

# Statistics of Basketball Scoring and Lead Changes

in collaboration with Alan Gabel, Marina Kogan, Aaron Clauset

*2015 SIAM Conference on Applications of Dynamical Systems*

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dunk courtesy of Dr. J

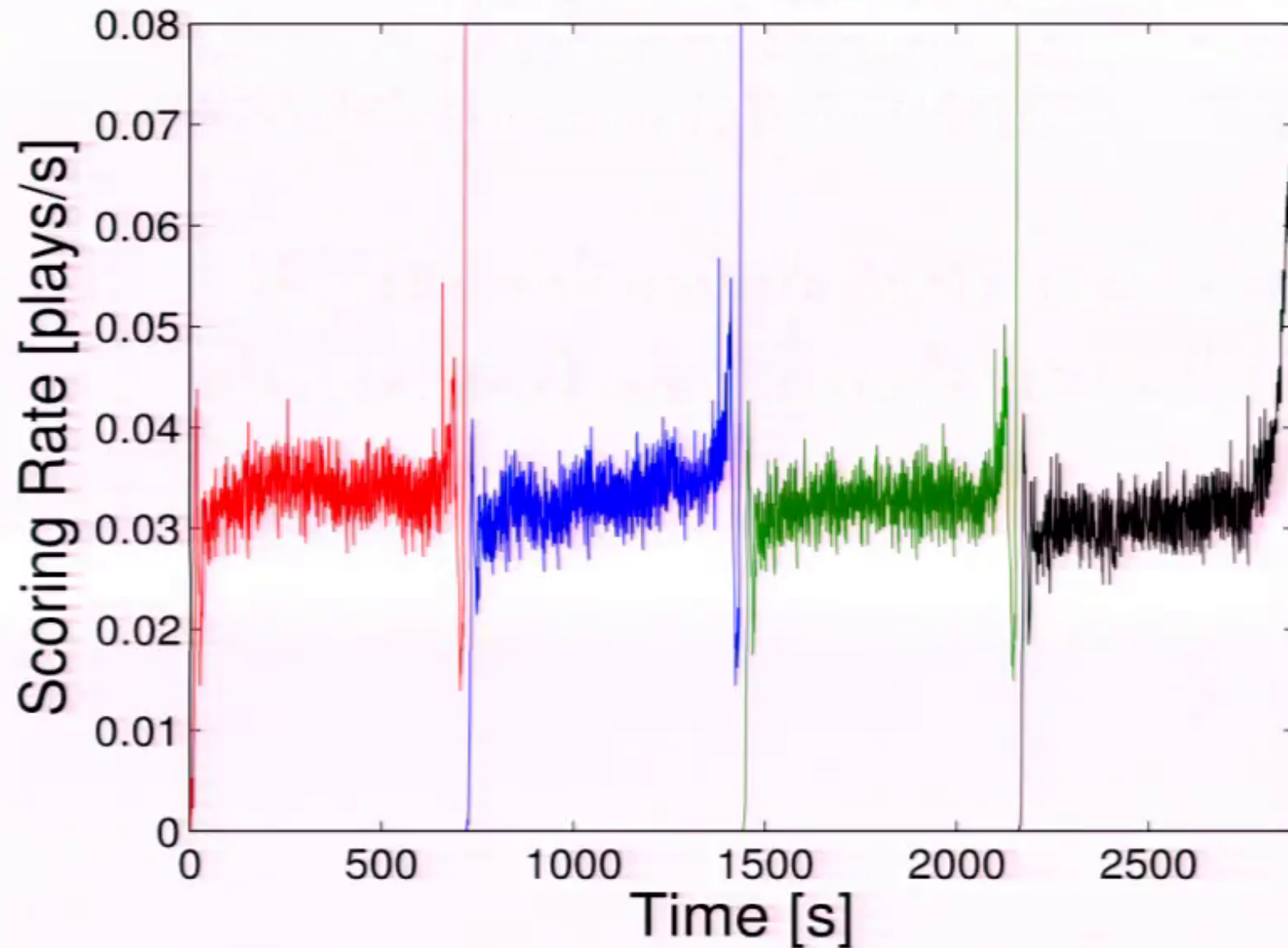
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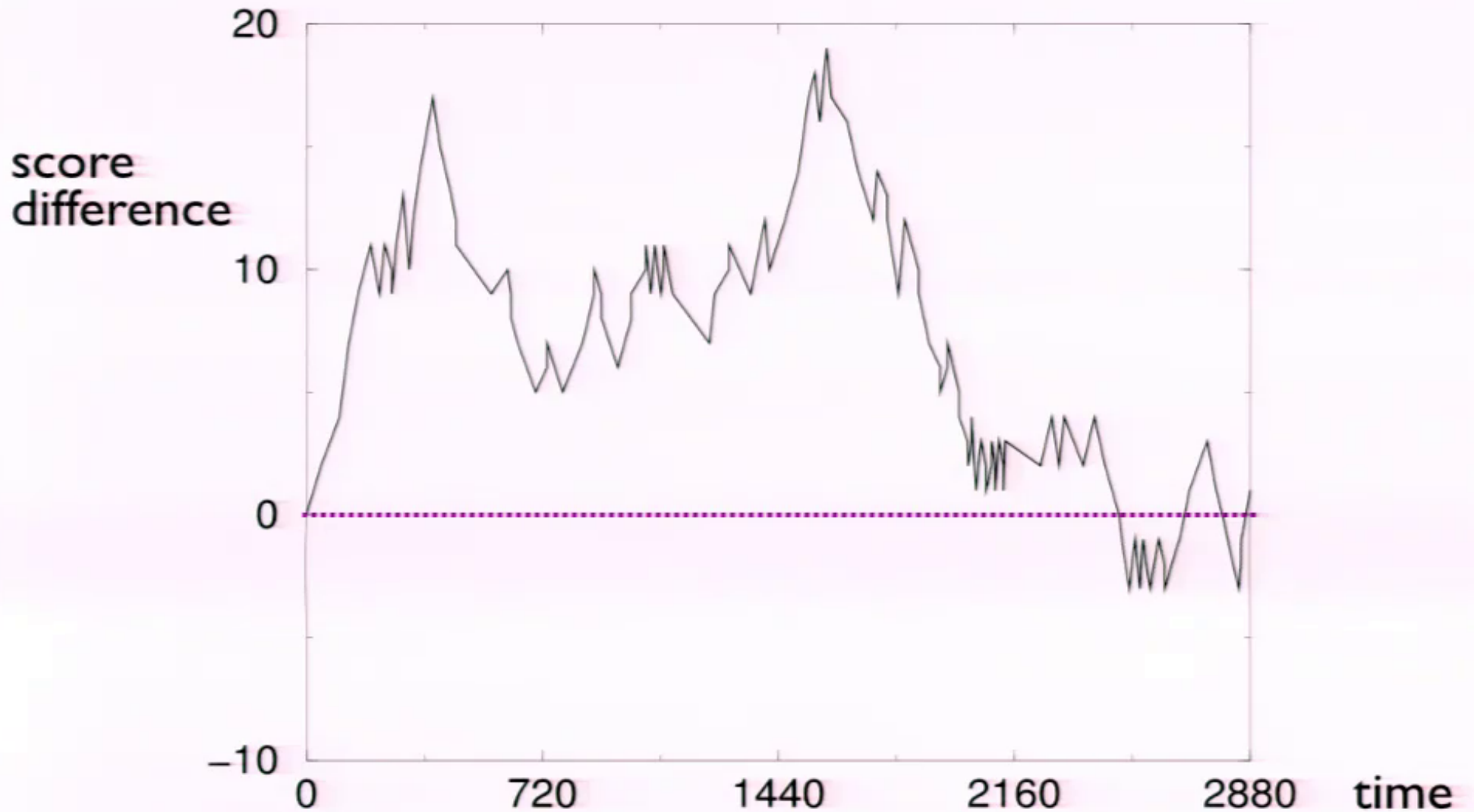
Can basketball scoring be  
described as a random walk?

