be ruled out that some selection bias occurred for trials recruiting from Asia and Oceania since they are increasingly registered at other regional registries.

Introduction

Clinical trials may terminate for a variety of reasons, some of which correctly envisaged in the study protocol [1 2] and others unforeseen and attributable to failures in the trial conduct. Examples of appropriate reasons for terminating a trial prior to completion include unequivocal evidence of futility or harm [3]. In this case early stopping may prevent additional patient exposure to ineffective or harmful treatments and limit further expenditure of resources on unsuccessful approaches. Conversely, premature termination due to poor accrual clearly reflects a failure of the trial process since trials completed with less than expected enrollment, are usually delayed and unable to meet their intended objectives meaningfully.

Clinical trials that fail to recruit successfully or in a timely manner their target number of participants pose ethical, financial and statistical issues [4]. They are a major concern in research areas where the acuity of the disease and the quickly evolving treatment paradigm render original research questions obsolete if not implemented in a timely manner. This partially explains why poor accrual and its consequences have been extensively investigated in some areas, mostly in oncology [5-7], and less in others.

Unsuccessful recruitment has been recently acknowledged [8 9] as the leading factor in cardiovascular trial failure, generating resource consuming underpowered trials which provide only inconclusive data with no or little return on investments.

The past decade has seen a fast growth in cardiovascular research [10]. Documenting impact of poor accrual on early termination of cardiovascular trials, also in terms of geographical and temporal trends, is important as it can provide insights to inform future trials.

The development of clinical trial registries, such as ClinicalTrials.gov, affords a remarkable opportunity to better understand the extent of early termination in cardiovascular trials. In the beginning, ClinicalTrials.gov was set to increase public awareness of clinical trials and its systematic evaluation was hindered by a lack of access to the complete, annotated data. This

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3 registry now serves as a mandatory repository for information on most clinical studies run under US
4 regulations and registration with ClinicalTrials.gov is mandatory for publishing study results in
5 many peer-reviewed journals. In addition, the database for Aggregate Analysis of ClinicalTrials.gov
6 (AACT) [11], a high-quality, searchable database of the information contained in ClinicalTrials.gov
7 is now publicly available.
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14 By leveraging information available through the AACT database, reflecting ClinicalTrials.gov as of
15 March 27, 2016, we present a snapshot of the last 10 years of cardiovascular research, with a focus
16 on geographical and temporal patterns of early termination due to poor accrual.
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20 21 22 23 **Material and Methods**

24
25 AACT database, reflecting ClinicalTrials.gov as of March 27, 2016, is the data source. A
26 comprehensive dictionary for the data elements in AACT is available online [12].
27

28
29 The MeSH code field in the AACT database was queried for at least one of the following MeSH
30 codes: A07 Cardiovascular System; C14 Cardiovascular Diseases; D27.505.954.411 Cardiovascular
31 Agents (including Anti-Arrhythmia/Antihypertensive/Cardiotonic/Fibrinolytic/Natriuretic/
32 Vasoconstrictor/Vasodilator Agents, Calcium/Potassium/Sodium Channel Blockers, Cardioplegic/
33 Sclerosing Solutions and Nitric Oxide Donors); E01.370.370 Diagnostic Techniques,
34 Cardiovascular (including Angiography, Angioscopy, Blood Circulation Time, Blood Flow
35 Velocity, Blood Pressure/Volume Determination, Capillary Fragility, Carotid Intima-Media
36 Thickness, Heart Function Tests, Laser-Doppler Flowmetry, Microscopic Angioscopy,
37 Plethysmography, Pulse Wave Analysis and Tilt-Table Test); E04.100 Cardiovascular Surgical
38 Procedures (E04.100.376 Cardiac Surgical Procedures, E04.100.700 Reperfusion and E04.100.814
39 Vascular Surgical Procedures); G09.330 Cardiovascular Physiological Phenomena (including
40 Ventricular Function, Myocardial Contraction, Blood Circulation, Neovascularization,
41 Hemodynamics and Cardiovascular Deconditioning) and H02.403.429.163 Cardiology, with the
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3 aim to identify all studies dealing with a cardiovascular condition. The final sample was limited to
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5 all such studies, started in the past decade - from January 2006 to December 2015 - and classified as
6
7 “Interventional”, therein referred to as cardiovascular trials.
8

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10 Study characteristics that have been considered are Year of start date, Phase (available only for drug
11
12 and biologics trials), Type of intervention, Number of arms, Primary purpose, Endpoint
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14 classification, Intervention model, Masking, Number and location of the facilities involved, Number
15
16 of patients enrolled.
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19 The rate of studies that have stopped recruiting or enrolling participants early and will not start
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21 again, defined “terminated” studies, was estimated on studies that are no longer recruiting
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23 participants because they have enough participants already, have ended, or have been stopped for
24
25 some reason and referred to as “closed” studies. The latter definition embraces also withdrawn
26
27 studies, intended as studies closed with no patients enrolled.
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30 Termination was used as the dichotomous outcome variable of a conditional inference tree built to
31
32 detect associations with the study characteristics listed above.
33

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35 Study duration was calculated as the difference between start date and completion date, only for
36
37 closed studies and “actual” completion date type.
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40 To establish the reason for stopping, text mining was applied to the narrative field of reason for
41
42 study termination. The following text pre-processing procedures were applied in the following
43
44 order: conversion to lowercase, removing numbers, removing punctuation, removing stop-words,
45
46 stemming words, removing stemmed uninformative terms (“studi”, “clinical”, “trial”, “patient”,
47
48 “subject”, “approach”, “termin”, “stop”), treating the stemmed terms “accrual” and “recruit” as
49
50 synonyms of “enrol”, stripping white space, and building a sequence of two adjacent words from
51
52 the text (bigrams).
53

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55 A randomly selected sample of about 10% of terminated trials was extracted to assess the accuracy
56
57 of automated text mining in identifying poor accrual as compared to manual review (gold standard).
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3 AACT was downloaded in pipe delimited text format and managed in R software, version 3.3.0.
4
5 The location of each facility, expressed as country in AACT database, was ascribed to a region and
6
7 to one of the five continents through R packages “countrycode” and “rworldmap”. Text mining was
8
9 performed with “tm” R package. Tree-based models were fit with “party” R package.
10
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12 13 14 **Results**

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16 In a 10-year time span, from 2006 to 2015, 13,729 cardiovascular trials were identified.

17
18 As shown in Figure 1, cardiovascular trials were prevalently run in Northern America (41%),
19
20 followed by Eastern and Western Europe (25%) and Eastern Asia (8%). The regions that together
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22 contributed to less than 0.5% were Middle, Eastern and Western Africa and Central Asia.
23

24
25 Single-centre studies accounted for the majority (60%) of cardiovascular trials. Among
26
27 intercontinental trials (n= 1,089), the most likely collaborations were bilateral between Americas
28
29 and Europe (32%), trilateral between Americas, Asia and Europe (14%), quadrilateral between
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31 Americas, Asia, Europe and Oceania (11%), and worldwide (8%).
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34 Overall, the most common interventional model was parallel design (60%). Of studies reporting
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36 number of arms (n=13,419), 27% were single-armed and 57% had two arms. Multi-arm studies (n=
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38 9,735), were typically randomized (89%) and blinded (38% double-blinded and 20% single-
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40 blinded). Phase II and III trials together accounted for 4,500 studies and 5052 recorded the phase as
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42 “not applicable”. The most frequently observed intervention was drug (n= 6,334), followed by
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44 device (n= 2,736) and procedure (n= 1,405).
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46
47 Eight thousand nine hundred cardiovascular trials (65%) were classified as closed studies. Of these,
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49 11% were terminated. The reason for termination was missing for 141 studies.
50

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52 According to the classification tree shown in Figure 2, termination was significantly associated with
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54 facilities’ location (p<0.001). In addition, trials run in Americas and multinational trials run in
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56 Americas and Europe or in Americas, Asia and Europe, showed different rates of early termination
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3 depending on the type of intervention (lowest for Behavioral and Dietary Supplement interventions
4 as compared to all other types, p -value<0.001). Among trials run in Europe, parallel trials were
5 more likely to terminate early than trials with other intervention models (7.3% vs. 11.7%, p -value =
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10 0.012).

11 Low figures of early termination for trials run in Asia and for trials recently started should be
12 interpreted with caution since they may suffer from a selection bias.
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15 The single stemmed term “enrol” occurred in 404 reasons for study termination and it was most
16 associated with the adjectives “poor”, “low” and “slow”, making poor accrual the most common
17 reason for trials failing to complete. The second most common substantive was “fund”, with 85
18 occurrences and it was associated with the term “lack”, followed by “sponsor”, with 70
19 occurrences, and associated with the term “decis”. Table 1 reports the most frequently used bigrams
20 in the reason for termination field. A network graph in Figure 3 shows the most frequent relations
21 (i.e., correlation > 0.15) between the (stemmed) terms “enrol”, “fund”, “sponsor”, “safety” and
22 “interim”, and the other words in the corpus of reason for termination text data.
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36 Table 1. Stemmed bigrams occurring in the reason for stopping field at least 10 times. Terminated cardiovascular trials, 2006-2015.

Bigrams	N
slow enrol	78
low enrol	69
lack enrol	41
poor enrol	36
difficult enrol	25
enrol rate	25
interim analysi	23
lack fund	23
safeti concern	23
insuffici enrol	22
sponsor decis	20
left institut	15
busi decis	14
inabl enrol	14
unabl enrol	14

detail descript	11
safeti issu	10

Furthermore, the term “enrol” occurred as the reason for stopping of 90 withdrawn trials and 18 suspended trials. Table 2 reports the proportion of trials terminated for poor accrual over terminated trials by study characteristic.

Table 2. Characteristics of closed cardiovascular interventional trials - 2005-2015. Proportion of terminated trials (% terminated) and proportion of trials terminated because of lack of accrual (% poor) by study characteristics.

