

# Linguistically Motivated Evaluation of Machine Translation Metrics based on a Challenge Set

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## Abstract

We employ a linguistically motivated challenge set in order to evaluate the state-of-the-art machine translation metrics submitted to the Metrics Shared Task of the 7th Conference for Machine Translation. The challenge set includes about 20,000 items extracted from 145 MT systems for two language directions (German  $\leftrightarrow$  English), covering more than 100 linguistically-motivated phenomena organized in a dozen of categories. The best performing metrics are YiSi-1, COMET-22 and BLEURT for German-English, and XL-DA for English-German, followed by BLEURT, COMET-22 and UniTE. Metrics in both directions are performing worst when it comes to named-entities & terminology. Particularly in German-English they are weak at detecting issues at punctuation, polar questions and idiom. In English-German, they perform worst at future II progressive of intransitive verbs, focus particles and present progressive of transitive verbs.

## 1 Introduction

Automatic evaluation metrics have been valuable tools for Machine Translation (MT), allowing quick evaluation and suggesting directions for further development. Many metrics have been suggested throughout the years, which in turn sets the requirement for their evaluation.

Whereas MT metrics so far have been evaluated based on the agreement of their scores with human judgments on test sets drawn from broad text, little research has taken place on investigating whether the performance of the metrics generalizes enough when evaluating particular cases. A more target way of evaluating metrics is using *challenge sets*. These are targeted test sets, which have been devised in such a way, so that they benchmark the ability of metrics to score particular translation phenomena.

In this paper we present empirical results on the performance of MT metrics, using an exten-

sive challenge set, which includes thousands of test items aiming to test the performance over more than one hundred linguistically-motivated phenomena in two language directions. It is based on thousands of manually created test items, their translation outputs from dozens of MT systems and semi-automatically evaluated with the supervision of linguists. Through this analysis we attempt to reveal strengths and weaknesses of several state-of-the-art MT metrics considering their background methods with regards to linguistic aspects.

The rest of the paper is structured as follows. In Section 2 related work is briefly described. In Section 3 we describe the construction of the challenge set and the evaluation protocol. The empirical results are outlined in Section 4, followed by a conclusion in Section 5.

## 2 Related work

The need for a thorough evaluation of Natural Language Processing (NLP) tools has lately received increased interest in the research community, indicated by a big amount of publications, among them several which received best paper awards (Ribeiro et al., 2020; Campolungo et al., 2022). When focusing on MT, first efforts were made in the 1990s with the introduction of test suites (King and Falkedal, 1990), which were revived after the latest advances in the field (Guillou and Hardmeier, 2016). To the best of our knowledge, the first efforts relevant to the application of challenge sets on MT metrics was presented as an analysis at the Findings paper of the Metrics shared task of the 6th Conference of Machine Translation (Freitag et al., 2021), based on the same test suite that we are using on this paper.

Hereby we are advancing as to that preliminary analysis by (a) increasing the number of challenge items to about 9,000-10,000, including outputs from state-of-the-art systems from 2021, (b) adding a second language direction (English-German) (c)

presenting a more fine-grained analysis, not only in the category level but also on the phenomenon level. This way we can get more confident and more generalisable empirical conclusions.

### 3 Method

#### 3.1 Test suite for MT systems

The challenge set is based on our test suite (Macketanz et al., 2022), a manually devised test suite for MT for German-English and its recently developed extension for English-German (Macketanz et al., 2021). The German-English side consists of 5,540 German test sentences covering 107 linguistically motivated phenomena, organized in 14 categories. The English-German side consists of 4,438 English test sentences covering 105 phenomena, organized in 12 categories.

The chosen phenomena do not follow a particular linguistic theory but their definition has been inspired by observing linguistic aspects which are relevant for MT. Each phenomenon is represented by at least 20 source test sentences to guarantee a balanced test set. The test suite is used to evaluate MT systems with regard to their performance on the phenomenon-targeting test sentences. The evaluation operates semi-automatically and it occurs based on a set of handwritten rules which contain regular expressions and fixed string tokens.

The above described test suite has been used to evaluate the outputs of 116 German-English and 29 English-German systems, submitted at the translation task of the Conference of Machine Translation (WMT) for four consequent years (2018-2021; Macketanz et al., 2018; Avramidis et al., 2019, 2020; Macketanz et al., 2021), including a preliminary system comparison in 2017 (Burchardt et al., 2017).

#### 3.2 Challenge set for MT metrics

Here we describe how the aforementioned test suite, along with inputs from previous shared tasks, is used in order to evaluate MT metrics. A challenge set for metrics requires contrastive pairs of correct/incorrect translations and a reference, whereas our original test suite contained only source sentences and handwritten rules for the outputs, but no reference translations. We therefore use the collected MT outputs to construct the challenge items for the metrics task in order to create the required challenge sets as following. For every source sentence of the test suite we create a tuple including:

- one correct translation, to be given to the metrics as reference translation; and a pair of
- another correct translation and
- one incorrect translation, the latter two intended to be given to the metrics for scoring.

In order to generate these tuples we perform random combinations of correct and wrong translations from the WMT outputs. Also, before collecting MT outputs, we filter out a part of the original test items, to be reserved for future evaluations.

The above process resulted into a metrics challenge set with 10,402 items for German-English and 8,945 items for English-German. The fact that the correct and incorrect translations have been sampled from real MT system outputs of the last 4 years, implies that these challenge set is closer to the real MT system ecosystem, as compared to artificially created challenge sets, which may contain translations that would never be produced by state-of-the-art MT.

#### 3.3 Evaluation of metrics

As explained, the challenge set consists of subsets of challenge items, where every subset has been deliberately created so that it can detect the metrics’ performance to a particular phenomenon. For every challenge item, the two MT outputs (correct/incorrect) are given unlabelled to the metrics as two separate MT hypotheses so that they score them against the aforementioned references and/or the source. The item is considered correctly scored, if the metric gives to the correct MT output a higher score than the incorrect MT output. Then the following statistics are calculated:

**Accuracy per phenomenon** is given by the ratio of all correctly-scored challenge items per phenomenon to the total number of challenge items for this phenomenon

**Accuracy per category** is given by the ratio of all correctly-scored challenge items per category to the total number of challenge items for this category (after aggregating the underlying phenomena of this category in one set).

**Significant tests for comparisons:** the highest metric accuracy for every phenomenon is compared to all other metric accuracies of the same phenomenon. For this, a one-tailed Z-test with  $\alpha = 0.95$  is calculated. The metrics whose accuracies that are not significantly worse than the highest accuracy, are considered to share the winning position for this phenomenon. The best accuracies per

category are calculated in the same way, after aggregating the challenge items from the underlying phenomena of every category.

**Statistics for metric categories:** We repeat this significance testing in two levels: one for all metrics participating in the shared task, and then separately for each one of the three metric categories (baseline, QE as a metric, reference-based). The significantly best systems per phenomenon over all metrics are indicated with a gray background, whereas the significantly best systems per metrics category are indicated with boldface.

Finally, we report three kinds of average scores: **Micro-average** treats all items equally, aggregating all test items to compute the average percentages; **Category macro-average** treats all categories equally by computing the percentages independently for each category and then averaging them **Phenomenon macro-average** treats all phenomena equally, by computing the percentages independently for each phenomenon and then averaging them

## 4 Results

The results are displayed in detail in Tables 1 and 2 in the category level and in Tables 3 and 4 for the phenomenon level, for both language directions German-English and English-German respectively.

### 4.1 Metric performance analysis

Here we are observing the statistics with a focus on comparing the performance of various metrics on the challenge set.

**German-English** The best performing metrics for German-English are YiSi-1 and COMET-22, achieving the significantly highest micro- and macro-average accuracies (84-85%), whereas for the macro-average, BLEURT is also included in the first significance cluster. Two QE based metrics, REUSE and MATESE, get the lowest accuracies.

When considering the systems performance with regards to particular categories, one can see that different metrics win in different combinations of categories. Most reference-based metrics perform best for at least four categories, apart from MS-COMET which only gets two.

Interestingly enough, two QE methods are the single winners of two particular categories, outperforming reference-aware metrics: COMET-Kiwi is the best performing system for *negation*(93%) and

HWTSC-TLM is the best performing system for *punctuation*.

