

Memorial Sloan Kettering Cancer Center

## **Basket Trials in Oncology**

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#### Disclosures

- DSMB
- Mylan
- BrightPath Biotherapeutics Co., Ltd.



#### Working group on targeted therapy / trial design



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#### New landscape of drug development



| Single Protocol                       | Objectives  |
|---------------------------------------|---|
| •Early phase trials                   | Safety and efficacy<br>Identify right population, dose, schedule, combination |
| <ul> <li>Adaptive protocol</li> </ul> | Multiple and prespecified hypotheses  |
| •Amended protocol                     | Evolve over time  |



# Can we do many trials with the cost and sample size of a single trial?

#### Can we answer multiple questions in a single trial?

- It can be done in a rigorous and efficient way
- What is the price to pay?



#### Innovative designs (adaptive, Bayesian)

- Premise: they are more efficient than traditional/ conventional designs in terms of sample size and trial duration
- Phase I Model based dose escalation designs
  - Dose; Schedules; Groups (pediatrics vs adults)
- Phase II (basket trials) efficacy
  - Borrow information across baskets
  - Evaluate emerging evidence in a formal statistical model



#### **Traditional Single arm Phase II Trial**



- Does the drug work in this particular cancer?
  - Is the response rate with this drug greater than the response rate of standard therapy (historical estimate)?



#### **Current landscape**







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#### **Basket Trials**

- Combining multiple histologies in a single trial
- In its most basic form a basket trial is specific to a molecular target and a targeted regimen, with histologies forming the baskets
  - Single drug/target, multiple disease sites
  - Example: Vemurafenib Hyman et al. NEJM 2015
- Implications for Clinical Trial Design: non randomized setting



#### Patient Selection: molecularly defined subgroups





#### **Basket trials: definition of basket**





#### Phase II Basket Trial: current field



- Single Target (a particular genomic alteration)
- Multiple Histologies (Anatomic Sites)

- Questions:
  - Does the treatment work at all?
  - If it works, does efficacy differ by histology?



#### Why these questions?

- The drug may not be hitting the target sufficiently
  - Tumor Heterogeneity
  - Non-specific binding
  - Incorrect dosing
  - .... — Uonco +
- → Hence the first question:
   Does the drug work?

- If the drug works, it may not work in all tumor sites
  - Secondary mutations interfering with sensitivity to treatment
  - Hypothesized mechanism of action
- → Hence the second question: Where does it work?



Panel A: Disease-Specific Baskets (Hyman et al., 2015)



Panel B: Disease-Mutation-Specific Baskets (CREATE, 2016)



Panel C: Disease-Drug-Mutation-Specific Baskets (CUSTOM, 2015)



Cunanan et al JCO 2017

| VOLUME 35 · NUMBER 3 · JANUARY 20, 2017 |                            |
|---|----------------------------|
| JOURNAL OF CLINICAL ONCOLOGY            | COMMENTS AND CONTROVERSIES |

### Basket Trials in Oncology: A Trade-Off Between Complexity and Efficiency

Kristen M. Cunanan, Mithat Gonen, Ronglai Shen, David M. Hyman, Gregory J. Riely, Colin B. Begg, and Alexia Iasonos, *Memorial Sloan Kettering Cancer Center, New York, NY.* 



Eliminate the confusion and provide a more precise terminology

| Table 1. Types of Master Protocols. |  |  |  |  |  |  |
|-------------------------------------|--|--|--|--|--|--|
| Type of Trial                       | Objective  |  |  |  |  |  |
| Umbrella                            | To study multiple targeted therapies in the context of a single disease  |  |  |  |  |  |
| Basket                              | To study a single targeted therapy in the context of multiple diseases or disease subtypes   |  |  |  |  |  |
| Platform                            | To study multiple targeted therapies in the context of a single<br>disease in a perpetual manner, with therapies allowed to<br>enter or leave the platform on the basis of a decision algo-<br>rithm |  |  |  |  |  |



#### Scientific and ethical design and review of innovative protocols

- Can the study answer the scientific question?
  - Safe
  - Ethical
  - Scientifically valid (addressing objectives)
  - Accurate (precision error)
    - » lasonos, Gonen, Bosl, JCO 2015
- How do we get to the answer **faster?**
- Minimize sample size; Trial duration
- Patient allocation/treatment: receiving inefficient treatment
- Are these designs optimal /efficient?



#### Protocols with multiple questions

- Primary vs secondary vs exploratory
- Ideal design options must be aligned with the numerous questions being asked
- Basket trial setting:
  - Does the drug work at all?
  - Does efficacy differ by disease site?



#### Example Design: Two-Stage Simon Design



- Allows for Early Stopping for Futility
  - RR 15% and 45%
  - 5% type I error; 80% power



#### Using the Traditional Design in Basket Trial





Implications

- There is no information sharing between baskets
- Ignores the commonality among the baskets (same mutation)
- Does it address the first question (does the drug work overall?)
- Higher chance it will declare the drug effective in at least one basket when the drug is truly ineffective; 40% when k=10, 5%)



#### **Aggregation Design**



Cunanan, Iasonos, Shen, Gonen, Begg; Stats Med 2017



#### How does the aggregation design work?

- **Specifications:** Investigators choose interesting and uninteresting response rates (15% and 45% in the previous example) as well as Type I error (5%) and power (80%)
  - Similar to the parallel design
- There are **8 tuning parameters** for the information sharing design
  - 5 decision nodes
  - 3 sample size
  - $\rightarrow$  Many possible designs meeting specifications
- We choose these parameters in such a way that the resulting design optimizes a utility function