	N	% Terminated	p-value (**)	% Poor	p-value (**)	
Year	2006-2007	1078	7.0	<0.001	42.3	<0.001
	2008-2009	1893	6.6		43.0	
	2010-2011	1955	6.0		43.3	
	2012-2013	1596	4.9		32.8	
	2014-2015	624	4.2		44.2	
Facility location (#)	Africa	32	3.2	<0.001	100.0	<0.001
	Americas	3769	14.0		46.3	
	Americas Asia Europe	129	13.2		17.6	
	Americas Asia Europe Oceania	89	7.9		14.3	
	Americas Europe	256	18.0		34.7	
	Asia	1079	5.6		33.3	
	Europe	2454	9.6		40.4	
	Oceania	71	18.3		30.8	
	Other	374	4.2		50.8	
Missing	647	5.9		23.7		
Phase	Phase 0	81	9.9	<0.001	32.9	0.012
	Phase 1	736	11.3		29.8	
	Phase 1/Phase 2	415	15.1		36.5	
	Phase 2	1542	11.7		44.4	
	Phase 2/Phase 3	231	13.2		36.9	
	Phase 3	1419	11.0		51.5	
	Phase 4	2997	8.2		46.6	
	NA	1479	8.6		14.3	
Intervention type	Behavioral	603	4.5	<0.001	1.8	<0.001
	Biological	294	10.2		33.3	
	Device	1679	11.9		42.7	
	Dietary Supplement	266	5.3		50.0	
	Drug	4309	13.4		39.8	
	Genetic	26	7.7		0.0	
	Procedure	44	13.6		45.1	
	Radiation	784	10.5		83.3	
	Other	895	5.4		47.9	
Number of arms	1	2474	11.2	0.004	42.0	<0.001
	2	4725	11.7		43.5	
	>2	1466	8.5		29.8	
	Missing	235	13.6		34.4	
Primary purpose	Basic Science	250	4.8	<0.001	25.0	0.002
	Diagnostic	491	11.0		50.0	
	Health Services Research	197	4.1		37.5	
	Prevention	1008	9.5		37.5	

	Screening	46	4.3		0.0	
	Supportive Care	280	10.3		75.0	
	Treatment	6264	12.1		39.7	
	Missing	364	8.0		48.3	
Allocation	Non-Randomized	1052	11.0	0.986	31.0	0.155
	Randomized	6039	11.0		41.9	
	Missing	1809	11.2		44.1	
Endpoint classification	Bio-availability	18	5.6	<0.001	0.0	0.155
	Bio-equivalence	38	7.9		66.7	
	Efficacy	2668	10.7		47.2	
	Pharmacodynamics	121	11.6		35.7	
	Pharmacokinetics	124	4.0		0.0	
	Pharmacokinetics/Dynamics	111	12.6		28.6	
	Safety	625	9.1		36.8	
	Safety/Efficacy	3811	12.8		37.2	
	Missing	1384	8.5		47.5	
Masking	Double Blind	2775	12.6	<0.001	36.7	0.119
	Open Label	4798	11.2		43.1	
	Single Blind	1287	7.1		46.2	
	Missing	40	15.0		33.3	
Intervention model	Crossover	713	7.4	0.009	39.6	0.148
	Factorial	156	8.3		38.5	
	Parallel	5246	11.4		41.5	
	Single Group	2727	11.4		40.8	
	Missing	58	15.5		33.3	
N. enrolled	(0,100]	5521	14.0	<0.001	45.3	<0.001
	(100,1000]	2832	6.3		27.4	
	(1000,20000]	467	5.6		10.7	
	>20000	53	3.8		0.0	
	Missing	27	19.2		40.0	
N. facilities (per study)	1	4934	10.3	<0.001	44.4	<0.001
	(1,10]	1876	14.4		44.1	
	(10,50]	1047	11.5		35.0	
	(50,100]	204	14.2		17.2	
	>100	191	9.4		16.7	
	Missing	648	5.9		23.7	
N. Conditions (per study)	1	6703	11.8	0.068	41.3	0.228
	2	1584	8.2		44.0	
	>2	613	13.8		32.9	
Conditions (*)	Acute Coronary Syndrome	205	12.2	-	48.3	-
	Atrial Fibrillation	380	13.4		37.2	
	Cardiovascular Diseases	481	5.4		34.6	
	Coronary Artery Disease	609	8.7		50.9	
	Coronary Disease	341	10.0		32.3	
	Heart Failure	644	13.8		53.9	
	Hypertension	901	10.2		29.3	
	Multiple Myeloma	620	15.8		42.9	
	Myocardial Infarction	216	9.7		38.2	
	Myocardial Ischemia	414	10.9		20.0	
	Stroke	477	10.9		34.6	
Overall		8900	11.1		41.1	

(#): Facility location describes the study-level location of enrolling sites. It results in a single continent for single-centre trials and multi-centre multinational trials and in a combination of continents for intercontinental trials.

(*): the number of MeSH conditions sums to 13,501 across the 8,900 closed trials. Only the conditions exceeding an absolute frequency of 200 are listed.

(**): Chi-square or Fisher test p-values.

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3 On a random sample of 85 terminated trials, where the reason for termination was manually
4 reviewed by one of the authors (I.B.), the prevalent reason was poor accrual (47%). Stopping
5 occurred for lack of funding and sponsor decision in 8% and 6% of the sampled trials, respectively.
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10 Appropriate reasons for termination based on internal or external evidence of futility or lack of
11 safety accounted for 26% of all reasons. The sensitivity and specificity of the stemmed term “enrol”
12 in identifying poor accrual were 97.5% and 100%, respectively.
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16 Terminated trials actually involved a total of 114,609 enrolled subjects (plus 44,513 scheduled) and
17 more than 10,500 facilities worldwide. Eighteen thousand eight hundred eight patients and 2,319
18 facilities actually took part in trials terminated because of poor accrual.
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22 The patterns of premature termination shown in Figure 4, varied from 9.6% to 14% (p-value <
23 0.001) among the two most contributing continents, Europe and Americas and were slightly
24 decreasing over the study period (p-value = 0.02).
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29 Intercontinental trials exhibited comparable figures of termination and lower figures of unsuccessful
30 accrual as the reason for their early stopping, as compared to intracontinental trials (13% vs. 11%,
31 p-value = 0.24, termination, of whom 28% vs. 44%, p-value = 0.002, due to poor accrual,
32 respectively). Figure 5 shows the time trend of poor accrual for intercontinental trials (p-value for
33 trend = 0.02, p-value for the difference = 0.001).
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41 A median actual duration of 24 months was observed both on closed trials and on the subset of
42 terminated trials. Only a slight difference emerged in the third quartile, ranging from 38 to 39
43 months for closed and terminate trials, respectively. For this reason, time trends were truncated at
44 the last biennium under study.
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50 Poor accrual accounted for more than 40% of reasons for early stopping in trials recruiting from
51 Americas and Europe. This proportion was by far inferior for all other continents of recruitment,
52 although caution must be taken in interpreting these figures since they rely on small absolute
53 numbers (Table 2).
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Conclusion

Clinical trials are a key step in advancing new therapeutic concepts for the management of chronic cardiovascular diseases from the research setting to the clinical practice [13]. Despite this achievement, the successful recruitment of the targeted number of participants in a given time frame remains a significant challenge to clinical trials [14]. Delayed and abandoned trials represent a waste of scarce human and economic resources which may slow the advancement of medical progress or reduce its timely impact on patient health and wellbeing.

Therefore, a thorough understanding of the nature of trial enrolment patterns, from an overview on aggregate data through to the working of individual trials, is of paramount importance.

This study contributes to a growing body of research on early termination due to poor accrual in cardiovascular trials [2 3 9], providing further insights into geographical and temporal patterns.

Among study findings, about 11% of all closed trials were terminated, which is consistent with other cross-sectional studies using the ClinicalTrials.gov registry [9 15]. When restricted to phase II and phase III trials together, the proportion of early termination (14%) was slightly inferior to that reported on a recent study [4] based on the National Library of Medicine clinical trial registry (19%).

Consistently with existing literature [8 9], the most common reason for cardiovascular trials failing to complete was poor accrual (41%). Common logistical reasons were related to lack of funds and sponsor decision. Since reason for termination was automatically characterized by word patterns through text mining, we may just speculate that the concepts underlying “safety concerns”, “safety issue” and “interim analysis” pertain to appropriate termination, possibly on data safety and monitoring board advice, because of excessive toxicity or in accord with early stopping rules.

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3 Almost all trials are dependent on the willingness of patients and professionals to give their time
4 and effort to participate and we estimated that the human dimension of poor accrual involved more
5 than 8,000 patients and the staff of 2,000 sites.
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9 Not only the overall patterns of early termination but also those concerned with poor accrual
10 exhibited geographical variations. Cardiovascular trials recruiting in the two most contributing
11 continents, exhibited the highest and lowest proportion of early termination due to unsuccessful
12 accrual in Americas and Europe, respectively, across all the study period.
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16 Nevertheless, time trends should be interpreted with caution, since the decrease seen in the last
17 biennium of the evaluation may be an artifact, reflecting both a delay in updating trial status in
18 ClinicalTrials.gov and a selection of trials with a short duration and less likely to suffer from low
19 accrual. However, comparisons between continents of recruitment per year appear to be appropriate
20 and reliable.
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24 It is interesting to notice that intercontinental trials, particularly those in bilateral collaboration with
25 Americas and Europe, suffer more from early termination and less from termination due to lack of
26 accrual, as compared to studies completely run in only one of the participating continents. Clearly,
27 intercontinental trials are often resource-intensive large-scale randomised controlled clinical trials,
28 recruiting thousands of patients from large numbers of trial sites (i.e., megatrials).
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32 On the one hand, this probably allows to recognize the achievement of enrolment goals within a
33 reasonable timeframe as one of the numerous advantages of globalization of cardiovascular clinical
34 trials, often evolving into megatrials [16], but on the other hand it highlights that other
35 organizational and financial issues challenge this process. Intercontinental trials represent a valuable
36 attempt to harmonize the generation of clinical evidence across continents. Their implementation is
37 particularly promising in device trials [17], where the comparison of procedural outcomes, using
38 similar devices in different environments, makes it possible to disentangle the effects of practice
39 patterns and procedural technique on clinical results.
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3 Some study limitations must be acknowledged. First the generalizability of study results. From a
4 recent investigation [18] on trends in global clinical trial registration from 2005 to 2013, based on
5 International Clinical Trials Registry Platform data, emerged that registered trials conducted in
6 Northern America and Latin America and Caribbean were almost exclusively registered in
7 ClinicalTrials.gov. Also European trials were predominantly registered in ClinicalTrials.gov rather
8 than in the EU Clinical Trials Register. Conversely, trials conducted in Oceania and Asia were
9 increasingly registered at other regional registries such as the Australian New Zealand Clinical
10 Trials Registry and the Japan Primary Registries Network, respectively.
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14 As a consequence, study results concerning Europe and Americas can be regarded as representative
15 of all registered trials recruiting from these continents. Moreover, differences in the extent of early
16 termination and of poor accrual, can be interpreted as genuine. On the contrary, it cannot be ruled
17 out that some selection bias occurred for trials recruiting from Asia and Oceania. Therefore, the
18 extent of early termination for trials run in these two continents may be underestimated.
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22 Furthermore, the identification of trials terminated for poor accrual relied on an automated process
23 with an estimated sensitivity of 97.5%, thus the extent of poor accrual may be underestimated.
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27 Poor accrual is a significant barrier to the successful and timely completion of clinical trials and to
28 the advancement of medical knowledge. Although this issue may be addressed in a variety of ways,
29 a global collaborative perspective on the planning and conduct of some cardiovascular clinical trials
30 should be further encouraged [19].
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5 **Contributorship:** IB and PB designed the study and wrote the manuscript; CL and IB performed
6
7 the statistical analysis; all authors contributed to results interpretation and approved the final
8
9 manuscript.
10

