








Motivation

- ✓ Emoji symbols take on different meanings based on the context of a message as no rigid semantics are attached to emoji by design.
- ✓ Hence, for machines to understand emoji, a machine readable sense inventory that lists different emoji senses is needed.
- ✓ **EmojiNet** is a machine readable sense inventory which enables this.

Real World Examples

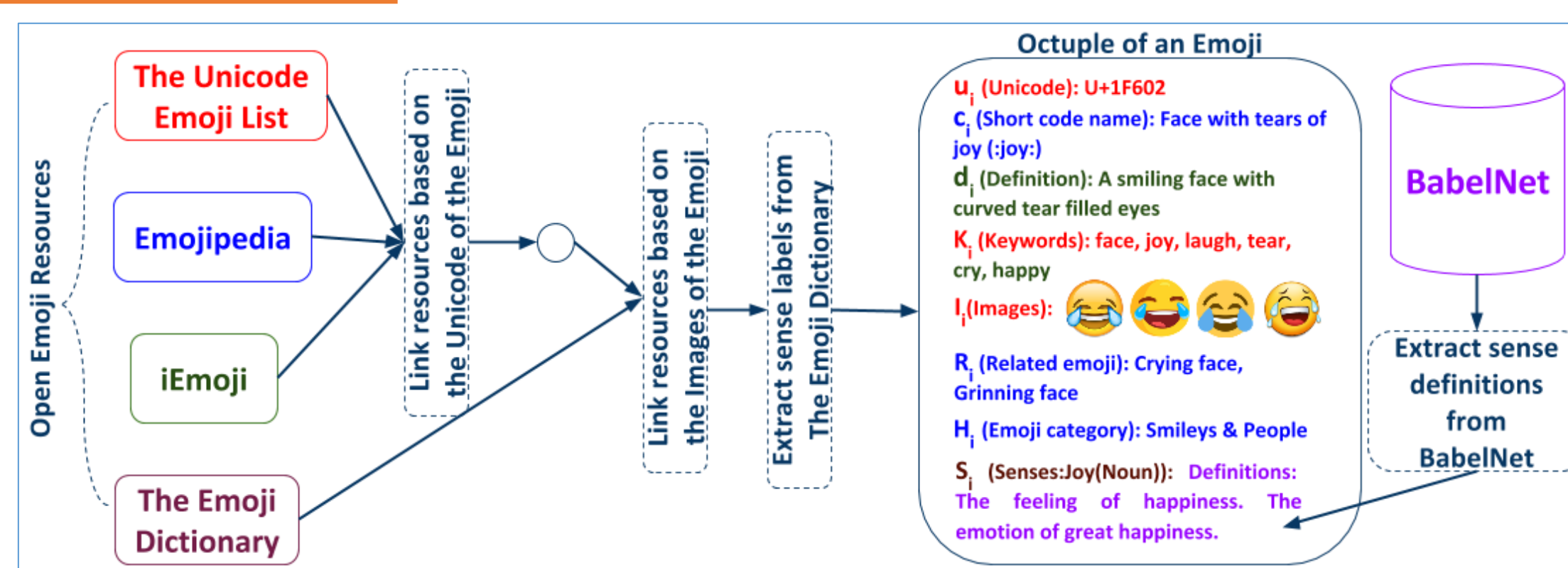
	Can't stop laughing 😂		Angry as hell 🖊️		Can't buy class la 💰
Laugh(N)		Anger(N)		Costly(A)	
	Got all A's but 1 😂 😊		Oooooooh shots fired! 🖊️ 🖊️	Work Hard(N)	Up early on the grind 💰
Happy(N)		Shot(N)			
	That was damn hilarious! 😂 😂 😂		He tried to kill one of my brothers 🖊️	Money(N)	Earn money when one register /w ur link 💰
Funny(A)		Kill(V)			