## (Almost) Constant Scoring Rate

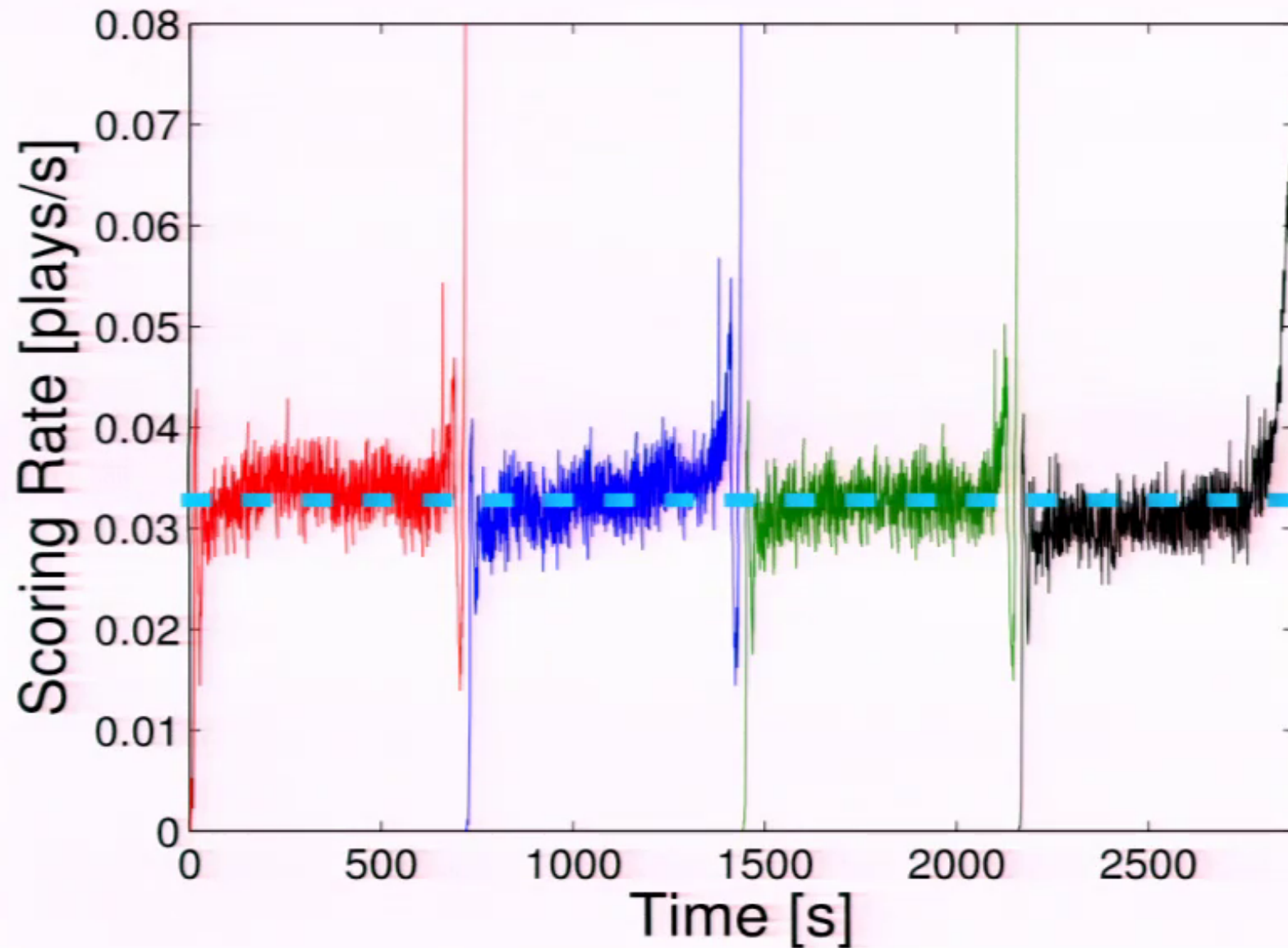


# Score Evolution in a Typical NBA Basketball Game

Chicago-Denver 11/26/2010

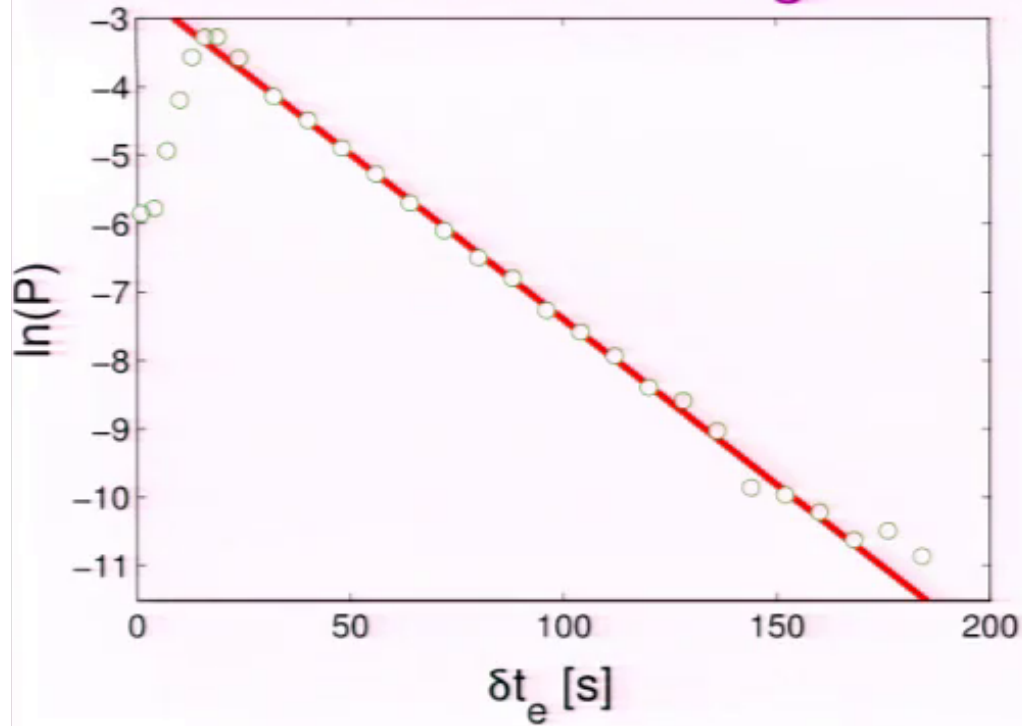


## (Almost) Constant Scoring Rate



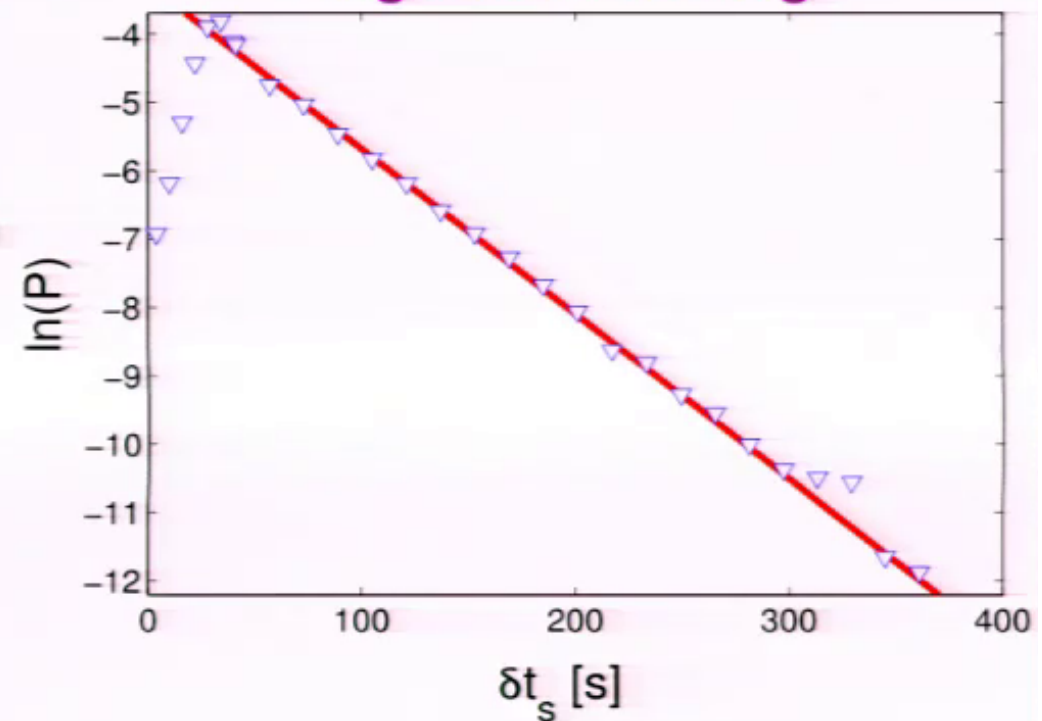
# Random Time Intervals Between Scores

either team scoring



$$P(\delta t) \sim e^{-\lambda \delta t}$$

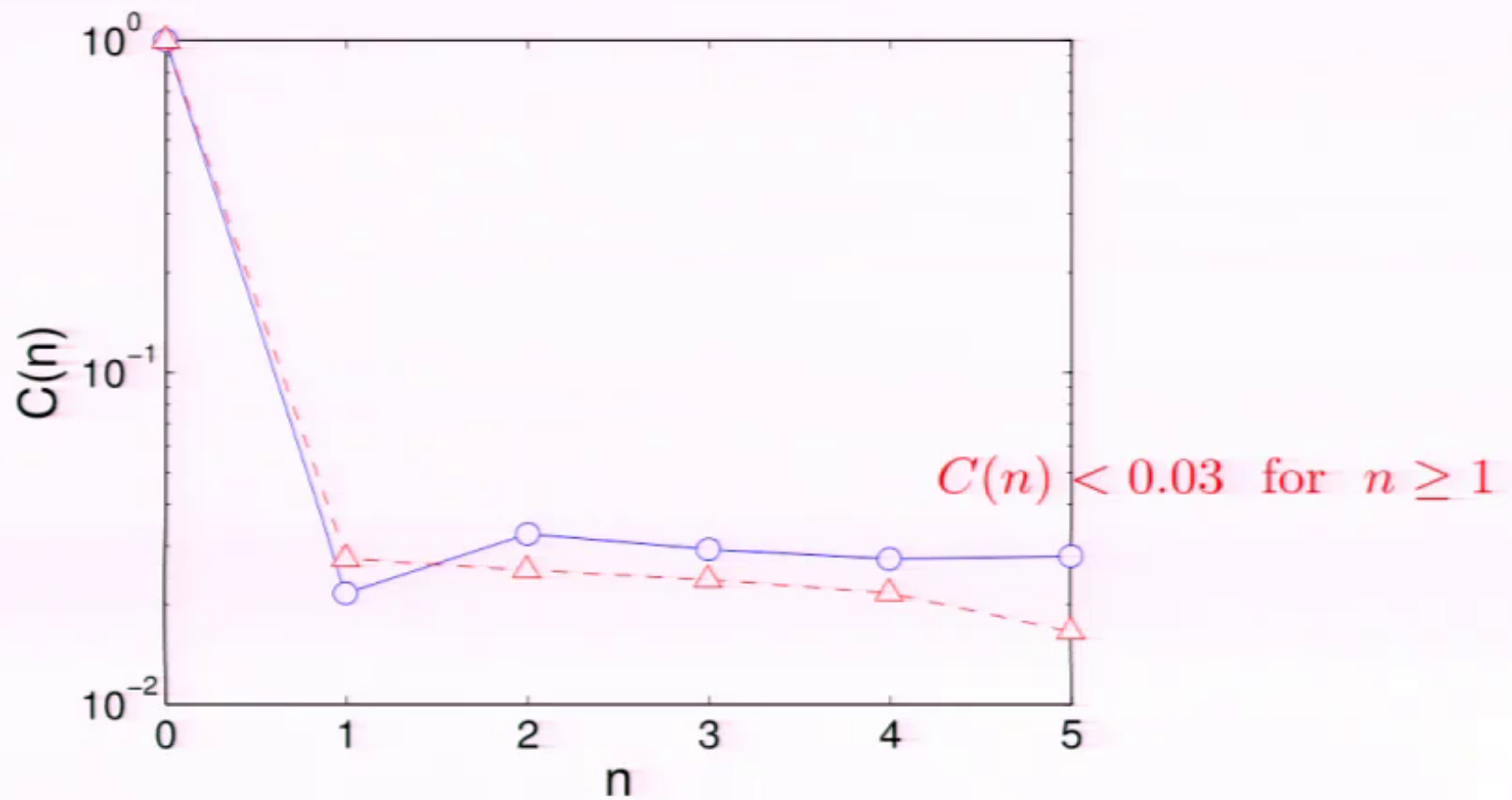
single team scoring