**English-German** XL-DA is the only system which prevails in both micro- and macro-average for English-German, winning 5 individual categories, whereas another 3 systems share the first position for macro-average accuracy (BLEURT, COMET-22 and UniTE). Their average accuracies are close to 80%, which raises concerns, as this indicates that 2 out of 10 challenge items in average are not scored correctly in this language direction, even for the best performing metrics. The lowest scoring metric is MATESE in both QE and reference-based versions, very close to REUSE.

Also in this direction, QE methods manage to outperform reference-based metrics in a few categories. REUSE is the best performing metrics for *false friends*, COMET-KIWI and CROSS-QE for *function words* and MS-COMET-QE for *punctuation*.

### 4.2 Linguistically motivated analysis

Here we are looking closer to the results for particular phenomena or categories.

#### 4.2.1 German-English

**Category-level** The overall average accuracy of all metrics with regards to the linguistically motivated categories is at 77% for German-English. This indicates that the metrics failed in average to predict properly the scores for about one out of four challenge items that we provided. Even for the best categories, the accuracy achieved by most metrics is considerably below the acceptable limit of 90%.

The best performing categories in average are *false friends* and *negation* with 84-85% accuracy. For the rest of the categories, the average accuracy is less than 80%. The worst performing categories in average are *named entity and terminology* and *punctuation* with only 66% accuracy, whereas *Subordination* comes next with 71%. The lowest performing score for all systems and all categories is achieved by XL-MQM, which can only score correctly almost half of the punctuation challenge items (53%).

**Phenomenon-level** The best accuracy for this language pair is achieved for *Transitive, future I* where the metrics get an accuracy of 95%-100%. Another 10 phenomena score more than 85%. Four of them also refer to the future tenses of the transitive, in particular future I and future II in both the

plain and their subjunctive form. Additionally, one can see good performance in *pied-piping*, *modal future I*, *intransitive present*, *false friends*, *comma* and the *negated modal for future I subjunctive II*.

The lowest accuracy of all metrics in average is given for *polar questions* (59%), followed by *idioms* (61%). An average accuracy of less than 65% is given for some more phenomena, such as the ones including *dates*, *cleft sentences*, *internal possessors*, *locations*, *relative clauses* and *quotation marks*.

The lowest phenomenon accuracies are given by QE methods, and particularly when it comes to *idioms*, where HWTSC-TLM achieves the lowest performance of 17%. This is explainable by the fact that idioms require resolving rather rare semantic relations between the source and the MT output (used for QE), but can be easily resolved with lexical matching on the reference (used by reference-aware metrics). Idioms have shown to be a particular challenge for MT systems as well.

#### 4.2.2 English-German

**Category-level** The overall average accuracy of all metrics with regards to the linguistically motivated categories is at 70% for English-German. This is 7% lower than the respective average accuracy for German-English, indicating that the metrics for this MT language direction perform worse.

The category where all metrics perform best in average is *negation* (87%), whereas the one where they perform worse is *Named entity & terminology* (57%). The rest of the categories lie in rather mediocre accuracies, between 65% and 81%. The performance of metrics in English-German is worse than German-English in all categories apart from *Negation*, *punctuation* and *subordination*, although the comparisons between the language directions have to be taken with a grain of salt, due to the fact that the two directions consist of different items.

**Phenomenon-level** The English-German phenomena, where metrics perform best in average are the *Contact clause*, *Negation*, *Ditransitive - present progressive* and *question tags*, achieving more than 85% of accuracy. The most difficult phenomena to score are two Intransitive - future II progressive, Focus particle and Transitive - present progressive, which achieve less than 40% average accuracy.

Interestingly enough, in this language direction there are metrics which scored zero accuracies in

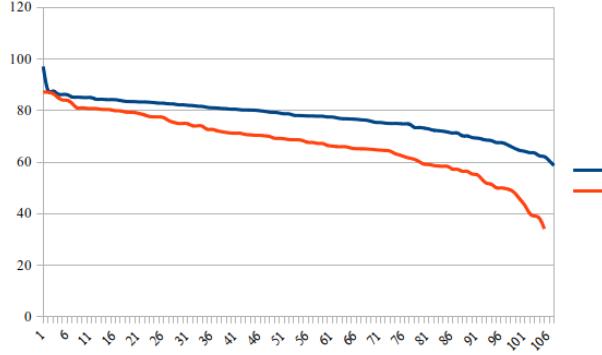


Figure 1: Plot of the accuracy of all phenomena per language direction. The accuracy percentage is shown on the vertical axis and the phenomena on the horizontal axis.

several phenomena, something that we didn't see in the opposite language direction <sup>1</sup>. These zero accuracies are mostly relevant to rare verb-related phenomena (e.g. intransitive constructions).

A comparative plot of the accuracies for all phenomena for both language directions can be seen in Figure 1. It is very clear that English-German lacks considerably, with its lowest scored phenomena being half of the lower-scored phenomena of the opposite direction.

## 5 Conclusion

In this paper we analyzed the performance of several state-of-the-art metrics with regards to particular linguistically-motivated phenomena for two language pairs, German-English and English-German. The analysis gave a multitude of observations, regarding both the performance of the metrics and the corresponding linguistic observations.

In an effort to draw conclusions after averaging accuracies, we conclude that the best performing metrics are YiSi-1, COMET-22 and BLEURT for German-English, and XL-DA for English-German, followed by BLEURT, COMET-22 and UniTE.

The metrics are particularly good at scoring the German-English verb tense *Transitive*, *future I* and the categories of *false friends* and *negation*. Concerning English-German, the best performing phenomena are *Contact clause* and *negation*.

On the contrary metrics in both directions are performing worst when it comes to *named-entities* & *terminology*. Particularly in German-English

<sup>1</sup>again this should take into consideration that English-German set has a participation of less systems and therefore less diversity than German-English

they are weak at detecting issues at *punctuation*, *polar questions* and *idiom*. In English-German at future II progressive of intransitive verbs, *focus particles* and *present progressive of transitive verbs*.

We believe that further investigation on particular phenomena or categories can provide explanations for the relevant observations and possibly lead to suggestions for technical improvements in the development of the metrics in the future. For example, many observations are also relevant to whether the metrics take into account for scoring the reference translation or the source (QE as a metric). Additionally, having seen several low accuracies regarding punctuation, we note that this issue is often handled via pre-processing scripts. The low percentages of scoring punctuation issues, show that the metrics should improve their engineering on that direction.

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category	#	baselines				qe-as-a-metric				ref-based-metrics				avg				
		BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	XL-DA	XL-MQM	MS-COMET	COMET-22	UniTE	
Ambiguity	298	71	80	80	<b>88</b>	<b>89</b>	80	60	<b>82</b>	67	65	73	88	<b>90</b>	88	87	<b>89</b>	80
Composition	252	65	74	72	87	<b>90</b>	74	73	76	59	76	<b>77</b>	<b>86</b>	82	82	83	81	77
Coordination & ellipsis	316	74	77	72	<b>79</b>	<b>80</b>	73	69	<b>82</b>	78	72	78	79	<b>83</b>	71	<b>84</b>	81	77
False friends	90	64	78	84	<b>93</b>	<b>92</b>	73	81	88	87	<b>91</b>	74	90	90	<b>93</b>	91	<b>93</b>	85
Function word	586	72	73	74	<b>83</b>	81	70	78	<b>81</b>	70	<b>81</b>	77	<b>84</b>	79	<b>83</b>	<b>83</b>	<b>83</b>	78
LDD & interrogatives	1014	75	76	82	<b>84</b>	<b>85</b>	79	72	<b>83</b>	63	75	<b>83</b>	<b>85</b>	82	80	<b>86</b>	84	80
MWE	610	73	78	72	<b>85</b>	<b>86</b>	70	70	<b>76</b>	56	60	<b>76</b>	<b>88</b>	<b>88</b>	78	86	<b>89</b>	77
Named entity & terminology	861	62	67	64	68	<b>76</b>	63	64	65	55	61	<b>71</b>	67	<b>75</b>	62	70	64	66
Negation	76	84	88	86	88	<b>91</b>	88	62	<b>93</b>	87	74	78	89	78	82	91	<b>92</b>	84
Non-verbal agreement	419	74	75	74	<b>83</b>	76	<b>75</b>	66	<b>75</b>	62	63	72	<b>83</b>	81	76	<b>84</b>	<b>84</b>	75
Punctuation	293	<b>77</b>	69	54	70	73	67	<b>81</b>	55	62	73	75	61	53	59	<b>68</b>	59	66
Subordination	679	69	69	70	<b>77</b>	74	67	59	72	65	62	<b>75</b>	75	70	68	<b>80</b>	77	71
Verb tense/aspect/mood	4697	69	77	63	85	<b>89</b>	76	63	81	78	71	<b>87</b>	84	79	83	<b>86</b>	84	78
Verb valency	211	70	72	77	88	<b>90</b>	72	64	<b>86</b>	62	64	72	91	88	84	<b>94</b>	91	79
macro avg.	10402	71	75	73	<b>83</b>	<b>84</b>	73	69	<b>78</b>	68	70	76	82	80	78	<b>84</b>	82	77
micro avg.	10402	70	75	68	82	<b>85</b>	74	66	78	70	70	<b>81</b>	82	79	79	<b>84</b>	82	77