11 **Funding:** This research received no specific grant from any funding agency in the public,
12
13 commercial or not-for-profit sectors.
14

15
16 **Competing interests:** All authors have completed the ICMJE uniform disclosure form at
17
18 www.icmje.org/coi_disclosure.pdf and declare: no support from any organisation for the submitted
19
20 work; no financial relationships with any organisations that might have an interest in the submitted
21
22 work in the previous three years; no other relationships or activities that could appear to have
23
24 influenced the submitted work
25
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27 **Data sharing:** No additional data available.
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References

1. Zannad F, Gattis Stough W, McMurray JJ, et al. When to stop a clinical trial early for benefit: lessons learned and future approaches. *Circ Heart Fail* 2012;**5**(2):294-302 doi: 10.1161/CIRCHEARTFAILURE.111.965707[published Online First: Epub Date]].
2. Sica DA. Premature termination of clinical trials--lessons learned. *J Clin Hypertens (Greenwich)* 2002;**4**(3):219-25
3. Task Force of the Working Group on Arrhythmias of the European Society of Cardiology. The early termination of clinical trials: causes, consequences, and control. With special reference to trials in the field of arrhythmias and sudden death. Task Force of the Working Group on Arrhythmias of the European Society of Cardiology. *Circulation* 1994;**89**(6):2892-907
4. Carlisle B, Kimmelman J, Ramsay T, MacKinnon N. Unsuccessful trial accrual and human subjects protections: an empirical analysis of recently closed trials. *Clin Trials* 2015;**12**(1):77-83 doi: 1740774514558307 [pii] 10.1177/1740774514558307[published Online First: Epub Date]].
5. Stensland KD, McBride RB, Latif A, et al. Adult cancer clinical trials that fail to complete: an epidemic? *J Natl Cancer Inst* 2014;**106**(9) doi: 10.1093/jnci/dju229[published Online First: Epub Date]].
6. Hirsch BR, Califf RM, Cheng SK, et al. Characteristics of oncology clinical trials: insights from a systematic analysis of ClinicalTrials.gov. *JAMA Intern Med* 2013;**173**(11):972-9 doi: 1682358 [pii] 10.1001/jamainternmed.2013.627[published Online First: Epub Date]].
7. Mitchell AP, Hirsch BR, Abernethy AP. Lack of timely accrual information in oncology clinical trials: a cross-sectional analysis. *Trials* 2014;**15**:92 doi: 10.1186/1745-6215-15-92[published Online First: Epub Date]].
8. Moya L. Clinical trials in cardiology: pinnacle or inflection point? *Circ Res* 2014;**114**(1):28-31 doi: 10.1161/CIRCRESAHA.113.302851[published Online First: Epub Date]].
9. Bernardez-Pereira S, Lopes RD, Carrion MJ, et al. Prevalence, characteristics, and predictors of early termination of cardiovascular clinical trials due to low recruitment: insights from the ClinicalTrials.gov registry. *Am Heart J* 2014;**168**(2):213-9 e1 doi: 10.1016/j.ahj.2014.04.013[published Online First: Epub Date]].
10. Huffman MD, Baldrige A, Bloomfield GS, et al. Global cardiovascular research output, citations, and collaborations: a time-trend, bibliometric analysis (1999-2008). *PLoS One* 2013;**8**(12):e83440 doi: 10.1371/journal.pone.0083440[published Online First: Epub Date]].

- 1
2
3 11. Tasneem A, Aberle L, Ananth H, et al. The database for aggregate analysis of ClinicalTrials.gov
4 (AACT) and subsequent regrouping by clinical specialty. PLoS One 2012;**7**(3):e33677 doi:
5 10.1371/journal.pone.0033677
6
7 PONE-D-11-20359 [pii][published Online First: Epub Date]].
8
9
10 12. Foltran F, Avossa F, Fedeli U, Baldi I, Spolaore P, Gregori D. Seasonal variations in injury
11 rates in children: evidence from a 10-year study in the Veneto Region, Italy. Int J Inj Contr
12 Saf Promot 2013;**20**(3):254-8 doi: 10.1080/17457300.2012.692691[published Online First:
13 Epub Date]].
14
15
16 13. Jackson N, Atar D, Borentain M, et al. Improving clinical trials for cardiovascular diseases: a
17 position paper from the Cardiovascular Round Table of the European Society of Cardiology.
18 Eur Heart J 2016;**37**(9):747-54 doi: 10.1093/eurheartj/ehv213[published Online First: Epub
19 Date]].
20
21
22
23 14. Bower P, Brueton V, Gamble C, et al. Interventions to improve recruitment and retention in
24 clinical trials: a survey and workshop to assess current practice and future priorities. Trials
25 2014;**15**:399 doi: 10.1186/1745-6215-15-399[published Online First: Epub Date]].
26
27
28 15. Williams RJ, Tse T, DiPiazza K, Zarin DA. Terminated Trials in the ClinicalTrials.gov Results
29 Database: Evaluation of Availability of Primary Outcome Data and Reasons for
30 Termination. PLoS One 2015;**10**(5):e0127242 doi: 10.1371/journal.pone.0127242[published
31 Online First: Epub Date]].
32
33
34 16. O'Connor CM. The Globalization of Heart Failure Research. JACC Heart Fail 2015;**3**(8):657-8
35 doi: 10.1016/j.jchf.2015.06.001[published Online First: Epub Date]].
36
37
38 17. Saito S, Valdes-Chavarri M, Richardt G, et al. A randomized, prospective, intercontinental
39 evaluation of a bioresorbable polymer sirolimus-eluting coronary stent system: the
40 CENTURY II (Clinical Evaluation of New Terumo Drug-Eluting Coronary Stent System in
41 the Treatment of Patients with Coronary Artery Disease) trial. Eur Heart J
42 2014;**35**(30):2021-31 doi: 10.1093/eurheartj/ehu210[published Online First: Epub Date]].
43
44
45
46 18. Viergever RF, Li K. Trends in global clinical trial registration: an analysis of numbers of
47 registered clinical trials in different parts of the world from 2004 to 2013. BMJ Open
48 2015;**5**(9):e008932 doi: 10.1136/bmjopen-2015-008932[published Online First: Epub
49 Date]].
50
51
52
53 19. Moss AJ, Francis CW, Ryan D. Collaborative clinical trials. N Engl J Med 2011;**364**(9):789-91
54 doi: 10.1056/NEJMp1013194[published Online First: Epub Date]].
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Figures

Figure 1. Geographical distribution of the facilities involved in cardiovascular trials, 2006-2015.

Figure 2. Conditional inference tree predicting early termination. Retained variables: Facility Location (Americas (AM), Americas Europe (AM-EU), Americas Asia Europe (AM-ASIA-EU), Asia, Europe (EU), Other), Year of start date, Intervention type (Behavioral (Behav), Biological (Bio), Device, Dietary Supplement (Diet), Drug, Genetic (Gene), Procedure (Proc), Radiation (Rad), Other), Intervention model (Crossover (Cr), Factorial (Fac), Parallel (Paral), Single group (Sing)).

Figure 3. Network graph showing the most frequent relations (i.e., correlation > 0.15) between the (stemmed) terms “enrol”, “fund”, “sponsor”, “safety” and “interim”, and the other words in the corpus of reason for termination text data. Solid lines identify associations with a correlation > 0.15 and dotted lines identify tautological associations.

Figure 4. Proportion of early terminations by continents of recruitment over time. Cardiovascular trials, 2006-2015.

Figure 5. Proportion of early terminations due to poor accrual for trials recruiting from a single continent or from different continents over time. Cardiovascular trials, 2006-2015.

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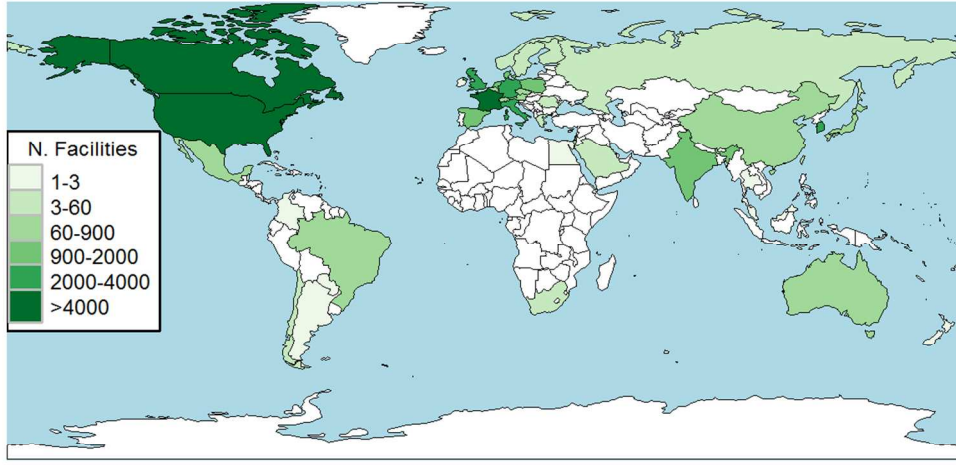


Figure 1. Geographical distribution of the facilities involved in cardiovascular trials, 2006-2015.