# No “Hot Hand” Gilovich, Vallone & Tversky (1985)

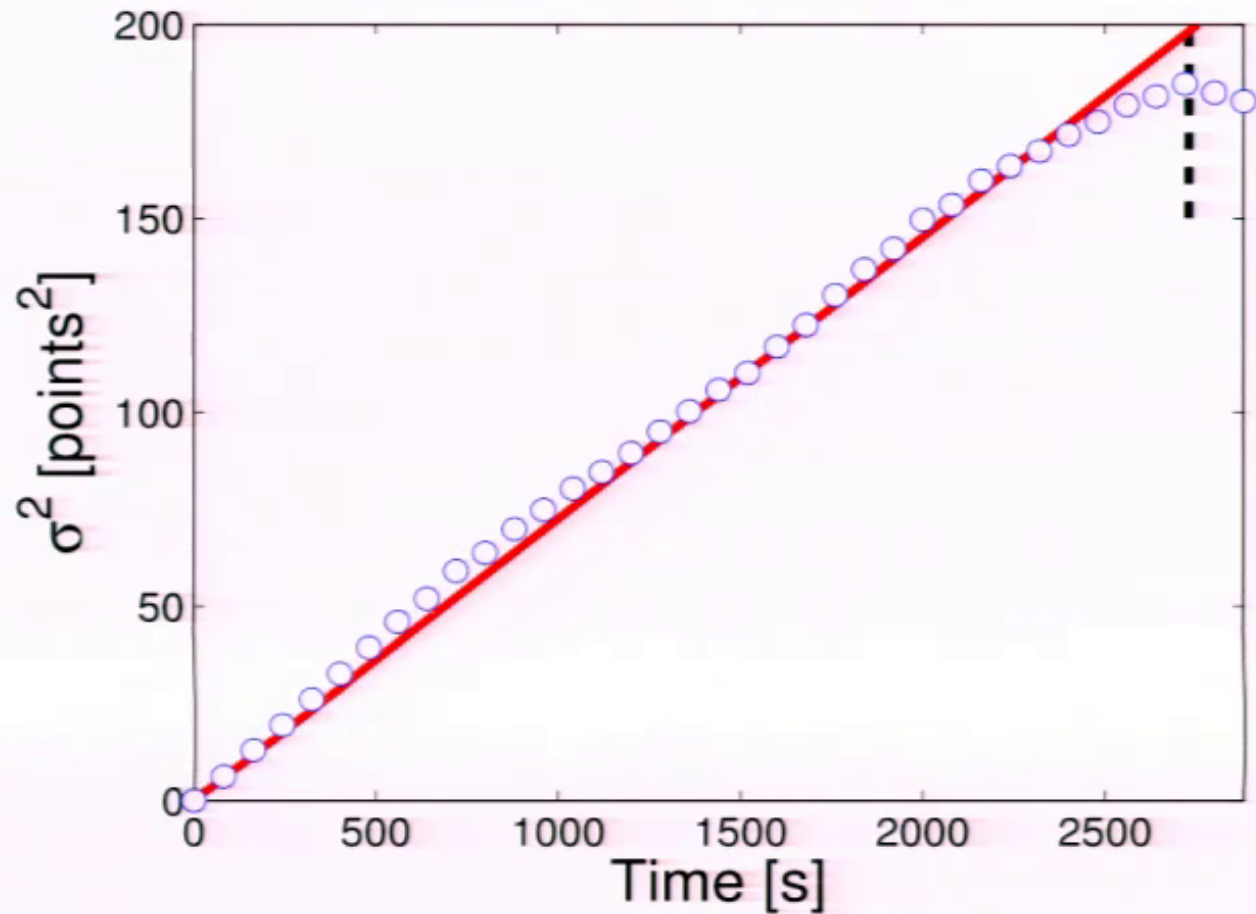
## Correlation Between Successive Scores

$$C(n) \equiv \frac{\sum_k (t_k - \langle t \rangle)(t_{k+n} - \langle t \rangle)}{\sum_k (t_k - \langle t \rangle)^2}$$





# Linear Growth in the Score Difference Variance



# Statistics of Lead Changes

- How many lead changes occur?
- How long does one team lead?
- When does the last lead change occur?
- When is a lead “safe”?

