



# Preserving MT Quality for Content With Inline Tags

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#### **AGENDA**

Why tags and placeholders are important?

MT + tags = it's complicated

Intento Solution: Smart Tag Handling

Experimental setting

Experimental results

Current status and next steps

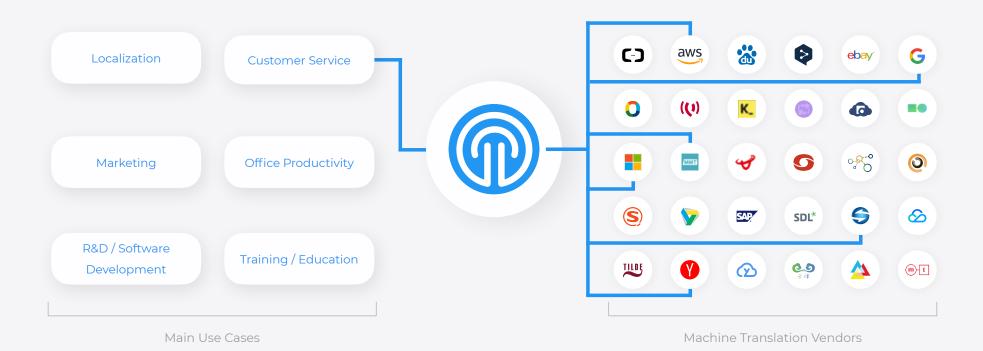




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#### **ABOUT INTENTO**

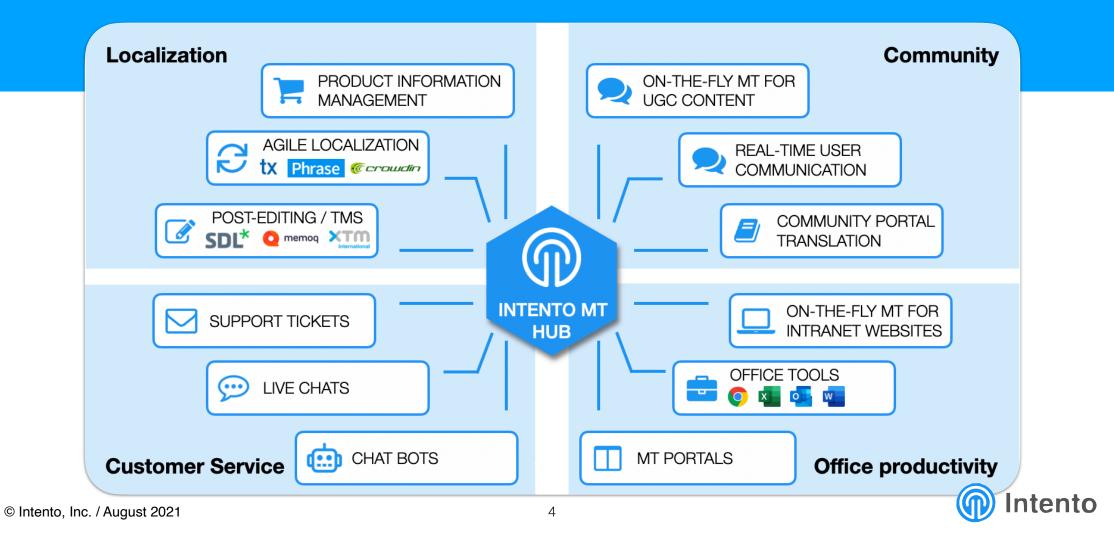
Intento MT Hub integrates AI/ML models from many vendors into the business processes, choosing the best-fit combination for every use case