Table 1: Accuracy of the metrics (%) with regards to the 14 linguistically motivated categories for German-English. The significantly best systems per phenomenon over all metrics are indicated with a gray background, whereas the significantly best systems per metrics category are indicated with boldface.

category	#	baselines				qe-as-a-metric				ref-based-metrics				avg											
		BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	REUSE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	MATESE-QE	XL-DA	XL-MQM	MEE2	MS-COMET	COMET-22	MATESE	MEE4	MEE	UniTE		
Ambiguity	146	71	<b>89</b>	72	<b>90</b>	87	47	15	<b>81</b>	55	38	38	38	47	37	<b>94</b>	89	87	81	84	61	91	73	92	69
Coordination & ellipsis	836	61	61	75	<b>80</b>	73	71	38	72	<b>76</b>	60	70	71	49	81	<b>83</b>	64	79	79	53	64	67	78	68	
False friends	225	63	<b>72</b>	62	70	67	52	<b>89</b>	64	67	63	68	60	52	71	71	82	76	69	57	<b>88</b>	69	71	68	
Function word	200	76	72	84	<b>90</b>	78	72	66	78	<b>91</b>	89	89	<b>92</b>	71	78	82	80	<b>90</b>	<b>90</b>	48	86	80	86	80	
MWE	829	72	77	78	<b>87</b>	85	71	32	79	78	79	79	<b>81</b>	57	86	86	80	<b>88</b>	86	58	80	76	87	77	
Named entity & terminology	1272	55	61	53	<b>66</b>	<b>64</b>	56	43	56	55	48	47	<b>59</b>	30	<b>73</b>	70	64	61	61	45	65	60	66	57	
Negation	174	83	85	86	89	<b>93</b>	87	78	87	<b>92</b>	<b>91</b>	<b>91</b>	86	84	82	81	92	83	91	88	91	82	<b>94</b>	87	
Non-verbal agreement	372	72	70	76	<b>81</b>	78	<b>81</b>	39	59	77	63	65	70	46	<b>89</b>	<b>90</b>	77	77	<b>90</b>	65	79	65	84	72	
Punctuation	336	<b>79</b>	74	77	76	77	<b>82</b>	46	70	68	62	62	72	58	67	60	75	69	79	54	75	63	<b>80</b>	69	
Subordination	994	74	74	<b>82</b>	80	78	80	48	81	<b>86</b>	82	83	82	58	<b>85</b>	84	74	<b>85</b>	<b>84</b>	58	76	65	84	76	
Verb tense/aspect/mood	3081	62	69	57	<b>70</b>	<b>69</b>	65	54	51	70	60	59	<b>77</b>	49	<b>78</b>	74	74	67	<b>77</b>	53	72	75	71	66	
Verb valency	480	64	71	76	<b>84</b>	76	77	48	65	<b>82</b>	70	72	74	47	78	78	71	79	<b>82</b>	60	69	60	78	71	
macro avg.	8945	69	73	73	<b>80</b>	77	70	50	70	<b>75</b>	67	69	73	53	<b>80</b>	79	77	78	<b>81</b>	58	78	70	<b>81</b>	72	
micro avg.	8945	65	69	67	<b>76</b>	73	68	48	63	<b>73</b>	64	65	<b>74</b>	49	<b>79</b>	77	73	73	78	55	73	69	76	69	

Table 2: Accuracy of the metrics (%) with regards to the 12 linguistically motivated categories for English-German

category	phenomenon	#	baselines										qe-as-a-metric			ref-based-metrics			avg
			BLEU	chRF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	XL-DA	XL-MQM	MS-COMET	COMET-22	UniTE	
Ambiguity	Lexical ambiguity	129	74	87	74	<b>95</b>	88	77	56	<b>81</b>	57	60	65	95	93	90	93	<b>99</b>	80
	Structural ambiguity	169	69	75	84	83	<b>89</b>	<b>82</b>	64	<b>82</b>	75	69	79	82	<b>88</b>	<b>86</b>	83	81	79
Composition	Compound	129	64	74	67	<b>90</b>	<b>91</b>	<b>70</b>	64	<b>71</b>	45	<b>70</b>	69	<b>90</b>	88	81	81	84	75
	Phrasal verb	123	66	74	78	85	<b>89</b>	79	83	81	74	82	<b>86</b>	81	76	82	<b>84</b>	79	80
Coordination & ellipsis	Gapping	51	76	76	80	<b>82</b>	71	92	59	<b>100</b>	75	75	98	80	<b>100</b>	82	98	88	83
	Right node raising	67	70	75	49	76	<b>91</b>	60	64	78	82	55	<b>84</b>	76	79	54	<b>82</b>	81	72
False friends	Sluicing	128	75	<b>79</b>	73	77	<b>78</b>	70	77	<b>80</b>	76	79	66	<b>81</b>	76	73	<b>80</b>	78	76
	Stripping	70	74	76	<b>87</b>	84	80	79	67	<b>77</b>	<b>83</b>	71	80	77	<b>89</b>	74	81	80	79
False friends	False friends	90	64	78	84	<b>93</b>	<b>92</b>	73	81	88	87	<b>91</b>	74	90	90	<b>93</b>	91	<b>93</b>	85
Function word	Focus particle	64	75	75	69	83	<b>88</b>	83	70	83	<b>88</b>	84	70	<b>88</b>	67	81	84	<b>88</b>	80
	Modal particle	166	79	77	67	<b>85</b>	<b>86</b>	75	69	<b>82</b>	<b>83</b>	81	75	<b>89</b>	83	87	<b>89</b>	86	81
LDD & interrogatives	Question tag	356	69	71	78	<b>82</b>	78	65	<b>84</b>	81	61	80	79	<b>81</b>	79	<b>82</b>	<b>81</b>	<b>81</b>	77
	Extended adjective construction	320	80	80	<b>89</b>	<b>88</b>	88	83	79	90	61	82	<b>93</b>	<b>89</b>	86	83	<b>90</b>	88	84
MWE	Extraposition	92	74	<b>83</b>	74	75	77	63	65	67	62	<b>79</b>	74	<b>80</b>	<b>79</b>	67	76	78	73
	Multiple connectors	87	<b>79</b>	76	69	63	76	59	67	<b>70</b>	64	63	68	66	57	<b>72</b>	68	64	68
MWE	Pied-piping	162	78	77	<b>97</b>	93	93	90	73	<b>96</b>	70	74	90	94	90	<b>96</b>	<b>95</b>	<b>95</b>	88
	Polar question	51	43	45	53	63	<b>67</b>	67	49	<b>69</b>	61	53	49	61	<b>75</b>	55	67	65	59
MWE	Scrambling	144	72	74	<b>90</b>	<b>90</b>	88	83	82	<b>90</b>	51	81	88	96	92	87	<b>98</b>	87	84
	Topicalization	61	85	84	79	<b>87</b>	<b>87</b>	74	66	<b>77</b>	<b>77</b>	70	69	<b>82</b>	70	80	<b>82</b>	<b>82</b>	78
MWE	Wh-movement	97	62	69	58	<b>85</b>	77	<b>81</b>	56	72	66	64	75	<b>81</b>	73	68	<b>81</b>	<b>82</b>	72
	Collocation	190	72	79	74	<b>91</b>	88	80	82	<b>84</b>	67	65	82	<b>91</b>	<b>91</b>	81	89	<b>92</b>	82
MWE	Idiom	133	67	69	55	76	<b>83</b>	42	36	44	20	17	<b>55</b>	<b>89</b>	86	65	75	<b>89</b>	61
	Prepositional MWE	146	79	84	71	<b>85</b>	<b>86</b>	65	82	82	72	<b>84</b>	<b>84</b>	<b>86</b>	<b>86</b>	75	85	80	80
Named entity & terminology	Verbal MWE	141	74	77	<b>88</b>	<b>87</b>	84	<b>89</b>	77	<b>89</b>	57	68	81	87	87	91	92	<b>94</b>	83
	Date	203	50	58	<b>65</b>	65	<b>66</b>	67	63	<b>70</b>	68	68	<b>70</b>	69	<b>74</b>	62	67	62	65
Negation	Domainspecific term	214	63	71	<b>74</b>	71	<b>74</b>	71	63	67	59	57	<b>77</b>	68	<b>75</b>	67	72	<b>74</b>	69
	Location	181	65	66	55	70	<b>82</b>	57	<b>76</b>	62	38	64	57	68	<b>80</b>	44	75	60	64
Negation	Measuring unit	203	67	72	58	61	<b>77</b>	57	54	57	56	51	<b>73</b>	62	<b>67</b>	66	63	54	62
	Proper name	60	75	73	75	85	<b>92</b>	62	72	78	50	70	<b>88</b>	78	85	<b>92</b>	85	85	78
Non-verbal agreement	Negation	76	84	88	86	88	<b>91</b>	88	62	<b>93</b>	87	74	78	89	78	82	91	<b>92</b>	84
	Coreference	251	68	72	85	<b>90</b>	<b>75</b>	<b>86</b>	73	81	66	69	77	<b>91</b>	88	84	<b>91</b>	<b>91</b>	81
Non-verbal agreement	External possessor	104	<b>88</b>	<b>88</b>	64	75	82	61	50	<b>70</b>	58	51	68	71	71	66	<b>76</b>	74	70
	Internal possessor	64	<b>80</b>	67	48	72	72	52	<b>62</b>	61	52	58	59	72	69	59	69	<b>75</b>	64

