Study Design and Analysis in Late-Stage Cancer Immunotherapy Trials

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Disclosure

 Employment: currently employed by Bristol-Myers Squibb as Head of Global Biometric Sciences in Medical and Market Access

 The views expressed in this presentation are personal based on my experience and do not necessarily reflect the views of Bristol-Myers Squibb

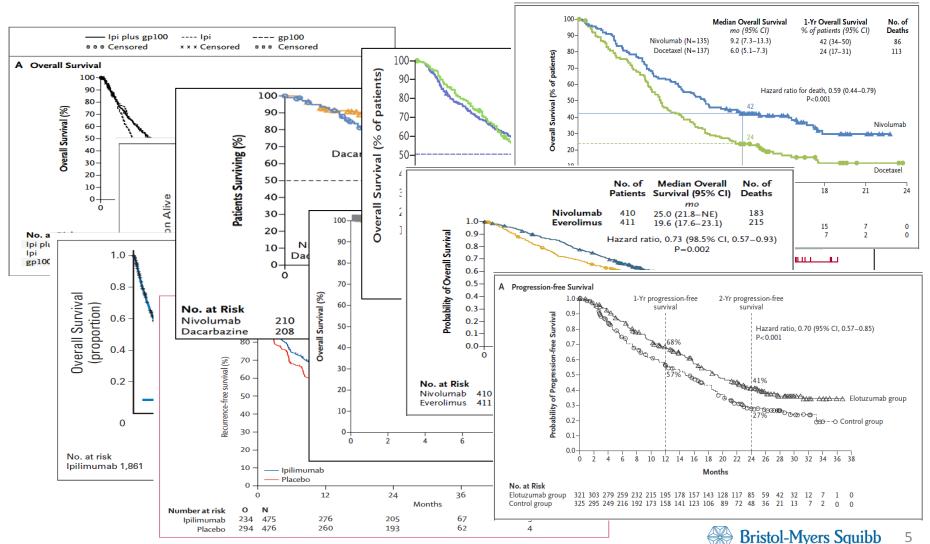
Outline

- Challenges in immuno-oncology
- Examples of efficacy outcomes in phase III randomized cancer immunotherapy trials
- Survival kinetics
- Impact caused by study design deviations
- Statistical consideration
 - Study Design
 - Statistical Analysis
- Concluding remarks

Challenges in Immuno-Oncology

- Biomarkers
- Sequence or combinations of immunotherapies
- Endpoints
- Subgroup
- Study Design
- Statistical Analysis
- Relative effectiveness

Examples from Phase III Cancer Immunotherapy Trials



Late-Stage Study Design (Time to Event as Primary Endpoint)

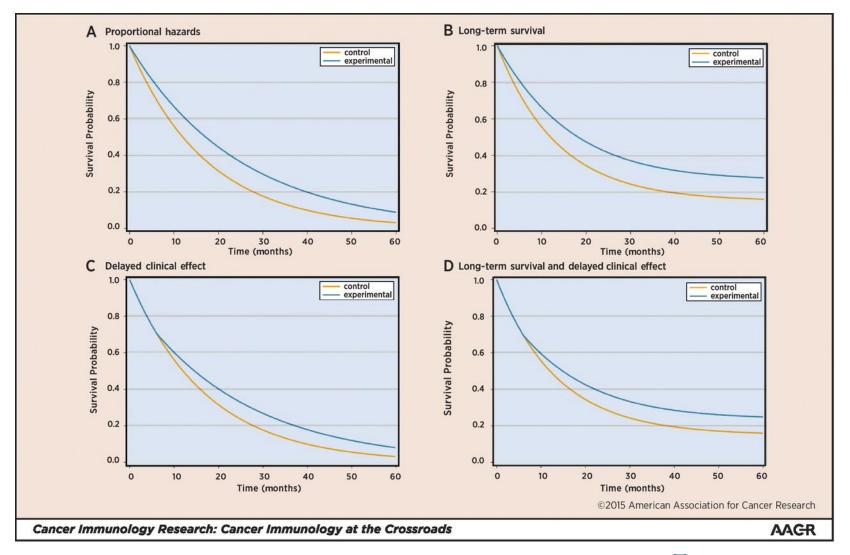
Conventional Late-Stage Study Design

- Exponential decay
- Proportional hazards
- Interim analysis with 50% events
- Event-driven
- Log-rank test