# Number of Lead Changes

evenly matched teams:  $m \sim \sqrt{N}$

$$\int^N dN' P(0, N') \sim \sqrt{N}$$

evenly matched teams;  
antipersistence  $p$ :  $m \sim \sqrt{N(1-p)/p}$

**Antipersistence:** After team A scores

team A scores next with probability  $p=0.35$

team B scores next with probability  $1-p=0.65$

# Distribution of Number of Lead Changes

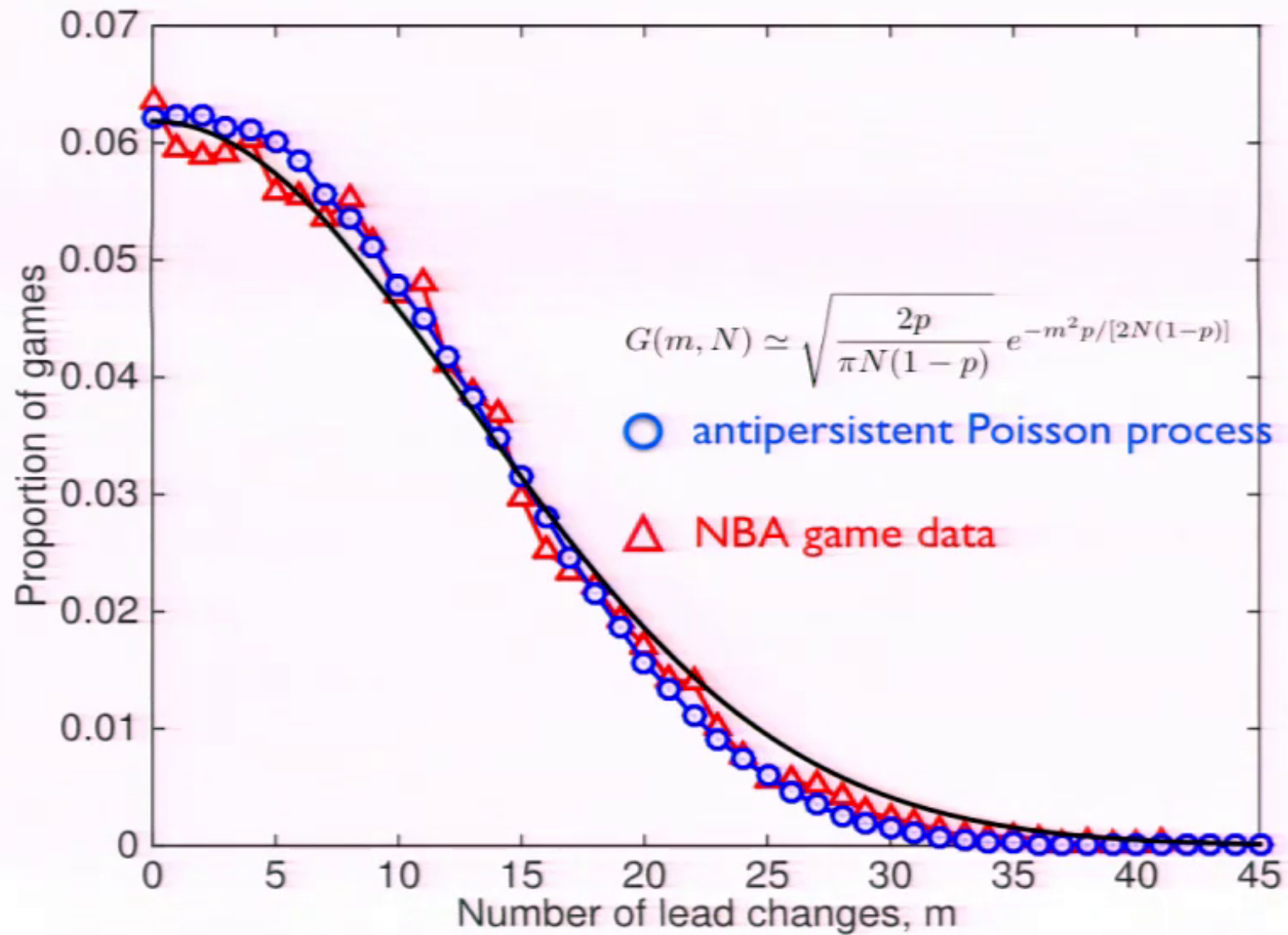
no antipersistence:

$$G(m, N) \simeq \sqrt{\frac{2}{\pi N}} e^{-m^2/2N}$$

with antipersistence:

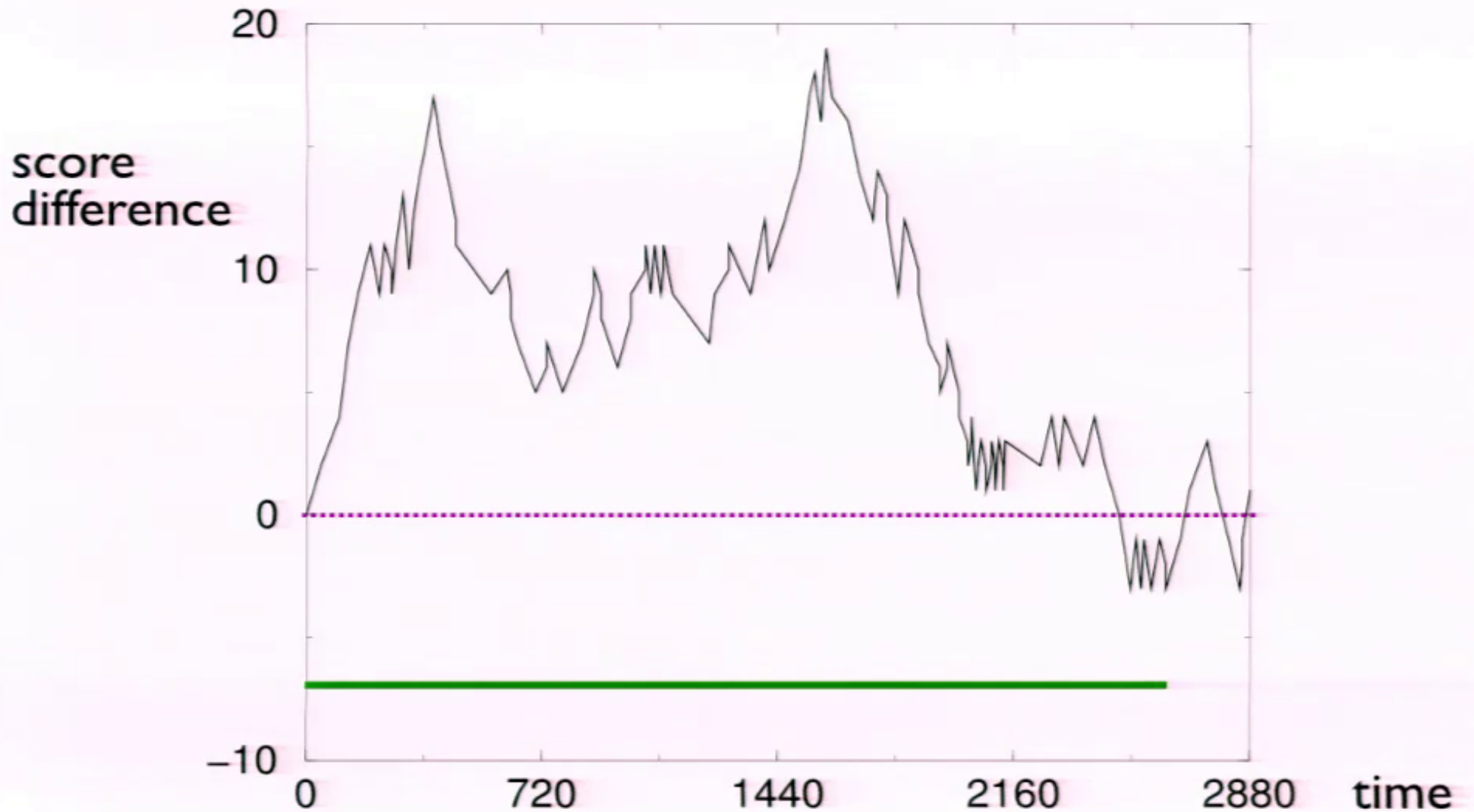
$$G(m, N) \simeq \sqrt{\frac{2p}{\pi N(1-p)}} e^{-m^2 p/[2N(1-p)]}$$

