

## World congress of Psycho-oncology 2015 Review

Psychosocial Intervention Research: Principles for Rigorous Design and Tips for Successful Conduct

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## **Psychosocial Intervention Research**

- Principles of study designs
- Determining sample size
- Choice of appropriate assessment measures
- Approaches to analyses
- How to deal with missing data



## **Trends of Psycho-oncologic intervention**

- The scope of the problem
  - Increased burden of cancer
  - Consumer expectation
  - Limited workforce and burnout amongst clinician
  - Global economic prospects

## Supportive care intervention use minimal health resource !



### **Trends of Psycho-oncologic intervention**

- Supportive care intervention
  - Empower patients and family
  - Recognize family and social circumstances
  - Account for individual needs
  - Patient/family centered



### **Trends of Psycho-oncologic intervention**

### 2013 IPOS

Current active issues Survivorship Distress screening

Potential area Minority populations Quality of care in practice Communication Skills E-Health

### 2015 IPOS

Current active issues New populations Self-management strategy Quality of care in practice Patient reported outcome Research quality improve

Potential area Physician's burden Find out underserved parts Wearable devices

#### Introduction

Acta Oncologica, 2015; Early Online: 1-8

informa healthcare

ORIGINAL ARTICLE

Effective, clinically feasible and sustainable: Key design features of psycho-educational and supportive care interventions to promote individualised self-management in cancer care

#### PENELOPE SCHOFIELD<sup>1,2,3,4,5</sup> & SUZANNE CHAMBERS<sup>6</sup>

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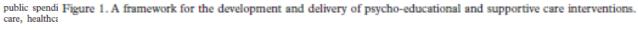
#### ABSTRACT

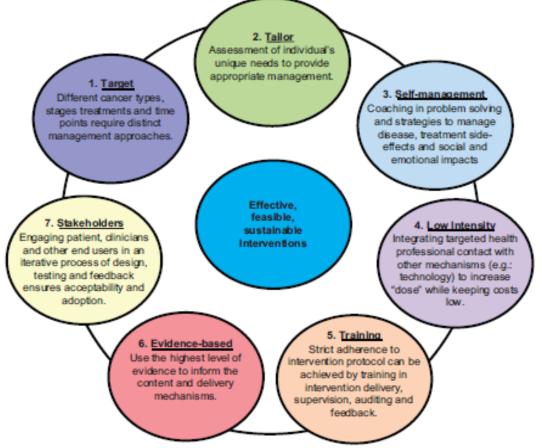
As the global burden of cancer increases healthcare services will face increas of these patients, their families and the communities in which they live. This need where direct clinical contact may be constrained or not readily availabl and skills to manage their illness outside of the hospital setting within their c **Aim**. To propose a framework for the development and delivery of psycho-edu drawing on theoretical principles of behaviour change and evidence-based inte ence in developing and testing complex interventions in oncology.

Approach. At the core of this intervention framework are considerations of cater for individuals' unique needs; to place minimal demands on the healt disseminated into usual care if successful. There are seven key features: 1) Ta to unique individual needs; 3) Promotion of patient self-management of 4) Efficient delivery of the intervention; 5) Training and adherence to protocol based; 7) Confirming stakeholder acceptability of the intervention.

Application. A case study of a randomised controlled trial which tested prusing this framework is presented. These interventions were designed to cater self-management while placing minimal demands on the acute health care se **Discussion.** Innovative ways to realise the potentially major impact that interventions can have on psychological morbidity, coping, symptoms and qu are needed. This framework, which is driven by theory, evidence, and experi tions are effective, clinically feasible and sustainable.

Cancer is the leading cause of burden of disease in the world, accounting for nearly one-fifth of the total disease burden [1]. The diagnosis and subsequent treatment of cancer is a major life stress that is followed by a range of well described psychological, social, physical, sexual, spiritual and practical difficulties [2]. The demand for oncology services in the US was estin 2020 [3]. In tl care services, than they are With the







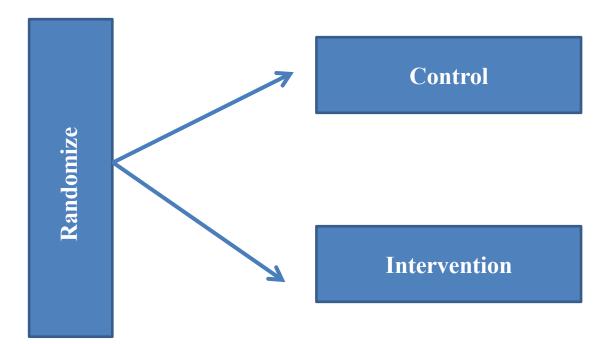


## Select study design

- "A RCT is
  - a planned experiment designed to asses the efficacy of an intervention in human beings by comparing the intervention to a control condition
  - The allocation to intervention or control is determined purely by chance (randomization)
- RCTs are a subset of possible experimental designs