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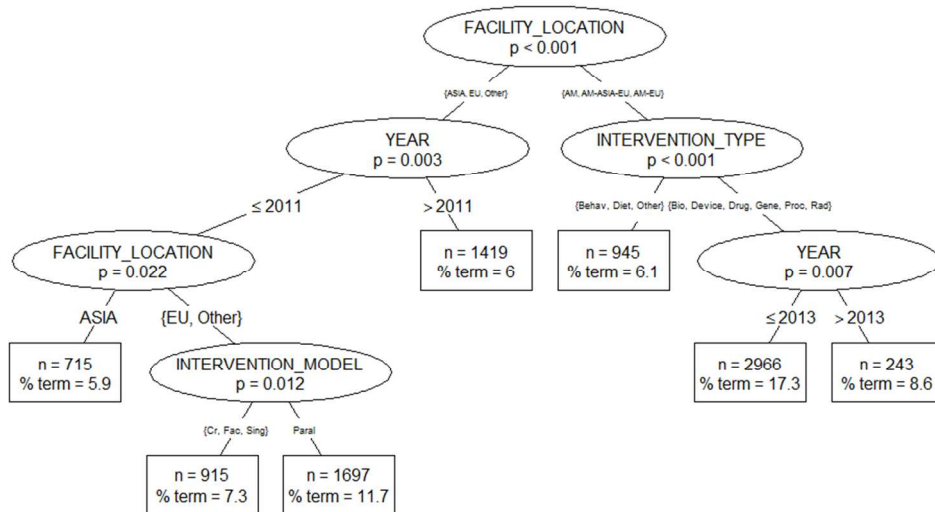


Figure 2. Conditional inference tree predicting early termination. Retained variables: Facility Location (Americas (AM), Americas Europe (AM-EU), Americas Asia Europe (AM-ASIA-EU), Asia, Europe (EU), Other), Year of start date, Intervention type (Behavioral (Behav), Biological (Bio), Device, Dietary Supplement (Diet), Drug, Genetic (Gene), Procedure (Proc), Radiation (Rad), Other), Intervention model (Crossover (Cr), Factorial (Fac), Parallel (Paral), Single group (Sing)).

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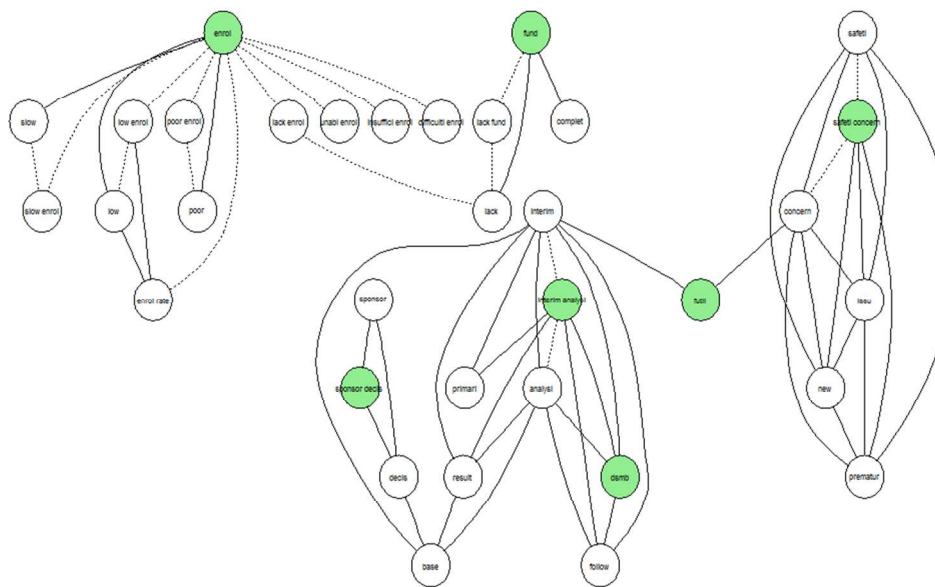


Figure 3. Network graph showing the most frequent relations (i.e., correlation > 0.15) between the (stemmed) terms "enrol", "fund", "sponsor", "safety" and "interim", and the other words in the corpus of reason for termination text data. Solid lines identify associations with a correlation > 0.15 and dotted lines identify tautological associations.

84x51mm (300 x 300 DPI)

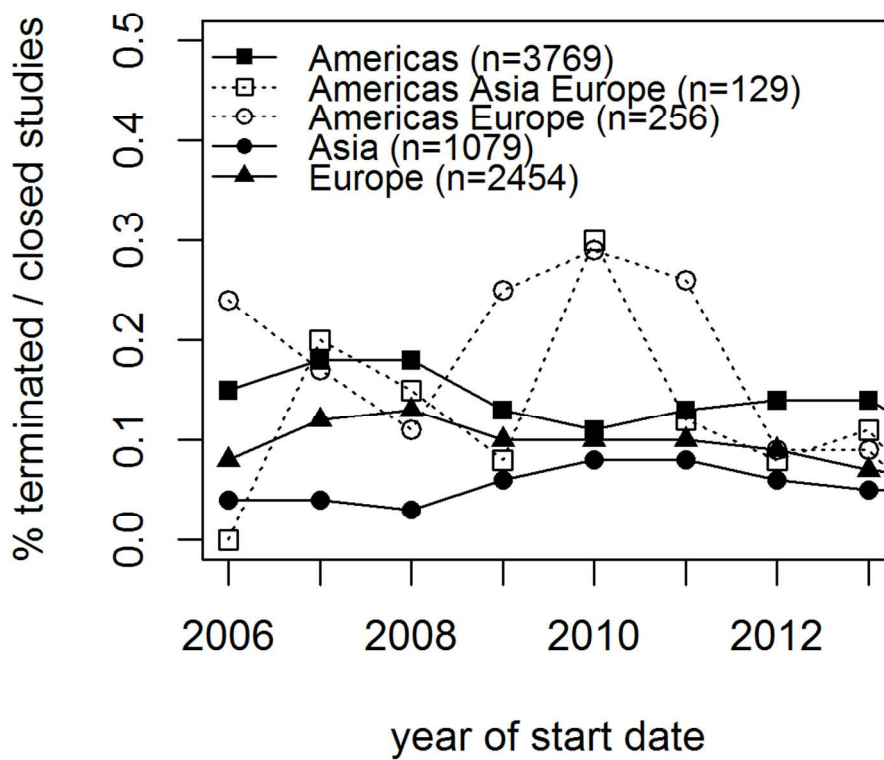


Figure 4. Proportion of early terminations by continents of recruitment over time. Cardiovascular trials, 2006-2015.

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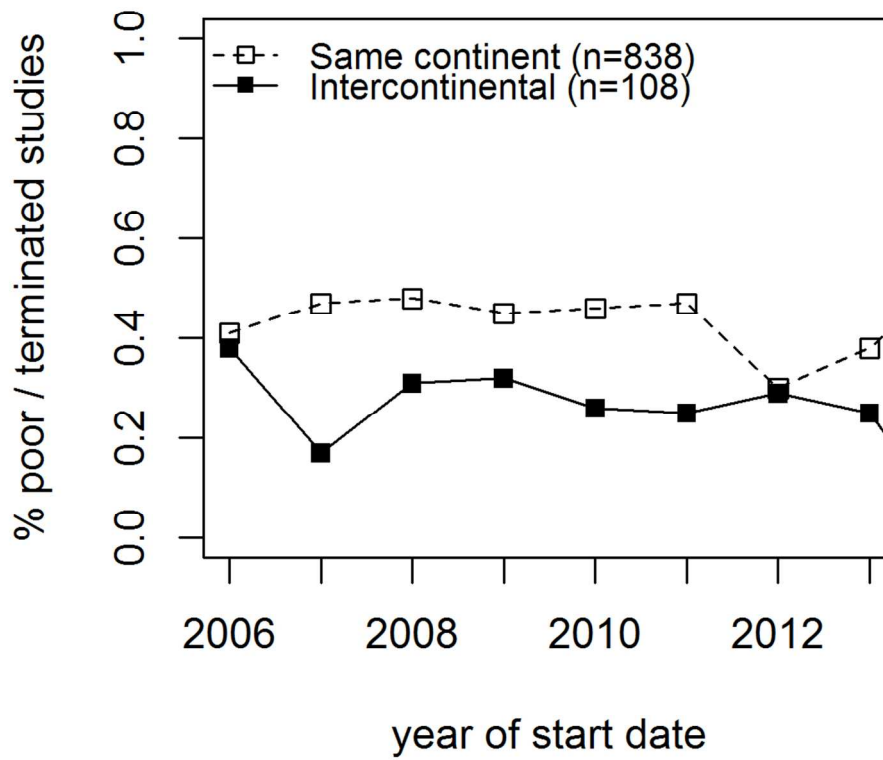


Figure 5. Proportion of early terminations due to poor accrual for trials recruiting from a single continent or from different continents over time. Cardiovascular trials, 2006-2015.

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BMJ Open

Early termination of cardiovascular trials as a consequence of poor accrual: analysis of ClinicalTrials.gov 2006-2015

Journal:	<i>BMJ Open</i>
Manuscript ID	bmjopen-2016-013482.R2
Article Type:	Research
Date Submitted by the Author:	18-May-2017
Complete List of Authors:	Baldi, Ileana; University of Padova, Cardiac, Thoracic and Vascular Sciences Lanera, Corrado; University of Padova, Cardiac, Thoracic and Vascular Sciences Berchiolla, Paola; University of Torino, Clinical and Biological Sciences Gregori, Dario; University of Padova, Cardiac, Thoracic and Vascular Sciences
Primary Subject Heading:	Cardiovascular medicine
Secondary Subject Heading:	Epidemiology
Keywords:	Clinical trials < THERAPEUTICS, EPIDEMIOLOGY, STATISTICS & RESEARCH METHODS

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3 **Early termination of cardiovascular trials as a consequence of poor**
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5 **accrual: analysis of ClinicalTrials.gov 2006-2015**
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8 Ileana Baldi¹, Corrado Lanera¹, Paola Berchiolla², Dario Gregori¹
9

10
11 ¹Unit of Biostatistics, Epidemiology and Public Health, Department of Cardiac, Thoracic and
12 Vascular Sciences, University of Padova, Padova, Italy
13
14

15
16
17 ²Department of Clinical and Biological Sciences, University of Torino, Torino, Italy
18
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24

25
26 **Correspondence to:**

27 Dr. Ileana Baldi,
28

29 Unit of Biostatistics, Public Health and Epidemiology
30

31 Department of Cardiac, Thoracic and Vascular Sciences, University of Padova
32

33 Via Loredan, 18 - 35131 Padova, Italy
34

35 Email: ileana.baldi@unipd.it
36

37 Phone: +39 049 8275403
38

39 Fax: +39 02 700445089
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Word count, excluding title page, abstract, references, figures and tables: 2268

Abstract

Objectives. To present a snapshot of experimental cardiovascular research with a focus on geographical and temporal patterns of early termination due to poor accrual.