# Distribution of Number of Lead Changes

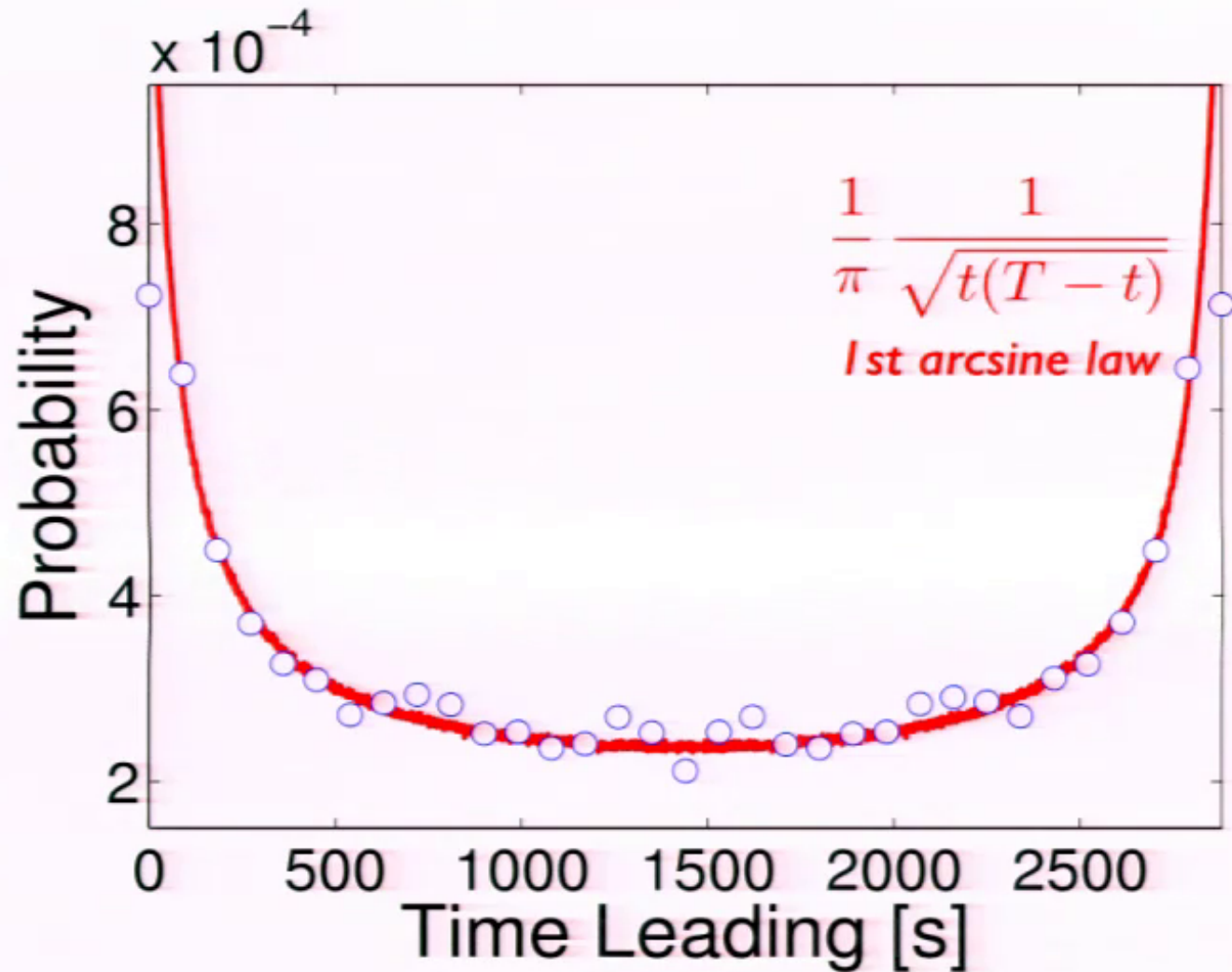


# How Long Does One Team Lead?

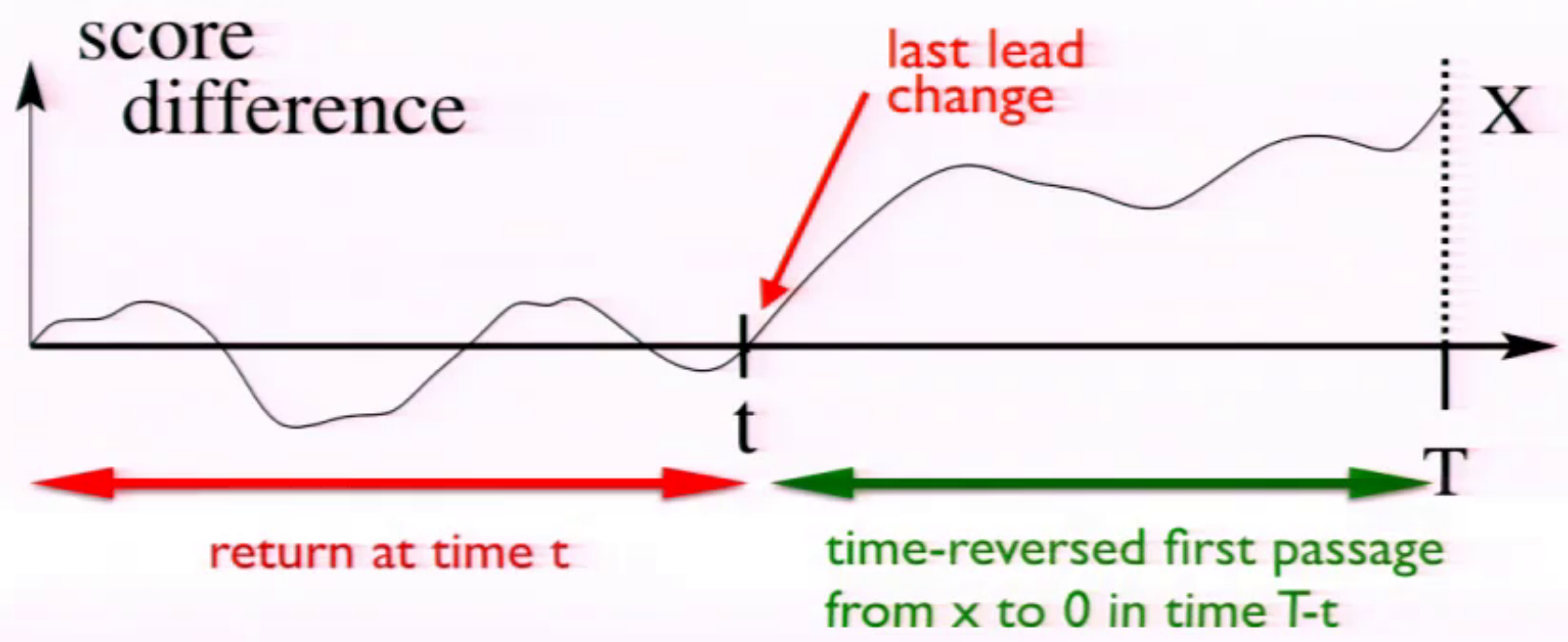
Chicago-Denver 11/26/2010



# How Long Does One Team Lead?



# When Does the Last Lead Change Occur?



$$\frac{1}{\sqrt{4\pi Dt}}$$

$$\frac{x}{\sqrt{4\pi D(T-t)^3}} e^{-x^2/[4D(T-t)]}$$

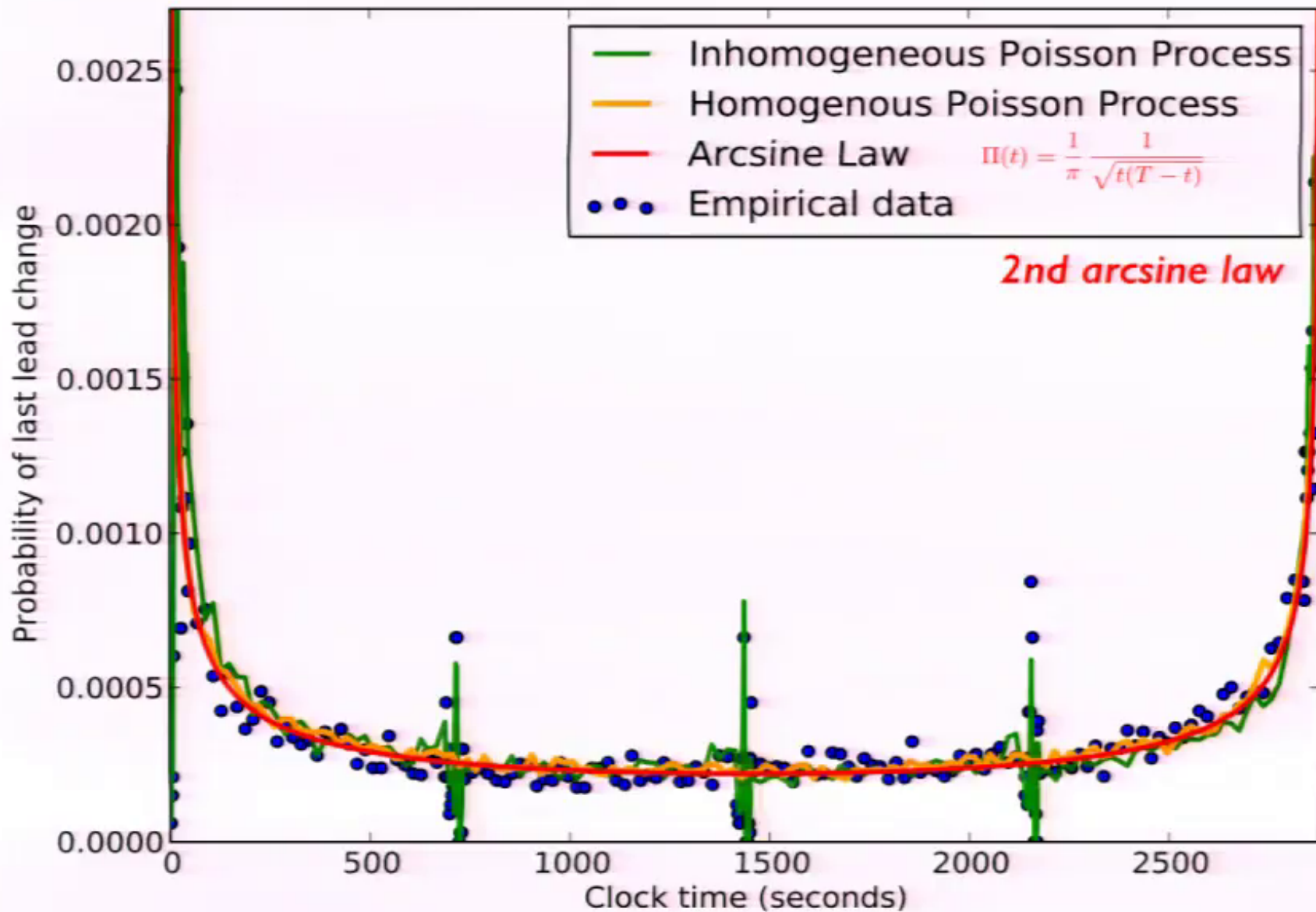