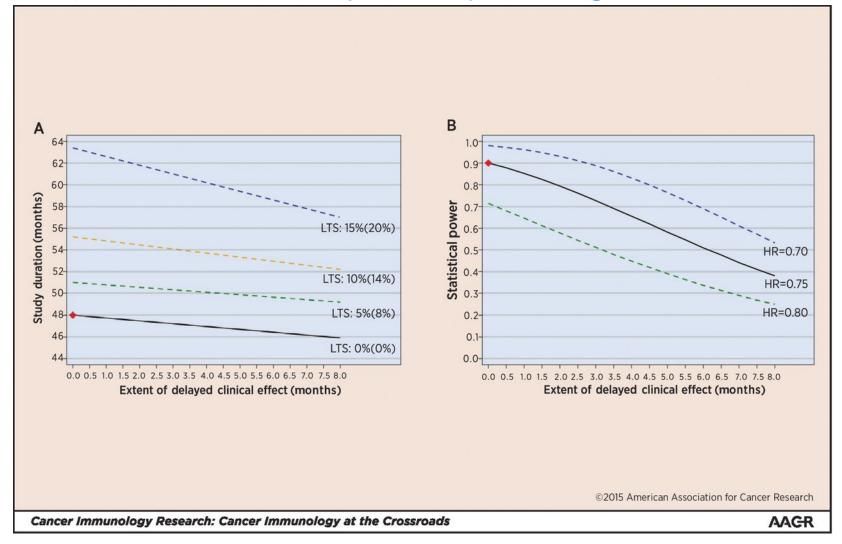
Customized Late-Stage Study Design

- Non-Exponential decay
- Nonproportional hazards
- Interim analysis with>50% events
- Time/event-driven
- Weighted log-rank test

Survival Kinetics



Impact Caused by Study Design Deviation



Interim Analysis Strategy and Management

- Necessity of interim analysis
 - Interim analysis vs. final analysis only
- Timing of interim analysis
 - Information fraction (% of target events reached)
 - Early vs. late
- Population included in the interim analysis
 - All patients vs. a subset of patients
- Type of interim analysis
 - Superiority vs. futility

Lessons Learned (Event-Driven vs. Time-Driven Design)

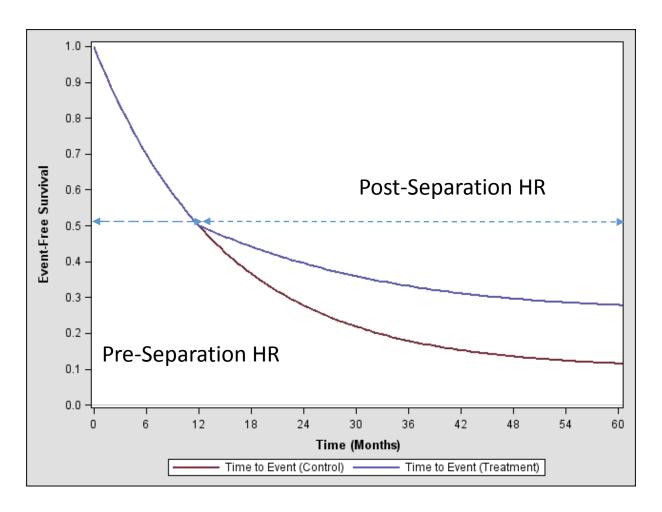
- Ipilimumab in front-line metastatic melanoma
 - Estimated study duration: 3 years
- 3 years after study start
 - ~85% of anticipated number of events
 - Decreasing event rate
 - ~84% statistical power
- Study continued for another 1.5~2 years for the remaining 15% of number of events
- Unblinding occurred with a couple events short of design



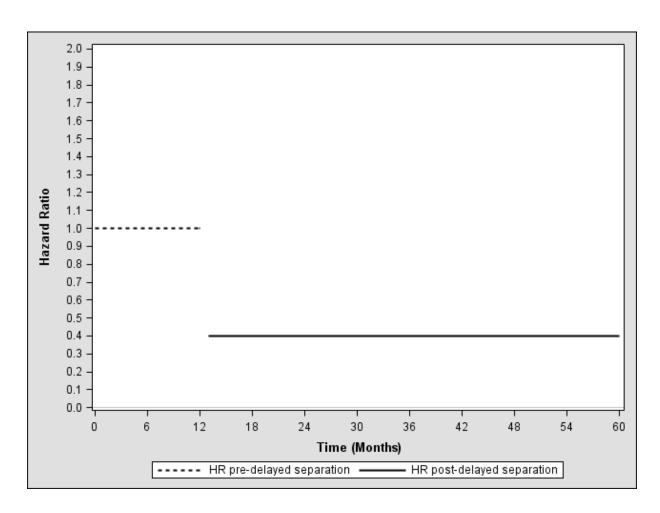
Weighted Log-Rank Test

- An alternative test procedure to be considered in study design
- WLR is more powerful than LR (log-rank) in the presence of delayed clinical effect
- Choice of weights depends on
 - Accumulated knowledge of class of therapy
 - Timing of delay
 - Thorough assessment via statistical simulations