Setting. The Aggregate Analysis of ClinicalTrials.gov (AACT) database, reflecting ClinicalTrials.gov as of March 27, 2016.

Design. The AACT database was searched for all cardiovascular clinical trials that started from January 2006 up to December 2015.

Results. Thirteen thousand seven hundred twenty-nine cardiovascular trials were identified. Of these, 8,900 (65%) were classified as closed studies. Globally, 11% of closed trials were terminated. This proportion varied from 9.6% to 14% for trials recruiting from Europe and America, respectively, with a slightly decreasing trend (p-value = 0.02) over the study period. The most common reason for trials failing to complete was poor accrual (41%). Intercontinental trials exhibited lower figures of poor accrual as the reason for their early stopping, as compared to trials recruiting in a single continent (28% vs. 44%, p-value = 0.002).

Conclusions. Poor accrual significantly challenges the successful completion of cardiovascular clinical trials. Findings are suggestive of a positive effect of globalization of cardiovascular clinical research on the achievement of enrolment goals within a reasonable timeframe.

Strengths and limitations of this study

- To identify cardiovascular clinical trials terminated early because of poor accrual, this study relies on the most updated release of ACCT database and on automated and replicable text mining techniques.

- By analysing early termination due to poor accrual by continent of recruitment over time, the study shows that poor accrual exhibits geographical heterogeneity with lower figures for intercontinental trials.
- In interpreting results it must be acknowledged that ClinicalTrials.gov is representative of registered trials recruiting from Europe and Americas. On the contrary, it cannot be ruled out that some selection bias occurred for trials recruiting from Asia and Oceania since they are increasingly registered at other regional registries.

Introduction

Clinical trials may terminate for a variety of reasons, some of which correctly envisaged in the study protocol [1 2] and others unforeseen and attributable to failures in the trial conduct. Examples of appropriate reasons for terminating a trial prior to completion include unequivocal evidence of futility or harm [3]. In this case early stopping may prevent additional patient exposure to ineffective or harmful treatments and limit further expenditure of resources on unsuccessful approaches. Conversely, premature termination due to poor accrual clearly reflects a failure of the trial process since trials completed with less than expected enrollment, are usually delayed and unable to meet their intended objectives meaningfully.

Clinical trials that fail to recruit successfully or in a timely manner their target number of participants pose ethical, financial and statistical issues [4]. They are a major concern in research areas where the acuity of the disease and the quickly evolving treatment paradigm render original research questions obsolete if not implemented in a timely manner. This partially explains why poor accrual and its consequences have been extensively investigated in some areas, mostly in oncology [5-7], and less in others.

Unsuccessful recruitment has been recently acknowledged [8 9] as the leading factor in cardiovascular trial failure, generating resource consuming underpowered trials which provide only inconclusive data with no or little return on investments.

The past decade has seen a fast growth in cardiovascular research [10]. Documenting impact of poor accrual on early termination of cardiovascular trials, also in terms of geographical and temporal trends, is important as it can provide insights to inform future trials.

The development of clinical trial registries, such as ClinicalTrials.gov, affords a remarkable opportunity to better understand the extent of early termination in cardiovascular trials. In the beginning, ClinicalTrials.gov was set to increase public awareness of clinical trials and its systematic evaluation was hindered by a lack of access to the complete, annotated data. This

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3 registry now serves as a mandatory repository for information on most clinical studies run under US
4 regulations and registration with ClinicalTrials.gov is mandatory for publishing study results in
5 many peer-reviewed journals. In addition, the database for Aggregate Analysis of ClinicalTrials.gov
6 (AACT) [11], a high-quality, searchable database of the information contained in ClinicalTrials.gov
7 is now publicly available.
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14 By leveraging information available through the AACT database, reflecting ClinicalTrials.gov as of
15 March 27, 2016, we present a snapshot of the last 10 years of cardiovascular research, with a focus
16 on geographical and temporal patterns of early termination due to poor accrual.
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20 21 22 23 **Material and Methods**

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25 AACT database, reflecting ClinicalTrials.gov as of March 27, 2016, is the data source. A
26 comprehensive dictionary for the data elements in AACT is available online [12].
27

28
29 The MeSH code field in the AACT database was queried for at least one of the following MeSH
30 codes: A07 Cardiovascular System; C14 Cardiovascular Diseases; D27.505.954.411 Cardiovascular
31 Agents (including Anti-Arrhythmia/Antihypertensive/Cardiotonic/Fibrinolytic/Natriuretic/
32 Vasoconstrictor/Vasodilator Agents, Calcium/Potassium/Sodium Channel Blockers, Cardioplegic/
33 Sclerosing Solutions and Nitric Oxide Donors); E01.370.370 Diagnostic Techniques,
34 Cardiovascular (including Angiography, Angioscopy, Blood Circulation Time, Blood Flow
35 Velocity, Blood Pressure/Volume Determination, Capillary Fragility, Carotid Intima-Media
36 Thickness, Heart Function Tests, Laser-Doppler Flowmetry, Microscopic Angioscopy,
37 Plethysmography, Pulse Wave Analysis and Tilt-Table Test); E04.100 Cardiovascular Surgical
38 Procedures (E04.100.376 Cardiac Surgical Procedures, E04.100.700 Reperfusion and E04.100.814
39 Vascular Surgical Procedures); G09.330 Cardiovascular Physiological Phenomena (including
40 Ventricular Function, Myocardial Contraction, Blood Circulation, Neovascularization,
41 Hemodynamics and Cardiovascular Deconditioning) and H02.403.429.163 Cardiology, with the
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3 aim to identify all studies dealing with a cardiovascular condition. The final sample was limited to
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5 all such studies, started in the past decade - from January 2006 to December 2015 - and classified as
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7 “Interventional”, therein referred to as cardiovascular trials.
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10 Study characteristics that have been considered are Year of start date, Phase (available only for drug
11
12 and biologics trials), Type of intervention, Number of arms, Primary purpose, Endpoint
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14 classification, Intervention model, Masking, Number and location of the facilities involved, Number
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16 of patients enrolled.
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19 The rate of studies that have stopped recruiting or enrolling participants early and will not start
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21 again, defined “terminated” studies, was estimated on studies that are no longer recruiting
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23 participants because they have enough participants already, have ended, or have been stopped for
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25 some reason and referred to as “closed” studies. The latter definition embraces also withdrawn
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27 studies, intended as studies closed with no patients enrolled.
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30 Termination was used as the dichotomous outcome variable of a conditional inference tree built to
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32 detect associations with the study characteristics listed above.
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35 Study duration was calculated as the difference between start date and completion date, only for
36
37 closed studies and “actual” completion date type.
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40 To establish the reason for stopping, text mining was applied to the narrative field of reason for
41
42 study termination. The following text pre-processing procedures were applied in the following
43
44 order: conversion to lowercase, removing numbers, removing punctuation, removing stop-words,
45
46 stemming words, removing stemmed uninformative terms (“studi”, “clinical”, “trial”, “patient”,
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48 “subject”, “approach”, “termin”, “stop”), treating the stemmed terms “accrual” and “recruit” as
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50 synonyms of “enrol”, stripping white space, and building a sequence of two adjacent words from
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52 the text (bigrams).
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55 A randomly selected sample of about 10% of terminated trials was extracted to assess the accuracy
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57 of automated text mining in identifying poor accrual as compared to manual review (gold standard).
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3 AACT was downloaded in pipe delimited text format and managed in R software, version 3.3.0.
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5 The location of each facility, expressed as country in AACT database, was ascribed to a region and
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7 to one of the five continents through R packages “countrycode” and “rworldmap”. Text mining was
8
9 performed with “tm” R package. Tree-based models were fit with “party” R package.
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12 13 14 **Results**

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16 In a 10-year time span, from 2006 to 2015, 13,729 cardiovascular trials were identified.

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18 As shown in Figure 1, cardiovascular trials were prevalently run in Northern America (41%),
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20 followed by Eastern and Western Europe (25%) and Eastern Asia (8%). The regions that together
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22 contributed to less than 0.5% were Middle, Eastern and Western Africa and Central Asia.
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25 Single-centre studies accounted for the majority (60%) of cardiovascular trials. Among
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27 intercontinental trials (n= 1,089), the most likely collaborations were bilateral between Americas
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29 and Europe (32%), trilateral between Americas, Asia and Europe (14%), quadrilateral between
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31 Americas, Asia, Europe and Oceania (11%), and worldwide (8%).
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34 Overall, the most common interventional model was parallel design (60%). Of studies reporting
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36 number of arms (n=13,419), 27% were single-armed and 57% had two arms. Multi-arm studies (n=
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38 9,735), were typically randomized (89%) and blinded (38% double-blinded and 20% single-
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40 blinded). Phase II and III trials together accounted for 4,500 studies and 5052 recorded the phase as
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42 “not applicable”. The most frequently observed intervention was drug (n= 6,334), followed by
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44 device (n= 2,736) and procedure (n= 1,405).
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47 Eight thousand nine hundred cardiovascular trials (65%) were classified as closed studies. Of these,
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49 11% were terminated. The reason for termination was missing for 141 studies.
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52 According to the classification tree shown in Figure 2, termination was significantly associated with
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54 facilities’ location (p<0.001). In addition, the type of intervention had an effect on the rate of early
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56 termination (lowest for Behavioral and Dietary Supplement interventions as compared to all other
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types, p -value <0.001) for trials run in Americas and multinational trials run in Americas and Europe or in Americas, Asia and Europe. Among trials run in Europe, parallel trials were more likely to terminate early than trials with other intervention models (7.3% vs. 11.7%, p -value = 0.012).

Low figures of early termination for trials run in Asia and for trials recently started should be interpreted with caution since they may suffer from a selection bias.

