

Skills  
Importance  
across ages in  
Men's  
Volleyball.



- Volleyball
- Model
- Data
- Method of analysis
- Results
- Conclusions
- Suggestions

# Skills Importance across Ages for Men's Volleyball.

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- Sum zero game.
  - Sets: Best of five.
    - 25 points per set 1-4 and 15 points for 5<sup>th</sup> set for the winner with at least 2 points difference.
  - Previous researches: Importance of skills for championships, tournaments, matches, sets, ambivalent sets.
  - Levels of the game:
    - Both genders, 4 level of ages compete in world level.
      - U19, U21, U23, Men.
      - U18, U20, U22, Women.

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- Structure of the game: Hierarchical.
- Team's performance in skills connected directly with the result (Marchelino et al., 2009).
- **The main question is: are all skills equally important for the outcome of a rally at all ages in Male Volleyball?**

# 2 Complexes of volleyball game

Complex 1-  
Attack after serve's pass

Complex 2-  
Attack after defense

Serve's  
pass

Set

Attack

Defense

Block

Serve

6 Basic Volleyball Skills

(Nishijima, Ohsawa, Matsuura, 1987)







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## Method of analysis

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- Transition Matrix 60 X 62. Last two columns are terminal moves (point + or point- )for the team under study.
- $P_i$  is the probability for a skill to end up in a point after two subsequent game moves.

$$P_i = P(Y_{t+1} = \text{point}^+ | Y_t = S_i) + \sum_{k=1, k \neq i}^n P(Y_{t+2} = \text{point}^+ | Y_{t+1} = S_k) P(Y_{t+1} = S_k | Y_t = S_i)$$

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## Method of analysis Measure

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- Importance score ( $I_i$ ). Measure of impact & uncertainty for a skill (Fellingham & Reese, 2004).

$$I_i = \frac{E(P_i | y)}{\sqrt{V(P_i | y)}}$$



Posterior mean



Standard deviation



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## Method of analysis Assumptions

- 1<sup>st</sup> assumption: Scoring for each skill is i.i.d.
- 2<sup>nd</sup> assumption: Patterns are first order Markov chains.

$$P_i = P(Y_{t+1} = \text{point}^+ | Y_t = S_i) = P(Y_{t+2} = \text{point}^+ | Y_{t+1} = S_k)$$

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## Method of analysis Model

- Simple multinomial model to estimate transition & success probabilities  $\pi_{ik}$

$$\pi_{ik} = P(Y_{t+1} = S_k | Y_t = S_i)$$

- For each skill we assume multinomial likelihood

$$f(y_{i1}, \dots, y_{i,n}, y_{i,n+1}, y_{i,n+2} | \pi_{i1}, \dots, \pi_{i,n}, \pi_{i,n+1}, \pi_{i,n+2}) \propto \prod_{k=1}^{n+2} \pi_{ik}^{y_{ik}}$$

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## Method of analysis Prior distribution

- We use a conjugate Dirichlet prior distribution of the type

$$f(\pi_{i1}, \dots, \pi_{i,n}, \pi_{i,n+1}, \pi_{i,n+2} \mid a_{i1}, \dots, a_{i,n}, a_{i,n+1}, a_{i,n+2}) \propto \prod_{k=1}^{n+2} \pi_{iK}^{\alpha_{iK}-1}$$

- Prior estimations from expert coaches. Low weight to experts/coaches opinion. Multiply  $0.1 \times N_i$  (10% additional of data points).
- All success probabilities & importance scores were calculated using a Monte Carlo scheme of 10.000 iterations.

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# Results

## MEN

•Volleyball

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Skill	Posterior mean	Standard deviation	Importance score
Block kill AS	0,99	0,001	948,117
Srv Jump 6	0,977	0,003	281,190
Block kill	0,973	0,004	225,156
Srv Float 6	0,959	0,008	114,423
Pass in Float 6	0,553*	0,019	27,855
Pass in Jump 6	0,568*	0,0204	27,819
Pass in Float 5	0,559*	0,0201	27,789
Pass in Jump 5	0,569*	0,021	27,039
Pass in Jump 4	0,511	0,02	24,937
Pass in Float 4	0,503	0,022	22,778

\*Since variation is associated with sample size, skills are performed more often receive larger importance scores.

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## Results U21/ Juniors

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Skill	Posterior mean	Standard deviation	Importance score
Block kill AS	0,979	0,003	315,514
Block kill	0,968	0,006	168,486
Srv Jump 6	0,964	0,007	139,076
Srv Float6	0,936	0,016	57,642
Pass in Float 5	0,539	0,029	18,335
Pass in Float 6	0,537	0,029	18,281
Pass in Jump 5	0,52	0,031	16,925
Set 1 MF quick	0,673*	0,041	16,536
Pass in Jump 6	0,522	0,034	15,451
Pass in Jump 4	0,481	0,034	14,114

\*Since variation is associated with sample size, skills are performed more often receive larger importance scores.

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## Results U19/Youth

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Skill	Posterior mean	Standard deviation	Importance score
Block kill AS	0,968	0,006	164,952
Block kill	0,935	0,016	57,611
Srv Jump 6	0,935	0,016	57,200
Set 1 LS quick	0,769	0,048	15,950
Srv Float 6	0,851	0,054	15,710
Pass in Float 6	0,58	0,04	14,333
Pass in Float 5	0,56	0,043	13,183
Pass in Float 4	0,532*	0,048	11,014
Set 1 FRS quick	0,747*	0,07	10,713
Set 1 MF quick	0,614	0,065	9,386

\*Since variation is associated with sample size, skills are performed more often receive larger importance scores.



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## Results across teams

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	Men	U21	U19
1	Block kill AS	Block kill AS	Block kill AS
2	Srv Jump 6	Block kill	Block kill
3	Block kill	Srv Jump 6	Srv Jump 6
4	SrvFloat 6	Srv Float 6	Set 1 LS quick
5	Pass in Float 6	Pass in Float 5	Srv Float 6
6	Pass in Jump 6	Pass in Float 6	Pass in Float 6
7	Pass in Float 5	Pass in Jump 5	Pass in Float 5
8	Pass in Jump 5	Set 1 MF quick	Pass in Float 4
9	Pass in Jump 4	Pass in Jump 6	Set 1 FRS quick
10	Pass in Float 4	Pass in Jump 4	Set 1 MF quick

•When comparing importance scores across teams, only the ordering should be compared.





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## Suggestions for coaches

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- Men's, Junior's and youth's game in high level are not different.
- Complex 1 (side out point) is very important (Calhun et al.,2002).
- Complex 2:
  - Block and quick tempo attack.
  - More floaters than spinners servers.
  - Better preparation of unpredictable situations (attack out of system).

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## Suggestions for coaches

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- Improve of model.
  - Use of past data of team's performance as prior information.
  - Standardized team profile.
  - On line use.
  - Indications for coaches' decisions during match.

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- The End

Thank you for your attention!