Approach

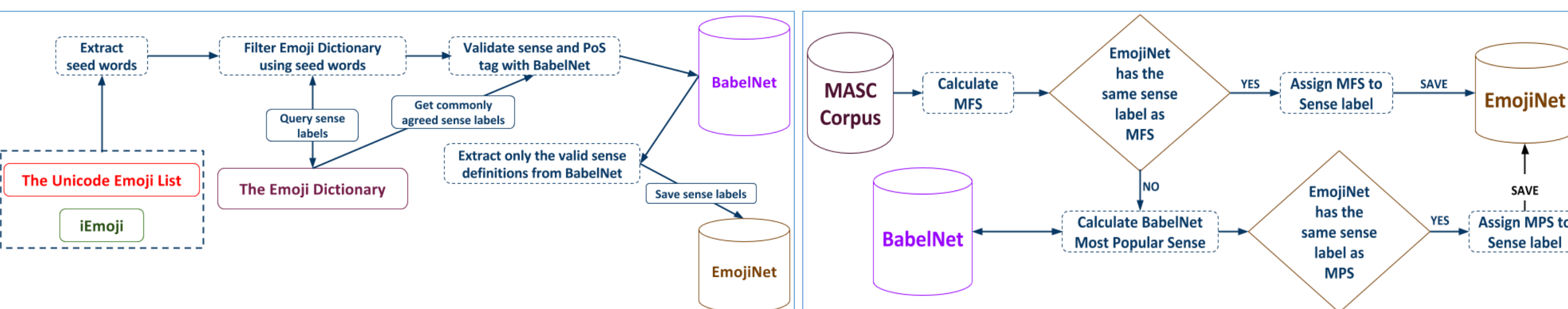
For each emoji e_i in EmojiNet, it records the octuple $e_i = (u_i, c_i, d_i, K_i, I_i, R_i, H_i, S_i)$, where u_i is the Unicode of e_i , c_i is the short code name of e_i , d_i is the description of e_i , K_i is the set of keywords of e_i , I_i is the set of images of e_i , R_i is the set of related emoji of e_i , H_i is the set of categories of e_i , S_i is the set of emoji senses of e_i .

Emoji Resource	u	c	d	K	I	R	H	S
Unicode Website	✓	✓	✗	✓	✓	✗	✗	✗
Emojipedia	✓	✓	✓	✗	✓	✓	✓	✗
iEmoji	✓	✓	✓	✓	✓	✗	✓	✗
Emoji Dictionary	✗	✗	✗	✗	✓	✗	✗	✓

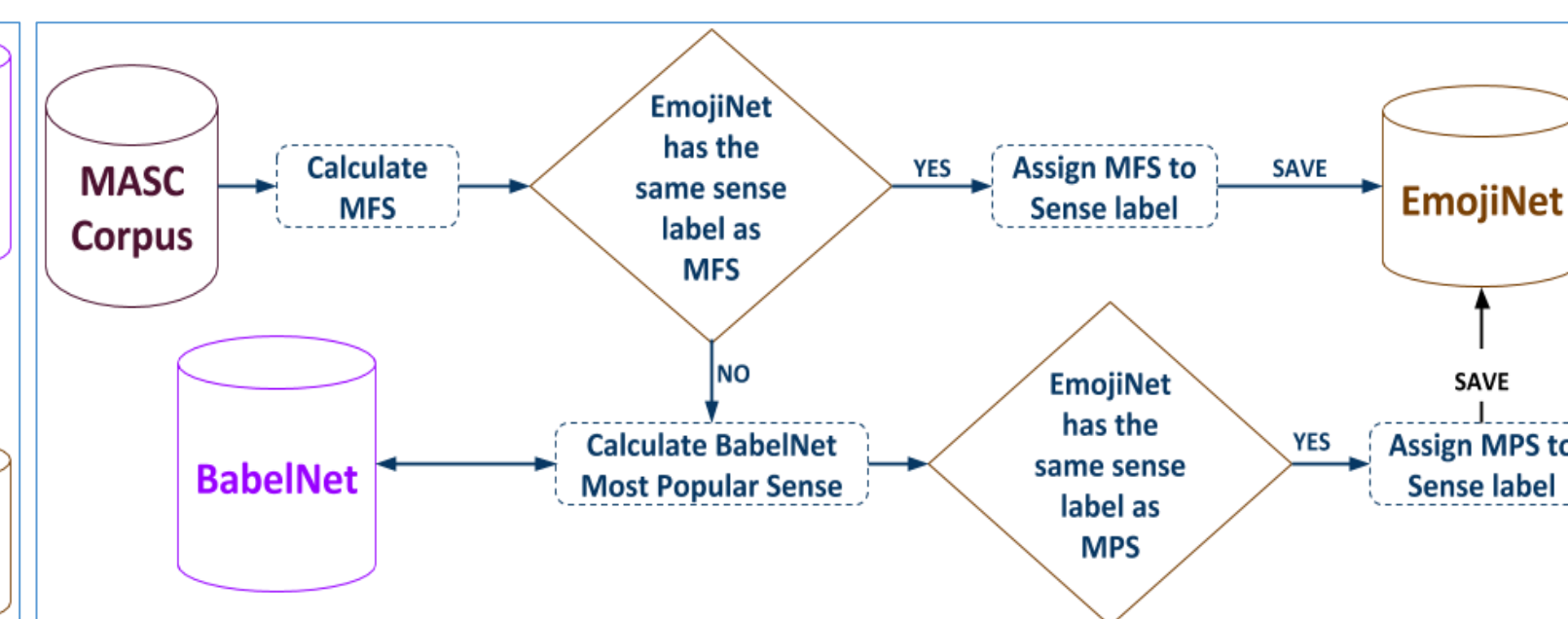
Table 1 – Emoji Data Available in Open Resources