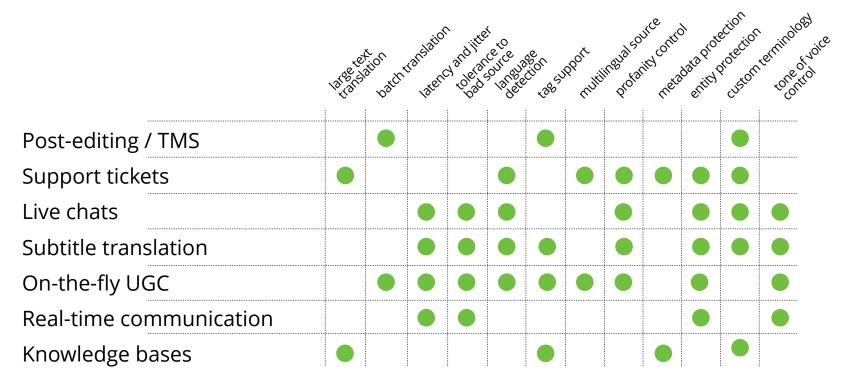
**INTENTO** 

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#### **MULTI-PURPOSE MT**

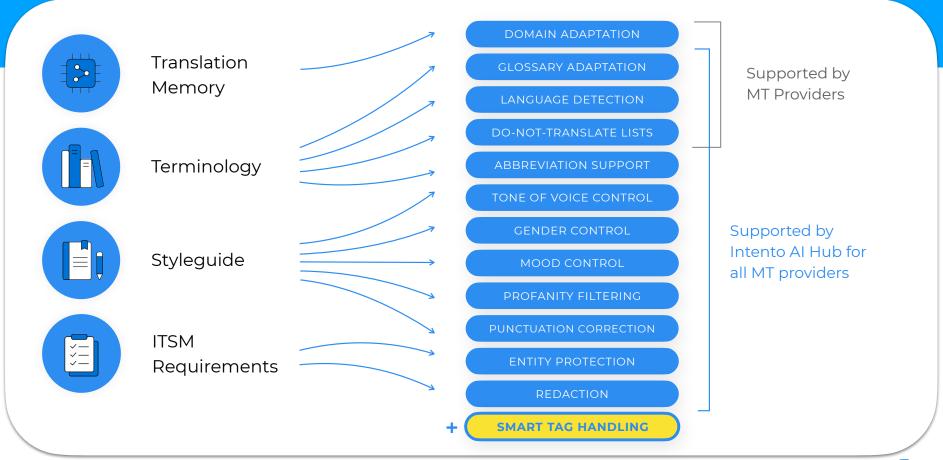


# MT REQUIREMENTS MATRIX EVERY CASE HAS ITS OWN NEEDS





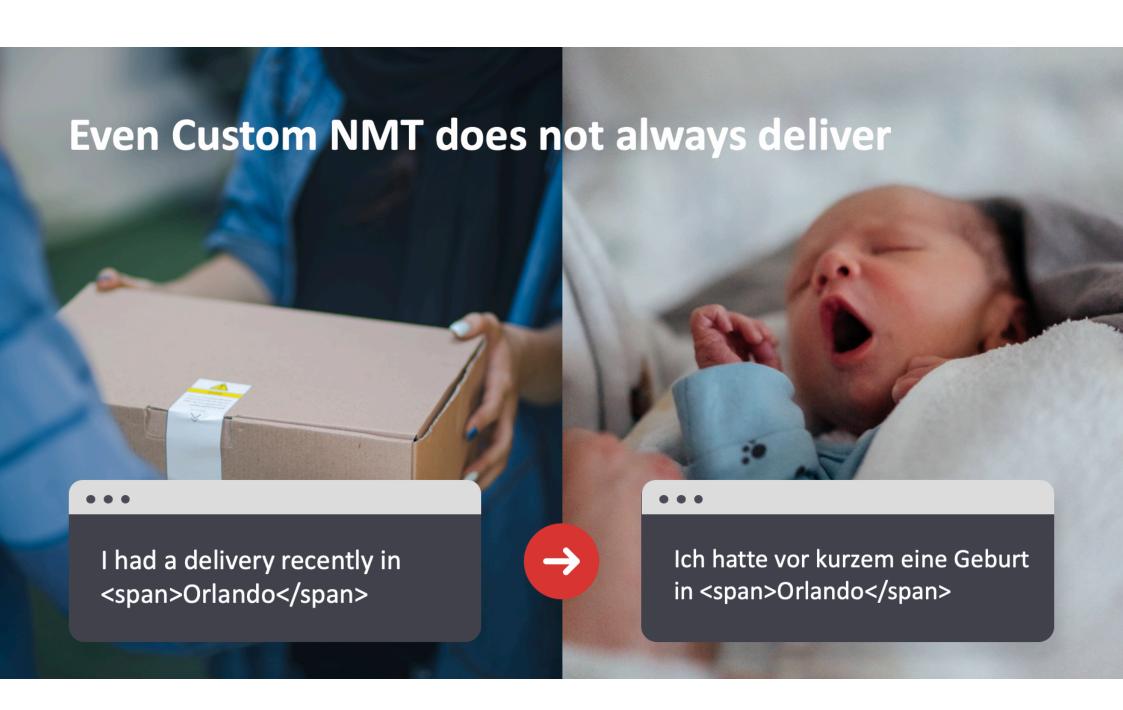
#### **USE-CASE SPECIFIC MT FEATURES**



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### SMART TAG HANDLING





# NMT + TAGS IT'S COMPLICATED

Inconsistent across MT providers and language pairs.