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category	phenomenon	#	baselines				qe-as-a-metric				ref-based-metrics				avg				
			BLEU	chRF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	XL-DA	XL-MQM	MS-COMET	COMET-22	UniTE	
Punctuation	Comma	46	91	87	78	<b>93</b>	89	74	83	85	87	85	<b>91</b>	<b>89</b>	80	78	<b>89</b>	83	85
	Quotation marks	247	<b>75</b>	65	49	66	70	65	<b>81</b>	49	57	71	72	56	48	55	<b>64</b>	55	62
Subordination	Adverbial clause	87	70	67	71	<b>82</b>	72	63	66	70	70	68	<b>74</b>	70	74	57	<b>77</b>	72	70
	Cleft sentence	109	<b>73</b>	66	61	67	66	51	48	66	62	64	<b>69</b>	66	64	66	<b>72</b>	69	65
	Free relative clause	70	67	71	66	<b>77</b>	67	<b>76</b>	50	60	63	56	70	74	54	66	77	<b>79</b>	67
	Indirect speech	119	64	70	<b>84</b>	81	71	66	58	<b>80</b>	57	58	75	83	65	65	<b>87</b>	85	72
	Infinitive clause	64	77	77	59	77	<b>78</b>	<b>77</b>	62	73	73	67	70	<b>75</b>	66	67	70	72	71
	Object clause	54	74	81	67	85	<b>89</b>	93	69	76	<b>94</b>	69	89	89	80	78	<b>93</b>	87	82
	Pseudo-cleft sentence	25	72	60	76	68	<b>92</b>	52	48	80	60	32	<b>100</b>	80	<b>92</b>	84	88	<b>92</b>	74
	Relative clause	71	63	<b>66</b>	65	65	<b>66</b>	58	59	<b>63</b>	48	59	61	62	66	68	<b>77</b>	70	64
	Subject clause	80	66	65	78	<b>85</b>	<b>86</b>	78	68	<b>86</b>	62	70	<b>86</b>	85	<b>88</b>	76	<b>86</b>	81	78
Verb tense/aspect/mood	Conditional	50	80	80	<b>88</b>	76	80	<b>82</b>	<b>82</b>	80	74	78	80	82	<b>88</b>	82	82	82	81
	Ditransitive - future I	121	72	71	69	<b>92</b>	88	89	58	<b>93</b>	85	68	<b>92</b>	92	85	83	<b>94</b>	<b>94</b>	83
	Ditransitive - future I subjunctive II	84	63	75	64	89	<b>95</b>	<b>96</b>	50	90	92	65	94	<b>93</b>	88	86	<b>92</b>	<b>93</b>	83
	Ditransitive - future II	97	60	71	58	82	<b>94</b>	64	58	<b>98</b>	69	69	<b>98</b>	85	78	87	<b>93</b>	87	78
	Ditransitive - future II subjunctive II	88	73	78	62	86	<b>97</b>	93	65	88	89	75	<b>99</b>	83	84	86	<b>89</b>	<b>89</b>	83
	Ditransitive - perfect	72	62	72	75	81	<b>93</b>	82	46	93	75	58	<b>96</b>	81	82	<b>92</b>	86	86	79
	Ditransitive - pluperfect	86	67	79	60	83	<b>88</b>	74	57	<b>81</b>	74	71	<b>83</b>	79	69	72	<b>86</b>	81	75
	Ditransitive - pluperfect subjunctive II	107	71	88	42	79	<b>92</b>	69	65	64	<b>75</b>	66	69	82	78	<b>88</b>	86	86	75
	Ditransitive - present	90	61	77	54	<b>91</b>	81	73	56	70	83	60	<b>99</b>	83	86	83	<b>88</b>	<b>89</b>	77
	Ditransitive - preterite	117	62	76	73	85	<b>89</b>	90	62	84	87	61	<b>91</b>	89	92	89	<b>95</b>	92	82
	Ditransitive - preterite subjunctive II	110	61	85	75	<b>95</b>	90	<b>92</b>	60	85	61	87	95	<b>96</b>	86	<b>96</b>	<b>95</b>	84	
	Imperative	98	78	79	84	<b>95</b>	89	84	78	<b>88</b>	57	74	84	90	87	<b>92</b>	88	<b>92</b>	83
	Intransitive - future I	32	53	72	56	88	<b>91</b>	97	69	84	<b>100</b>	91	97	88	88	<b>94</b>	84	88	84
	Intransitive - future I subjunctive II	56	61	70	48	<b>93</b>	89	80	55	93	<b>100</b>	68	95	<b>98</b>	84	86	95	<b>98</b>	82
	Intransitive - future II	62	60	77	35	<b>90</b>	89	55	45	79	69	58	<b>87</b>	95	94	84	90	92	75
	Intransitive - future II subjunctive II	94	72	89	59	94	<b>98</b>	69	63	80	86	82	<b>100</b>	<b>94</b>	85	91	91	89	84
	Intransitive - perfect	61	56	59	67	84	<b>87</b>	54	66	62	64	66	<b>69</b>	75	67	<b>77</b>	72	72	69
	Intransitive - pluperfect	85	79	85	47	85	<b>87</b>	58	46	68	<b>88</b>	55	86	<b>82</b>	71	79	78	73	73
	Intransitive - pluperfect subjunctive II	79	87	90	39	97	<b>100</b>	52	56	78	<b>95</b>	76	<b>94</b>	96	95	<b>99</b>	96	<b>97</b>	84
	Intransitive - present	54	69	74	63	91	<b>98</b>	96	65	96	94	76	<b>98</b>	89	93	91	<b>94</b>	93	86
	Intransitive - preterite	46	46	63	63	<b>89</b>	74	78	74	<b>93</b>	91	83	<b>93</b>	85	80	74	<b>87</b>	74	78
	Intransitive - preterite subjunctive II	100	43	51	64	<b>86</b>	79	80	58	79	<b>91</b>	67	89	87	<b>89</b>	73	<b>88</b>	78	75
	Modal - future I	42	90	<b>95</b>	76	88	<b>95</b>	93	76	83	74	83	<b>98</b>	88	76	<b>93</b>	88	86	86