The single stemmed term “enrol” occurred in 404 reasons for study termination and it was most associated with the adjectives “poor”, “low” and “slow”, making poor accrual the most common reason for trials failing to complete. The second most common substantive was “fund”, with 85 occurrences and it was associated with the term “lack”, followed by “sponsor”, with 70 occurrences, and associated with the term “decis”. Table 1 reports the most frequently used bigrams in the reason for termination field. A network graph in Figure 3 shows the most frequent relations (i.e., correlation > 0.15) between the (stemmed) terms “enrol”, “fund”, “sponsor”, “safety” and “interim”, and the other words in the corpus of reason for termination text data.

Table 1. Stemmed bigrams occurring in the reason for stopping field at least 10 times. Terminated cardiovascular trials, 2006-2015.

Bigrams	N
slow enrol	78
low enrol	69
lack enrol	41
poor enrol	36
difficult enrol	25
enrol rate	25
interim analysi	23
lack fund	23
safeti concern	23
insuffici enrol	22
sponsor decis	20
left institut	15
busi decis	14
inabl enrol	14
unabl enrol	14

detail descript	11
safeti issu	10

Furthermore, the term “enrol” occurred as the reason for stopping of 90 withdrawn trials and 18 suspended trials. Table 2 reports the proportion of trials terminated for poor accrual over terminated trials by study characteristic.

Table 2. Characteristics of closed cardiovascular interventional trials - 2005-2015. Proportion of terminated trials (% terminated) and proportion of trials terminated because of lack of accrual (% poor) by study characteristics.

	N	% Terminated	p-value (**)	% Poor	p-value (**)	
Year	2006-2007	1078	7.0	<0.001	42.3	<0.001
	2008-2009	1893	6.6		43.0	
	2010-2011	1955	6.0		43.3	
	2012-2013	1596	4.9		32.8	
	2014-2015	624	4.2		44.2	
Facility location (#)	Africa	32	3.2	<0.001	100.0	<0.001
	Americas	3769	14.0		46.3	
	Americas Asia Europe	129	13.2		17.6	
	Americas Asia Europe Oceania	89	7.9		14.3	
	Americas Europe	256	18.0		34.7	
	Asia	1079	5.6		33.3	
	Europe	2454	9.6		40.4	
	Oceania	71	18.3		30.8	
	Other	374	4.2		50.8	
Missing	647	5.9		23.7		
Phase	Phase 0	81	9.9	<0.001	32.9	0.012
	Phase 1	736	11.3		29.8	
	Phase 1/Phase 2	415	15.1		36.5	
	Phase 2	1542	11.7		44.4	
	Phase 2/Phase 3	231	13.2		36.9	
	Phase 3	1419	11.0		51.5	
	Phase 4	2997	8.2		46.6	
	NA	1479	8.6		14.3	
Intervention type	Behavioral	603	4.5	<0.001	1.8	<0.001
	Biological	294	10.2		33.3	
	Device	1679	11.9		42.7	
	Dietary Supplement	266	5.3		50.0	
	Drug	4309	13.4		39.8	
	Genetic	26	7.7		0.0	
	Procedure	44	13.6		45.1	
	Radiation	784	10.5		83.3	
	Other	895	5.4		47.9	
Number of arms	1	2474	11.2	0.004	42.0	<0.001
	2	4725	11.7		43.5	
	>2	1466	8.5		29.8	
	Missing	235	13.6		34.4	
Primary purpose	Basic Science	250	4.8	<0.001	25.0	0.002
	Diagnostic	491	11.0		50.0	
	Health Services Research	197	4.1		37.5	
	Prevention	1008	9.5		37.5	

	Screening	46	4.3		0.0	
	Supportive Care	280	10.3		75.0	
	Treatment	6264	12.1		39.7	
	Missing	364	8.0		48.3	
Allocation	Non-Randomized	1052	11.0	0.986	31.0	0.155
	Randomized	6039	11.0		41.9	
	Missing	1809	11.2		44.1	
Endpoint classification	Bio-availability	18	5.6	<0.001	0.0	0.155
	Bio-equivalence	38	7.9		66.7	
	Efficacy	2668	10.7		47.2	
	Pharmacodynamics	121	11.6		35.7	
	Pharmacokinetics	124	4.0		0.0	
	Pharmacokinetics/Dynamics	111	12.6		28.6	
	Safety	625	9.1		36.8	
	Safety/Efficacy	3811	12.8		37.2	
	Missing	1384	8.5		47.5	
Masking	Double Blind	2775	12.6	<0.001	36.7	0.119
	Open Label	4798	11.2		43.1	
	Single Blind	1287	7.1		46.2	
	Missing	40	15.0		33.3	
Intervention model	Crossover	713	7.4	0.009	39.6	0.148
	Factorial	156	8.3		38.5	
	Parallel	5246	11.4		41.5	
	Single Group	2727	11.4		40.8	
	Missing	58	15.5		33.3	
N. enrolled	(0,100]	5521	14.0	<0.001	45.3	<0.001
	(100,1000]	2832	6.3		27.4	
	(1000,20000]	467	5.6		10.7	
	>20000	53	3.8		0.0	
	Missing	27	19.2		40.0	
N. facilities (per study)	1	4934	10.3	<0.001	44.4	<0.001
	(1,10]	1876	14.4		44.1	
	(10,50]	1047	11.5		35.0	
	(50,100]	204	14.2		17.2	
	>100	191	9.4		16.7	
	Missing	648	5.9		23.7	
N. Conditions (per study)	1	6703	11.8	0.068	41.3	0.228
	2	1584	8.2		44.0	
	>2	613	13.8		32.9	
Conditions (*)	Acute Coronary Syndrome	205	12.2	-	48.3	-
	Atrial Fibrillation	380	13.4		37.2	
	Cardiovascular Diseases	481	5.4		34.6	
	Coronary Artery Disease	609	8.7		50.9	
	Coronary Disease	341	10.0		32.3	
	Heart Failure	644	13.8		53.9	
	Hypertension	901	10.2		29.3	
	Multiple Myeloma	620	15.8		42.9	
	Myocardial Infarction	216	9.7		38.2	
	Myocardial Ischemia	414	10.9		20.0	
	Stroke	477	10.9		34.6	
Overall		8900	11.1		41.1	

(#): Facility location describes the study-level location of enrolling sites. It results in a single continent for single-centre trials and multi-centre multinational trials and in a combination of continents for intercontinental trials.

(*): the number of MeSH conditions sums to 13,501 across the 8,900 closed trials. Only the conditions exceeding an absolute frequency of 200 are listed.

(**): Chi-square or Fisher test p-values.

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3 On a random sample of 85 terminated trials, where the reason for termination was manually
4 reviewed by one of the authors (I.B.), the prevalent reason was poor accrual (47%). Stopping
5 occurred for lack of funding and sponsor decision in 8% and 6% of the sampled trials, respectively.
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10 Appropriate reasons for termination based on internal or external evidence of futility or lack of
11 safety accounted for 26% of all reasons. The sensitivity and specificity of the stemmed term “enrol”
12 in identifying poor accrual were 97.5% and 100%, respectively.
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16 Terminated trials actually involved a total of 114,609 enrolled subjects (plus 44,513 scheduled) and
17 more than 10,500 facilities worldwide. Eighteen thousand eight hundred eight patients and 2,319
18 facilities actually took part in trials terminated because of poor accrual.
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22 The patterns of premature termination shown in Figure 4, varied from 9.6% to 14% (p-value <
23 0.001) among the two most contributing continents, Europe and Americas and were slightly
24 decreasing over the study period (p-value = 0.02).
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29 Intercontinental trials exhibited comparable figures of termination and lower figures of unsuccessful
30 accrual as the reason for their early stopping, as compared to intracontinental trials (13% vs. 11%,
31 p-value = 0.24, termination, of whom 28% vs. 44%, p-value = 0.002, due to poor accrual,
32 respectively). Figure 5 shows the time trend of poor accrual for intercontinental trials (p-value for
33 trend = 0.02, p-value for the difference = 0.001).
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41 A median actual duration of 24 months was observed both on closed trials and on the subset of
42 terminated trials. Only a slight difference emerged in the third quartile, ranging from 38 to 39
43 months for closed and terminate trials, respectively. For this reason, time trends were truncated at
44 the last biennium under study.
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50 Poor accrual accounted for more than 40% of reasons for early stopping in trials recruiting from
51 Americas and Europe. This proportion was by far inferior for all other continents of recruitment,
52 although caution must be taken in interpreting these figures since they rely on small absolute
53 numbers (Table 2).
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Conclusion

Clinical trials are a key step in advancing new therapeutic concepts for the management of chronic cardiovascular diseases from the research setting to the clinical practice [13]. Despite this achievement, the successful recruitment of the targeted number of participants in a given time frame remains a significant challenge to clinical trials [14]. Delayed and abandoned trials represent a waste of scarce human and economic resources which may slow the advancement of medical progress or reduce its timely impact on patient health and wellbeing.

Therefore, a thorough understanding of the nature of trial enrolment patterns, from an overview on aggregate data through to the working of individual trials, is of paramount importance.

This study contributes to a growing body of research on early termination due to poor accrual in cardiovascular trials [2 3 9], providing further insights into geographical and temporal patterns.

Among study findings, about 11% of all closed trials were terminated, which is consistent with other cross-sectional studies using the ClinicalTrials.gov registry [9 15]. When restricted to phase II and phase III trials together, the proportion of early termination (14%) was slightly inferior to that reported on a recent study [4] based on the National Library of Medicine clinical trial registry (19%).

Consistently with existing literature [8 9], the most common reason for cardiovascular trials failing to complete was poor accrual (41%). Common logistical reasons were related to lack of funds and sponsor decision. Since reason for termination was automatically characterized by word patterns through text mining, we may just speculate that the concepts underlying “safety concerns”, “safety issue” and “interim analysis” pertain to appropriate termination, possibly on data safety and monitoring board advice, because of excessive toxicity or in accord with early stopping rules.