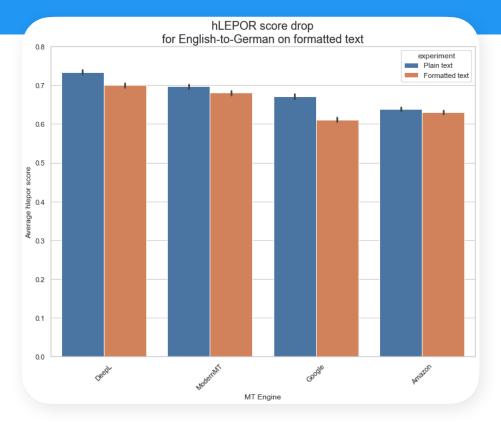
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Customized models may fall back onto baseline because of tags.

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Placeholders are impossible for MT to interpret.

Glossaries also break as they often rely on tags.





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#### **CURRENT SOLUTIONS**

Raw MT: 🦠

. .

MTPE: either spend post-editor time on editing broken language, or remove tags and spend post-editor time on putting them back.

Our primary use-case: **video translation** (mistreated tags are critical, editing them is complicated)



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```
I had a delivery recently
<timestamp class='timestamp'
start='00:00:13,230'
end='00:00:17,690'/>
in <ph/>
```



### (1) Removing inline tags

I had a delivery recently in <ph/>

<timestamp class='timestamp'

start='00:00:13,230'

end='00:00:17,690'/>



#### (2) Filling placeholders with generative models

I had a delivery recently in New York

<timestamp class='timestamp' start='00:00:13,230' end='00:00:17,690'/> <ph/>



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### (3) Translating plain text

I had a delivery recently in New York

Ich hatte kürzlich eine Lieferung in New York

<timestamp
class='timestamp'
 start='00:00:13,230'</pre>

end='00:00:17,690'/>

<ph/>



### (4) Performing word alignment

I had a delivery recently in New York

Ich hatte kürzlich eine Lieferung in New York

<timestamp

class='timestamp'

start='00:00:13,230'

end='00:00:17,690'/>

<ph/>



### (5) Putting tags back

I had a delivery recently in New York