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category	phenomenon	#	baselines				qe-as-a-metric				ref-based-metrics				avg				
			BLEU	chRF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	XL-DA	XL-MQM	MS-COMET	COMET-22	UniTE	
	Modal - future I subjunctive II	86	94	94	48	81	<b>97</b>	70	<b>78</b>	<b>79</b>	67	<b>79</b>	<b>78</b>	<b>85</b>	64	<b>86</b>	<b>85</b>	80	79
	Modal - perfect	149	72	72	57	74	<b>85</b>	62	67	<b>85</b>	47	77	81	66	57	69	<b>70</b>	66	69
	Modal - pluperfect	75	<b>100</b>	99	73	84	<b>100</b>	67	83	69	47	<b>91</b>	89	69	44	<b>80</b>	76	69	77
	Modal - pluperfect subjunctive II	61	72	80	69	79	<b>90</b>	80	69	85	85	79	<b>90</b>	80	75	<b>89</b>	84	82	81
	Modal - present	30	57	73	57	<b>93</b>	80	80	53	<b>90</b>	80	80	80	73	73	<b>80</b>	<b>80</b>	77	75
	Modal - preterite	72	61	74	65	<b>88</b>	<b>88</b>	89	54	90	<b>93</b>	78	92	<b>89</b>	81	81	<b>89</b>	83	81
	Modal - preterite subjunctive II	30	80	77	53	<b>83</b>	<b>83</b>	87	43	<b>93</b>	87	73	87	<b>83</b>	70	<b>83</b>	80	<b>83</b>	78
	Modal negated - future I	43	93	88	86	81	<b>100</b>	91	86	86	65	91	<b>93</b>	79	74	<b>91</b>	81	74	85
	Modal negated - future I subjunctive II	73	92	96	79	86	<b>97</b>	73	79	79	77	88	<b>92</b>	88	75	<b>90</b>	86	84	85
	Modal negated - perfect	126	50	62	63	66	<b>72</b>	70	60	73	63	71	<b>88</b>	63	61	<b>71</b>	63	61	66
	Modal negated - pluperfect	126	87	<b>99</b>	79	90	94	63	83	74	55	93	<b>95</b>	<b>88</b>	75	87	<b>88</b>	83	83
	Modal negated - pluperfect subjunctive II	81	65	74	63	73	<b>78</b>	69	64	59	<b>84</b>	79	<b>84</b>	79	75	<b>81</b>	73	70	73
	Modal negated - present	33	<b>79</b>	64	58	73	70	58	48	64	64	67	<b>88</b>	<b>79</b>	76	73	67	70	68
	Modal negated - preterite	61	66	87	67	<b>90</b>	89	<b>95</b>	38	90	<b>95</b>	75	82	80	80	82	<b>85</b>	80	80
	Modal negated - preterite subjunctive II	77	66	83	57	<b>91</b>	86	92	47	91	86	75	<b>95</b>	<b>83</b>	78	<b>84</b>	<b>84</b>	84	80
	Progressive	76	66	67	66	71	<b>75</b>	63	50	<b>75</b>	64	64	67	67	68	62	75	<b>80</b>	68
	Reflexive - future I	85	76	80	74	<b>89</b>	82	64	84	<b>86</b>	75	81	<b>85</b>	87	81	81	89	<b>92</b>	82
	Reflexive - future I subjunctive II	96	70	66	66	79	<b>84</b>	64	71	79	80	79	<b>89</b>	85	80	79	85	<b>89</b>	78
	Reflexive - future II	116	83	85	43	77	<b>97</b>	62	40	67	72	43	<b>73</b>	79	74	75	<b>87</b>	83	71
	Reflexive - future II subjunctive II	107	74	77	61	81	<b>93</b>	84	66	79	<b>91</b>	77	<b>92</b>	85	78	84	<b>89</b>	<b>88</b>	81
	Reflexive - perfect	188	64	62	68	<b>81</b>	<b>82</b>	73	53	<b>86</b>	78	54	<b>85</b>	82	78	82	<b>86</b>	84	75
	Reflexive - pluperfect	109	63	55	76	83	<b>87</b>	77	54	80	75	47	<b>83</b>	83	81	<b>87</b>	85	82	75
	Reflexive - pluperfect subjunctive II	90	76	80	52	79	<b>97</b>	70	66	70	<b>88</b>	70	81	74	64	<b>89</b>	81	78	76
	Reflexive - present	125	59	74	77	<b>90</b>	80	86	72	88	74	75	<b>92</b>	85	85	<b>90</b>	86	87	81
	Reflexive - preterite	117	69	75	67	85	<b>88</b>	81	54	76	66	56	<b>83</b>	<b>91</b>	85	75	88	89	77
	Reflexive - preterite subjunctive II	124	77	70	66	86	<b>91</b>	74	54	72	65	55	<b>83</b>	89	88	79	89	<b>91</b>	77
	Transitive - future I	43	95	95	86	<b>100</b>	<b>100</b>	95	86	<b>100</b>	<b>100</b>	<b>100</b>	95	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	97
	Transitive - future I subjunctive II	37	81	84	57	95	<b>100</b>	76	54	92	<b>100</b>	89	86	95	84	<b>97</b>	95	95	86
	Transitive - future II	33	76	94	45	94	<b>100</b>	88	70	88	88	<b>94</b>	64	<b>97</b>	85	91	94	94	85
	Transitive - future II subjunctive II	50	84	88	42	88	<b>100</b>	92	90	92	<b>98</b>	<b>98</b>	90	<b>92</b>	76	<b>92</b>	90	90	88
	Transitive - perfect	99	64	80	42	81	<b>88</b>	<b>91</b>	73	79	78	86	76	76	81	<b>88</b>	81	79	78
	Transitive - pluperfect	22	73	82	50	82	<b>91</b>	68	73	73	68	<b>77</b>	<b>77</b>	86	77	73	<b>91</b>	82	76
	Transitive - pluperfect subjunctive II	39	85	97	36	64	<b>100</b>	33	69	49	<b>92</b>	67	54	74	62	<b>97</b>	72	72	70
	Transitive - present	33	58	73	58	<b>94</b>	91	79	82	88	88	79	<b>94</b>	<b>94</b>	91	88	91	88	83

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category	phenomenon	#	baselines									qe-as-a-metric			ref-based-metrics				
			BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	XL-DA	XL-MQM	MS-COMET	COMET-22	UniTE	avg
Verb valency	Transitive - preterite	57	51	63	77	<b>86</b>	82	82	67	<b>95</b>	93	68	91	91	<b>100</b>	82	<b>100</b>	86	82
	Transitive - preterite subjunctive II	97	40	60	76	<b>86</b>	84	80	73	<b>86</b>	74	80	<b>84</b>	<b>84</b>	79	<b>85</b>	82	77	
	Case government	80	65	62	79	<b>88</b>	<b>89</b>	80	71	<b>94</b>	52	66	75	92	92	<b>95</b>	92	79	
	Mediopassive voice	50	64	66	66	<b>82</b>	80	58	50	<b>74</b>	64	50	66	88	88	<b>90</b>	86	72	
	Passive voice	33	85	82	79	91	<b>94</b>	73	64	<b>94</b>	64	61	79	91	91	88	<b>94</b>	<b>94</b>	83
	Resultative predicates	48	73	85	85	94	<b>98</b>	73	69	<b>81</b>	73	75	67	94	79	94	<b>96</b>	94	83
macro avg.		10402	71	76	67	83	<b>86</b>	74	65	79	73	71	<b>82</b>	83	79	80	<b>84</b>	83	77
micro avg.		10402	70	75	68	82	<b>85</b>	74	66	78	70	70	<b>81</b>	82	79	79	<b>84</b>	82	77

