

# Reading and Interpreting Medical Research

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## Overview

- + Classes of studies
- + Ethical research
- + How to publish research
- + Basic stats
- + Reading and interpreting papers

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## Types of Papers

- + Invited
- + Review
- + Original research

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## Invited Paper

- + Author(s) are experts/at cutting edge in field
- + Editor of journal asks them to submit paper on their expertise
- + Largely summarizes their past work and looks to the “state of the art” in a particular area
- + Beware the author that thinks a little too highly of himself

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## Review Paper

- + Authors extensively summarize current and past research on a particular topic
- + Can have well over 100 references
- + Author(s) often experts in particular area
  - + Often invited
- + Extremely useful for getting up to speed in a particular field

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## Original Research Paper

- + Authors are presenting information on original data they have collected
- + Including development of tool/treatment
  - + In this type of study, the methodology may be more interesting than the results

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## Types of Original Research Studies

- + Retrospective
  - + Chart review
- + Prospective
- + Randomized vs. paired (matched)
- + Blinded vs. non-blinded
- + The gold standard
  - + Prospective, double-blind randomized study

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## Retrospective Studies

- + Study of already-existing data
- + Relatively easy to perform
  - + Data are already there, just have to look it up
  - + Chart review
    - + Pull out charts on former/current patients, look up required information, test results, etc.

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## Problems with Retrospective Studies

- + No control over confounding variables
- + Need *lots* of data to show any kind of population effect
  - + Nurses study
    - + Huge dataset has over 100,000 respondents
    - + Lots of good science
  - + And...
    - + Correlation between french fry consumption as a child and breast cancer?

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## Prospective Studies

- + Examine the effect of a treatment vs a group receiving different/no/placebo treatment
  - + Treatments decided ahead of time
  - + Protocol for all subjects determined
- + Can be difficult
  - + People must consent to participating
  - + All treatments (or lack thereof) must be ethical

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## Advantages of Prospective Studies

- + Designed to answer a particular question
- + Design should eliminate factors that may confound the issue

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## Randomized Studies

- + Subjects are randomly assigned to groups
- + Keeps investigators from choosing subjects who are more/less likely to respond to treatment
- + Should lead to a relatively equal distribution of subjects between groups
  - + Roughly same age range in groups
  - + Roughly same body types
  - + But, it may not

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## Matching Subjects

- + Eliminate chance of demographics of one group being different from demographics of another
- + Not easy to match large groups for
  - + Gender
  - + Height
  - + Weight
  - + Fitness level
  - + Etc.

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## Blinding of Investigators

- + Investigators examining subjects should not be aware of their treatment status
  - + Could lead to biasing results of their examinations
  - + It's hard to be *completely* objective

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## Double-Blind Studies

- + Both investigators and subjects are unaware of which subjects belong to which group
  - + Control for placebo effects
    - + Can be 30%

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## The Research Gold Standard

- + Prospective, double-blinded randomized study
  - + Best way to show an effect of treatment, etc.
  - + Designed to eliminate confounding factors, control covariates
  - + Randomization should avoid bias in selection of subjects
  - + Blinding of investigators and subjects should ensure integrity of results, account for placebo effects

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## Hydroxychloroquine [Plaquenil] and COVID-19 Controversy

- + Many positive reports
- + Is it an effective treatment for COVID-19?
- + Most studies had no control group
- + In most positive studies it was used in conjunction with a kitchen sink of other treatments
  - + Azithromycin [antibiotic, "Z pack"]
  - + Corticosteroids [powerful anti-inflammatory drugs]
- + FYI, hydroxychloroquine is NOT a useful treatment for COVID-19

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## Ethical Research

- + Research should not compromise treatment
  - + Difficult to challenge the "gold standard" for treatment
  - + Nor should study participants receive more attention
- + Built-in protections for subjects
  - + HIPAA
  - + Informed consent
  - + Institutional review board
  - + Often required by journals in order to publish results of research

