

# MARKOV

## The New Road to WAR

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## SALO 2.0: Bayesian ordered logit for SoG and penalties

$$\Pr(\text{away shot}) = \Lambda(\alpha_{sa} - X\beta_s - Z\gamma_s)$$

$$\Pr(\text{home shot}) = \Lambda(\alpha_{sh} + X\beta_s + Z\gamma_s)$$

(likelihood)

$$\Pr(\text{away pen}) = \Lambda(\alpha_{pa} - X\beta_p - Z\gamma_p)$$

$$\Pr(\text{home pen}) = \Lambda(\alpha_{ph} + X\beta_p + Z\gamma_p)$$

$$\gamma_s \sim N(0, \sigma_s)$$

$$\gamma_p \sim N(0, \sigma_p)$$

(prior)

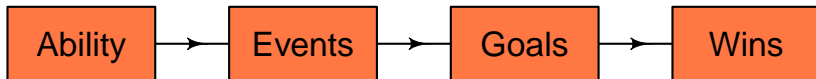
$$GP \sim \text{BB}(82, \alpha_G + \gamma_s\beta_G, \phi)$$

([name?])

# WAR: combining multiple abilities into an overall value

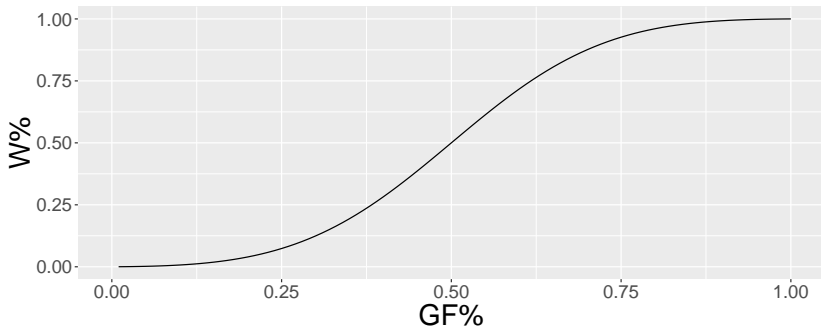


# cWAR linearly maps micro ability to macro results



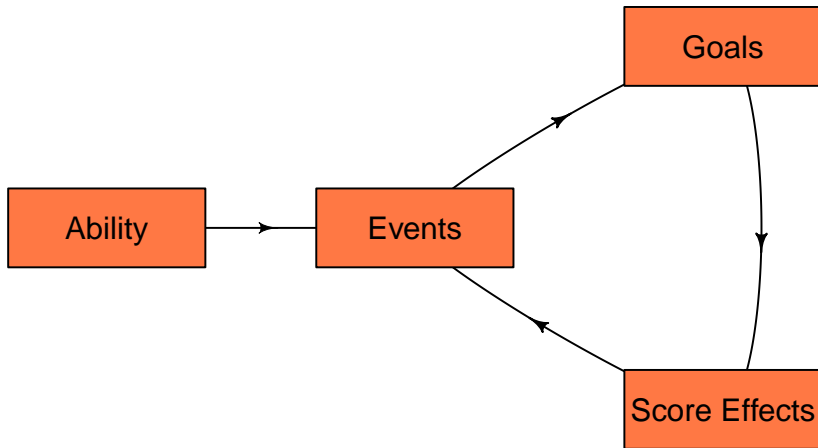
## Wins (added) aren't linear in goals (added)

```
G <- (0:100) / 100  
W <- skellam::pskellam(-1, (1 - G) * 6, G * 6)  
W <- W / (1 - skellam::dskellam(0, (1 - G) * 6, G * 6))
```



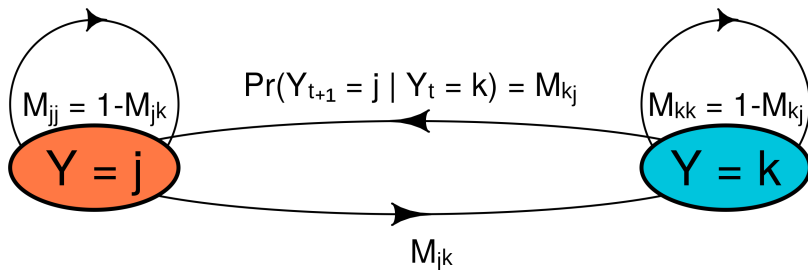
► bWAR 2.x accounts for this

Goals (added) aren't (globally) linear in ability, either!