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3 Almost all trials are dependent on the willingness of patients and professionals to give their time
4 and effort to participate and we estimated that the human dimension of poor accrual involved more
5 than 8,000 patients and the staff of 2,000 sites.
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9 Not only the overall patterns of early termination but also those concerned with poor accrual
10 exhibited geographical variations. Cardiovascular trials recruiting in the two most contributing
11 continents, exhibited the highest and lowest proportion of early termination due to unsuccessful
12 accrual in Americas and Europe, respectively, across all the study period.
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16 Nevertheless, time trends should be interpreted with caution, since the decrease seen in the last
17 biennium of the evaluation may be an artifact, reflecting both a delay in updating trial status in
18 ClinicalTrials.gov and a selection of trials with a short duration and less likely to suffer from low
19 accrual. However, comparisons between continents of recruitment per year appear to be appropriate
20 and reliable.
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24 It is interesting to notice that intercontinental trials, particularly those in bilateral collaboration with
25 Americas and Europe, suffer more from early termination and less from termination due to lack of
26 accrual, as compared to studies completely run in only one of the participating continents. Clearly,
27 intercontinental trials are often resource-intensive large-scale randomised controlled clinical trials,
28 recruiting thousands of patients from large numbers of trial sites (i.e., megatrials).
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32 On the one hand, this probably allows to recognize the achievement of enrolment goals within a
33 reasonable timeframe as one of the numerous advantages of globalization of cardiovascular clinical
34 trials, often evolving into megatrials [16], but on the other hand it highlights that other
35 organizational and financial issues challenge this process. Intercontinental trials represent a valuable
36 attempt to harmonize the generation of clinical evidence across continents. Their implementation is
37 particularly promising in device trials [17], where the comparison of procedural outcomes, using
38 similar devices in different environments, makes it possible to disentangle the effects of practice
39 patterns and procedural technique on clinical results.
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3 Some study limitations must be acknowledged. First the generalizability of study results. From a
4 recent investigation [18] on trends in global clinical trial registration from 2005 to 2013, based on
5 International Clinical Trials Registry Platform data, emerged that registered trials conducted in
6 Northern America and Latin America and Caribbean were almost exclusively registered in
7 ClinicalTrials.gov. Also European trials were predominantly registered in ClinicalTrials.gov rather
8 than in the EU Clinical Trials Register. Conversely, trials conducted in Oceania and Asia were
9 increasingly registered at other regional registries such as the Australian New Zealand Clinical
10 Trials Registry and the Japan Primary Registries Network, respectively.
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14 As a consequence, study results concerning Europe and Americas can be regarded as representative
15 of all registered trials recruiting from these continents. Moreover, differences in the extent of early
16 termination and of poor accrual, can be interpreted as genuine. On the contrary, it cannot be ruled
17 out that some selection bias occurred for trials recruiting from Asia and Oceania. Therefore, the
18 extent of early termination for trials run in these two continents may be underestimated.
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22 Furthermore, the identification of trials terminated for poor accrual relied on an automated process
23 with an estimated sensitivity of 97.5%, thus the extent of poor accrual may be underestimated.
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27 Poor accrual is a significant barrier to the successful and timely completion of clinical trials and to
28 the advancement of medical knowledge. Although this issue may be addressed in a variety of ways,
29 a global collaborative perspective on the planning and conduct of some cardiovascular clinical trials
30 should be further encouraged [19].
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5 **Contributorship:** IB and PB designed the study and wrote the manuscript; CL and IB performed
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7 the statistical analysis; all authors contributed to results interpretation and approved the final
8
9 manuscript.
10

11 **Funding:** This research received no specific grant from any funding agency in the public,
12
13 commercial or not-for-profit sectors.
14

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16 **Competing interests:** All authors have completed the ICMJE uniform disclosure form at
17
18 www.icmje.org/coi_disclosure.pdf and declare: no support from any organisation for the submitted
19
20 work; no financial relationships with any organisations that might have an interest in the submitted
21
22 work in the previous three years; no other relationships or activities that could appear to have
23
24 influenced the submitted work
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27 **Data sharing:** No additional data available.
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References

1. Zannad F, Gattis Stough W, McMurray JJ, et al. When to stop a clinical trial early for benefit: lessons learned and future approaches. *Circ Heart Fail* 2012;**5**(2):294-302 doi: 10.1161/CIRCHEARTFAILURE.111.965707[published Online First: Epub Date]].
2. Sica DA. Premature termination of clinical trials--lessons learned. *J Clin Hypertens (Greenwich)* 2002;**4**(3):219-25
3. Task Force of the Working Group on Arrhythmias of the European Society of Cardiology. The early termination of clinical trials: causes, consequences, and control. With special reference to trials in the field of arrhythmias and sudden death. Task Force of the Working Group on Arrhythmias of the European Society of Cardiology. *Circulation* 1994;**89**(6):2892-907
4. Carlisle B, Kimmelman J, Ramsay T, MacKinnon N. Unsuccessful trial accrual and human subjects protections: an empirical analysis of recently closed trials. *Clin Trials* 2015;**12**(1):77-83 doi: 1740774514558307 [pii] 10.1177/1740774514558307[published Online First: Epub Date]].
5. Stensland KD, McBride RB, Latif A, et al. Adult cancer clinical trials that fail to complete: an epidemic? *J Natl Cancer Inst* 2014;**106**(9) doi: 10.1093/jnci/dju229[published Online First: Epub Date]].
6. Hirsch BR, Califf RM, Cheng SK, et al. Characteristics of oncology clinical trials: insights from a systematic analysis of ClinicalTrials.gov. *JAMA Intern Med* 2013;**173**(11):972-9 doi: 1682358 [pii] 10.1001/jamainternmed.2013.627[published Online First: Epub Date]].
7. Mitchell AP, Hirsch BR, Abernethy AP. Lack of timely accrual information in oncology clinical trials: a cross-sectional analysis. *Trials* 2014;**15**:92 doi: 10.1186/1745-6215-15-92[published Online First: Epub Date]].
8. Moya L. Clinical trials in cardiology: pinnacle or inflection point? *Circ Res* 2014;**114**(1):28-31 doi: 10.1161/CIRCRESAHA.113.302851[published Online First: Epub Date]].
9. Bernardez-Pereira S, Lopes RD, Carrion MJ, et al. Prevalence, characteristics, and predictors of early termination of cardiovascular clinical trials due to low recruitment: insights from the ClinicalTrials.gov registry. *Am Heart J* 2014;**168**(2):213-9 e1 doi: 10.1016/j.ahj.2014.04.013[published Online First: Epub Date]].
10. Huffman MD, Baldrige A, Bloomfield GS, et al. Global cardiovascular research output, citations, and collaborations: a time-trend, bibliometric analysis (1999-2008). *PLoS One* 2013;**8**(12):e83440 doi: 10.1371/journal.pone.0083440[published Online First: Epub Date]].

- 1
2
3 11. Tasneem A, Aberle L, Ananth H, et al. The database for aggregate analysis of ClinicalTrials.gov
4 (AACT) and subsequent regrouping by clinical specialty. PLoS One 2012;**7**(3):e33677 doi:
5 10.1371/journal.pone.0033677
6
7 PONE-D-11-20359 [pii][published Online First: Epub Date]].
8
9
10 12. Foltran F, Avossa F, Fedeli U, Baldi I, Spolaore P, Gregori D. Seasonal variations in injury
11 rates in children: evidence from a 10-year study in the Veneto Region, Italy. Int J Inj Contr
12 Saf Promot 2013;**20**(3):254-8 doi: 10.1080/17457300.2012.692691[published Online First:
13 Epub Date]].
14
15
16 13. Jackson N, Atar D, Borentain M, et al. Improving clinical trials for cardiovascular diseases: a
17 position paper from the Cardiovascular Round Table of the European Society of Cardiology.
18 Eur Heart J 2016;**37**(9):747-54 doi: 10.1093/eurheartj/ehv213[published Online First: Epub
19 Date]].
20
21
22
23 14. Bower P, Brueton V, Gamble C, et al. Interventions to improve recruitment and retention in
24 clinical trials: a survey and workshop to assess current practice and future priorities. Trials
25 2014;**15**:399 doi: 10.1186/1745-6215-15-399[published Online First: Epub Date]].
26
27
28 15. Williams RJ, Tse T, DiPiazza K, Zarin DA. Terminated Trials in the ClinicalTrials.gov Results
29 Database: Evaluation of Availability of Primary Outcome Data and Reasons for
30 Termination. PLoS One 2015;**10**(5):e0127242 doi: 10.1371/journal.pone.0127242[published
31 Online First: Epub Date]].
32
33
34 16. O'Connor CM. The Globalization of Heart Failure Research. JACC Heart Fail 2015;**3**(8):657-8
35 doi: 10.1016/j.jchf.2015.06.001[published Online First: Epub Date]].
36
37
38 17. Saito S, Valdes-Chavarri M, Richardt G, et al. A randomized, prospective, intercontinental
39 evaluation of a bioresorbable polymer sirolimus-eluting coronary stent system: the
40 CENTURY II (Clinical Evaluation of New Terumo Drug-Eluting Coronary Stent System in
41 the Treatment of Patients with Coronary Artery Disease) trial. Eur Heart J
42 2014;**35**(30):2021-31 doi: 10.1093/eurheartj/ehu210[published Online First: Epub Date]].
43
44
45
46 18. Viergever RF, Li K. Trends in global clinical trial registration: an analysis of numbers of
47 registered clinical trials in different parts of the world from 2004 to 2013. BMJ Open
48 2015;**5**(9):e008932 doi: 10.1136/bmjopen-2015-008932[published Online First: Epub
49 Date]].
50
51
52
53 19. Moss AJ, Francis CW, Ryan D. Collaborative clinical trials. N Engl J Med 2011;**364**(9):789-91
54 doi: 10.1056/NEJMp1013194[published Online First: Epub Date]].
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Figures

Figure 1. Geographical distribution of the facilities involved in cardiovascular trials, 2006-2015.

Figure 2. Conditional inference tree predicting early termination. Retained variables: Facility Location (Americas (AM), Americas Europe (AM-EU), Americas Asia Europe (AM-ASIA-EU), Asia, Europe (EU), Other), Year of start date, Intervention type (Behavioral (Behav), Biological (Bio), Device, Dietary Supplement (Diet), Drug, Genetic (Gene), Procedure (Proc), Radiation (Rad), Other), Intervention model (Crossover (Cr), Factorial (Fac), Parallel (Paral), Single group (Sing)).

Figure 3. Network graph showing the most frequent relations (i.e., correlation > 0.15) between the (stemmed) terms “enrol”, “fund”, “sponsor”, “safety” and “interim”, and the other words in the corpus of reason for termination text data. Solid lines identify associations with a correlation > 0.15 and dotted lines identify tautological associations.