## When Does the Last Lead Change Occur?

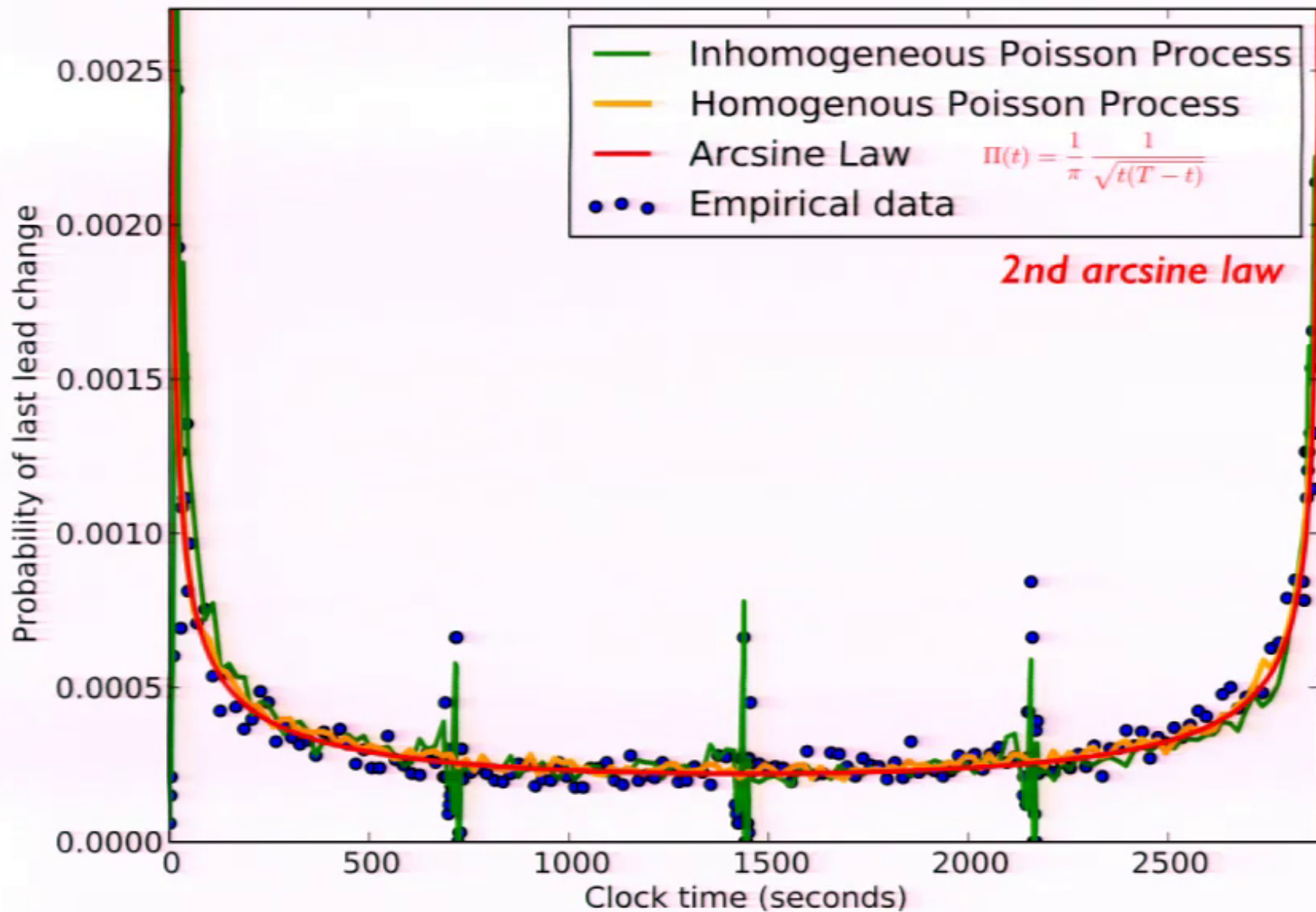
$\Pi(t)$  = Probability that last lead change occurs at time  $t$

$$\begin{aligned}\Pi(t) &= 2 \int_0^{\infty} dx P(x=0, t) F(x, T-t) \\ &= 2 \int_0^{\infty} \frac{dx}{\sqrt{4\pi Dt}} \frac{x}{\sqrt{4\pi D(T-t)^3}} e^{-x^2/[4D(T-t)]} \\ &= \frac{1}{\pi} \frac{1}{\sqrt{t(T-t)}}\end{aligned}$$