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## HIPAA

- + Health insurance portability and accountability act
  - + Passed in 1996
  - + Been to the doctor in the past 25 years?
- + Mainly deals with how your medical records may be exchanged/discussed among medical professionals, insurance companies, etc.
- + Any subject data in a study must be de-identified
  - + No way to link study data to a particular person
  - + Data must be kept secure

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## Informed Consent

- + Research subjects must be aware of and *understand*:
  - + All possible consequences of their participation
  - + Any benefits they may accrue
  - + Should be *written* and *signed*

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## Institutional Review Board (IRB)

- + Should review and approve all research at an institution before it is carried out
  - + Including the informed consent form
- + Made up of a combination of people
  - + Scientists familiar with the topic
  - + Other scientists
  - + Non-scientific members of the institution
  - + Members of the community

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## Publishing Your Research

- + Carry out a quality study with a significant result
- + Find the appropriate journal
  - + Quality, well-respected
  - + Read by people in the field with which you are dealing
- + Write up research in the appropriate format
- + Submit to journal editor for review

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## Peer Review

- + Editor will send paper to several reviewers who should be experts in the field
  - + Should be blind to the source of the paper
    - + Not always possible
    - + Reviewers often familiar with other researchers in the field
  - + Accept as-is
  - + Accept pending revisions
  - + Revise and re-submit
  - + Reject

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## Problems With Peer Review

- + Can be hard to publish controversial, but correct findings
  - + People may have trouble accepting something that goes against theory that they believe (or espouse)
- + Dependent on ethics of reviewers
- + Best system available

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## Writing Your Paper

- + Know the relevant literature
- + Know the relevant literature
- + Know the relevant literature
- + Know the relevant literature
- + Write for the appropriate audience
- + Always define acronyms before using them
- + Use appropriate grammar
- + Know the relevant literature

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## Suggestion for Paper Structure

- + Abstract
- + Introduction
- + Materials and methods
- + Results
- + Discussion and conclusions

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## Writing Your Paper: The Abstract

- + Short summary
  - + Usually around 150 words
- + Should include:
  - + Purpose of study
  - + Overview of methodology
  - + Overview of results
  - + Statement of what study showed
- + The sales pitch
  - + "What's it going to take to get you to read my paper?"
  - + Often the only text publically-available
- + Usually, the last thing written

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## Writing Your Paper: Introduction

- + Summarize what is currently known about the topic
  - + Cite all appropriate literature
    - + Make sure you've actually read it as well
- + Why is your project needed?
- + What question does your project answer?
- + State purpose at end
  - + Along with any hypotheses

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## Writing Your Paper: Materials and Methods

- + Describe what was done
  - + The reader should be able to reproduce your study
- + Subjects involved
  - + Demographics
  - + Inclusion/exclusion criteria
  - + How were they divided into groups?
- + Apparatus used
  - + Hardware
  - + Software
- + Describe how analysis performed
- + What statistics were used

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## Writing Your Paper: Results

- + Charts and tables often the best
  - + Yes, even in scientific literature everybody looks at the pictures first
- + Text should elaborate on interesting results
- + Do not speculate about the meaning of the results
  - + Just state them

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## Writing Your Paper: Discussion and Conclusions

- + Summarize results and provide interpretation
  - + What's it mean?
- + Include how your results relate to the existing literature on the topic
  - + Hopefully in agreement with previous work
  - + If not in agreement, explain why
  - + How do your results extend current knowledge?
- + Did you answer your research question?
  - + Hypotheses proven/disproven?
- + Weaknesses of your study
- + Recommendations for further work

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## Introduction to Biostatistics

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## Sensitivity

- + Probability of detecting disease/symptom, given that person has disease/symptom
- +  $(\text{number with positive test}) / (\text{total number of people with disease})$
- + *True positive rate*

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## Specificity

- + Probability of not detecting disease/symptom given that person does not have disease/symptom
- + (number with negative test) / (total number of people without disease)
- + *True negative rate*

