## Learning to Generate Move-by-Move Commentary for Chess Games from Large-Scale Social Forum Data: APPENDIX

Appendix A: Additional Data Examples

Text	Categories	
Unpins and defends the knight, but it	Desc	
does n't matter, as the time is ripe.	Desc	
He gets fed up and exchanges Queen for Rook .	Desc	
Rxc3, I just retake with my queen, whilst if he		
attempts defense with the bishop, then after 17.Bd2,	Desc,Rationale	
Ne4, 18.Rxc3, Nxg3, 19.Rxc6, Nxh1, I've won a rook outright.		
Preparing to castle, and threatening	Desc	
now white 's e pawn for real.		
Simply getting my rook off that dangerous diagonal	Desc	
, and protecting the b pawn .		
I throw in a check	Desc	
Threatening mate with Qxh2	Desc,Quality	
A punch drunk move !	Quality	
This is not the best move.	Quality	
The most logical move.	Quality	
This move is dubious.	Quality	
The check gains time to support the advance of the a-paw	Desc,Quality	
maybe Ke1 was better	Rationale	
I did n't want to retreat the N and I rejected 11.	Rationale	
I wish to both defend the pawn, and threaten indirectly the	Rationale	
black queen, gaining a tempo		
it would suite me better if my opponent made a queenside castling, since	Comparative	
then my advanced pawn on the d-file would assist in a future attack on the king 's position.		
but better would be nd2 to get the knight in the game, the queen rook, too.	Comparitive	
i think it would have been better to play nxe5 and maintain a material advantage.	Comparitive	
although not as effective as the bishop move, even 10.0-0-0 is better than the text,	Comparitive	
though 10 bg4 would have been very nasty.		
fianchettoing, so that when black does complete his development, his b will be on a better diagnol.	Comparitive	
He doesn't notice that his Knight is hanging	GameInfo	
Now of course my forces are anchored around the pawns on e3 and h5, and the black rook		
loses his hope of penetrating the white position on the e-file	GameInfo	
Well, now the game will get interesting soon	GeneralInfo	
He tries his trick, which of course is noticed	GeneralInfo	
This is often what I will do, when I'm playing white.	GeneralInfo	

Table 1: Some commentary texts from each of the six categories. The **Categories** column lists those into which the example falls. As pointed out earlier, the category labels are not exclusive i.e. a text can belong to multiple categories, though texts with more than one category are few in our dataset. ('Desc' is shor for 'Move Description')

# **Appendix B: Additional details for methods**

## Templates

- *Move Description:* For the Move Description category, we consider following templates:
  - 1. **Capture** moves : [PLAYERMOVED] captures the [CAPTUREDPIECE] at [FINALSQUARE] using the [PIECE-MOVED] at [INITIALSQUARE].
  - 2. Non-Capture moves: [PLAYER-MOVED] moves the [PIECEMOVED] from [INITIALSQUARE] to [FINAL-SQUARE].
  - 3. **Castling** moves: [PLAYERMOVED] does a castling.

For moves which lead to a CHECK in the resultant board state, an additional *putting the king in check* is added to the template. [PLAYERMOVED] (Black/White), [INITIALSQUARE], [FINALSQUARE], [PIECEMOVED] are filled in based on the move description on the input side.

- *Move Quality:* Based on the move score ( as calculated by the chess engine *Stockfish*) > θ or < θ, one of the following two is generated:</li>
  - 1. A good move.
  - 2. A bad move. The threshold  $\theta$  is found by tuning it on the validation set to maximize BLEU. We start from  $\theta = 0$ .

## **Appendix C: Qualitative examples**

Some qualitative examples.



Temp: Black moves the pawn from f7 to f5.

NN: Attacks the bishop , but allows black to gain the pawn back.

RAW: I take the pawn.

GAC(M): Black attacks white bishop.

GAC(M+T): Black threatens white bishop with his pawn.

GAC(M+T+S): Black threatens white bishop with his pawn.