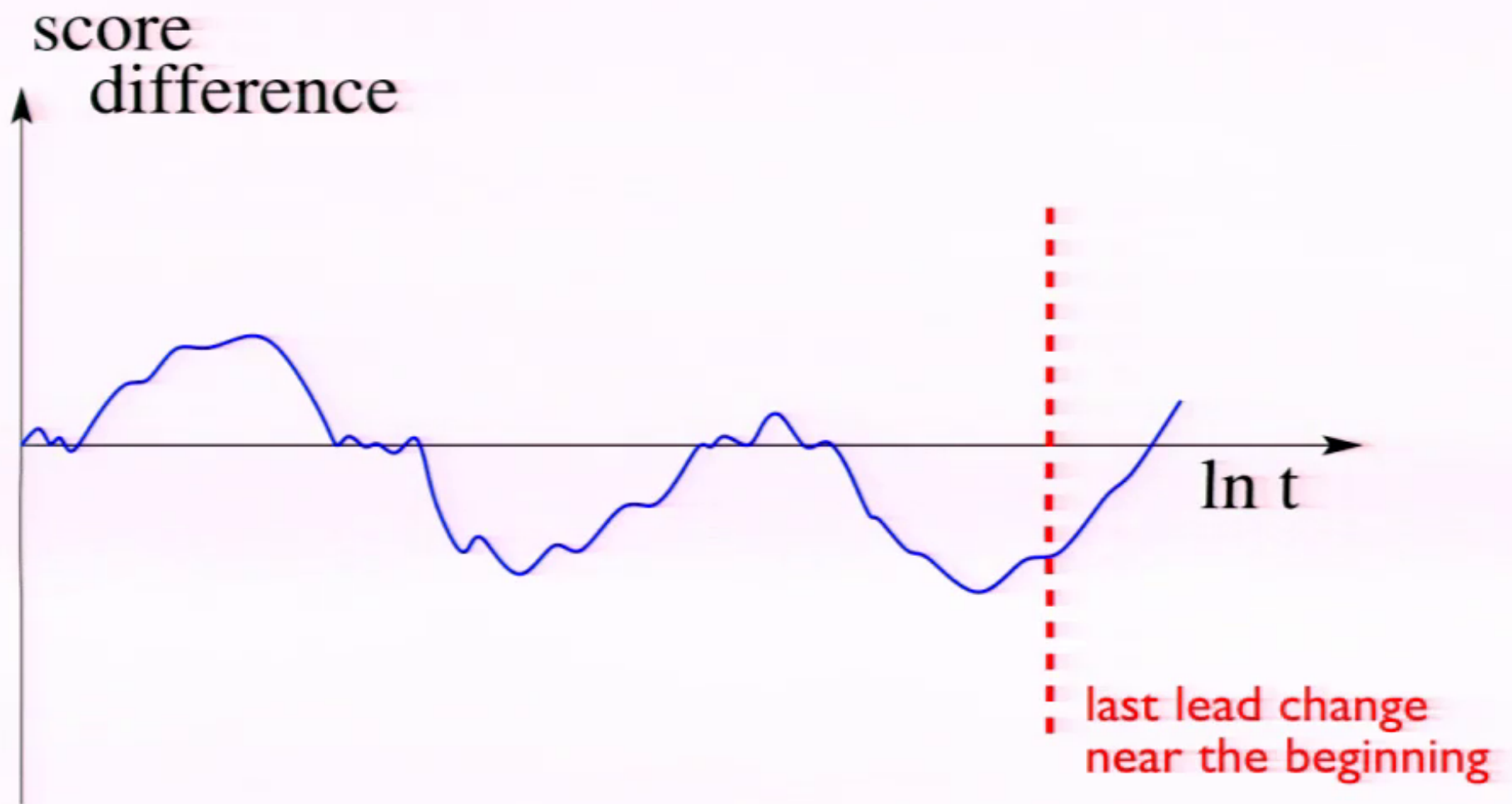
# Probability When Last Lead Occurs



# Probability When Last Lead Occurs

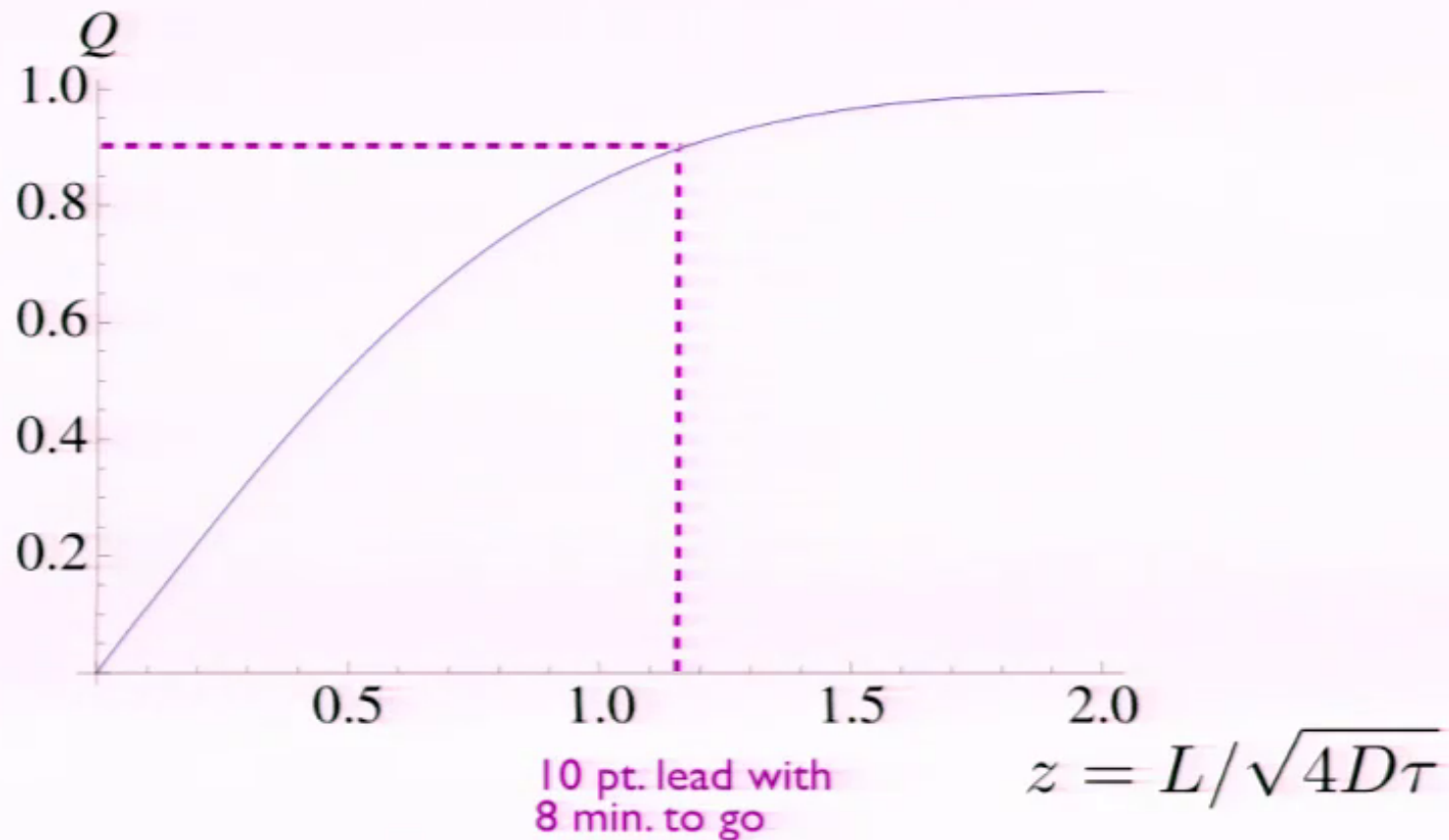


Why?