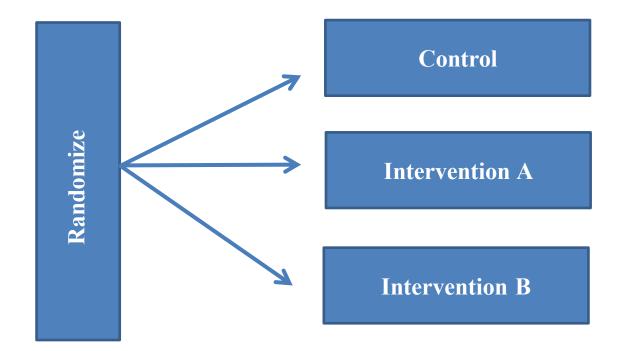


- Design options to lower placebo response
- Option 1. Parallel single stage design



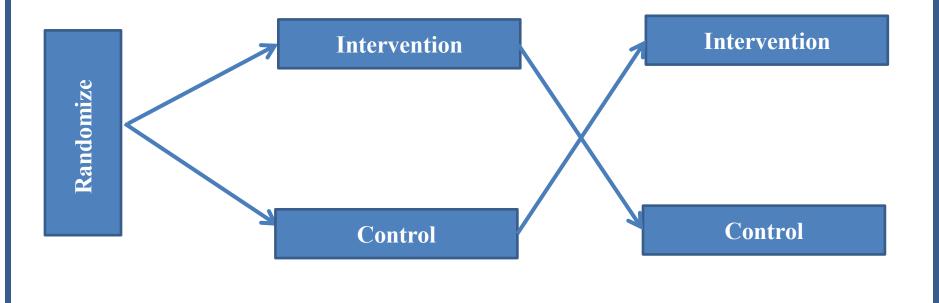


- Design options to lower placebo response
- Option 2. Multi-arm parallel



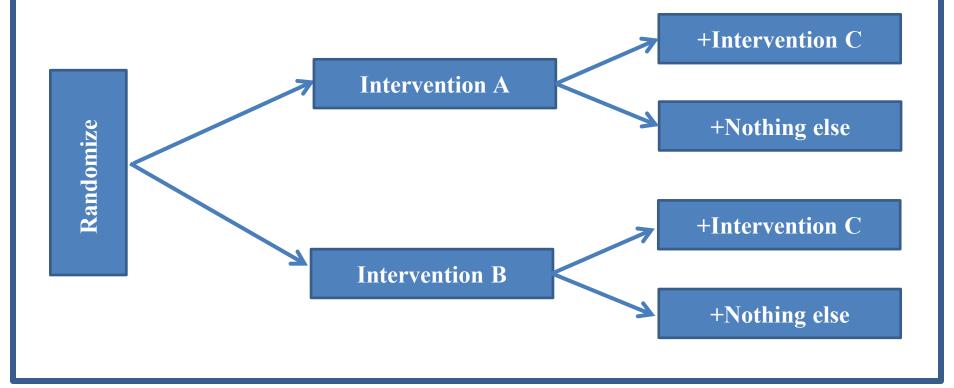


- Design options to comparison only subject to withinsubject variability not between-subject variability with less patients .
- Option 3. Cross-Over Designs



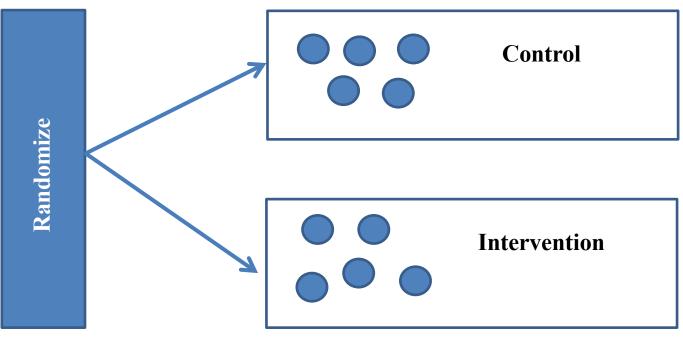


- Design options to permit the simultaneous test of two different hypotheses with less patients .
- Option 4. Factorial (Fractional)