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## Related Terms

- + Positive predictive value
  - + Probability that a person has disease/condition given a positive test
- + Negative predictive value
  - + Probability that a person does not have disease/condition given a negative test
- + False positive
  - + Person who tests positive but is really negative
- + False negative
  - + Person who tests negative but is really positive

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## An Example

	Positive Test	Negative Test
Disease Present	150	30
Disease Absent	60	260

- + Sensitivity =  $150 / 180 = 0.83$
- + Specificity =  $260 / 320 = 0.81$
- + Positive predictive value =  $150 / 210 = 0.71$
- + Negative predictive value =  $260 / 290 = 0.90$

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## Real-Life Example

- + Mammography
  - + 75-90% sensitive
  - + 90-95% specific
  - + PPV:
    - + 20%, women < 50
    - + 60-80%, women 50-69

American College of Preventive Medicine Policy Statement

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## COVID-19

- + With a completely new, highly infectious contagion, is a *sensitive* or *specific* test more important to prevent spread?
- + What are consequences of a *false negative* vs a *false positive*?
- + Very non-theoretical issue: if people can have the virus and be asymptomatic, how does one determine the true positive rate?

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## An Example for a Very Contagious Disease with No Good Treatment

	Positive Test	Negative Test
Disease Present	180	0
Disease Absent	100	220

- + Sensitivity =  $180 / 180 = 1.0$
- + Specificity =  $220 / 320 = 0.69$
- + Positive predictive value =  $180 / 280 = 0.64$
- + Negative predictive value =  $220 / 220 = 1.0$

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## Summary

- + Useful to know specificity/sensitivity/etc. in order to understand the purpose of a given test
- + Need to establish these values when developing new tests and procedures

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## Controversy: Whole-Body CAT Scan

- + Whole-body CAT scan for healthy people to pick up any possible disease
- + Problems:
  - + CAT scan sensitive, but not specific
  - + Findings often equivocal, require lots of follow up testing to confirm
  - + Causes lots of unnecessary worry
  - + Stress on already-burdened health care system

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## Type I Error

- + Detecting a difference between two groups when none really exists
  - + False positive
- +  $P$  value of a calculation
  - + Expresses chance of a type I error
  - + Generally,  $P < 0.05$  used to demonstrate statistical significance

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## A Word About P-Values

- +  $P < 0.05$  an arbitrary threshold
  - + Means 95% certain result is not just a statistical fluke
  - + Is this “good enough?”
- + This means that 1 of 20 “statistically significant” results is result of random error
  - + What happens when dozens of medical journals become hundreds?
- + Sterne, Smith. Sifting the evidence—what’s wrong with significance tests? *British Medical Journal* 322:226-231, 2001.
  - + <http://bmj.bmjournals.com>

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## Type II Error

- + Not detecting a difference between two groups that does, in fact, exist
  - + False negative
- + Tends to occur with small sample sizes
- + *Statistical power*
  - + Power of 80% usually used
  - + Requires knowledge of your test population
    - + How variable measurements will be
    - + Good guessing

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## Sources of Error

- + Bias
  - + Measurement always erroneously high or low
  - + Human tendencies
  - + Other systemic effects
    - + Calibration of measuring device
- + Random error
  - + Difficulty in reproducing test conditions
  - + Noisy measurement tools
  - + Noisy measures
    - + Biological systems tend to have large tolerances

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## Comparing Sets of Data

- + Independent data
- + Dependent (paired) data
- + *Normally* distributed!
  - + "If there's any justice in the world, everything is Gaussian."
    - + -- F. Fontaine, many times
- + Comparing means

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## Independent t-test

- + Comparing two different things
  - + Independent
- + Comparing the means of two different populations
- + Standard deviation/standard error give an idea of how spread about the mean data are
  - + Variance

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## Paired t-test

- + Comparing data that are paired
  - + e.g., leg strength before and after rehab in same person
  - + Data are not statistically independent
- + Mean, std dev/err of groups are *not* interesting for this comparison
- + Interested in the mean/std dev of the difference between the pairs