A *Markov chain* randomly changes state in discrete time according to a matrix of transition probabilities

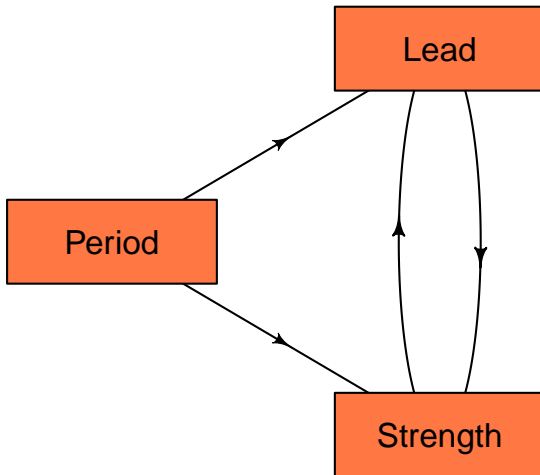
$$M = \begin{bmatrix} M_{jj} & M_{jk} \\ M_{kj} & M_{kk} \end{bmatrix}$$



*Markov property:* Distribution of  $Y_t$  given  $Y_0$  equals  $M^t$



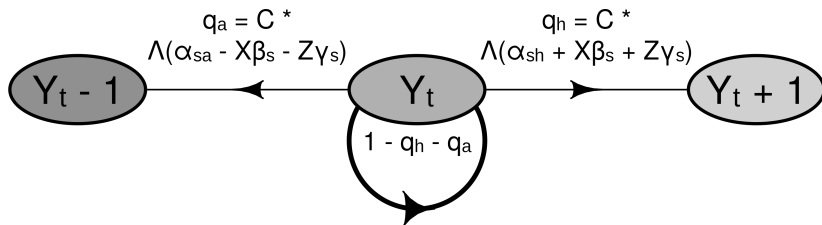
# SALO defines a game state space and transition matrix



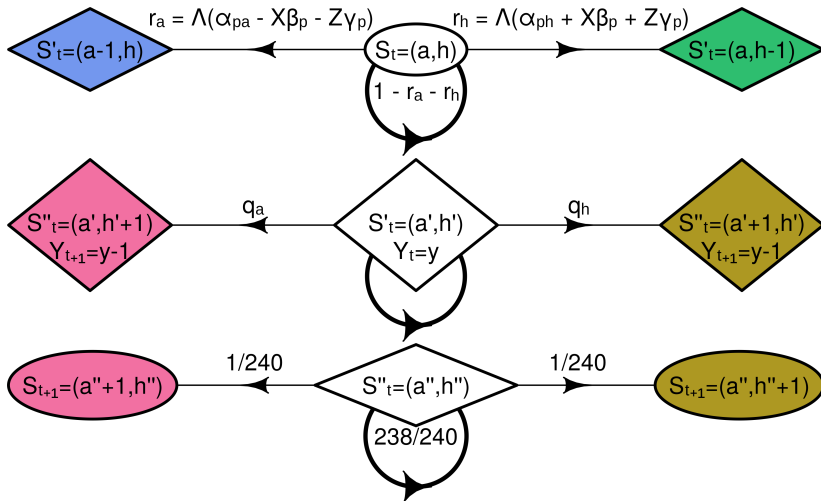
## Transition matrices defined separately for each period