- Design options
  - to compare to the nature of the intervention
  - to reduce self selection
  - cannot introduce the intervention in all units at once
- Option 5. Cluster randomized trial





- Design options to
  - fewer units needed (same as cross-over design)
  - cannot introduce the intervention in all units at once
  - Evaluate the community effectiveness
  - previously shown to be efficacious in an individually randomized trial or in a different setting; systematically evaluate new program
  - to study the effect of time on intervention effectiveness (i.e. seasonality, time since introduction)
- Option 6. Stepped Wedge Design



• Option 6. Stepped Wedge Design

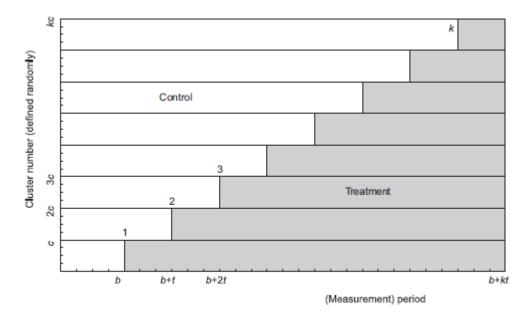


Fig. 1. Illustration of the stepped wedge design, where different (groups of) clusters switch from control to treatment at different time points.



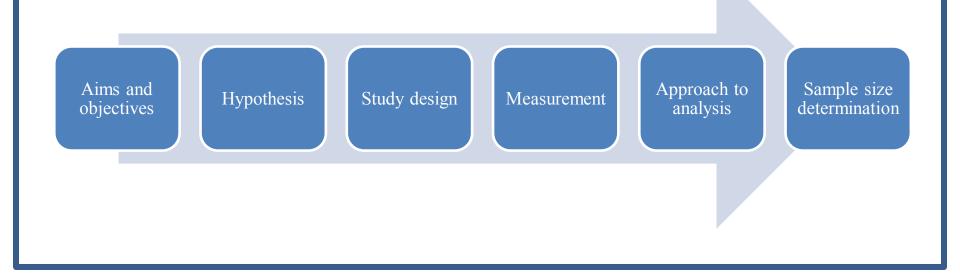
## **Study participants**

- Consider feasibility
  - Identifying who may benefit from intervention (Ceiling and floor effects)
- Control group
  - Usual care
  - Placebo
  - Wait list control
  - Another intervention
  - Reduced intervention
  - Active control



## Issues with sample size

- Why dose sample size matter?
  - Sample size can be too small to detect the effect of interest
  - Sample size can be unnecessarily large including more participants than is needed to detect the effect of interest
- Sample size determination





## Sample size determination

- Sample size calculation make use of the relationship among
  - Sample size (N)
  - Significant criteria (alpha)
    - Alpha decided whether to accept that a finding from a sample is likely to be real or not, and usually it is 0.05
  - Statistical power (1-beta)
    - Beta represents the risk of mistakenly accepting the null hypothesis, and usually it is 0.20
  - Population effect size



## **Population effect size**

• The effect size is the discrepancy between

– The null hypothesis vs. alternate hypothesis  $d = \frac{\bar{x}_1 - \bar{x}_2}{\bar{x}_1 - \bar{x}_2}$ 

### • Cohen's d

- Cohen'd is the effect size index for the difference between two independent mean in the classical t-test
- A d of 0.5 implies a half of a standard deviation difference between population means
  - hesitantly defined effect sizes as "small, d = 0.2," "medium, d = 0.5," and "large, d = 0.8",



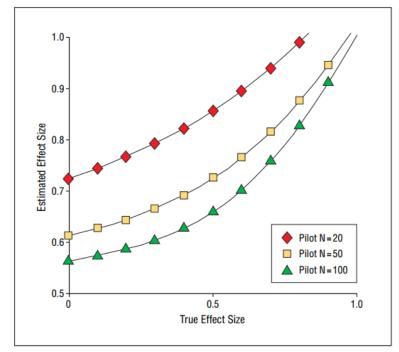
## Cohen's d

- **Do not use pilot study** effect sizes to answer this question
  - Studies worth performing are aborted
  - Studies not aborted are under-power
- Also not advisable to use sample size of a previous study or trial reporting statistically significant result

PERSPECTIVES

#### Caution Regarding the Use of Pilot Studies to Guide Power Calculations for Study Proposals

Helena Chmura Kraemer, PhD; Jim Mintz, PhD; Art Noda, MS; Jared Tinklenberg, MD; Jerome A. Yesavage, MD



**Figure 3.** The estimated effect size if the study is not aborted, relative to the true effect size using pilot studies with sample sizes of 20, 50, and 100.



