

Key Point Analysis via Contrastive Learning and Extractive Argument Summarization

Milad Alshomary, Timon Gurcke, Shahbaz Syed, Philipp Heinrich,
Maximilian Spliethöver, Phlipp Cimiano, Martin Potthast, and Henning Wachsmuth

Key Point Analysis Shared Task at ArgMining 2021



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Key Point Analysis Task

- Given a collection of natural language arguments, generate a set of **key points** and their **salience scores**, that summarize the collection

[----]

I do not trust that a solution shot into my child's arm can protect them. There is a risk of a serious reaction or even death. I as a parent should decide.

Forcing people to have their children vaccinated goes against free will.

I do not agree to force children without parental consent should not be fair

parents should have the freedom to decide what they consider best for their children

Routine child vaccinations isn't mandatory since children don't spread the virus

The child population has a low degree of vulnerability, so vaccination is not urgent yet

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1) Key point generation

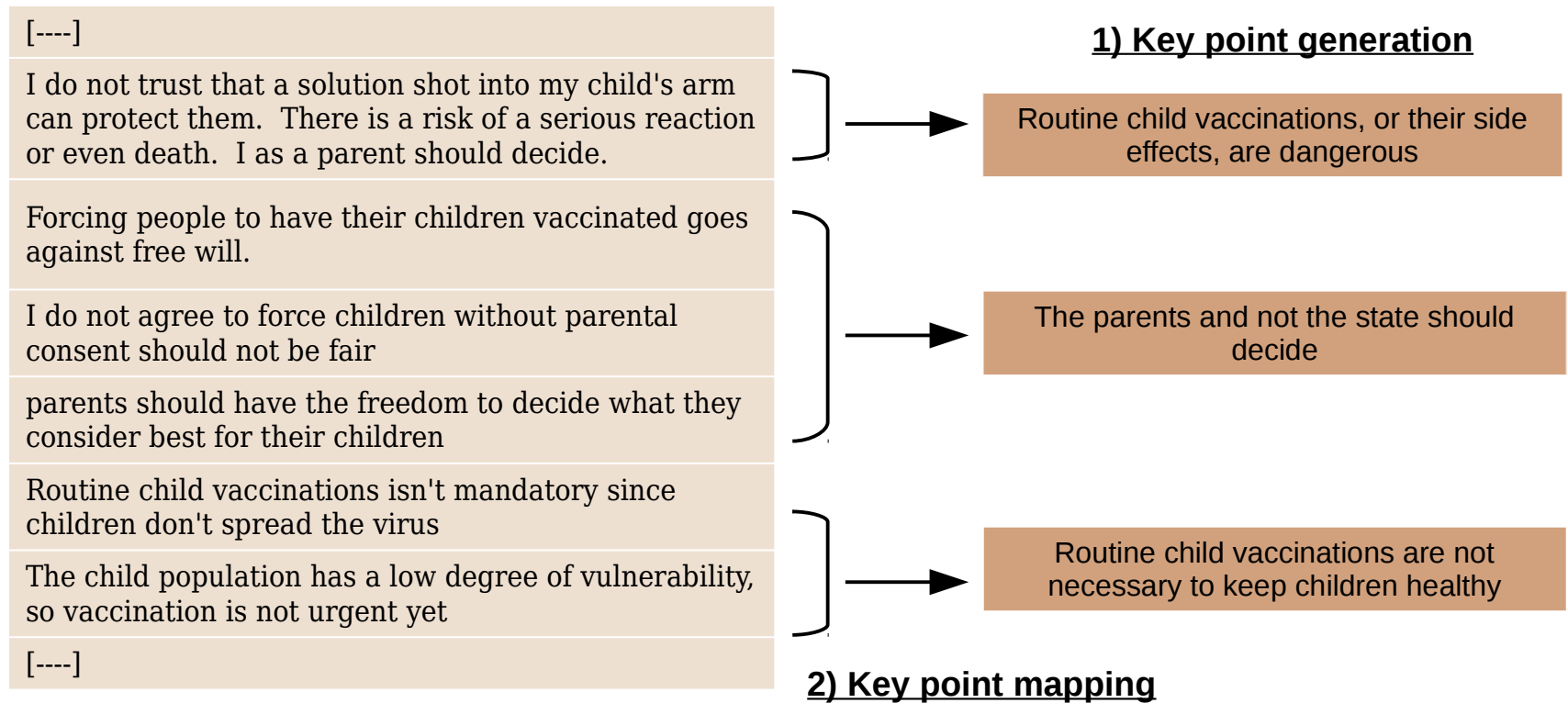
Routine child vaccinations, or their side effects, are dangerous