```
Ich hatte kürzlich eine Lieferung<timestamp
class='timestamp'
start='00:00:13,230'
end='00:00:17,690'/>
in <ph/>
```



### **EXPERIMENTS**



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# EXPERIMENTS TWO EXPERIMENTS

#### A: HTML FORMATTING

How much MT quality suffers from simple HTML tags?

Using Smart Tag Handling to put tags back after MT

#### **B: PLACEHOLDERS**

How much MT quality suffers from words replaced by placeholders?

Does translating text w/o placeholders help?

Using Smart Tag Handling to put placeholders back after MT

Does expanding placeholders help?



## **EXPERIMENTS** ORIGINAL DATASET

EN-DE corpus from TAUS

Domain - Financial Services

1955 segments

> 5 tokens per segment

The investigation confirmed the Die Untersuchung bestätigte complainant's legal claim that the C-57 Amendment to the Canadian Trade-Marks Act violates Articles 23.1 and 2 as well as Article 24.3 (the socalled standstill clause) of TRIPS and that such infringements cannot be justified on the basis of the TRIPS.

die rechtliche Behauptung des Antragstellers, das Gesetz C-57 zur Änderung des kanadischen Handelsmarkengesetzes verstoße gegen Artikel 23 Absätze 1 und 2 sowie Artikel 24 Absatz 3 (die so genannte Stillhalteklausel) des TRIPS, exception under Article 24.6 of und dieser Verstoß könne nicht durch die Ausnahmeregelung des Artikels 24 Absatz 6 des TRIPS gerechtfertigt werden.



# A - TAGGING DATA PREPARATION A - TAGGING

1-3 tag entries per segment

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tags: 1-place (img, br) or 2place (span, i, em, a, b, strong, u, s)

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nesting: 1-3 levels

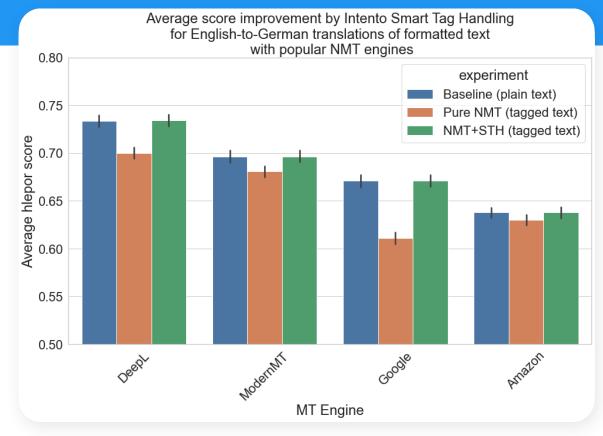
The investigation confirmed the complainant's legal <b> claim that the C-57 Amendment to the Canadian Trade-Marks Act violates Articles 23.1 and <a href="https://example.com/index.html"> 2 as well as <s> Article 24.3 </s> ( the so-called standstill clause ) of TRIPS </a> and that such infringements cannot be justified on the basis of the exception </b> under Article 24.6 of <img src="https://example.com/image.png" alt="Some image"/> TRIPS.



# A - TAGGING SCORING

Calculate hLEPOR score for:

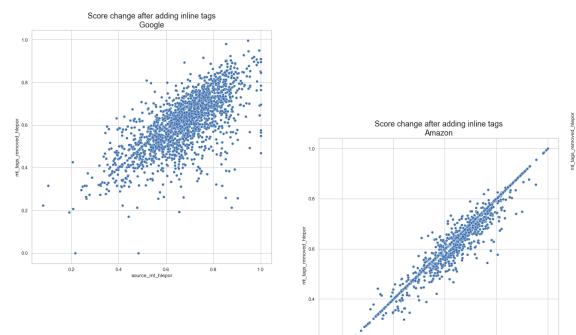
- (1) Plain text NMT
- (2) Tagged text NMT after tag removal
- (3) Tagged text NMT+STH after tag removal

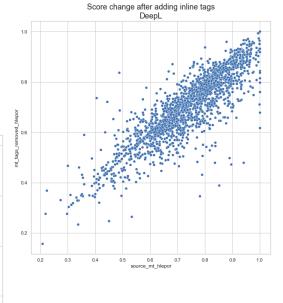




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# A - TAGGING SEGMENT DEGRADATION DUE TO TAGS







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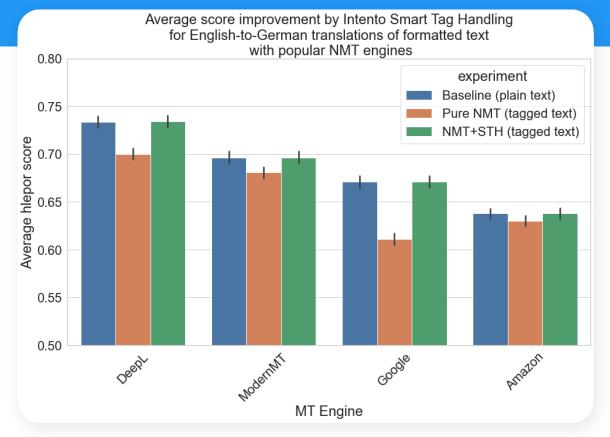
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# A - TAGGING DISCUSSION

Even innocent HTML tags degrade NMT quality (as of today).

The way to improve the quality is to translate text with tags removed and insert them back after MT

Benefits: (1) same level of translation quality as plain text, (2) post-editor does not spend time to move tags, (3) natively integrated into the existing AVT workflow.





### **B - PLACEHOLDERS** DATA PREPARATION

Same dataset, 367 segments with DNT.

Non-translatables replaced with

placeholder tags.

The investigation confirmed the complainant's legal claim that the <ph/> Amendment to the Canadian Trade-Marks Act violates Articles 23.1 Änderung des kanadischen and <ph/> as well as Article 24.3 (the so-called standstill clause) of <ph/> and that such infringements cannot be justified on the basis of the exception under Article 24.6 of <ph/