• Minimal important difference (MID) or minimal clinically important difference (MCID)

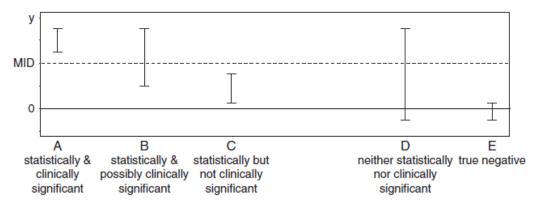


Figure 1. Interpretations of five cases of 95% confidence intervals, their relationship to the null values (0) and the minimal important different (MID).

King MT. A point of minimal important difference (MID): a critique of terminology and methods Expert Rev. Pharmacoeconomics Outcomes Res. 11(2), 171–184 (2011)



### Half a standard deviation



MEDICAL CARE

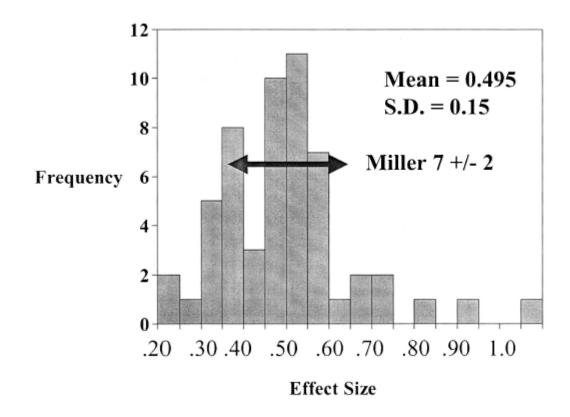


FIG. 1. Distribution of effect sizes computed from 56 estimates of the minimal difference derived from 33 studies.

Norman GR. Interpretation of Changes in Health-related Quality of Life The Remarkable Universality of Half a Standard Deviation. MEDICAL CARE Volume 41, Number 5, pp 582–592



### 10% of the instrument range

Interpreting Clinically Significant Changes in **Patient-Reported Outcomes** 

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<sup>2</sup> The Institute for Clinical Evaluative Sciences, Sunnybrook Hospital and University of Toronto. Toronto, Ontario, Canada,

BACKGROUND. The goal of this study was to determine what magnitude of change in a patient-reported outcome score is clinically meaningful, so a clinicians' guide may be provided for estimating the minimal important difference (MID) when empiric estimates are not available.

METHODS. Consecutive laryngeal cancer patients (n = 98) rated their quality of life (QOL) relative to other patients. These comparisons were contrasted with arithmetic differences in scores on the Functional Assessment of Cancer Therapy-Head and Neck (FACT-H&N) scale, Functional Assessment of Cancer Therapy-General (FACT-G) scale, 2 utility measures (the time tradeoff [TTO] and Daily Active Time Exchange [DATE]), and performance status (Karnofsky) scores. RESULTS. The FACT-H&N score needed to differ by 4% for average patients to rate themselves as "a little bit better" relative to other patients (95% CI, 1%-8%) and by 9% to rate themselves as "a little bit worse" relative to others (95% CI, 4%-13%). The corresponding values for other measures were FACT-G 4% (1%-7%) and 8% (95% CI, 5%-11%); TTO 5% (95% CI, 0%-11%) and 6% (95% CI, 0%-10%); DATE

ference (MID) was about 5% to 10% of the instrument range. CI, 1%–6%) a

ference (MID CONCLUSIONS benchmark c sensitive to f

Presented in part at the American Society of

**CONCLUSIONS.** One rule of thumb for interpreting a difference in QOL scores is a benchmark of about 10% of the instrument range. Patients appear to be more This simple sensitive to favorable differences, so an improvement of 5% may be meaningful. Cancer 2007; This simple benchmark may be useful as a rough guide to meaningful change. Cancer 2007;110:196-202. © 2007 American Cancer Society.



### Binary outcome variable— proportions

 This approach reduces power (~30% for dichotomizing), loses information, eats up degrees of freedom.