The parents and not the state should decide

Routine child vaccinations are not necessary to keep children healthy

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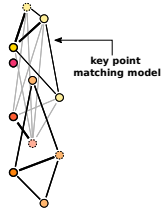


Approach

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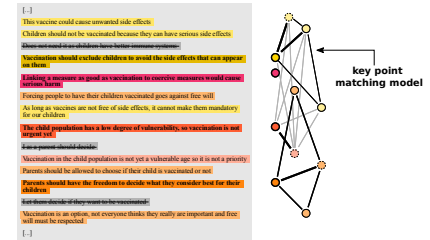
1) Key point generation: A graph based approach to extract key points from the input arguments

[...]
This vaccine could cause unwanted side effects.
Children should not be vaccinated because they can have serious side effects.
Some countries do not allow children to be vaccinated because of the risk of side effects.
Some countries should require children to avoid the side effects that can appear in them.
It is better to vaccinate as many children as possible than to avoid the side effects that can appear in them.
Forcing people to have their children vaccinated goes against free will.
As long as vaccines are not free of side effects, it cannot make them mandatory for our children.
The child population has a low degree of vulnerability, so vaccination is not urgent.
Some parents should decide.
Vaccination in the child population is not yet a vulnerable age so it is not a priority.
Parents should be allowed to decide if their child is vaccinated or not.
Parents should have the freedom to decide what they consider best for their children.
Some decisions should be made by the government.
Vaccination is an option, not everyone thinks they really are important and free will must be respected.
[...]

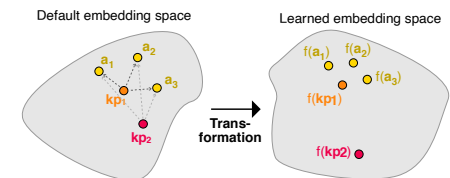


Approach

1) **Key point generation:** A graph based approach to extract key points from the input arguments



2) **Key point matching:** A contrastive learning approach to learn a new embedding space that represent the argument key point matching criterion



Approach: Key Point generation

- **Key Idea:** Extractive summarization by modeling *centrality* and *argumentativeness* in sentences (Alshomary et al. 2020)

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- **Procedure:**

- 1) Arguments to a collection of sentences

[...]
This vaccine could cause unwanted side effects
Children should not be vaccinated because they can have serious side effects
Does not need it as children have better immune systems
Vaccination should exclude children to avoid the side effects that can appear on them
Linking a measure as good as vaccination to coercive measures would cause serious harm
Forcing people to have their children vaccinated goes against free will
As long as vaccines are not free of side effects, it cannot make them mandatory for our children
The child population has a low degree of vulnerability, so vaccination is not urgent yet
I as a parent should decide
Vaccination in the child population is not yet a vulnerable age so it is not a priority
Parents should be allowed to choose if their child is vaccinated or not
Parents should have the freedom to decide what they consider best for their children
Let them decide if they want to be vaccinated
Vaccination is an option, not everyone thinks they really are important and free will must be respected
[...]

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- **Key Idea:** Extractive summarization by modeling *centrality* and *argumentativeness* in sentences (Alshomary et al. 2020)

- **Procedure:**

- 1) Arguments to a collection of sentences
- 2) Argumentative quality scores collected via *Project Debater's API*

[...]