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## t-test Examples

- + Compare pain scores (scale of 1-100) in subjects
  - + Comparison of people with arthritis to people without arthritis
    - + Independent t-test
  - + Comparison of people with arthritis to *the same people before they had arthritis*
    - + Paired t-test

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## Comparing More Than Two Things

- + Example: subjects with ACL reconstruction (anterior cruciate ligament, in the knee)
  - + Involved (injured) side vs. uninvolved side
  - + Test knee flexion strength at different speeds: 30, 60, 90, 120 deg/sec
  - + Two sides, four speeds = lots of t-tests (paired or unpaired in this case?)
- + ANOVA (repeated measures)

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## ANOVA

- + Analysis of variance
- + Way of performing many comparisons
- + *Main effects*
- + *Interactions*

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## ANOVA Example

- + Previous example:
  - + 2 x 4 ANOVA
    - + 2: uninvolved, involved leg
    - + 4: different speeds
- + Main effects [possible explanations]:
  - + Leg
    - + ACL leg weaker (?)
  - + Speed
    - + Lower strength at higher speed (regardless of which leg) (?)
- + Interaction [possible explanations]:
  - + Between leg and speed
    - + Involved leg weaker at some speeds but not others (?)

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## Types of ANOVA

- + Repeated measures
  - + Previous example
  - + All data being compared are dependent
- + Mixed model
  - + Some comparisons independent
  - + Example:
    - + Test strength prior to and after some intervention
    - + Also compare between genders
    - + 2 x 2 mixed model ANOVA

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## More ANOVA

- + Use *post-hoc* t-tests to illustrate differences
  - + Mean and std dev of all tests with involved leg vs uninvolved leg
  - + Use P-value for t-tests
  - + This is unneeded if there are only two levels to the variable: e.g., pre vs post, since there is only one comparison to make
- + Beware multiple comparisons!

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## Multiple Comparisons

- + Comparing variables all day increases chances of finding a significant result
- + Correct for multiple comparisons in *post-hoc* t-tests
  - + Strict: *Bonferroni* correction
  - + Multiply P-value by number of comparisons made
    - + If three comparisons, need  $P < 0.017$  for significance
- + ***Some studies do this, some do not!***

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## Another ANOVA Issue

- + Sphericity
  - + Variance of effect (SD of difference) is different between different levels of a variable
  - + There exist corrections for this
    - + e.g., Greenhouse-Geisser
  - + ***Very few studies do this!***

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## Linear Regression and Correlation

- + Relationship between two variables is linear
  - + Let's hope it is
  - + We are not good at explaining non-linear things
    - + Exponential isn't so bad
- + Correlation coefficient explains how much variance in one variable is accounted for by another variable

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## Correlation Coefficient

- + Pearson correlation
- + Pearson  $R$
- +  $R$
- + Correlation between two variables:
  - + The value  $R^2$  tells how much one variable explains variance in another
  - + Correlations may be statistically significant but not particularly useful

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## Multiple Regression

- + Model some data as a linear combination of several other variables
  - + E.g., body fat from skinfold measurements
- + Can be very useful
- + Can be horribly misapplied

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## Limits of Agreement

- + Where can data be expected to live?
- + 68% within 1 st dev of mean
- + 95% within 2 st devs of mean

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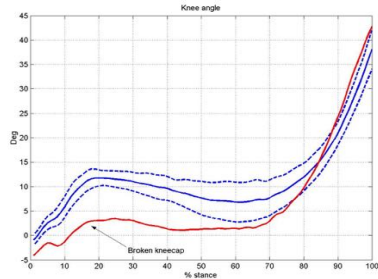
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## Limits of Agreement Example

- + Knee angle during stance phase of gait



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## Difficult Things to Measure

- + Pain
- + Outcome after a treatment/procedure
- + Patient/subject satisfaction
  - + Mood ring?