$$M^* = (M_1)^{2400} \times (M_2)^{2400} \times (M_3)^{2400}$$

Lead change prob. is SALO shot prob.  $\times$  (constant) Sh%



# Penalties, PPG, and expiration cause strength changes



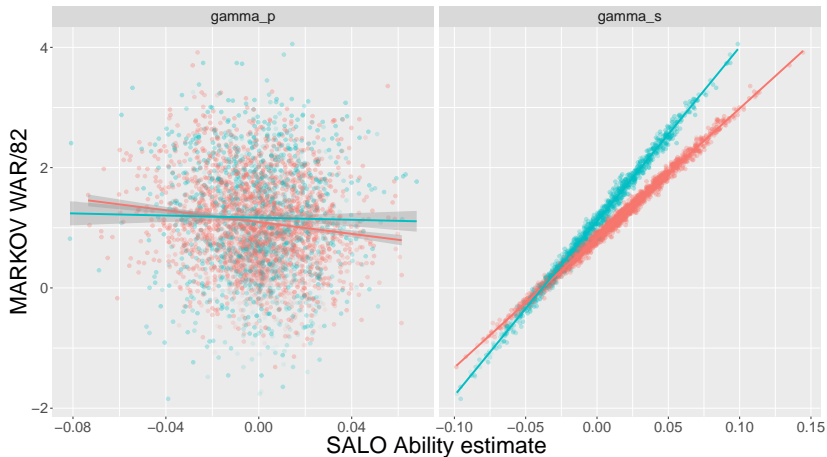
# Assumptions are added for finiteness and completeness

- ▶  $M$  is cropped to  $135 \times 135$  (15 leads, 9 strength states)
- ▶ Average ice time: forwards 15:00, defensemen 20:00
- ▶ Model-based replacement player

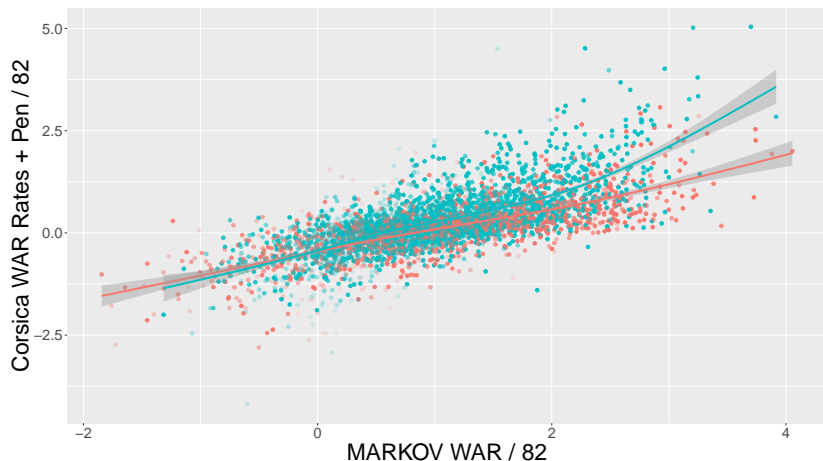
## Top players mostly D (ice time assumption is severe)

season	player	pos	mean	sd
20152016	KRIS LETANG	D	4.055	1.550
20152016	PAVEL DATSYUK	C	3.916	1.267
20132014	MARK GIORDANO	D	3.880	1.572
20152016	JAKE MUZZIN	D	3.741	1.582
20152016	HAMPUS LINDHOLM	D	3.740	1.573
20152016	COLTON PARAYKO	D	3.727	1.574
20142015	PATRICE BERGERON	C	3.701	1.258
20172018	RADKO GUDAS	D	3.449	1.602
20152016	OLIVER EKMAN-LARSSON	D	3.382	1.547
20152016	CARL HAGELIN	L	3.356	1.248

# WAR is almost linear in shots and unrelated to penalties



# Corsica WAR is not quite linear in MARKOV WAR



<https://www.salohockey.net>