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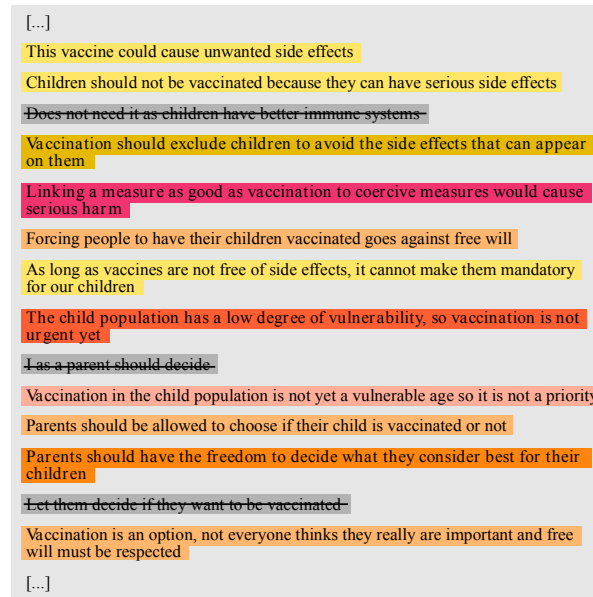
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- **Procedure:**
 - 1) Arguments to a collection of sentences
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 - 3) Filter out sentences with argument quality score less than a minimum threshold

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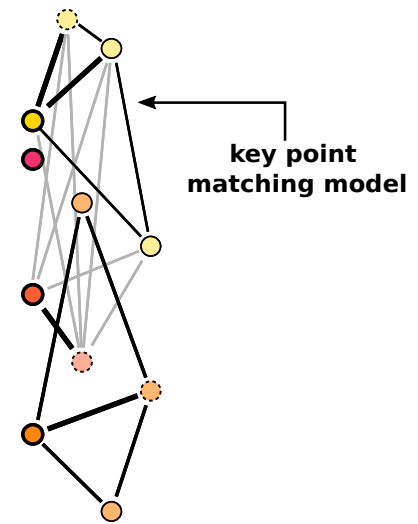
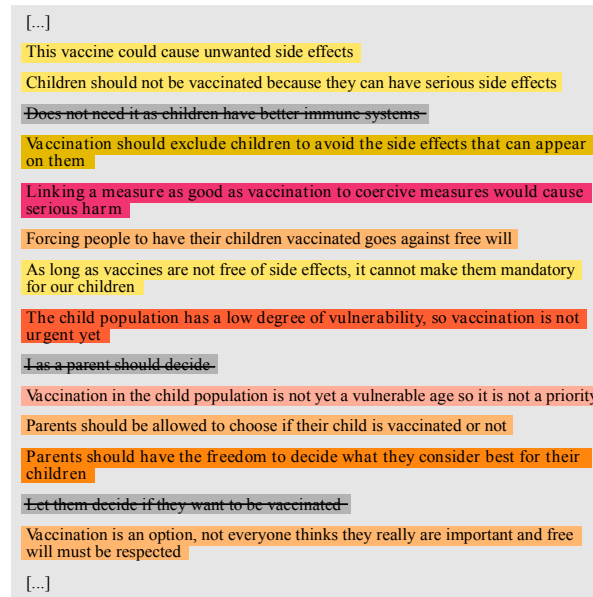


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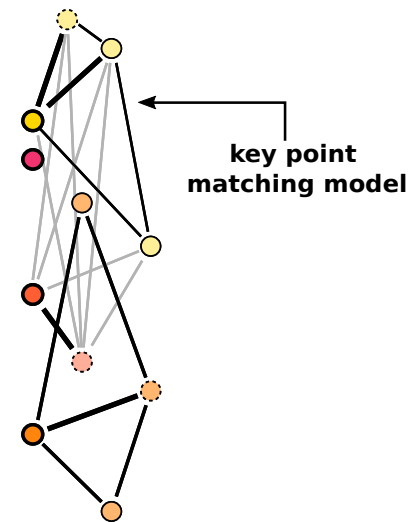
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 - 5) Run PageRank → Take top N sentences → Filter duplicates to ensure diversity

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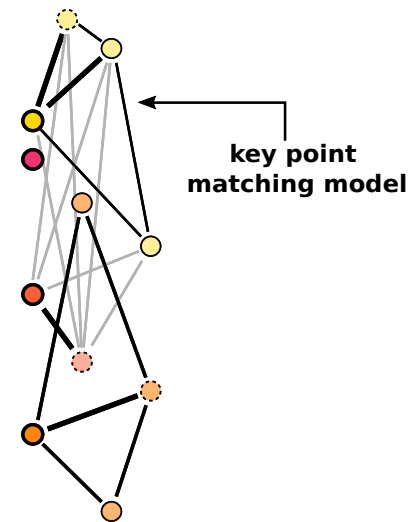
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- **Implementation:**

