## Horse Racing, Kelly Betting, and Unintuitive Bets

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- Imagine you are betting on a horse race with, say, 3 horses. Robin will be one of the horses
- The *odds* are the prices for betting on each horse, set by the casino
- Decimal odds:  $\alpha_{Robin} = 3$  means bet \$1 to profit \$2

- *EV* = expected profit (value) of your bet
- Let  $p_{Robin} = 0.3 =$  true probability that Robin wins
- Let  $\alpha_{\textit{Robin}} = 3 =$  decimal odds that Robin wins
- $EV = p\alpha 1$  because

$$\begin{aligned} \mathsf{EV} &= p \cdot (\text{profit if win bet}) + (1-p) \cdot (\text{loss if lose bet}) = \\ &= p(\alpha-1) + (1-p)(-1) \\ &= p\alpha-1 \end{aligned}$$

•  $EV_{Robin} = -0.1$ , sad!

• Does there exist a scenario in which you would make a Negative EV bet?

• Does there exist a scenario in which you would make a Negative EV bet *in the long run*?

## **Money Function**

- Suppose we bet on the same horse race for *N* consecutive horse races.
- *n* horses
- Decimal odds (α<sub>1</sub>,..., α<sub>n</sub>)
- True win probabilities  $(p_1, ..., p_n)$
- Fraction of your money  $(x_1, ..., x_n)$  bet on each horse
- Fraction of your money b not bet
- Horse index  $h \in \{1, ..., n\}$
- Race index  $r \in \{1, ..., N\}$
- $W_{rh} = 1$  if horse *h* Wins race *r*, else 0.  $W_{rh} \sim \text{Bernoulli}(p_h)$
- $V_N$  = capital after N races, starting with \$1

$$\boxed{V_N = \prod_{r,h} \left[ b + x_h \alpha_h \right]^{W_{rh}}}$$

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- Want to choose  $(b, x_1, ..., x_n)$  to maximize  $\mathbb{E}V_N$
- *Problem*: Maximizing the expectation of a product of random variables is difficult

$$V_N = \prod_{r,h} \left[ b + x_h \alpha_h \right]^{W_{rh}}$$

- Idea: take the log
- $\log \mathbb{E}V_N$  doesn't help
- Kelly: Instead, maximize  $\mathbb{E} \log V_N$
- Jensen:  $\log \mathbb{E}V_N \ge \mathbb{E}\log V_N$
- Sometimes,  $\log \mathbb{E}V_N > \mathbb{E}\log V_N$

$$\begin{aligned} & \operatorname{argmax}_{(b,x_1,\dots,x_n)} \mathbb{E} \log V_N \\ &= \operatorname{argmax}_{(b,x_1,\dots,x_n)} \mathbb{E} \sum_{r,h} W_{rh} \log(b + x_h \alpha_h) \\ & \text{subject to} \quad b + \sum_h x_h = 1 \end{aligned}$$

• Doable!

- ...Lagrange multipliers / KKT conditions...
- Yields a formula for (x<sub>1</sub>, ..., x<sub>n</sub>), the fraction of your captial that you should bet on each horse!

- Permute indices so that p<sub>h</sub>α<sub>h</sub> > ... > p<sub>h+1</sub>α<sub>h+1</sub> (arrange the horses by decreasing order of EV)
- 2. The fraction of your capital that you don't bet, *b*, is the minimum positive value of

$$\frac{1-\sum_{h=1}^t p_h}{1-\sum_{h=1}^t \frac{1}{\alpha_h}}$$

for  $t \in \{1, ..., n\}$ 

3. Set

$$x_h = \max\{p_h - \frac{b}{\alpha_h}, 0\}$$

- Does there exist a scenario in which you would make a Negative EV bet *in the long run*?
- According to Kelly, yes

## Example of a Kelly-Optimal, Negative EV Bet

- 3 horses
- True win probabilities p = (.6, .3, .1)
- Decimal odds  $\alpha = (2, 3, 8)$
- Kelly says

$$\begin{cases} b = 0.6, \\ x_1 = 0.3, \\ x_2 = 0.1, \\ x_3 = 0 \end{cases}$$

 Bet 1/10<sup>th</sup> of our captial on horse 2 (Robin), which is a Negative EV bet:

$$EV_2 = p_2\alpha_2 - 1 = (.3)3 - 1 = -0.1$$

• Why?

• Because using the compound capital

$$V_N = \prod_{r,h} \left[ b + x_h \alpha_h \right]^{W_{rt}}$$

- You're compounding your money and don't want to go bankrupt
- If we instead maximize one race by itself, we would put all our money on the horse with the highest EV

- If the odds are fair  $\sum \frac{1}{\alpha_h} = 1$ 

then

$$x_h = p_h$$

• Our allocations don't depend on the odds at all!

• Please help me get true win probabilities  $(p_1, ..., p_n)$