### Table

Table 1  Sample sizes for various combinations of relative risk reduction and base rate*					
	Relative risk reduction				
Base rate	0.08	0.16	0.25		
0.01	247 500	61875	25300		
0.02	122500	30625	12550		
0.05	47500	11875	4 865		
0.1	22500	5625	2 300		
0.2	10000	2 500	1025		
0.5	2 500	625	255		

\*Sample size based on the approximate formula n=16×(BR(1–BR))/ARR<sup>2</sup>, where BR=base rate and ARR=absolute risk reduction. Sample sizes are rounded to the nearest 5 or 0.

Norman GR. Sample size calculations: should the emperor's clothes be off the peg or made to measure?.

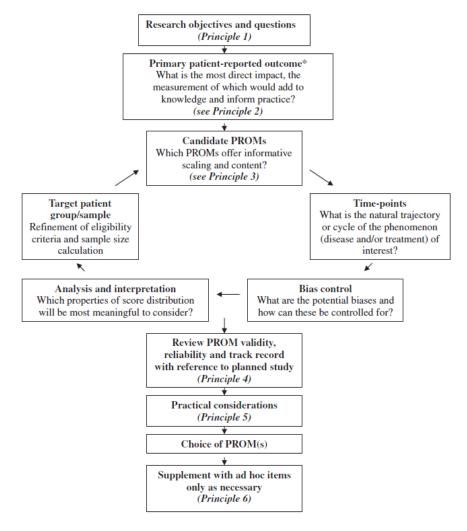


Choice of appropriate assessment measures

- What are the specific outcome constructs that **will be** <u>influenced by the intervention</u>?
- What is the **population** of interest
- What is the <u>time frame</u> of interest

#### Measurements





\* The same process should be repeated for each secondary and tertiary patient-reported outcome. In these cases, the question is 'what is the next most important impact, the measurement of which would add to knowledge and inform practice?'

Fig. 1 - Algorithm for choosing patient-reported outcome measures (PROMs).

Luckett T. Choosing patient-reported outcome measures for cancer clinical research . Practical principles and an algorithm to assist non-specialist researchers. european journal of cancer 4 6 (2010) 3 1 4 9 .3 1 5 7



### review

Annals of Oncology 22: 2179–2190, 2011 doi:10.1093/annonc/mdq721 Published online 21 February 2011

### Choosing between the EORTC QLQ-C30 and FACT-G for measuring health-related quality of life in cancer clinical research: issues, evidence and recommendations

T. Luckett<sup>1,2\*</sup>, M. T. King<sup>1</sup>, P. N. Butow<sup>1,3</sup>, M. Oguchi<sup>1,3</sup>, N. Rankin<sup>1,4</sup>, M. A. Price<sup>1,3</sup>, N. A. Hackl<sup>5</sup> & G. Heading<sup>5,6</sup>

<sup>1</sup>Psycho-oncology Co-operative Research Group (PoCoG); <sup>2</sup>Improving Palliative Care through Clinical Trials (ImPaCCT), New South Wales, Department of Palliative Care, Braeside Hospital, Wetherill Park; <sup>3</sup>Centre for Medical Psychology and Evidence-based Decision-making (CeMPED), University of Sydney, Camperdown; <sup>4</sup>Centre for Health Service Development, University of Wollongong, Wollongong; <sup>5</sup>Cancer Institute New South Wales, Eveleigh; <sup>6</sup>Clinical Education and Training Institute, New South Wales Health, Gladesville, Australia

Received 15 June 2010; revised 31 August 2010; accepted 15 November 2010

**Background:** This review aims to assist cancer clinical researchers in choosing between the two most widely used measures of cancer-specific health-related quality of life: the European Organisation for the Research and Treatment of Cancer Quality of Life Questionnaire Core 30 and Functional Assessment of Cancer Therapy—General (FACT-G). **Materials and methods:** Information on QLQ-C30 and FACT-G content, scale structure, accessibility and availability was collated from websites and manuals. A systematic review was undertaken to identify all articles reporting on psychometric properties and information to assist interpretability. Evidence for reliability, validity and responsiveness was rated using a standardised checklist. Instrument properties were compared and contrasted to inform recommendations.

**Results:** Psychometric evidence does not recommend one questionnaire over the other in general. However, there are important differences between the scale structure, social domains and tone that inform choice for any particular study.