Figure 4. Proportion of early terminations by continents of recruitment over time. Cardiovascular trials, 2006-2015.

Figure 5. Proportion of early terminations due to poor accrual for trials recruiting from a single continent or from different continents over time. Cardiovascular trials, 2006-2015.

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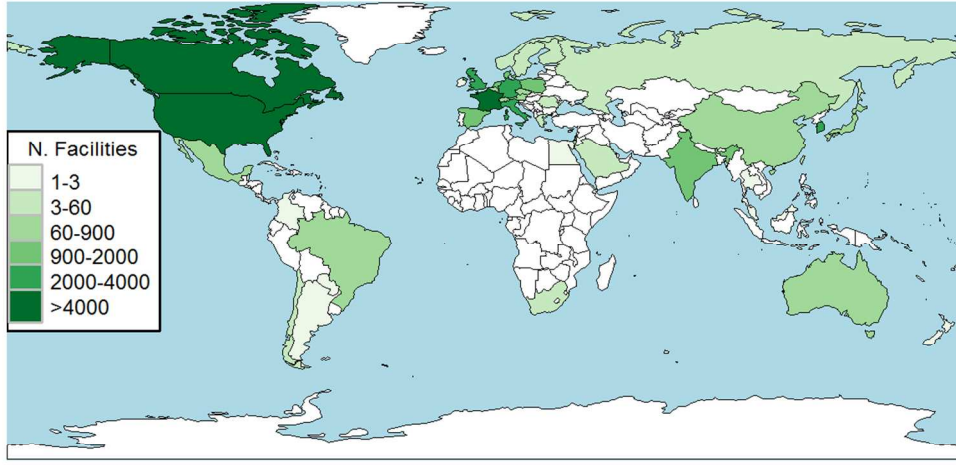


Figure 1. Geographical distribution of the facilities involved in cardiovascular trials, 2006-2015.

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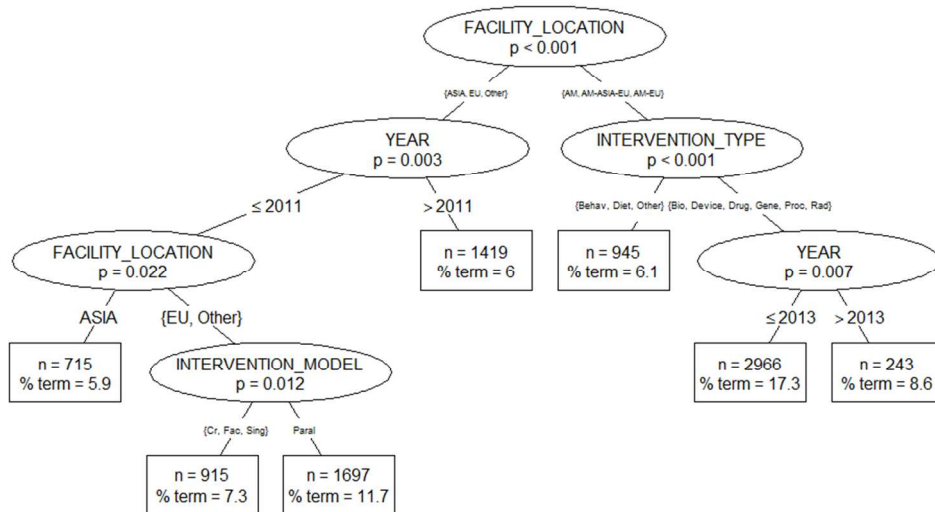


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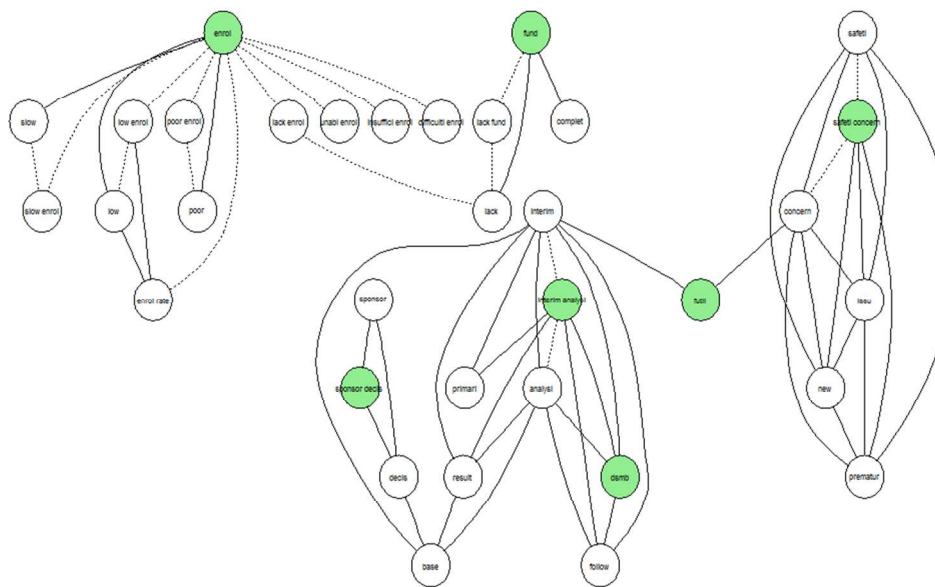


Figure 3. Network graph showing the most frequent relations (i.e., correlation > 0.15) between the (stemmed) terms "enrol", "fund", "sponsor", "safety" and "interim", and the other words in the corpus of reason for termination text data. Solid lines identify associations with a correlation > 0.15 and dotted lines identify tautological associations.

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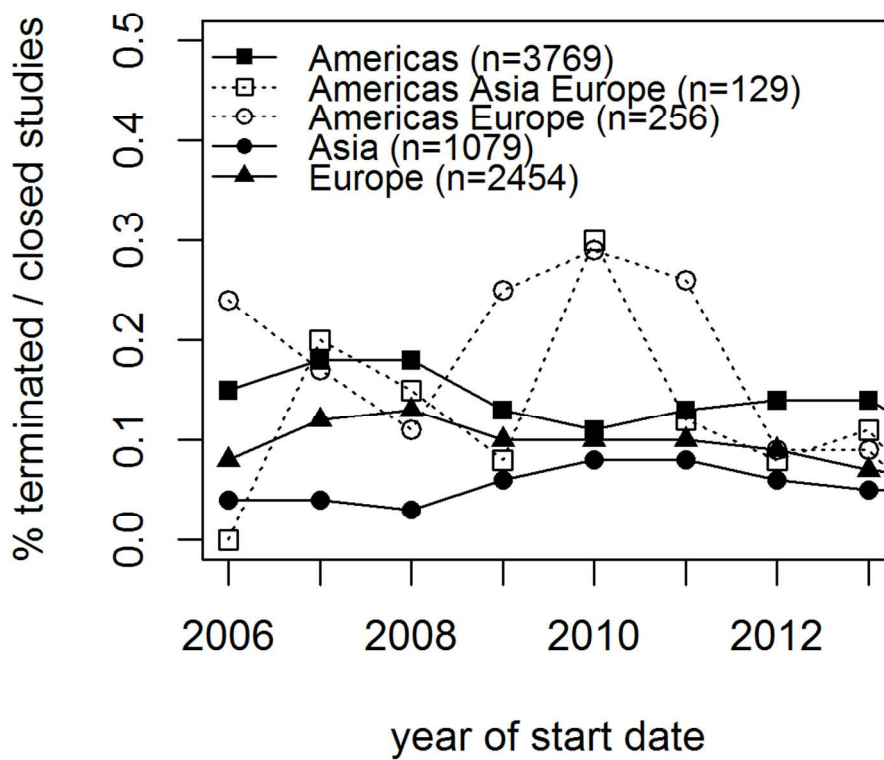


Figure 4. Proportion of early terminations by continents of recruitment over time. Cardiovascular trials, 2006-2015.

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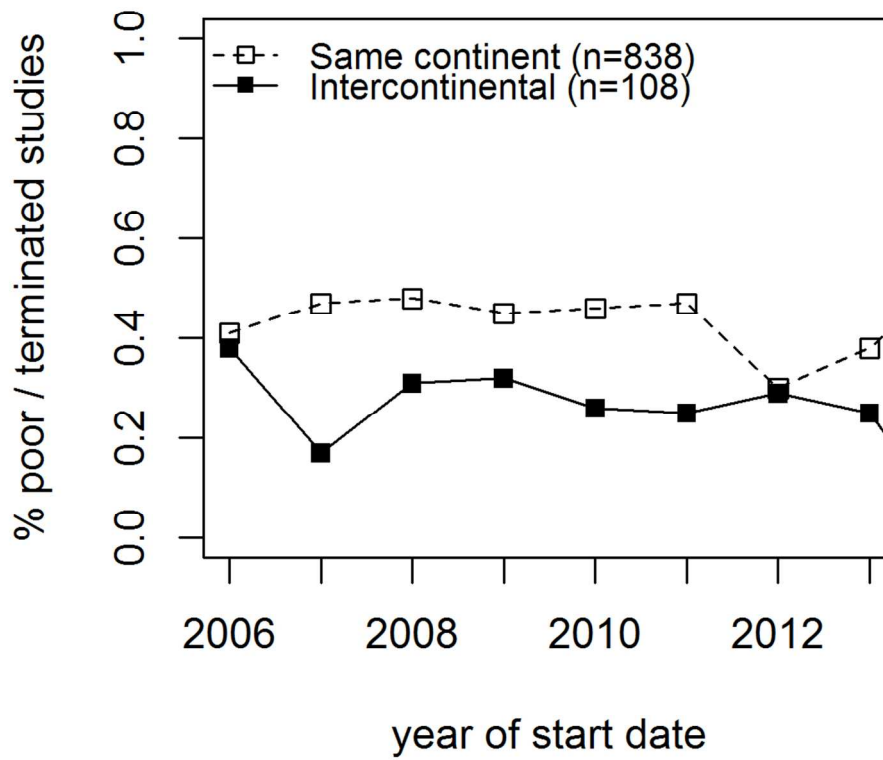


Figure 5. Proportion of early terminations due to poor accrual for trials recruiting from a single continent or from different continents over time. Cardiovascular trials, 2006-2015.

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