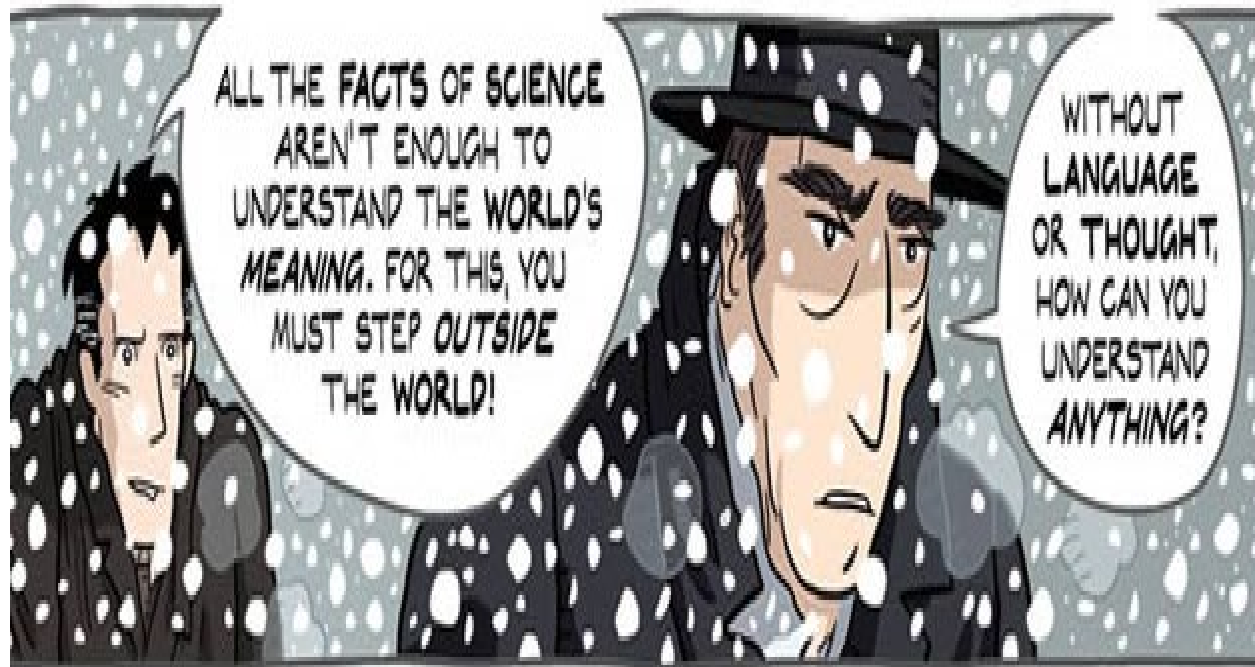


Adaptive Trial Designs

Ross Upshur

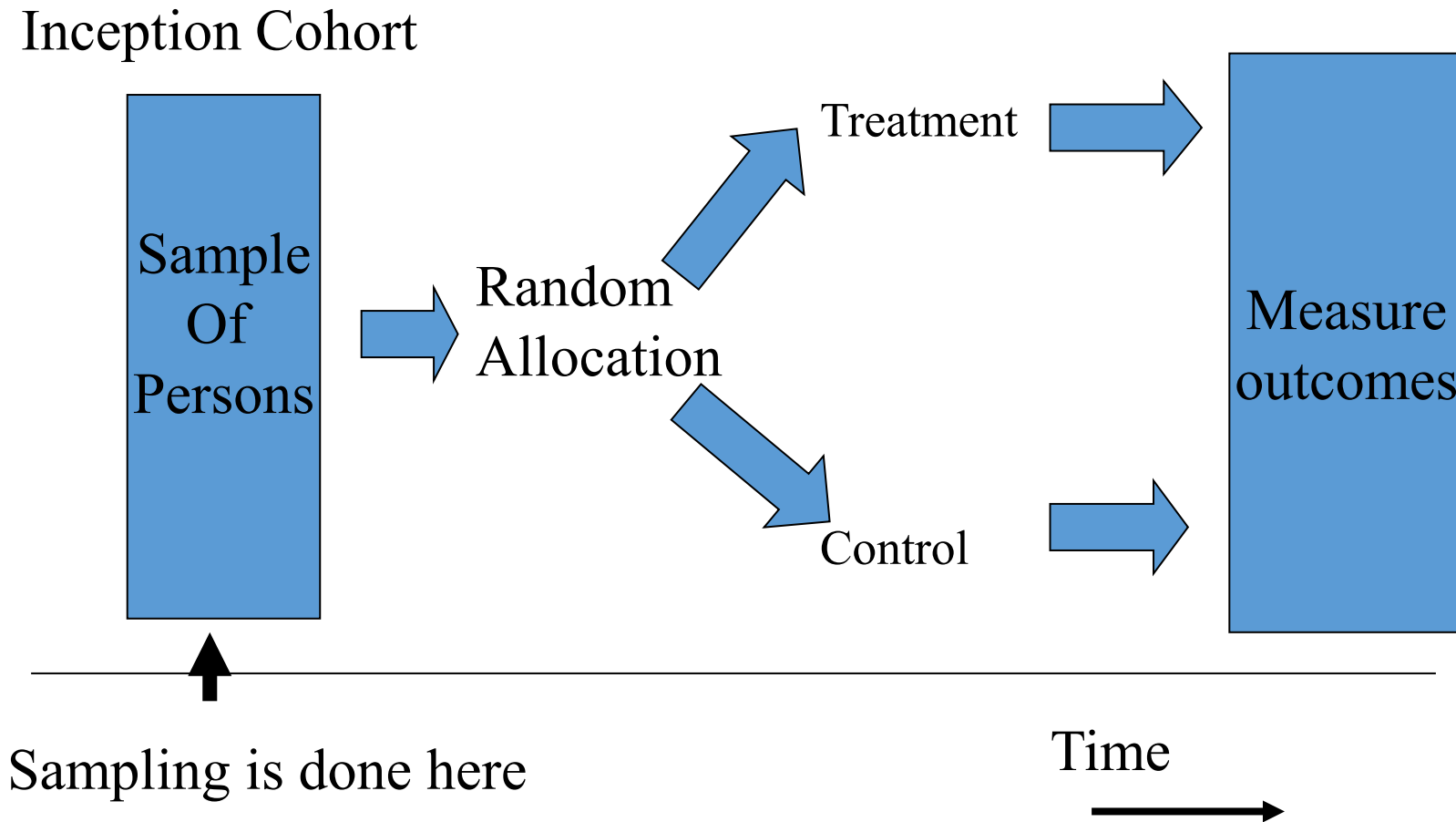


Truth

- The truth cannot be told so as to be understood but not believed.

William Blake

Randomized Control Trial



Adaptive Designs for Clinical Studies

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graph TD; A[Adaptive Designs for Clinical Studies] --> B[Model-based/Continual Assessment Designs]; A --> C[Group Sequential/Sample-Size Re-Estimation