**Conclusions:** Where research objectives are concerned with the impact of a specific tumour type, treatment or symptom, choice should be guided by the availability, content, scale structure and psychometric properties of relevant European Organisation for the Research and Treatment of Cancer versus Functional Assessment of Chronic Illness Therapy modules. Because the FACT-G combines symptoms and concerns within each scale, individual items should always be reviewed within the context of specific research objectives. Where these issues are indecisive, researchers are encouraged to use an algorithm at the end of the current article. **Key words:** psychometrics, quality of life, questionnaires



### Choice of appropriate assessment measures

#### **EORTC-C30**, social functioning \* 지난 한 주를 기준으로 답변하여 주십시오. 약간 마우 조형 그라다 그라다 아니다 그렇다 일을 하거나 기타 일상생활을 영위하는데 한계를 느낀 적이 6 2 3 1 4 있습니까? 취미생활이나 여가활동을 하는데 있어 한계를 느낀 적이 2 3 1 7 4 있습니까?

### Weak to moderate correlation, r=0.10-0.50

### FACT-G, social well-being

		전혀 그렇지 않다	조금 그렇다	보통이다	다소 그렇다	매우 그렇다
	사회/가족 영역				adar - an ad - for an and 1844 - ad A	
1.	친구들과 가까워지는 듯한 느낌이 든다.	0	1	2	3	4
2.	정서적으로 가족들의 따뜻한 보살핌을 받는다.	0	1	2	3	4
3.	친구들로부터 도움을 받는다.	0	1	2	3	4
4.	내 가족들은 내 병을 받아들였다.	0	I	2	3	4
5.	내 병에 대한 가족들의 대화에 만족한다.	0	1	2	3	4
6.	배우자와 가깝게 느낀다	0	1	2	3	4

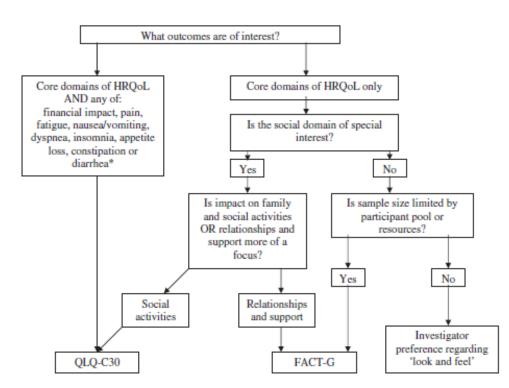
Luckett T. Choosing between the EORTC QLQ-C30 and FACT-G for measuring health-related quality of life in cancer clinical research: issues, evidence and recommendations. Annals of Oncology 22: 2179–2190, 2011

#### Measurements



### Choice of appropriate assessment measures

Annals of Oncology



\*Where cognitive functioning is an outcome of interest, researchers are encouraged to seek a dedicated questionnaire rather than rely on the scale included in the QLQ-C30.

Figure 1. Decision tree for choosing between the Quality of Life Questionnaire Core 30 (QLQ-C30) and Functional Assessment of Cancer Therapy—General (FACT-G) when availability and psychometric properties of modules and/or translated versions and item-by-item content of FACT-G items are not deciding factors. HRQoL, health-related quality of life.

Luckett T. Choosing between the EORTC QLQ-C30 and FACT-G for measuring health-related quality of life in cancer clinical research: issues, evidence and recommendations. Annals of Oncology 22: 2179–2190, 2011

#### Analysis



Psycho-Oncology Psycho-Oncology 22: 499–505 (2013) Published online 7 February 2012 in Wiley Online Library (wileyonlinelibrary.com). DOI: 10.1002/pon.3046

## Scientific rigour in psycho-oncology trials: why and how to avoid common statistical errors

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\*Correspondence to: Psycho-Oncology Cooperative Research Group, University of Sydney, Sydney NSW 2006, Australia. E-mail: melanie.bell@sydney.edu.au

Received: 25 July 2011 Revised: 15 January 2012 Accepted: 16 January 2012

#### Abstract

*Objective*: It is well documented that statistical and methodological flaws are common in much of the health research literature, including psycho-oncology. These can have far-reaching effects, including the publishing of misleading results; the wasting of time, effort, and financial resources; exposure of patients to the potential harms of research and decreased confidence in science and researchers by the public.

*Methods*: Several of the most common statistical errors and methodological pitfalls that occur in the field of psycho-oncology are discussed, including those that occur at the design, analysis, reporting and conclusion stages.

*Results*: Fourteen topics are briefly discussed, explaining why there is a problem and how to avoid it. These include proper approaches to power, clustering, missing data, categorization of continuous variables, subgroup analyses, multiple comparisons, statistical interactions, confidence intervals and correct interpretation of *p*-values. Extensive referencing points the reader to more in-depth explanations.