Ground Truth: Blocking the bishop out and eyeing for f4 and mate on c2.





Temp: White moves the queen from d1 to h5, putting the king in check.

NN: White 's Queen strikes with 'Check ! '

RAW: I take the pawn. GAC(M): White throws in the check. GAC(M+T): White takes the bishop with his queen.

GAC(M+T+S):White checks him with his queen..

Ground Truth: I put the king in check.





 $\ensuremath{\text{Temp}}\xspace$  : White moves the knight from e4 to f6 , putting the king in check

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NN: { 13 : +3.25 } 23
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RAW: I take the pawn.

GAC(M): White sees the threat and threatens the knight.

GAC(M+T): White throws in a check.

GAC(M+T+S): White throws in a check.

Ground Truth: The obvious move, forcing off the black queen and maintaining the menacing pawn presence on c5 and d6, white 's attack looks dangerously close to being winning.

Figure 3: Example output 3: Move description subset of data.



Temp: White moves the knight from g1 to f3.

NN: I bring out my knight to f3 as usual.

RAW: I move my knight to d5 and attacking the pawn on e4.

GAC(M): White develops his knight.

GAC(M+T): White brings out his knight to attack the pawn.

GAC(M+T+S): White develops his knight.

 $\ensuremath{\textbf{Ground}}$   $\ensuremath{\textbf{Truth}}\xspace.$  And making the opponent respond to my move.

Figure 4: Example output 4: Move description subset of data.



**Temp**: Black moves the queen from d8 to d6

**NN**: Black brings out his queen , which breaks the queen and provides protection the the e-pawn

RAW: I take the pawn.

GAC(M): Black attacks white queen.

GAC(M+T): Black brings out his queen to the attack .

GAC(M+T+S): Black brings his queen out

Ground Truth: Letting the Queen join the attack.





Temp: Black moves the pawn from a6 to a5

NN: The pawn advance begins.

RAW: I take the pawn.

GAC(M): Black brings up his bishop to cover his bishop.

GAC(M+T): Black pushes up his pawn to free white pawn.

GAC(M+T+S): Black develops his bishop and attack the pawn.

 ${\bf Ground}\ {\bf Truth}:$  Bg4 links the queen and the rock , which would free up black to take the e5 pawn and even out material .





Temp: White moves the knight from e5 to d7 , putting the king in check

 $\ensuremath{\text{NN}}\xspace$  : ... with the only piece near my king and no protection .

RAW: I take the pawn.

 $\ensuremath{\textbf{GAC(M)}}\xspace$  : White sees the check and threatens the knight.

GAC(M+T): White throws in a check.

GAC(M+T+S): White checks him with his knight.

Ground Truth: I want to rid blacks DSB 's reduce the outposts for his knight and hopefully overwork his superior piece with my minor pieces.

Figure 7: Example output 7: Move description subset of data.



Figure 8: Example output 8: Move description subset of data.



Figure 9: Example output 1: Move quality subset of data.



Temp: A good move. NN: good move !! RAW: A good move. GAC (M): This is a good move. GAC (M+T): A good move. GAC (M+T+S): A good move. Ground Truth: A brilliant move.

Figure 10: Example output 2: Move quality subset of data.



Temp: A good move. NN: This is my 37th move ... RAW: A good move. GAC (M): This move is a bad. GAC (M+T): A good move. GAC (M+T+S): A good move. Ground Truth: A puzzling move.

Figure 11: Example output 3: Move quality subset of data.



Temp: A good move. NN: A wasted move. RAW: A good move. GAC(M): This move is dubious. GAC(M+T): A good move. GAC(M+T+S): A good move. Ground Truth: A wasted move.

Figure 12: Example output 4: Move quality subset of data.



Temp: A good move.
NN: A nice tactical move, threatening Nxd6+
RAW: A good move.
GAC(M): This move is not very good.
GAC(M+T): A good move.
GAC(M+T+S): This is a good move.
Ground Truth: Not the best move.