- 1) Spacy for sentence splitting → sentences with a minimum of 5 and a maximum of 20 tokens are kept
- 2) Optimized on the training set to select best parameters: *quality threshold: 0.2, Matching threshold: 0.8, and damping factor: 0.2*
- 3) Post-processing to remove candidate key points that has a matching score higher than 0.8

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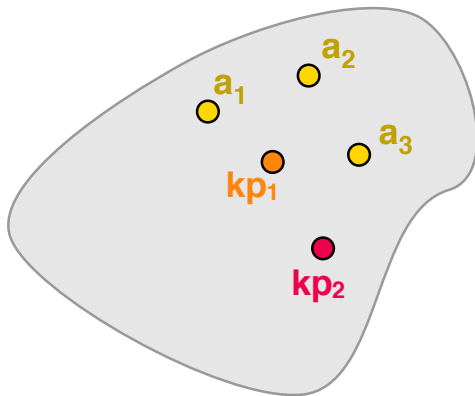
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 - 1) Mapping arguments and key points into a default semantic space

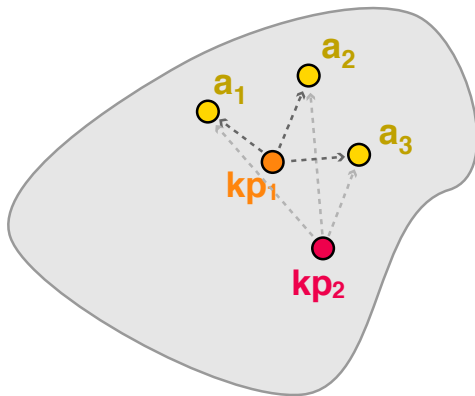
Default embedding space



Approach: Key Point matching

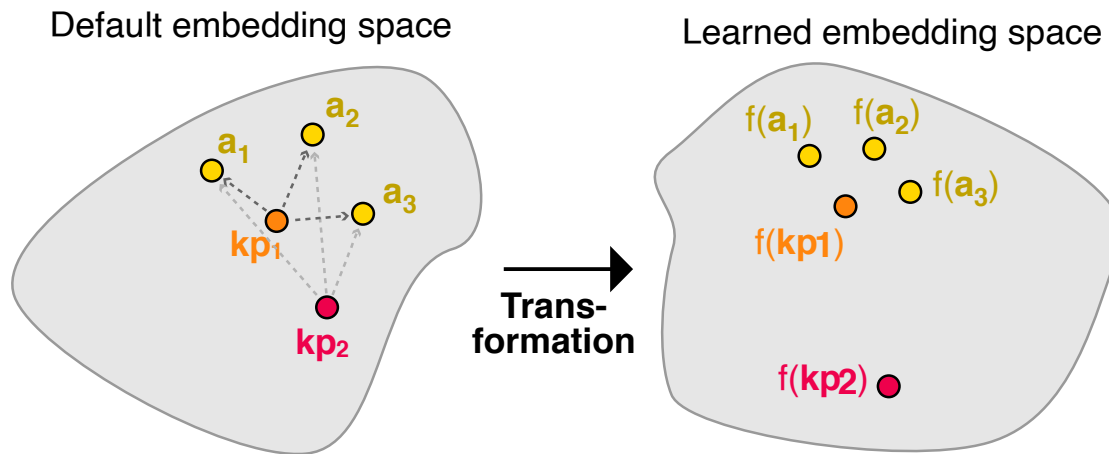
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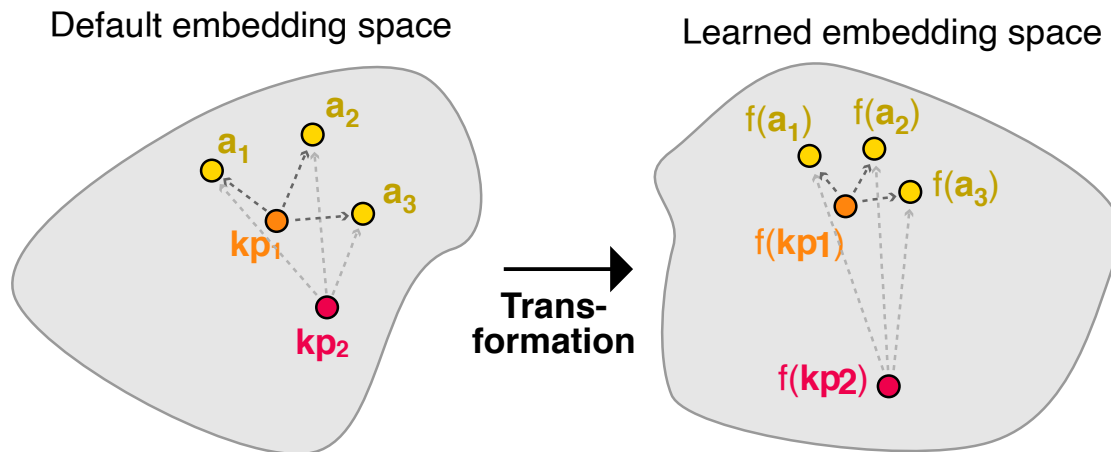
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- **Procedure:**
 - 1) Mapping arguments and key points into a default semantic space
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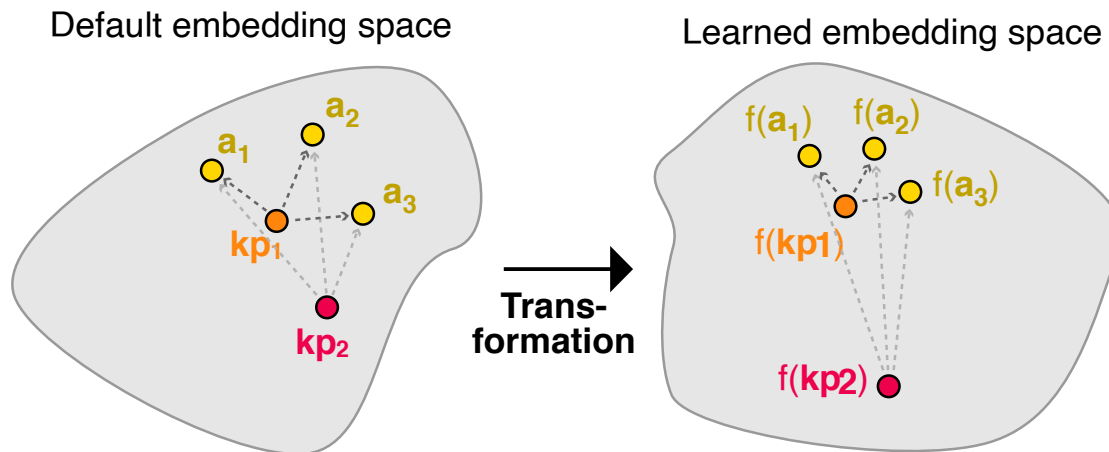
