## The Dependence of Chess Opening Network Structure on Playing Strength

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## Gathering and Processing Game Data in Chess Opening Networks

- Data is taken from the April 2023 Lichess Database.
- After removing players who played <200 games in the month and selecting just $1 / 10^{\text {th }}$ of the remaining players, we are left with 4 million games and about $\mathbf{1 0 , 0 0 0}$ players
- We then process these games into a white network and a black network by calculating overlap:
First 3 Moves of an Example Opening Network For Playing as White

- "Self branches" capture a player's variety in their repertoire while "enemy branches" capture the moves played by all opponents.

Quantifying the Degree of Opening Variety Through Branching

- Branch points do not all indicate the same degree of opening repertoire variety. Consider $Y$ to quantify this variety:

$$
Y=1-|1-2 d|
$$

- Where $\mathrm{d}=\left(f_{\text {last }}-f_{\text {current }}\right) / f_{\text {last }}$ is the fractional drop in move frequency $f$ across the branch point.
- As we see in the above plot of $Y(d)$, branches with a fractional drop of $50 \%$ contribute maximally to branching degree.

- While splits of $80 / 20$ or $90 / 10$ indicate less variety and therefore have lower branching degree, as there is one dominant move
- $33 / 33 / 33$ splits or other higher order even splits also contribute less, as this might indicate indecisiveness rather than planned variety.


## How Does Opening Variety Change With Playing Strength?

- We calculate $Y$ at each self-branch point for each game, averaging together the results for each move number.
- This plot shows players ranging from beginner to expert, though no professional-level players.



## Discussion

- We see that, on average, higher rated players have slightly less opening variety early in the game than lower rated players, while they have more opening variety later in the game.
- This "opening variety" in later moves largely comes from move memorization.
- Lower rated players arguably have more variety in positions, but that is because they have not memorized the moves and therefore see a new game every time.