Figure 13: Example output 5: Move quality subset of data.



Figure 14: Example output 6: Move quality subset of data.



Figure 15: Example output 7: Move quality subset of data.



NN: knight c6 would have been much better for obvious reasons .

**RAW**: It would have been better to play the pawn.

GAC(M):better was to develop the knight.

GAC(M+T): it would have been better to play f5.

 $\mbox{GAC}(\mbox{M+T+S})$  : it would be better to play the pawn , but i think it would be a little better .

Ground Truth: black would have been much better off doing  $\underline{rxh4}$ , because eventually, that pawn does become a queen ...

Figure 16: Example output 1: Comparative subset of data.



NN: what better way to defend than to attack.

RAW: better would have been to retreat the knight.

GAC(M): that would have been better.

GAC(M+T): it would have been better to play the rook.

**GAC(M+T+S)**: it would be better to play the knight to move to the king , but i think it would be better to play the knight to move to the king side.

Ground Truth: as better would 've been to retreat her ra5.





NN: i think c3 was better.

RAW: better would have been to retreat the bishop to retreat.

GAC(M): that would have been better.

GAC(M+T): it would have been better to do the bishop to the king side.

**GAC(M+T+S)**: it would be better to play the knight to move to the knight , but i wanted to play the knight to move to the king side of the board.

Ground Truth: understandable , but 5 bc4 might be better.

Figure 18: Example output 3: Comparative subset of data.

Appendix D: Additional information on AMT experiment





Q. Does black knight attacks d4?
 <sup>7</sup> ⊙ Yes ⊙ No

Figure 19: AMT (Amazon Mechanical Turk) sample HIT (Human Intelligence Task): Part 1 of 2 : Two chess proficiency questions are asked at beginning of a HIT

Proficiency question 2.



Q. Does black knight attacks d4? ◎ Yes ◎ No

You have judge the commentary on :

1) Correctness: Is the text commentary a valid commentary for the chess board

2) Completeness: Does the commentary correctly describe the chess move which occurred. In other words, given the commentary and the previous board, would you be able to figure out the move which was taken?

3) English language Fluency: Is the commentary in fluent English?

1. Commentary text: Back to standing in front of the king ! Which piece was moved: white pawn g2

	1.1 Is commentary correct for the shown chess move?
	1.2 Can you infer what the move is from commentary given only the previous board state? $\hfill \label{eq:2.1}$ Yes $\hfill \hfill \hf$
Previous board state Current board state	1.3 On a scale of 1-5, with 5 being most fluent, rate the English fluency of the commentary text $@$ 1 $@$ 2 $@$ 3 $@$ 4 $@$ 5

2. Commentary text: \${c2} Which piece was moved: \${m2}

Figure 20: AMT (Amazon Mechanical Turk) sample HIT (Human Intelligence Task): Part 2 of 2: 7 sets of questions are asked to judge quality of generated text. Each of the seven texts is output from a different method.



Figure 21: Commentary text: *I develop my bishop to the queen*.

An example instance where output commentary from our method was marked as not valid for the given chess move

### Checking chess proficiency of annotators

Our proficiency test questions are chosen from a subset of questions by (Cirik et al., 2015). Each question consists of a chess board and a question about the board configuration or game situation. The paper proposes a range of question types such as enumerating pieces of a type, enumerating pieces of a player, whether one piece threatens another, and whether the configuration corresponds to a checkmate or stalemate. For simplicity we stick to only those question types that have binary answer response.

We classify the question types into **Easy** and **Hard** question types. Each annotator is presented with one **Easy** and one **Hard** question at the start of a HIT.

#### References

Volkan Cirik, Louis-Philippe Morency, and Eduard Hovy. 2015. Chess q&a: Question Answering on Chess Games. In *Reasoning, Attention, Memory* (*RAM*) Workshop, Neural Information Processing Systems.