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- **Implementation:**
 - **Two inputs:** An argument and concatenation of the topic and the key point
 - **RoBERTa-large** (*Liu and Lapata, 2019*) as an encoder
 - **Mean-pooling layer** to map encoder's outputs into a sentence embedding
 - **Cosine similarity** as a similarity function



Results

- **TRACK1: Key points matching**

Model	Rank	Strict mAP (r)	Relaxed mAP (r)	Mean of mAP (r)	Strict p@50% (r)
SMatchToPR *	1	0.789 (1)	0.927 (4)	0.858 (1)	0.848 (1)
NLP@UIT *	2	0.746 (3)	0.93 (3)	0.838 (2)	0.827 (3)
ModrnTalk *	3	0.754 (2)	0.902 (6)	0.828 (4)	0.806 (5)
Enigma *	4	0.739 (5)	0.928 (4)	0.833 (3)	0.828 (2)
MatchTStm *	5	0.745 (4)	0.902 (6)	0.824 (5)	0.808 (4)

- **TRACK2: Key points generation and matching**

Model	Rank	mAP (r)	KP set rank
BarH	1	0.885 (1)	1 / (1,1,2)
SMatchToPR	2	0.818 (2)	2 / (2,1,2)
Enigma	3	0.491 (3)	4 / (2,4,3)
XLNet	4	0.443 (4)	3 / (4,3,1)
pa_vincent	5	0.096 (5)	None
mozhiwen	6	0 (6)	None