Step 1 – Extract Data from Open Web Resources and Integrate them based on Unicode Character and Image Representations



Step 2 – Filter Senses and Part-of-Speech for each Emoji Sense to Populate EmojiNet



Step 3 – Perform Word Sense Disambiguation to Assign Meanings to Emoji Senses

Evaluation

- ✓ The Emoji Dictionary was merged with other open resources by matching the images in The Emoji Dictionary with images found in other resources. A nearest neighborhood-based image processing algorithm was used for this task and its accuracy was 98.42%.
- ✓ Two Word Sense Disambiguation (WSD) algorithms based on the **Most Frequent Sense (MFS)** and the **Most Popular Sense (MPS)** were used to assign meaning to emoji senses extracted from The Emoji Dictionary. Their combined WSD accuracy was 85.18%.

	Correct	Incorrect	Total
Noun	1,271 (83.28%)	255 (16.71%)	1,526
Verb	735 (84.00%)	140 (16.00%)	875
Adjective	725 (90.06%)	80 (9.93%)	805
Total	2,731 (85.18%)	475 (14.81%)	3,206

Table 2 – Word Sense Disambiguation Statistics

Emoji Resource	u	c	d	K	I	R	H	S
# of Emoji with each Feature	1,074	845	1,074	1,074	1,074	1,002	705	875
# of Records Stored for each Feature	1,074	845	1,074	8,069	28,370	9,743	8	3,206

Table 3 – EmojiNet Statistics

EmojiNet at Work

Let's disambiguate the sense of the 🙏 emoji in the tweets T1 and T2, where T1: *Pray for my family 🙏 God gained an angel today* and T2: *Hard to win, but we did it man 🙏 Lets celebrate*. EmojiNet lists two senses for 🙏 and they are pray(V) and highfive(N). We extract words from sense definitions available in EmojiNet for the above two senses. They are: highfive(N) – {palm, high, hand, slide, **celebrate**, raise, person, head, five} and pray(V) – {worship, thanksgiving, saint, **pray**, higher, **god**, confession}. We then calculate the overlap of the words in tweets with the words extracted from the sense definitions in EmojiNet. This leads us to decide that the 🙏 emoji in T1 refers to pray(V) and the 🙏 emoji in T2 refers to highfive(N).

Future Work

- ✓ Expand EmojiNet sense definitions with words extracted from tweets, using a word embeddings model trained on tweets with emoji.
- ✓ Evaluate the usability of EmojiNet using Emoji Sense Disambiguation and Emoji Similarity Finding tasks and expose EmojiNet as a web service. EmojiNet demo is available at <http://emojinet.knoesis.org/>

Reference – Sanjaya Wijeratne, Lakshika Balasuriya, Amit Sheth, Derek Doran. *EmojiNet: Building a Machine Readable Sense Inventory for Emoji*. In 8th International Conference on Social Informatics (SoCInfo 2016). Bellevue, WA, USA.

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