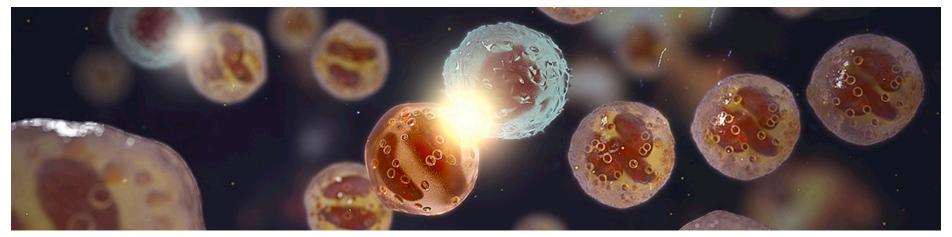


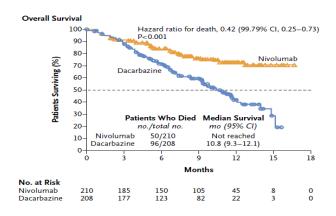
# Testing treatment effect when hazards are non-proportional

David Wright, PhD, Head Statistical Innovation, AZ 3<sup>rd</sup> EFSPI Workshop on Regulatory Statistics, Basel

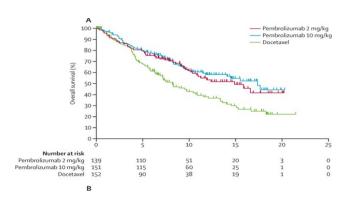
25 September 2018



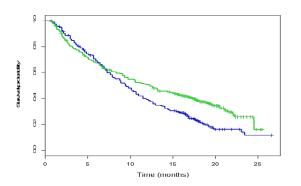
### Recent IO trials have brought the concept of NPH in the forefront....



#### **OS: Nivo in melanoma**

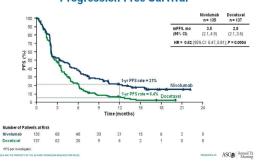


**OS: Pembro in NSCLC** 



#### **OS: Nivo in NSCLC**

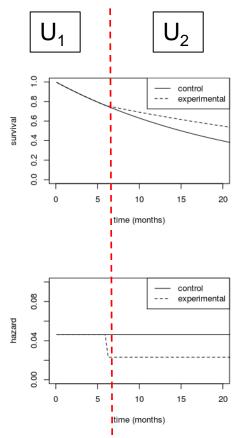
#### **Progression-Free Survival**





**PFS: Nivo in NSCLC** 

## Log rank test



$$U_1 = \sum_{t_i < 6} O_{Ci} - EC_i$$

$$U_2 = \sum_{t_i > 6} O_{Ci} - EC_i$$

The log-rank statistic,  $U = U_1 + U_2$ , may have very low power because  $E(U_1) \approx 0$ .

Since we expect  $E(U_2) > 0$ , there has been interest in using a weighted log-rank statistic, e.g.,

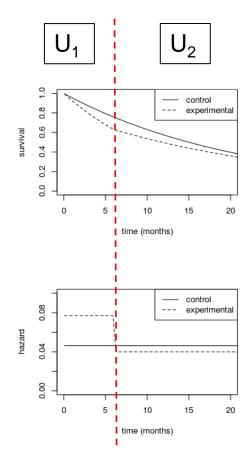
$$U_W = 0 \times U_1 + 1 \times U_2,$$

and claim a significant positive result when e.g.,

$$U_W/se(U_W) > 1.96.$$



## Weighted log-rank test



The problem is that we can find situations where  $E(U_2) > 0$ , yet survival on the experimental arm is worse at all time points.

In this case  $pr(U_W/se(U_W) > 1.96)$  may far exceed 2.5%.

We have proposed a "modestly weighted logrank test" that avoids this problem but still manages to improve power over the standard log-rank test in delayed effect scenarios.

Magirr, D., & Burman, C. F. (2018). Modestly Weighted Logrank Tests. *arXiv:1807.11097*.



## **Discussion points**

Which null hypothesis should we consider:  $S_E(t) = S_C(t)$  or  $S_E(t) \le S_C(t)$ ?

Should hypothesis testing and estimation match up, or is it acceptable to use different approaches?