*Conclusions*: To increase the scientific rigour in psycho-oncology, researchers should involve a biostatistician from the beginning of the study and should commit to continuing education on best practices in the fields of statistics and reporting.

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Keywords: cancer; oncology; design; analysis; reporting; quality control; pitfalls

### Analysis



### Annals of Internal Medicine

### Academia and Clinic

### Extending the CONSORT Statement to Randomized Trials of Nonpharmacologic Treatment: Explanation and Elaboration

Isabelle Boutron, MD, PhD; David Moher, PhD; Douglas G. Altman, DSc; Kenneth F. Schulz, PhD, MBA; and Philippe Ravaud, MD, PhD,

for the CONSORT Group'



#### CONSORT 2010 checklist of information to include when reporting a randomised trial\*

Adequate reporting of ra	CONSORT 2010 checklist of information to include when reporting a randomised trial*				
essary to allow accurate cability of the results. Th	Section/Topic	Item No	Checklist item	Reported on page No	
Reporting Trials) Stateme is intended to address th	Title and abstract				
RCTs. However, some s		1a	Identification as a randomised trial in the title		
pharmacologic treatments		1b	Structured summary of trial design, methods, results, and conclusions (for specific guidance see CONSORT for abstracts)		
tions, devices, rehabilitati	Introduction				
vention) are not specifical	Background and	2a	Scientific background and explanation of rationale		
Furthermore, considerable	objectives	2b	Specific objectives or hypotheses		
nonpharmacologic trials	Methods				
CONSORT group develo	Trial design	3a	Description of trial design (such as parallel, factorial) including allocation ratio		
ment for trials assessing n	That design	3b	Important changes to methods after trial commencement (such as eligibility criteria), with reasons		
meeting of 33 experts w	Participants	4a	Eligibility criteria for participants		
2006, to develop an ex	r antoipanto	4b	Settings and locations where the data were collected		
	Interventions	5	The interventions for each group with sufficient details to allow replication, including how and when they were actually administered		
	Outcomes	6a	Completely defined pre-specified primary and secondary outcome measures, including how and when they were assessed		
		6b	Any changes to trial outcomes after the trial commenced, with reasons		
	Sample size	7a	How sample size was determined		
		7b	When applicable, explanation of any interim analyses and stopping guidelines		
	Randomisation:				
	Sequence	8a	Method used to generate the random allocation sequence		
	generation	8b	Type of randomisation; details of any restriction (such as blocking and block size)		
	Allocation concealment mechanism	9	Mechanism used to implement the random allocation sequence (such as sequentially numbered containers), describing any steps taken to conceal the sequence until interventions were assigned		
	Implementation	10	Who generated the random allocation sequence, who enrolled participants, and who assigned participants to interventions		
	Blinding	11a	If done, who was blinded after assignment to interventions (for example, participants, care providers, those		
	CONSORT 2010 checklist			Page 1	



### Reporting of Patient-Reported Outcomes in Randomized Trials The CONSORT PRO Extension

HE CONSORT (CONSOLIdated Standards of Reporting Trials) Statement, first published in 1996 and most recently revised in 2010,<sup>1,2</sup> provides evidence-based recommendations to improve the completeness of reporting of randomized controlled trials (RCTs). The statement focuses on parallel-group trials, but a number of extensions for reporting other trial deThe CONSORT (Consolidated Standards of Reporting Trials) Statement aims to improve the reporting of randomized controlled trials (RCTs); however, it lacks guidance on the reporting of patient-reported outcomes (PROs), which are often inadequately reported in trials, thus limiting the value of these data. In this article, we describe the development of the CONSORT PRO extension based on the methodological framework for guideline development proposed by the Enhancing the Quality and Transparency of Health Research (EQUATOR) Network. Five CONSORT PRO checklist items are recommended for RCTs in which PROs are primary or important secondary end points. These recommendations urge that the PROs be identified as a primary or secondary outcome in the abstract, that a description of the hypothesis of the PROs and relevant domains be provided (ie, if a multidimensional PRO tool has been used), that evidence of the PRO instrument's validity and reliability be provided or cited, that the statistical approaches for dealing with missing data be explicitly stated, and that PRO-specific limitations of study findings and generalizability of results to other populations and clinical practice be discussed. Examples and an updated CONSORT flow diagram with PRO items are provided. It is recommended that the CONSORT