Table 3: Accuracy of the metrics(%) with regards to the linguistically-motivated phenomena for German-English

category	phenomenon	#	baselines									qe-as-a-metric			ref-based-metrics				Ambiguity	Coordination & ellipsis	False friends	Function word	MWE		
			BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	REUSE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	MATESE-QE	XL-DA	XL-MQM	MEE2	MS-COMET	COMET-22	MATESE	MEE4	MEE	UniTE	avg
Ambiguity	Lexical ambiguity	146	71	<b>89</b>	72	<b>90</b>	87	47	15	<b>81</b>	55	38	38	47	37	<b>94</b>	89	87	81	84	61	91	73	92	69
	Gapping	163	58	68	77	<b>84</b>	74	78	58	71	<b>80</b>	37	67	71	67	80	<b>88</b>	67	83	79	68	64	71	77	71
	Pseudogapping	201	77	67	92	<b>97</b>	82	79	26	81	<b>93</b>	80	80	<b>92</b>	57	<b>97</b>	93	78	89	96	72	79	85	<b>96</b>	81
	Right node raising	47	64	72	<b>94</b>	87	83	<b>91</b>	9	81	87	34	<b>91</b>	81	81	91	96	68	85	94	9	68	66	<b>98</b>	74
	Sluicing	169	56	54	51	<b>63</b>	59	57	51	<b>61</b>	56	46	51	47	28	<b>67</b>	<b>67</b>	59	64	62	36	59	63	54	55
	Stripping	139	58	58	60	65	<b>68</b>	57	38	53	<b>63</b>	55	55	53	32	67	<b>82</b>	63	65	68	37	61	55	70	58
Coordination & ellipsis	VP-ellipsis	117	47	51	<b>90</b>	85	75	74	26	<b>95</b>	84	92	92	85	48	85	80	42	<b>89</b>	82	60	47	51	85	71
	False friends	225	63	<b>72</b>	62	70	67	52	<b>89</b>	64	67	63	68	60	52	71	71	82	76	69	57	<b>88</b>	69	71	68
	Focus particle	20	30	35	25	<b>80</b>	45	35	<b>55</b>	15	45	10	10	50	10	60	55	30	35	<b>75</b>	5	35	30	70	38
	Question tag	180	82	76	<b>91</b>	<b>91</b>	82	77	68	84	96	<b>98</b>	<b>98</b>	<b>97</b>	78	80	85	86	<b>96</b>	92	53	92	85	88	85
	Collocation	112	61	76	78	<b>92</b>	88	76	46	89	88	<b>91</b>	<b>91</b>	86	57	93	<b>96</b>	76	86	<b>95</b>	74	79	56	<b>95</b>	80

Continued on next page

category	phenomenon	#	baselines										qe-as-a-metric										ref-based-metrics				
			BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	REUSE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	MATESE-QE	XL-DA	XL-MQM	MEE2	MS-COMET	COMET-22	MATESE	MEE4	MEE	UniTE	avg		
Named entity & terminology	Compound	63	51	84	<b>89</b>	70	87	71	3	89	98	90	90	<b>100</b>	68	90	<b>97</b>	76	87	<b>97</b>	33	73	68	92	78		
	Idiom	266	82	75	86	<b>95</b>	92	83	22	<b>93</b>	86	73	73	<b>92</b>	61	97	97	86	96	<b>98</b>	64	85	89	<b>97</b>	83		
	Nominal MWE	288	71	78	66	<b>84</b>	81	60	39	66	62	<b>82</b>	<b>82</b>	72	50	72	74	79	<b>88</b>	69	47	78	76	75	70		
	Prepositional MWE	35	<b>86</b>	83	<b>86</b>	71	<b>86</b>	<b>86</b>	83	60	66	77	77	77	69	86	86	86	69	80	69	86	<b>89</b>	80	79		
	Verbal MWE	65	71	74	83	<b>89</b>	62	48	23	69	<b>83</b>	65	65	58	52	85	75	74	71	<b>86</b>	68	77	65	82	69		
	Date	234	53	60	69	<b>74</b>	68	81	31	80	63	83	83	<b>93</b>	59	67	<b>76</b>	60	67	65	65	60	60	71	68		
	Domainspecific term	312	56	76	71	<b>89</b>	86	65	33	<b>78</b>	73	42	42	62	25	<b>97</b>	94	77	91	78	72	79	73	80	70		
	Location	12	83	58	<b>92</b>	75	50	<b>100</b>	83	<b>100</b>	<b>100</b>	<b>100</b>	92	92	8	<b>100</b>	<b>100</b>	83	83	75	33	92	75	83	80		
	Measuring unit	389	48	<b>55</b>	24	53	<b>54</b>	28	<b>43</b>	21	28	15	15	31	11	<b>69</b>	58	58	33	46	21	61	54	53	40		
	Proper name	325	<b>61</b>	54	58	52	53	59	62	58	64	<b>67</b>	64	64	39	58	55	59	58	59	36	60	55	<b>65</b>	57		
Negation	Negation	174	83	85	86	89	<b>93</b>	87	78	87	<b>92</b>	<b>91</b>	<b>91</b>	86	84	82	81	92	83	91	88	91	82	<b>94</b>	87		
Non-verbal agreement	Coreference	81	86	86	<b>96</b>	<b>95</b>	75	<b>90</b>	41	33	77	56	60	73	60	<b>98</b>	<b>100</b>	89	85	96	93	88	73	93	79		
Punctuation	Genitive	206	73	68	<b>86</b>	73	82	73	22	<b>83</b>	70	62	64	63	52	<b>85</b>	<b>86</b>	75	78	84	52	76	63	79	70		
	Possession	85	55	58	31	<b>86</b>	74	<b>92</b>	78	26	<b>93</b>	74	74	86	19	88	91	69	66	<b>96</b>	68	76	64	89	71		
	Quotation marks	336	<b>79</b>	74	77	76	77	<b>82</b>	46	70	68	62	62	72	58	67	60	75	69	79	54	75	63	<b>80</b>	69		
	Adverbial clause	193	81	73	<b>89</b>	81	67	75	65	79	<b>88</b>	79	79	77	46	<b>86</b>	<b>85</b>	77	80	82	37	77	67	81	75		
	Cleft sentence	179	63	57	<b>74</b>	60	63	61	45	72	74	<b>80</b>	<b>80</b>	59	60	<b>73</b>	67	68	<b>72</b>	71	54	68	60	71	66		
Subordination	Contact clause	150	75	74	<b>95</b>	<b>94</b>	88	91	53	<b>99</b>	<b>98</b>	<b>97</b>	<b>97</b>	<b>97</b>	87	<b>97</b>	<b>97</b>	73	95	<b>98</b>	81	75	59	<b>97</b>	87		
	Indirect speech	38	42	47	<b>74</b>	63	50	37	24	58	<b>95</b>	50	50	63	58	63	68	42	<b>79</b>	76	47	42	39	74	56		
	Infinitive clause	85	55	80	80	86	<b>95</b>	96	40	78	95	71	81	<b>99</b>	59	89	91	61	<b>94</b>	<b>93</b>	67	69	51	<b>93</b>	78		
	Object clause	16	38	56	62	<b>88</b>	62	81	31	56	81	<b>94</b>	<b>94</b>	62	0	<b>100</b>	<b>100</b>	50	81	88	19	62	56	<b>100</b>	66		
	Pseudo-cleft sentence	73	88	<b>89</b>	73	66	<b>90</b>	<b>86</b>	70	81	68	<b>88</b>	<b>88</b>	85	64	85	<b>86</b>	85	85	75	64	<b>88</b>	82	71	80		
	Relative clause	112	83	84	73	<b>90</b>	82	<b>95</b>	36	78	88	73	73	93	66	<b>94</b>	89	79	92	91	68	82	69	<b>93</b>	80		
	Subject clause	148	<b>90</b>	<b>90</b>	84	89	<b>91</b>	<b>88</b>	33	87	<b>89</b>	<b>88</b>	<b>88</b>	<b>89</b>	37	84	82	86	<b>86</b>	86	57	<b>88</b>	78	<b>86</b>	81		
	Conditional	106	77	70	92	<b>94</b>	91	<b>98</b>	18	86	92	92	92	87	36	<b>92</b>	84	84	89	87	58	89	80	<b>92</b>	81		
	Ditransitive - conditional I progressive	72	49	61	89	<b>93</b>	83	61	74	94	<b>99</b>	74	93	<b>99</b>	65	<b>93</b>	82	71	<b>92</b>	<b>92</b>	69	67	79	<b>92</b>	80		
	Ditransitive - conditional I simple	34	74	94	62	65	<b>97</b>	71	91	41	<b>100</b>	41	44	97	47	97	94	94	94	65	<b>100</b>	38	97	97	<b>100</b>	78	
Verb tense/aspect/mood	Ditransitive - conditional II progressive	51	78	82	78	<b>88</b>	80	<b>80</b>	63	51	65	49	55	67	71	84	82	84	84	90	59	84	<b>98</b>	86	75		
	Ditransitive - conditional II simple	59	64	68	66	<b>76</b>	66	68	59	53	<b>69</b>	47	49	56	53	<b>80</b>	78	78	69	73	51	<b>80</b>	78	76	66		
	Ditransitive - future I progressive	61	51	<b>62</b>	34	<b>62</b>	57	79	90	84	<b>92</b>	49	66	51	11	<b>79</b>	75	56	43	66	11	59	57	69	59		
	Ditransitive - future I simple	88	51	<b>60</b>	50	56	56	69	<b>90</b>	52	66	42	48	50	16	<b>65</b>	<b>64</b>	57	52	58	34	<b>65</b>	59	59	55		
	Ditransitive - future II progressive	91	64	60	<b>66</b>	<b>66</b>	47	74	56	84	70	<b>95</b>	<b>95</b>	45	41	65	62	71	69	82	36	76	<b>91</b>	74	68		
	Ditransitive - future II simple	49	<b>94</b>	<b>94</b>	39	86	65	86	88	76	<b>100</b>	59	59	92	12	86	39	90	88	92	57	90	90	<b>96</b>	76		
	Ditransitive - past perfect progressive	91	44	58	<b>67</b>	60	<b>66</b>	66	37	51	65	73	69	<b>75</b>	52	<b>78</b>	71	60	63	71	55	62	69	68	63		