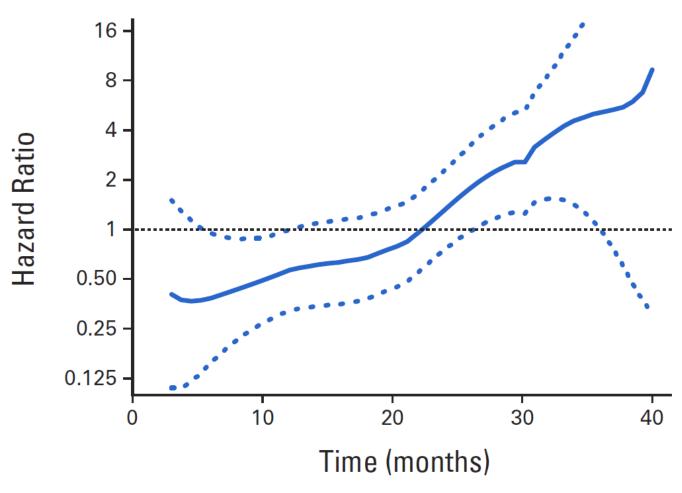
Hazard Ratio



Change in Hazard Ratio

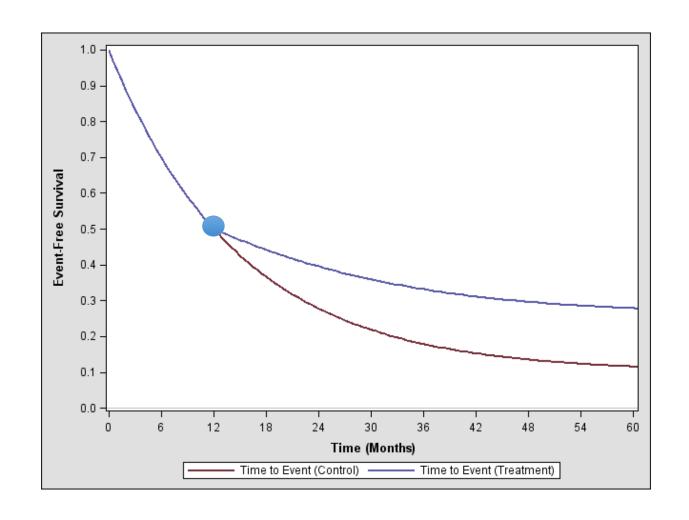


Change in Hazard Ratio (ECOG E4A03)

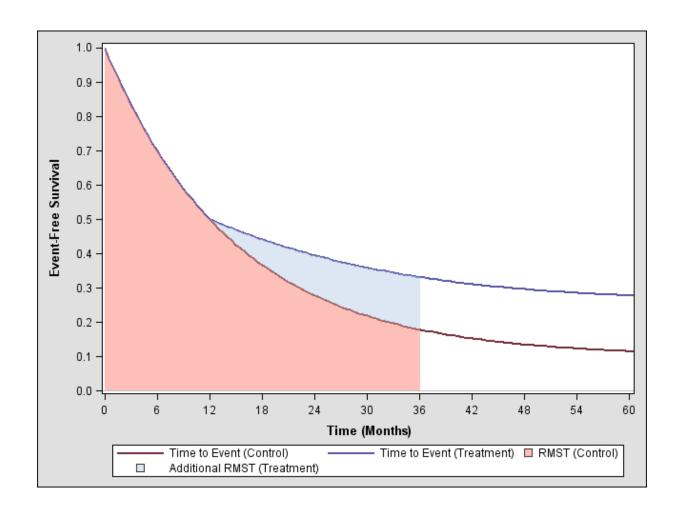




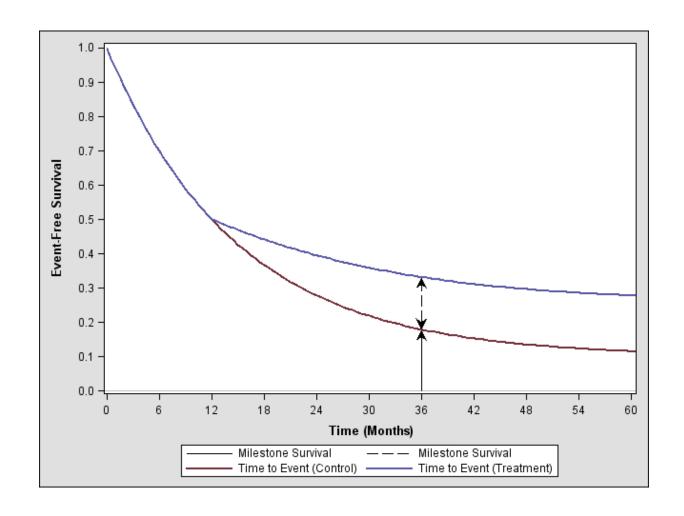
Median Survival Time



Restricted Mean Survival Time



Milestone Survival



Concluding Remarks

- Customized statistical approach needed in cancer immunotherapy research
- Unique survival kinetics, i.e., delayed effect and long-term survival need to be built into design and analysis
- Time-driven vs. Event-driven study design
- Weighted log-rank test is a viable alternative
- Median time may not be the optimal summary of treatment effect
- Other informative summary statistics: change in hazard ratio, milestone survival or restricted mean survival
- Designs using other endpoints possible, such as milestone survival or restricted mean survival time

Reference

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