## Statistical analysis plan

- To prepare an adequate analysis plan, you will need to decide the following
  - Intention to treat and/or per-protocol analysis
  - Statistical procedures to be used for primary and additional analyses (and any assumptions about missing data these may entail)
  - Composite endpoints or summary measures consistent with study objectives
  - Multiplicity adjustment
  - Expected rate and handling of missing forms (and any sensitivity analysis)



#### STATISTICS IN MEDICINE, VOL. 13, 1715-1726 (1994)

### **TESTING FOR BASELINE BALANCE IN CLINICAL TRIALS\***

#### STEPHEN SENN

Medicine and Clinical Development Department, CIBA, CH4002 Basle, Switzerland

#### SUMMARY

Once the data from a clinical trial are available for analysis it is common practice to carry out 'tests of baseline homogeneity' on prognostic covariates before proceeding to analyse the effects of treatment on outcome variables. It is argued that this practice is philosophically unsound, of no practical value and potentially misleading. Instead it is recommended that prognostic variables be identified in the trial-plan and fitted in an analysis of covariance regardless of their baseline distribution (statistical significance).

### Analysis

Bland and Altman *Trials* 2011, **12**:264 http://www.trialsjournal.com/content/12/1/264



### METHODOLOGY

**Open Access** 

### Comparisons against baseline within randomised groups are often used and can be highly misleading

J Martin Bland  $^{1\ast}$  and Douglas G  $\rm Altman^2$ 

#### Abstract

**Background:** In randomised trials, rather than comparing randomised groups directly some researchers carry out a significance test comparing a baseline with a final measurement separately in each group.

**Methods:** We give several examples where this has been done. We use simulation to demonstrate that the procedure is invalid and also show this algebraically.

**Results:** This approach is biased and invalid, producing conclusions which are, potentially, highly misleading. The actual alpha level of this procedure can be as high as 0.50 for two groups and 0.75 for three.

**Conclusions:** Randomised groups should be compared directly by two-sample methods and separate tests against baseline are highly misleading.

Keywords: Baseline, significance, comparison, within-group, type I error, alpha, ageing



## Sources of multiple testing

- Multiple outcomes
- Multiple predictors
- Subgroup analyses
- Multiple definitions for the exposures and outcomes
- Multiple time points for the outcome
- Multiple looks at the data



## Principled handling of missing data

- 1. Replacing missing observations with a single value
  - such as the mean or the last observation,
  - but, it can both increase the type I error rate by artificially reducing the variance in the data and cause biased estimation
- 2. just ignore missingness by performing a complete case analysis,
  - but it can result in bias if the reason for missingness is related to the outcome.



## Principled handling of missing data

- 3. The use of maximum likelihood methods such as mixed models
  - are best practices for the analysis of longitudinal data where some of the outcomes are not observed (if less than 10%)
- 4. Sensitivity analysis
- 5. Missing imputation

Carpenter J, Kenward M. Missing Data in Randomised Controlled Trials - A ractical Guide. National Institute for Health Research: In. Birmingham, 2008.



## **Reporting missing data**

- Missing data rates, by treatment arm, should be reported, particularly in longitudinal studies.
  - the CONSORT statement's flowchart can be a good means for doing this
  - the possible effects of attrition should be discussed as well, with sensitivity analyses performed and discussed to demonstrate the robustness of the results to missing data assumptions

### Thank you



# american psychosocial oncology society MARCH 3-5, 2016

Psychosocial Cancer Care for All: Achieving Equity in Psychosocial Oncology

HOME	ABSTRACT SUBMISSION	CONFERENCE PROGRAM	SUPPORT & EXHIBIT	SAN DIEGO TRAVEL
Save the	Datac			
Week of August 1				
Call for Abstract		an a 🚽 👬 🖂 .		
October 5, 2015				
Abstract Submis	sion Deadline			
March 3, 2016				
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March 4-5, 2016				
Conference Sess	sions, Exhibits You're	invited!		ANT REAL PROPERTY
and Posters	Join us i	n San Diego, California, March 3-5, 20	16 . Meet our invited speaker	
			1000 A. S. S. A. L. I.	

### Psychosocial Care for All: Achieving Equity in Psychosocial Oncology Across Ethnic, Racial and Cultural Minorities

The APOS 13th Annual Conference will feature one day of preconference workshops, followed by two-days of educational conference sessions. The conference will be held at the Sheraton San Diego Hotel and Marina.