Continued on next page

category	phenomenon	#	baselines										qe-as-a-metric										ref-based-metrics				
			BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	REUSE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	MATESE-QE	XL-DA	XL-MQM	MEE2	MS-COMET	COMET-22	MATESE	MEE4	MEE	UniTE	avg		
Ditransitive - past perfect simple	112	62	71	40	65	<b>72</b>	51	43	37	56	54	38	<b>79</b>	30	71	57	69	<b>74</b>	70	41	70	71	66	58			
Ditransitive - past progressive	83	57	61	45	<b>70</b>	59	24	<b>71</b>	39	61	37	37	37	20	<b>72</b>	67	61	47	70	13	66	60	54	51			
Ditransitive - present perfect progressive	48	54	88	<b>94</b>	85	92	<b>100</b>	52	90	85	<b>100</b>	<b>100</b>	94	81	79	73	83	<b>94</b>	92	65	81	77	90	84			
Ditransitive - present perfect simple	54	37	41	35	<b>56</b>	30	30	33	31	33	<b>39</b>	30	33	28	65	59	63	41	48	26	<b>67</b>	65	59	43			
Ditransitive - present progressive	72	38	68	<b>93</b>	<b>94</b>	90	<b>99</b>	35	<b>99</b>	<b>100</b>	<b>99</b>	<b>99</b>	<b>100</b>	93	88	88	86	<b>100</b>	96	88	83	75	97	87			
Ditransitive - simple past	77	56	66	65	<b>77</b>	56	73	82	69	<b>97</b>	86	73	94	40	79	84	81	70	<b>94</b>	69	82	75	82	75			
Ditransitive - simple present	54	30	56	39	<b>83</b>	<b>83</b>	57	28	67	67	67	67	<b>70</b>	70	81	<b>83</b>	74	72	59	80	74	65	80	66			
Gerund	161	85	80	81	<b>96</b>	92	89	78	58	97	92	92	<b>99</b>	19	<b>96</b>	<b>96</b>	77	95	<b>97</b>	25	83	56	<b>96</b>	81			
Imperative	50	50	70	<b>98</b>	96	70	72	82	78	<b>100</b>	90	90	92	48	96	90	70	<b>100</b>	96	62	76	66	92	81			
Intransitive - conditional I progressive	9	89	78	<b>100</b>	89	<b>100</b>	<b>100</b>	0	<b>100</b>	22	22	22	44	67	33	56	89	89	89	44	<b>100</b>	78	<b>100</b>	72			
Intransitive - conditional I simple	3	0	33	0	67	<b>100</b>	<b>100</b>	<b>100</b>	33	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	67	<b>100</b>	67	67	<b>100</b>	<b>100</b>	<b>100</b>	0	67	73				
Intransitive - future I progressive	7	86	<b>100</b>	43	<b>100</b>	57	57	<b>71</b>	0	57	29	29	57	29	71	<b>100</b>	86	86	86	0	86	86	<b>100</b>	64			
Intransitive - future I simple	24	<b>75</b>	67	<b>75</b>	<b>75</b>	50	79	96	71	96	54	54	<b>100</b>	29	58	58	<b>67</b>	62	62	54	<b>67</b>	<b>67</b>	62	67			
Intransitive - future II progressive	4	<b>50</b>	<b>50</b>	0	25	<b>50</b>	25	25	<b>75</b>	<b>75</b>	25	25	0	0	50	<b>75</b>	25	25	50	0	25	50	25	34			
Intransitive - future II simple	7	<b>100</b>	<b>100</b>	86	86	<b>100</b>	<b>100</b>	57	<b>100</b>	57	57	<b>100</b>	43	43	43	86	<b>100</b>	<b>100</b>	14	86	57	86	77				
Intransitive - past perfect progressive	16	50	62	25	38	<b>69</b>	<b>81</b>	38	38	50	44	44	69	31	56	38	<b>62</b>	50	50	12	<b>62</b>	56	25	48			
Intransitive - past perfect simple	18	72	78	<b>89</b>	<b>89</b>	61	17	44	89	<b>94</b>	89	89	50	17	78	67	78	78	83	11	78	<b>89</b>	72	69			
Intransitive - past progressive	28	57	57	32	<b>71</b>	54	43	46	46	<b>68</b>	36	36	50	21	<b>57</b>	54	<b>57</b>	<b>57</b>	50	32	54	50	54	49			
Intransitive - present perfect simple	2	50	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	0	<b>100</b>	50	<b>100</b>	<b>100</b>	<b>100</b>	0	<b>100</b>	50	<b>100</b>	84			
Intransitive - present progressive	5	<b>100</b>	<b>100</b>	80	80	80	<b>80</b>	60	0	<b>80</b>	0	0	0	<b>80</b>	<b>80</b>	80	<b>100</b>	60	80	80	<b>100</b>	80	80	72			
Intransitive - simple past	24	38	46	33	<b>62</b>	58	58	96	96	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>	42	62	58	58	54	<b>71</b>	67	<b>71</b>	38	<b>71</b>	67			
Intransitive - simple present	10	30	40	<b>80</b>	50	40	60	40	40	70	60	60	70	<b>80</b>	60	50	30	30	70	<b>80</b>	30	20	50	52			
Modal	20	<b>60</b>	55	35	40	45	95	<b>100</b>	50	10	45	45	15	0	35	35	70	60	25	0	<b>75</b>	60	45	45			
Modal negated	20	65	60	35	<b>70</b>	65	55	70	50	65	<b>95</b>	<b>95</b>	<b>95</b>	0	<b>95</b>	80	70	70	85	5	70	50	90	65			
Reflexive - conditional I progressive	65	<b>52</b>	46	35	48	45	45	28	15	38	25	25	63	<b>65</b>	83	<b>85</b>	66	35	52	63	54	77	57	50			
Reflexive - conditional I simple	112	<b>70</b>	<b>70</b>	46	48	58	57	37	9	32	32	32	<b>100</b>	80	86	89	78	57	64	<b>90</b>	68	<b>91</b>	60	62			
Reflexive - conditional II progressive	97	<b>72</b>	69	67	66	61	54	49	10	64	28	28	<b>80</b>	70	87	89	84	62	84	74	73	<b>91</b>	73	65			
Reflexive - conditional II simple	109	68	61	<b>72</b>	52	54	40	28	11	50	25	19	<b>92</b>	65	83	<b>91</b>	73	41	78	88	56	86	57	59			
Reflexive - future I progressive	70	67	79	61	70	<b>84</b>	66	64	60	59	<b>83</b>	<b>83</b>	66	47	<b>80</b>	76	71	61	79	53	61	74	69	69			
Reflexive - future I simple	83	67	<b>86</b>	39	71	76	55	63	49	61	<b>67</b>	<b>67</b>	61	41	<b>78</b>	72	<b>78</b>	55	76	53	70	<b>80</b>	65	65			
Reflexive - future II progressive	81	56	<b>80</b>	44	64	75	54	53	54	73	65	65	88	<b>91</b>	<b>85</b>	80	78	73	83	62	74	75	70	70			
Reflexive - future II simple	56	66	<b>88</b>	43	77	<b>88</b>	66	68	61	79	59	59	<b>98</b>	55	79	71	80	62	88	57	73	<b>89</b>	68	72			
Reflexive - past perfect progressive	98	50	66	56	67	<b>71</b>	53	51	33	66	45	45	<b>82</b>	60	71	72	68	68	<b>76</b>	44	66	72	60	61			
Reflexive - past perfect simple	53	47	55	72	68	<b>74</b>	47	43	25	64	23	23	<b>98</b>	66	79	85	66	60	<b>87</b>	72	64	81	68	62			