Designs]; A --> D[Group Sequential/Response Adaptive Designs]; A --> E[Adaptive Randomization Designs]; B --> B1[Used in dose finding to assign patients to more informative doses]; C --> C1[Allow increases in sample size after interim analysis]; D --> D1[Increase possibility of success by allocating more patients to successful treatments, select patient subgroups more responsive to treatment, drop non-efficacious doses, switch from superiority to non-inferiority or modify primary endpoint]; E --> E1[Modify randomization on the basis of prognostic factors to balance study groups];
```

Model-based/
Continual
Assessment
Designs

Used in dose finding
to assign patients to
more informative
doses

Group Sequential/
Sample-Size Re-
Estimation Designs

Allow increases in
sample size after
interim analysis

Group Sequential/
Response Adaptive
Designs

Increase possibility of
success by allocating more
patients to successful
treatments, select patient
subgroups more responsive
to treatment, drop non-
efficacious doses, switch
from superiority to non-
inferiority or modify
primary endpoint

Adaptive
Randomization
Designs

Modify
randomization on
the basis of
prognostic factors
to balance study
groups

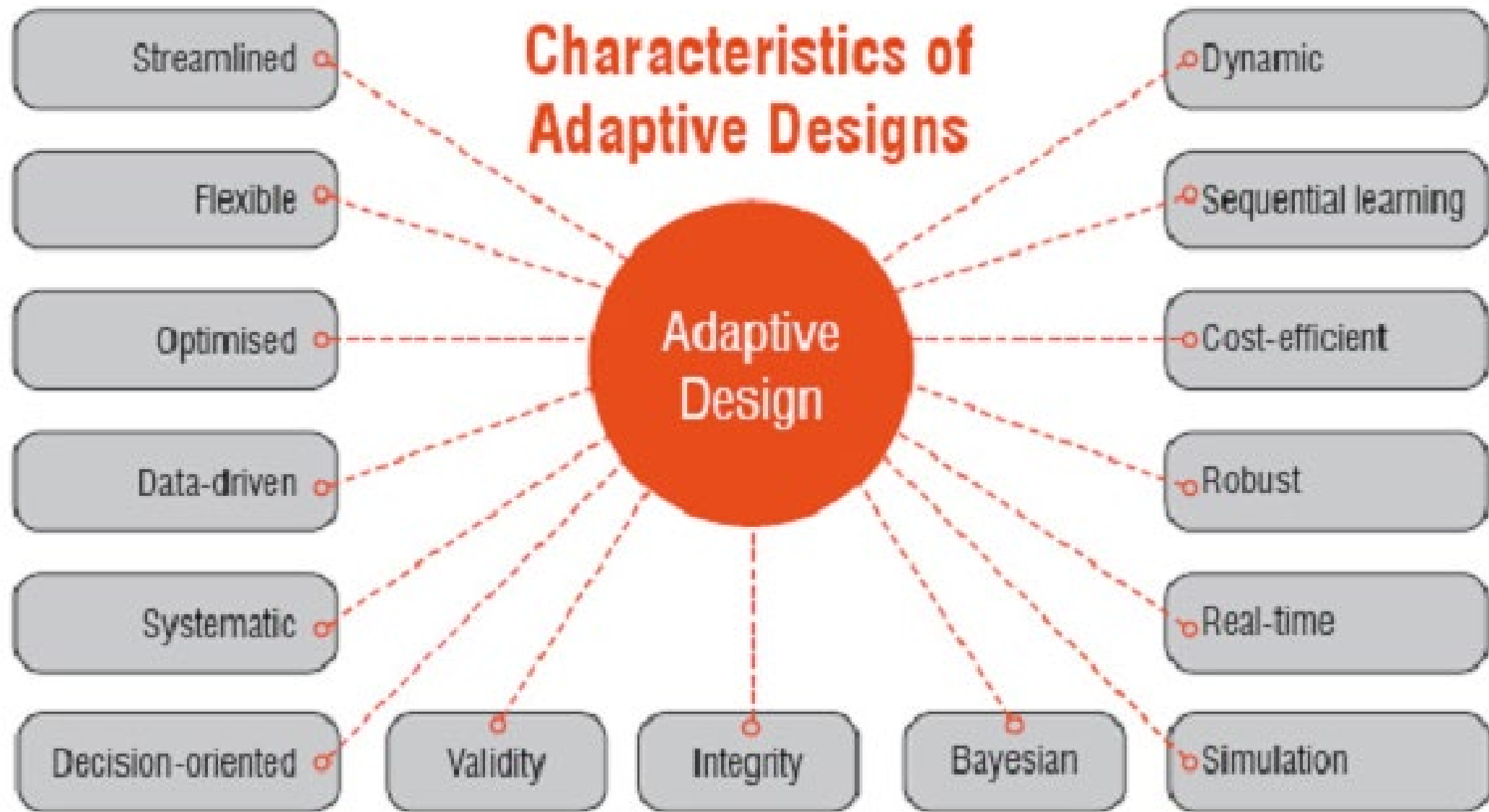
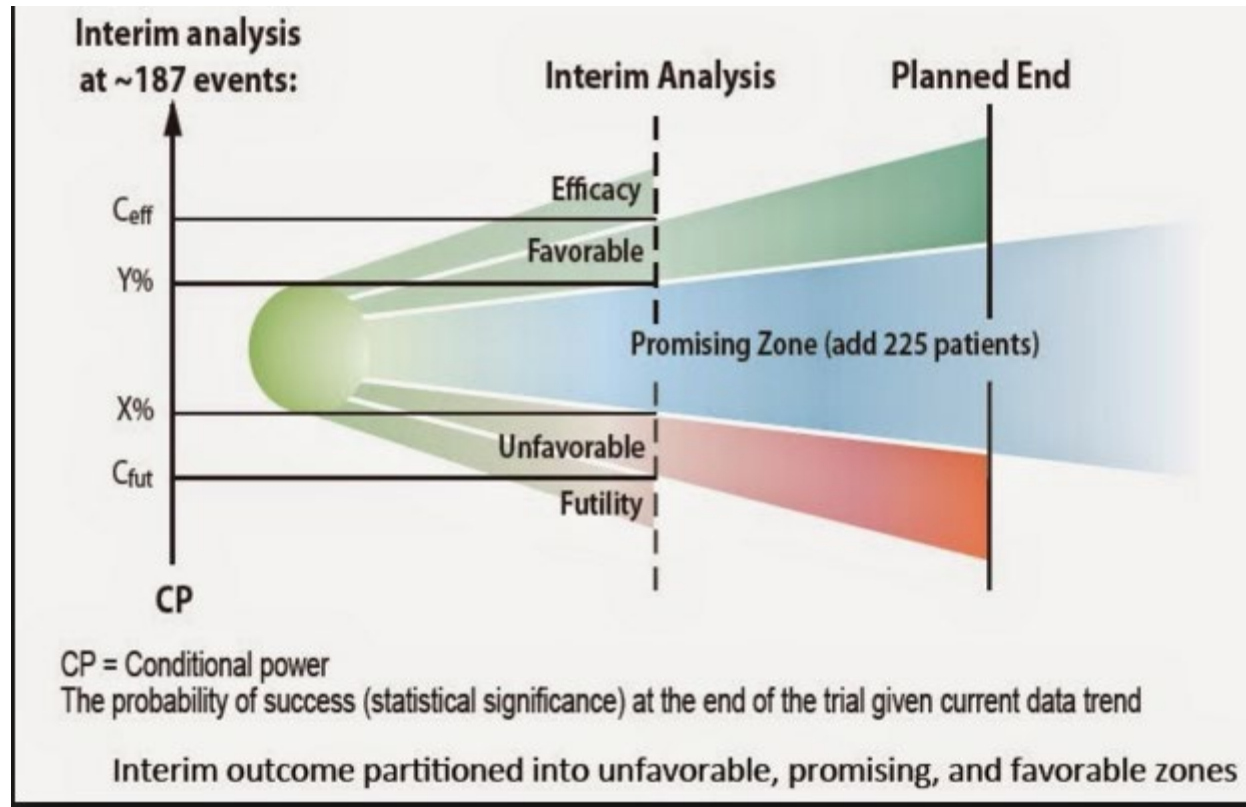


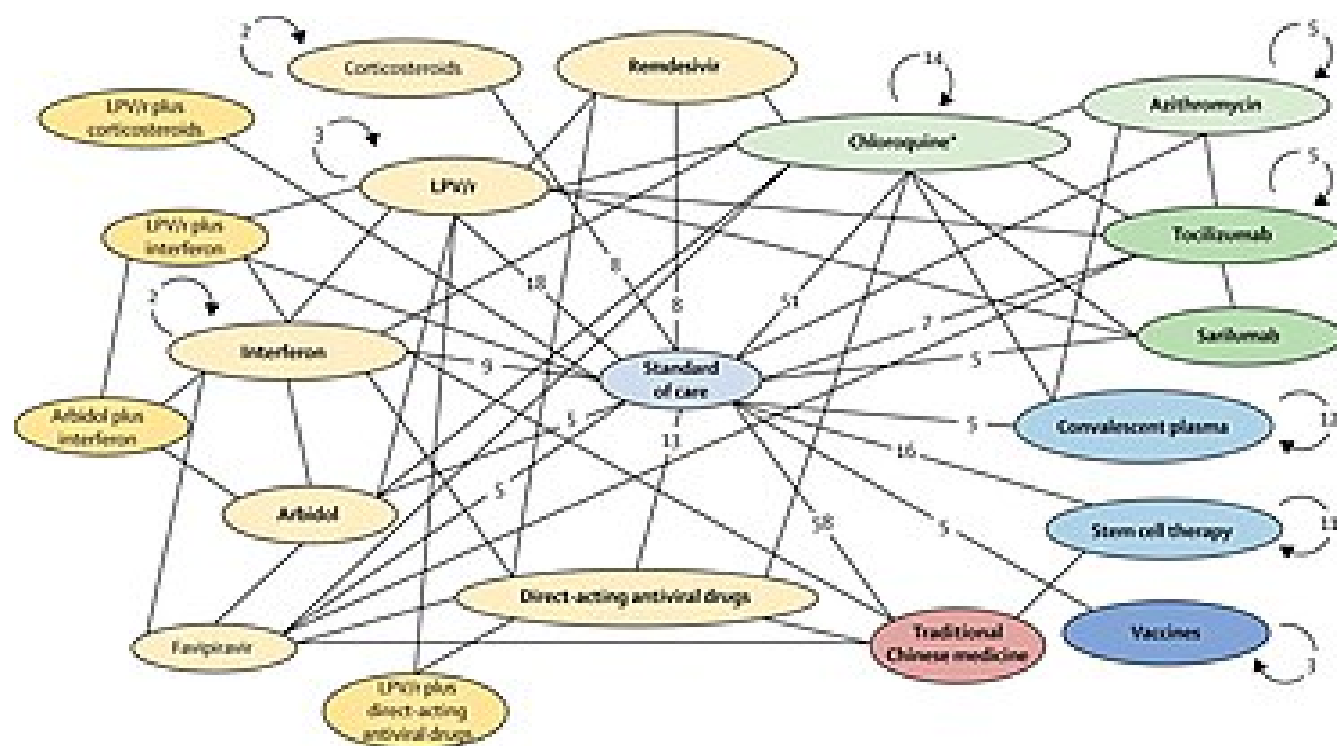
Figure 3

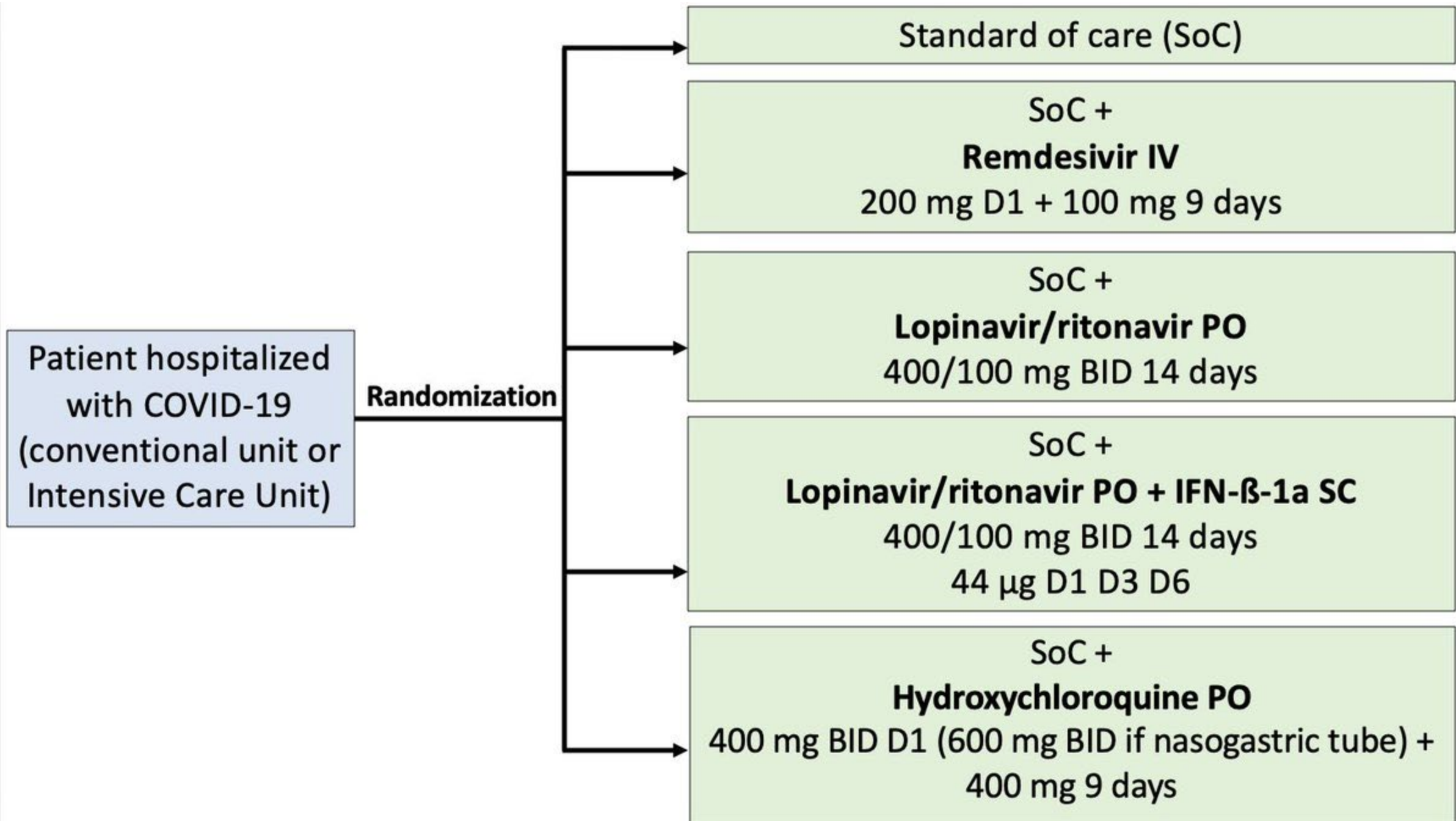
Table 2. Eight Common Types of Adaptations

- Stopping early (or late, i.e., extending accrual) with a conclusion of superiority or futility
- Adaptively assigning doses to more efficiently assess the dose-outcome relationship
- Adding or dropping arms or doses
- Seamless phases of drug development within a single trial
- Changing the proportion of patients randomized to each arm
- Adaptively identifying in on an indication or responder population
- Changing accrual rate

Used with permission from Berry D., Nat Rev Clin Oncol 2012; 9: 199-207.