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## Outcome Measurements

- + Questionnaire
  - + Score for each question
  - + Must be validated
- + “How do you feel?” scale of 1 to 10
  - + Not continuous
- + Visual analog scale
  - + Mark pain/satisfaction on [10 cm] line
  - + Measure distance from start of line to mark



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## My Data Aren't Normally Distributed!!!

- + Few samples
  - + Difficult to create a bell-shaped curve with five subjects
- + Non-continuous data
- + Categorical data
  - + "yes", "no", "sometimes"
- + Use non-parametric statistics

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## Non-Parametric Statistics

- + Non-parametric versions of parametric tests
  - + Independent t-test: Mann-Whitney test
  - + Paired t-test: Wilcoxon test
  - + Etc...
- + Chi-square test
  - + More yes replies in group 1 than group 2

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## A Word About Statistical Significance

- + Not necessarily clinically significant!
- + Is effect smaller than something that can be measured reliably?
  - + e.g., Group 1 has 0.5° more knee flexion than group 2

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## Important Medical Research Trivia

- + Do not compare right vs left
  - + Why?
- + What part of the body is referred to as the “leg”?

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## Reading and Interpreting Papers

- + Read with a critical eye!
  - + Appropriate prior research cited in introduction?
  - + Used correct tools?
    - + Measuring devices
    - + Stats
  - + Used tools properly?
    - + Electromagnetic tracker in room with metal studs in walls
  - + Correct interpretation of statistics

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## Reading and Interpreting Papers

- + Beware the abstract!
  - + Sales pitch for the paper
  - + Often good to read *last* rather than first
    - + Did authors, in fact, demonstrate what they claim in abstract?

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## Sample Study

- + *Effects of remote, retroactive intercessory prayer on outcomes in patients with bloodstream infection: randomised controlled trial*
- + Leonard Leibovici
- + British Medical Journal 2001; 323:1450-1451
- + <http://bmj.bmjournals.com/cgi/content/full/323/7327/1450>

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## Sample Study

- + Population
  - + All adult patients admitted to a university hospital with bloodstream infection from 1990-1996
  - + 3393 patients
- + Randomized into two groups
  - + 1691 in intervention group
  - + 1702 in control group

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## Sample Study

- + Intervention
  - + List of first names of patients in intervention group given to a person
  - + Person said short prayer for the well-being and full recovery of this group as a whole
- + Variables compared
  - + Number of deaths in hospital (mortality)
  - + Length of hospital stay
  - + Duration of fever

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## Sample Study

- + Results
  - + Mortality not different between groups
    - + 28.1% vs 30.2%,  $P = 0.4$
  - + Length of stay in hospital shorter in intervention group
    - +  $P = 0.01$
  - + Duration of fever shorter in intervention group
    - +  $P = 0.04$
- + Conclusion
  - + "...This intervention is cost effective, probably has no adverse effects, and should be considered for clinical practice..."

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## Sample Study Strengths and Weaknesses

- + Prayer said long after illness
  - + Is this useful?
    - + Does it affect the way patient will be treated in hospital if it is known that s/he will be prayed for afterwards?
      - + Perhaps it doesn't matter as long as the prayer is said?
- + Why not pray when they come into hospital?
  - + Prospective study
  - + But, presumably, a supreme being is not limited by causality
- + What flavor of prayer?
  - + Performed in Israel
  - + Christians/Muslims/Buddhists/Druids/Pastafarians et al. are wrong?

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## Sample Study Conclusion

- + Proof of existence of divine?
- + Proof of existence of Type I error?
- + Note: published in December issue
  - + BMJ often publishes *interesting/ironic* papers in the "Christmas" or April issues

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## Finding Relevant Literature

- + Many databases available
  - + Some pay
  - + Some free
- + PubMed:
  - + <https://www.ncbi.nlm.nih.gov/PubMed/>
  - + Free access to MEDLINE and several other databases
- + Google Scholar
  - + <https://scholar.google.com>
  - + Often leads to PDFs the author may have uploaded

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