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category	phenomenon	#	baselines										qe-as-a-metric										ref-based-metrics				
			BLEU	chrF	COMET-QE	BLEURT	YiSi-1	MS-COMET-QE	REUSE	HWTSC-TLM	COMET-Kiwi	KG-BERT	HWTSC-TS	CROSS-QE	MATESE-QE	XL-DA	XL-MQM	MEE2	MS-COMET	COMET-22	MATESE	MEE4	MEE	UniTE	avg		
Verb valency	Reflexive - past progressive	5	<b>100</b>	<b>100</b>	20	40	<b>100</b>	20	40	20	<b>80</b>	20	20	20	40	80	80	<b>100</b>	<b>100</b>	80	40	<b>100</b>	<b>100</b>	80	65		
	Reflexive - present perfect progressive	33	48	76	70	<b>88</b>	76	61	24	64	<b>100</b>	64	64	<b>100</b>	<b>100</b>	97	<b>100</b>	79	82	<b>100</b>	97	79	97	82	79		
	Reflexive - present perfect simple	39	46	<b>72</b>	67	67	69	59	54	79	74	72	72	<b>92</b>	90	<b>87</b>	85	69	64	85	77	72	77	72	73		
	Reflexive - present progressive	99	51	56	48	54	<b>67</b>	56	46	27	36	24	24	<b>77</b>	56	62	70	68	46	58	62	59	<b>76</b>	57	53		
	Reflexive - simple past	119	70	<b>77</b>	34	73	73	61	53	37	<b>89</b>	73	67	83	62	82	76	75	72	<b>91</b>	44	69	79	72	69		
	Reflexive - simple present	138	65	63	52	67	<b>88</b>	57	32	39	44	62	56	<b>89</b>	76	70	69	75	62	62	64	70	<b>78</b>	54	63		
	Transitive - future II progressive	11	<b>82</b>	<b>82</b>	55	73	64	<b>91</b>	73	82	73	<b>91</b>	<b>91</b>	55	45	<b>91</b>	82	82	73	82	18	82	82	82	74		
	Transitive - conditional I progressive	11	<b>91</b>	82	0	45	36	64	<b>82</b>	36	55	27	27	18	18	45	27	<b>91</b>	55	45	36	<b>91</b>	<b>91</b>	36	50		
	Transitive - conditional I simple	9	<b>100</b>	<b>100</b>	11	89	56	56	67	56	<b>100</b>	56	56	67	33	78	44	<b>100</b>	78	<b>100</b>	56	<b>100</b>	<b>100</b>	67	71		
	Transitive - conditional II progressive	20	55	55	55	75	<b>80</b>	60	60	35	<b>75</b>	50	50	40	10	70	65	65	65	<b>85</b>	50	75	55	55	58		
	Transitive - conditional II simple	2	<b>100</b>	<b>100</b>	50	<b>100</b>	<b>100</b>	50	50	50	<b>100</b>	50	50	50	0	<b>100</b>	50	<b>100</b>	<b>100</b>	<b>100</b>	50	<b>100</b>	<b>100</b>	<b>100</b>	75		
	Transitive - future I progressive	12	<b>83</b>	50	42	75	25	<b>75</b>	50	50	<b>75</b>	42	42	50	42	42	42	17	<b>83</b>	33	67	75	<b>83</b>	<b>83</b>	58	56	
	Transitive - future I simple	22	<b>95</b>	77	32	64	59	<b>82</b>	50	41	36	36	36	50	14	59	36	<b>91</b>	59	55	50	86	<b>91</b>	59	57		
	Transitive - future II simple	39	<b>92</b>	85	10	59	67	79	46	64	<b>82</b>	72	72	<b>82</b>	13	72	38	<b>87</b>	74	69	23	85	<b>87</b>	67	65		
	Transitive - past perfect progressive	16	69	<b>81</b>	75	50	<b>81</b>	<b>94</b>	56	38	62	38	38	75	12	62	38	<b>81</b>	69	75	38	75	69	50	60		
	Transitive - past perfect simple	9	78	<b>89</b>	44	<b>89</b>	33	<b>100</b>	44	89	<b>100</b>	78	78	56	0	78	78	<b>89</b>	44	<b>89</b>	67	<b>89</b>	78	67	71		
	Transitive - present perfect progressive	5	<b>80</b>	<b>80</b>	<b>80</b>	20	<b>100</b>	20	<b>100</b>	40	60	60	40	0	60	20	<b>80</b>	60	60	60	<b>80</b>	<b>80</b>	40	59			
	Transitive - present perfect simple	9	67	<b>78</b>	67	<b>78</b>	44	<b>100</b>	44	<b>100</b>	78	78	78	33	0	67	33	<b>78</b>	56	<b>78</b>	56	<b>78</b>	67	67	65		
	Transitive - present progressive	10	<b>70</b>	40	10	20	30	<b>60</b>	0	40	50	40	40	40	30	50	50	<b>60</b>	20	30	40	50	<b>60</b>	30	39		
	Transitive - simple past	23	43	57	52	<b>96</b>	35	<b>91</b>	61	61	87	57	57	52	43	<b>91</b>	70	61	65	87	70	74	43	87	65		
	Transitive - simple present	16	62	62	25	38	<b>69</b>	50	50	31	<b>94</b>	31	31	44	19	50	25	62	62	<b>81</b>	44	62	56	44	50		
	Case government	57	67	70	72	75	<b>82</b>	81	44	72	<b>86</b>	68	77	79	68	77	75	81	70	<b>82</b>	68	81	75	77	74		
	Catenative verb	177	58	62	74	<b>86</b>	70	<b>80</b>	28	71	77	71	71	67	25	67	72	63	<b>79</b>	76	47	59	55	72	65		
	Middle voice	29	69	83	<b>97</b>	93	79	72	31	<b>90</b>	79	86	86	76	31	<b>97</b>	93	86	93	83	79	90	62	93	79		
	Passive voice	70	51	71	<b>74</b>	67	66	64	47	76	<b>87</b>	71	71	74	36	79	70	64	73	<b>87</b>	47	60	53	60	66		
	Resultative	147	74	80	77	<b>90</b>	86	80	76	45	<b>84</b>	66	68	80	74	88	87	78	82	88	75	78	63	<b>92</b>	78		
macro avg.		8945	65	70	62	<b>74</b>	70	70	53	60	<b>75</b>	62	63	72	45	<b>77</b>	73	74	71	<b>79</b>	52	74	70	74	67		
micro avg.		8945	65	69	67	<b>76</b>	73	68	48	63	<b>73</b>	64	65	<b>74</b>	49	<b>79</b>	77	73	73	78	55	73	69	76	69		

Table 4: Accuracy of the metrics(%) with regards to the linguistically-motivated phenomena for English-German