| Component | Traditional | Flexible |
|------------------------|------------------------------|--------------------------|
| Interim Analyses | Limited (1 to 2) | Frequent |
| Randomization | Fixed (1:1, 2:1) | Variable |
| Number of Arms | Limited (2 to 3) | Few to Many |
| Use of Incomplete Data | Imputation at Final Analysis | Imputation at All Stages |
| Philosophy | Frequentist | Bayesian or Frequentist |
| Control of Error Rates | Via Theoretical Calculation | Via Extensive Simulation |

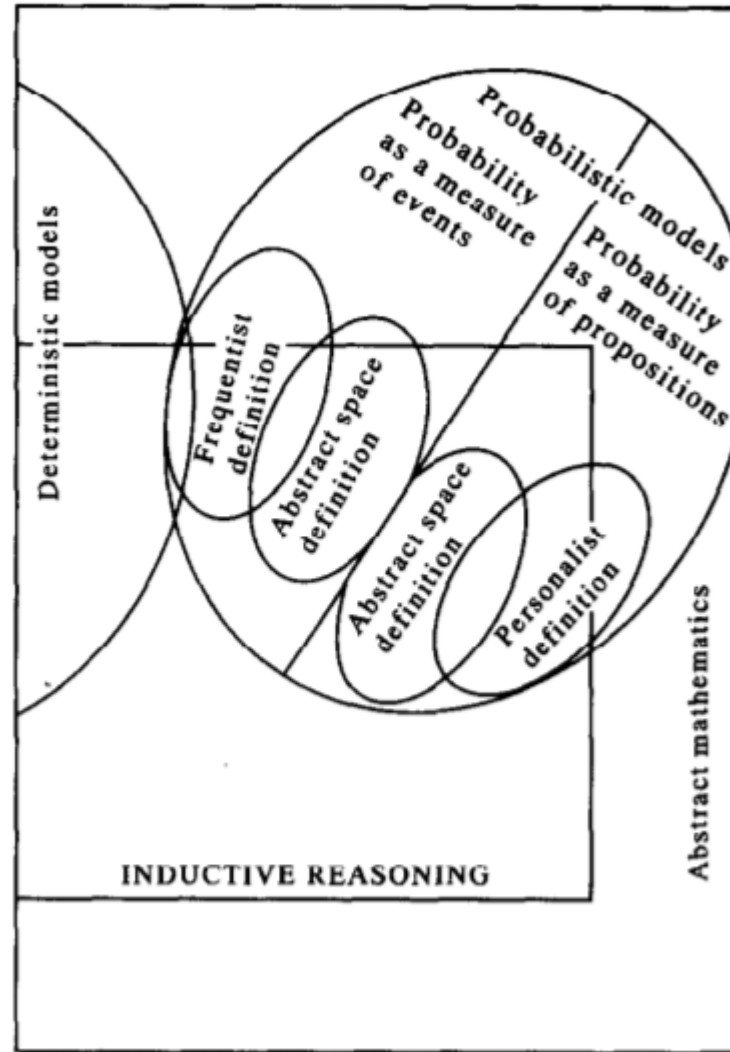


Fig. 2. Probabilistic models further refined.

Cartwright's Causal Criterion

- C causes E if and only if $P(E/C) +/ - \{F_1 + F_2 \dots F_N\} > P(E/-C) +/ - \{F_1 + F_2 \dots F_N\}$ where $F_1 \dots F_N$ are a complete set of covariates
- An idealized model that sets out precise *ceteris paribus* conditions