Die Untersuchung bestätigte die rechtliche Behauptung des Antragstellers, das Gesetz <ph/> zur Handelsmarkengesetzes verstoße gegen Artikel 23 Absätze 1 und <ph/> sowie Artikel 24 Absatz 3 (die so genannte Stillhalteklausel) des <ph/>, und dieser Verstoß könne nicht durch die Ausnahmeregelung des Artikels 24 Absatz 6 des <ph/> gerechtfertigt werden.



## **B - PLACEHOLDERS** DATA PREPARATION

Same dataset, 367 segments with DNT.

Non-translatables replaced with placeholder tags.

Placeholder tags are expanded with dummy values using multilingual generative language model.

The investigation confirmed the complainant's legal claim that the <ph/> Amendment to the Canadian Trade-Marks Act violates Articles 23.1 to the Canadian Trade-Marks Act and <ph/> as well as Article 24.3 (the violates Articles 23.1 and so-called standstill clause) of <ph/> and that such infringements cannot be justified on the basis of the exception under Article 24.6 of <ph/

The investigation confirmed the complainant's legal claim that the <span>Second</span> Amendment <span>23.2</span> as well as Article 24.3 (the so-called standstill clause) of <span>NAFTA</span> and that such infringements cannot be justified on the basis of the exception under Article 24.6 of <span>NAFTA</ span>.



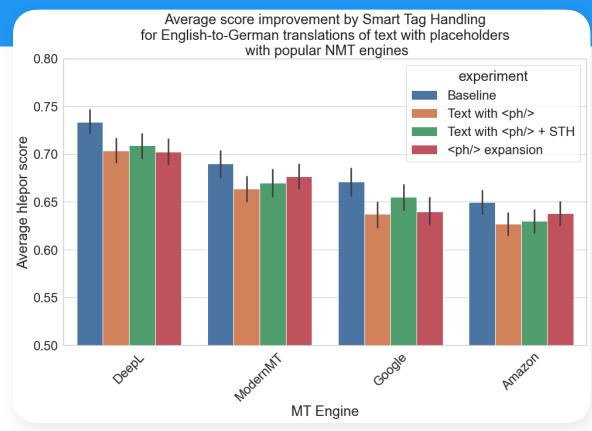
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# **B - PLACEHOLDERS**SCORING

#### Calculate hLEPOR score for:

(1) Plain text NMT with removed DNT vs reference translation with removed DNT (Baseline)

- (2) Text with <ph/> vs reference (Raw NMT)
- (3) Text with <ph/> vs reference (NMT+STH)
- (4) Text with expanded <ph/> vs reference





# B - PLACEHOLDERS DISCUSSION

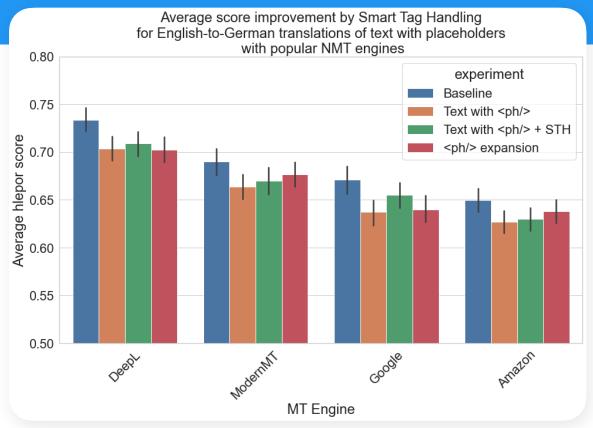
Adding placeholders significantly decreases MT quality for all MT engines.

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Using STH for <ph/> improves MT quality. Level of improvement depends on how well MT engine deals with incomplete sentences vs. sentences with <ph/> tags.

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Expanding placeholders further helps for some engines (ModernMT and Amazon), should not be used for others (Google and DeepL).





#### CONCLUSIONS

Even innocent HTML tags degrade NMT quality (as of today). Placeholders too.

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The way to improve the quality is to translate text with tags removed and insert them back after MT.

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Also, this is a must for MT engines that are best for certain languages, but lack tag support (Tencent, Baidu, Naver, etc)

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For placeholders, removing placeholders from translation altogether also improves the MT quality.

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Placeholder expansion helps for some MT engines, for others it needs improvement.



#### **CURRENT STATUS**

Available as an automated post-editing via API for selected customers.

The main use-case so far - subtitle translation in TMS, to reduce time spent on both text editing and timestamp re-placement.

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We are planning to evaluate ROI (cost and TAT decrease) for AVT with one of our customers, we'll keep you posted :-)



#### REMAINING ISSUES AND NEXT STEPS

Our tag placement algorithm works decently for single-position tags (timestamps, img, br).

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Putting back deeply nested HTML structures requires further improvement.

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# Using MT for inline tags? Let us know! ks@inten.to



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