Cunanan et al, 2017; 2018 (available code)



#### Efficiencies, Cunanan et al JCO 2017





#### In Conclusion what are the benefits?

- It is possible to **reduce the number of patients** needed for basket trials by sharing information across baskets
- Sample size reductions of ~10% 30% depending on the homogeneity of the treatment effect
- Price to pay: if the treatment works in only one basket information sharing requires ~5 %- 10% more patients
- Considering the general premise of targeted treatment this is a modest price to pay for the potential gains



#### **Discussion: are the error rates important?**

# **Specifying the True- and False-Positive Rates in Basket Trials** JCO Precision Oncology 2017

Kristen M. Cunanan Alexia Iasonos Ronglai Shen David M. Hyman Gregory J. Riely Mithat Gönen Colin B. Begg

- Is 40% False positive rate acceptable?
  - The extent to which information is borrowed is determined by the variability among response rates across baskets
- Which error rate is more important to minimize?
  - Taking an inactive drug forward or
  - Stopping an active drug?



#### **Metrics for Evaluating Designs**

- Familywise Error Rate (FWER): If the drug is inactive in all baskets (null case), what is the probability of incorrectly declaring activity in one or more of the inactive basket?
  - **o Active** The drug is active in none of the *K* baskets
- **Marginal power**: probability of correctly identifying an *individual* basket as active, when a true treatment effect exists.
- **Power:** Parameter space under the alternative hypothesis is multi-dimensional so the definition of power requires some thought
  - **1** Active The drug is active in one of the K baskets
  - **2 Active** The drug is active in one of the K baskets

- ...

- *K* Active The drug is active in one of the K baskets
- Operating Characteristics



#### World Medical Association Declaration of Helsinki

Ethical Principles for Medical Research Involving Human Subjects (JAMA 2013)

**22.** The design and **performance** of each research study involving human subjects must be **clearly described and justified** in a research protocol.

Table: <sup>1</sup>Marginal power (\*FWER); <sup>2</sup>expected trial size, N; <sup>3</sup>expected trial duration, T (months)

| Scenario | Proposed  |       |                | Reference |       |                | Sample Size |
|----------|-----------|-------|----------------|-----------|-------|----------------|-------------|
| (Truth)  | $Power^1$ | $N^2$ | T <sup>3</sup> | $Power^1$ | $N^2$ | T <sup>3</sup> | Reduction   |
| 0 Active | *5.2%     | 56    | 7              | *5.3%     | 58    | 10             | -           |
| 1 Active | 70%       | 75    | 10             | 79%       | 69    | 13             | -           |
| 2 Active | 81%       | 84    | 11             | 81%       | 83    | 15             | -           |
| 3 Active | 85%       | 89    | 11             | 80%       | 96    | 15             | 7%          |
| 4 Active | 88%       | 86    | 10             | 82%       | 108   | 16             | 20%         |
| 5 Active | 89%       | 76    | 8              | 82%       | 121   | 16             | 37%         |



#### Not all drugs are a success story

- What can we learn from a negative trial to inform future trials /hypotheses?
  - Phase I and Phase II, Cannistra JCO 2009, 2010
- Do we have enough and reliable data (rigorous) to answer the questions:
  - Why did the drug/combination fail?
    - Wrong schedule /dose?
    - Did we choose the wrong patient population?
    - Is there efficacy in some subpopulation?
    - Was our historical control or estimate off?



#### The conventional scientific method



#### Tradeoff between drug access and rigor

Patients – drug access

Participate in early phase trials



Rigor - Scientific integrity

If the drug works If the drug does not work

- Scientifically valid regardless of the level of activity Not all drugs are a success story
- There is no uniformly efficient strategy
  - Performance depends on how many tumor types are sensitive to the drug
  - False positive and false negative rates need to be studied / reported



#### Amendments: scientific review - rigor

- Eligibility
- Scope of the study
- Design
- Adding/dropping arms (cohorts)
- Expanding cohorts (increase or modify sample size)
- Safety of efficacy or futility stopping rules
- Multiple looks (descriptive/hypotheses generating/ no testing)



- <u>iasonosa@mskcc.org</u>
- Software
  - <u>https://www.mskcc.org/departments/epidemiology-</u> <u>biostatistics/biostatistics/basket-trials</u>

1: Cunanan KM, Iasonos A, Shen R, Gönen M. Variance prior specification for a basket trial design using Bayesian hierarchical modeling. Clin Trials. 2019 Apr;16(2):142-153. doi: 10.1177/1740774518812779. Epub 2018 Dec 7. PubMed PMID: 30526008.

2: Cunanan KM, Iasonos A, Shen R, Begg CB, Gönen M. An efficient basket trial design. Stat Med. 2017 May 10;36(10):1568-1579. doi: 10.1002/sim.7227. Epub 2017 Jan 18. PubMed PMID: 28098411; PubMed Central PMCID: PMC5380524.

3: Cunanan KM, Gonen M, Shen R, Hyman DM, Riely GJ, Begg CB, Iasonos A. Basket Trials in Oncology: A Trade-Off Between Complexity and Efficiency. J Clin Oncol. 2017 Jan 20;35(3):271-273. doi: 10.1200/JCO.2016.69.9751. Epub 2016 Nov 28. Review. PubMed PMID: 27893325; PubMed Central PMCID: PMC5559900.

4. Kristen M. Cunanan, Alexia Iasonos, Ronglai Shen, David M. Hyman, Gregory J. Riely, Mithat Gönen, and Colin B. Begg <u>Specifying</u> the True- and False-Positive Rates in Basket Trials. JCO Precision Oncology 2017:1, 1-5



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