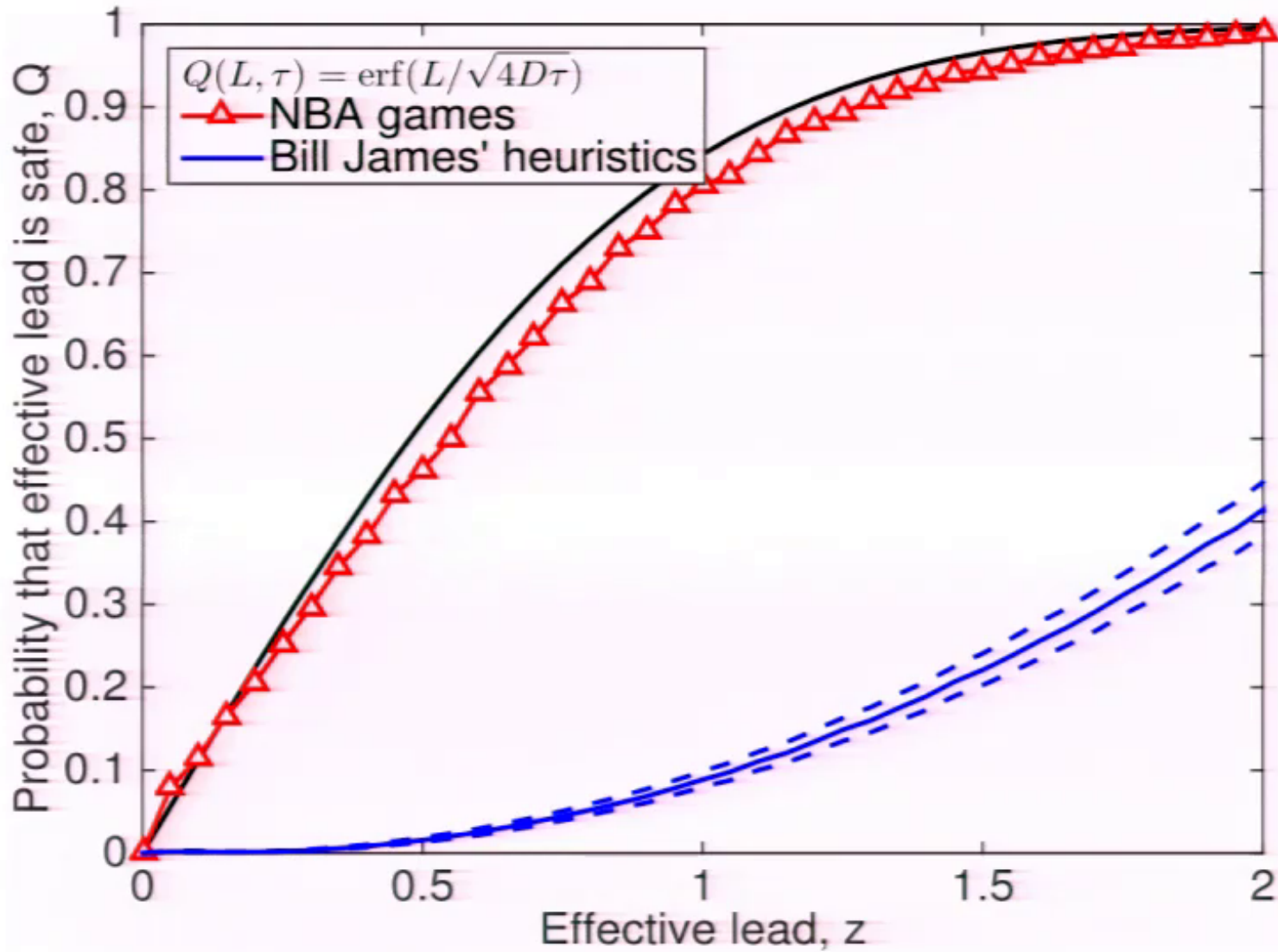


# When Is a Lead Safe?

$$Q(L, \tau) = \text{erf}(L/\sqrt{4D\tau})$$



# When Is a Lead Safe?



Bill James  
Inventor of *Sabermetrics*

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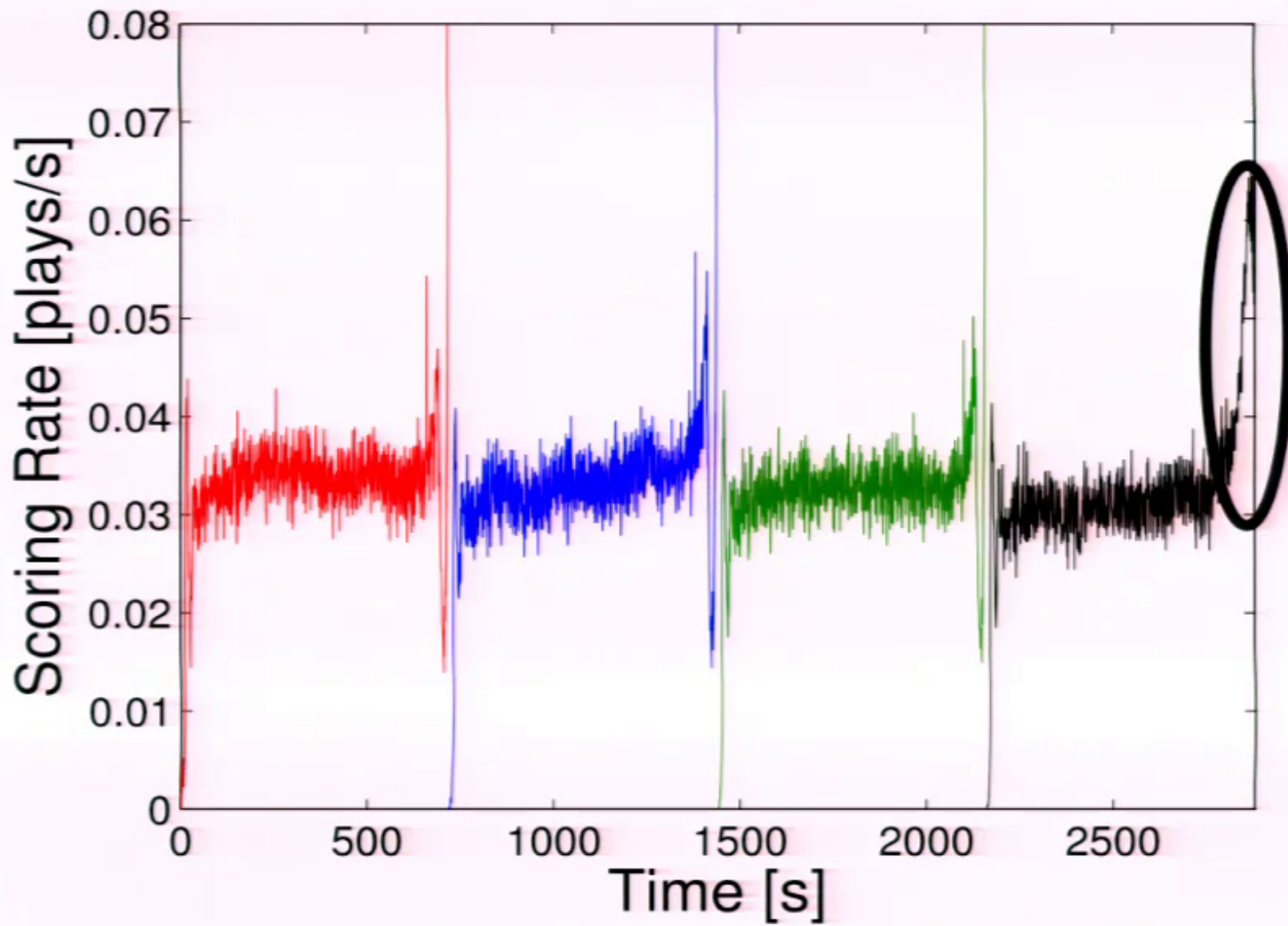
Can basketball scoring be  
described as a random walk?

**Yes!**

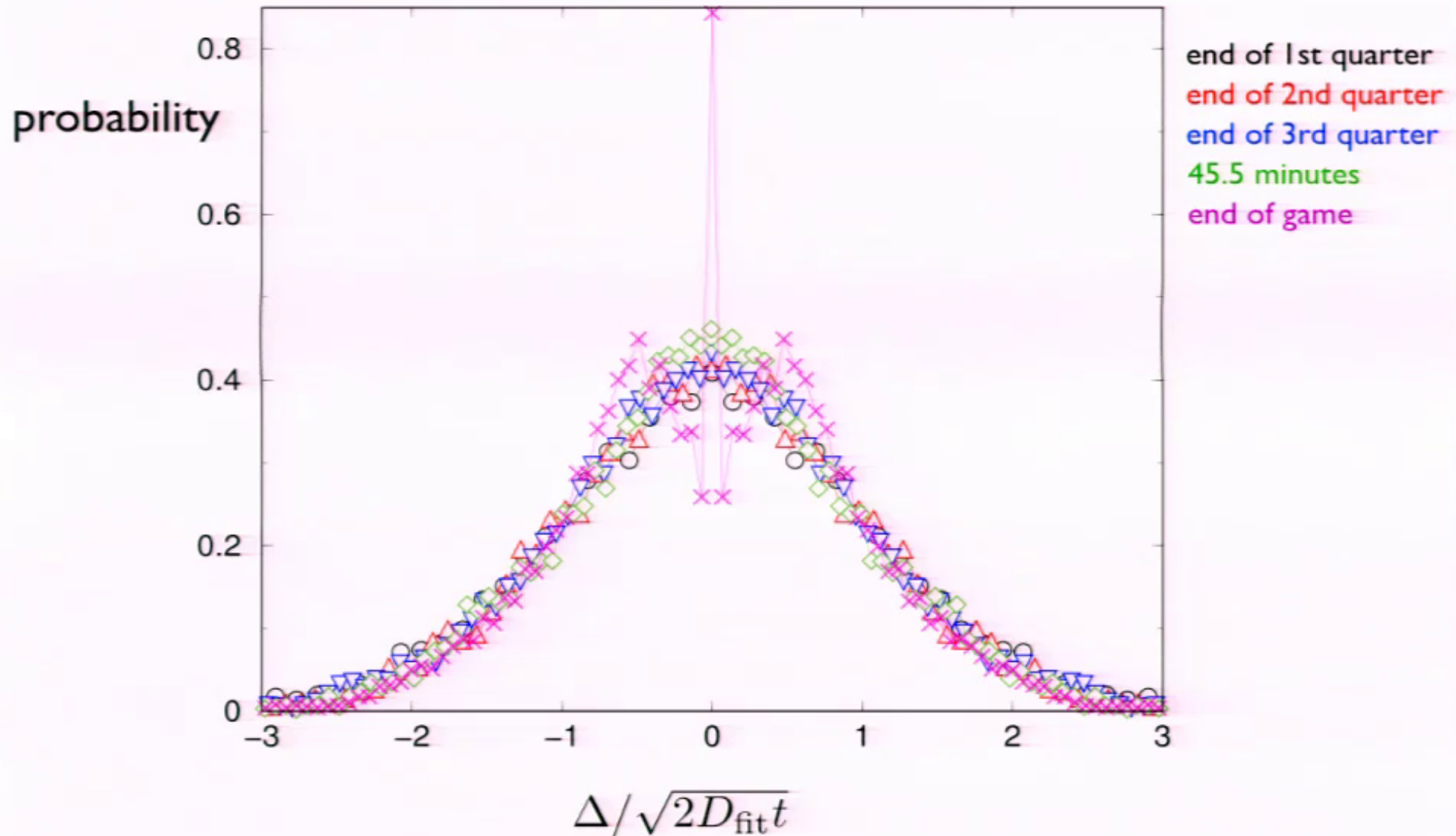
# Some Buts.....

0. *Last 2.5 minutes:* anomalous.





# Almost Gaussian Score Difference Distribution *except in the last 2.5 minutes*



# Some Buts.....

0. **Last 2.5 minutes:** anomalous.
1. **Bias:** Teams typically <sup>not that</sup> unevenly matched.
2. **Antipersistence:** After team A scores, same team scores next with probability 0.35.
3. **Return to zero:** winning team coasts, losing team desperate.

