

MT Customization

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Content

1. Why MT customization?
2. Assessing a customization project
3. Overview of the customization process
4. Corpus processing and term extraction
5. Dictionary customization
6. Linguistic Customization
7. Evaluation
8. Conclusion: automating the customization process

(1) Why MT?

- Human translation
 - Not available
 - Too expensive
 - Too slow
- Polished translation not necessary
 - Gisting
 - Summary
 - Drafting

(1) Applications of MT

- Assimilation: gisting
 - Intelligence analysis
 - WWW
- Dissemination
 - Post-edited: translation/localization; TMs
 - No post-editing:
 - Technical: maintenance, support,... (Cisco)
 - Non-technical: administrative (EU)

(1) Why MT Customization?

- Higher quality:
 - Provide raw MT for large knowledge bases
 - Minimize post-editing for technical documents
- Precision and consistency in technical term translation over large amount of documents
- User maintained dictionaries

(1) When to use customized MT

- Large document knowledge base:
 - Over 10,000 pages
- Emphasis on content accessibility over polished language, but
 - Precise translation is required
 - Documents must be readable
 - Document contents must be understandable

(1) Cost/benefits analysis: CRM

- CRM Average Cost per Transaction (Forrester, 2001):
 - Telephone: \$32.74
 - Web self-service: \$1.17
- Web site:
 - 10,000 hits/day, 10% less calls: save \$30,000/day
 - A \$1M customization effort is recouped in 1 month

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(2) Translatability and Linguistic Closure

- Translatability: how close is the natural language used in the domain to the artificial language implemented in the MT system?
- Linguistic closure: some domains and document types use very repetitive and uniform language: few new words or syntactic constructions appear after having seen a few hundred documents.

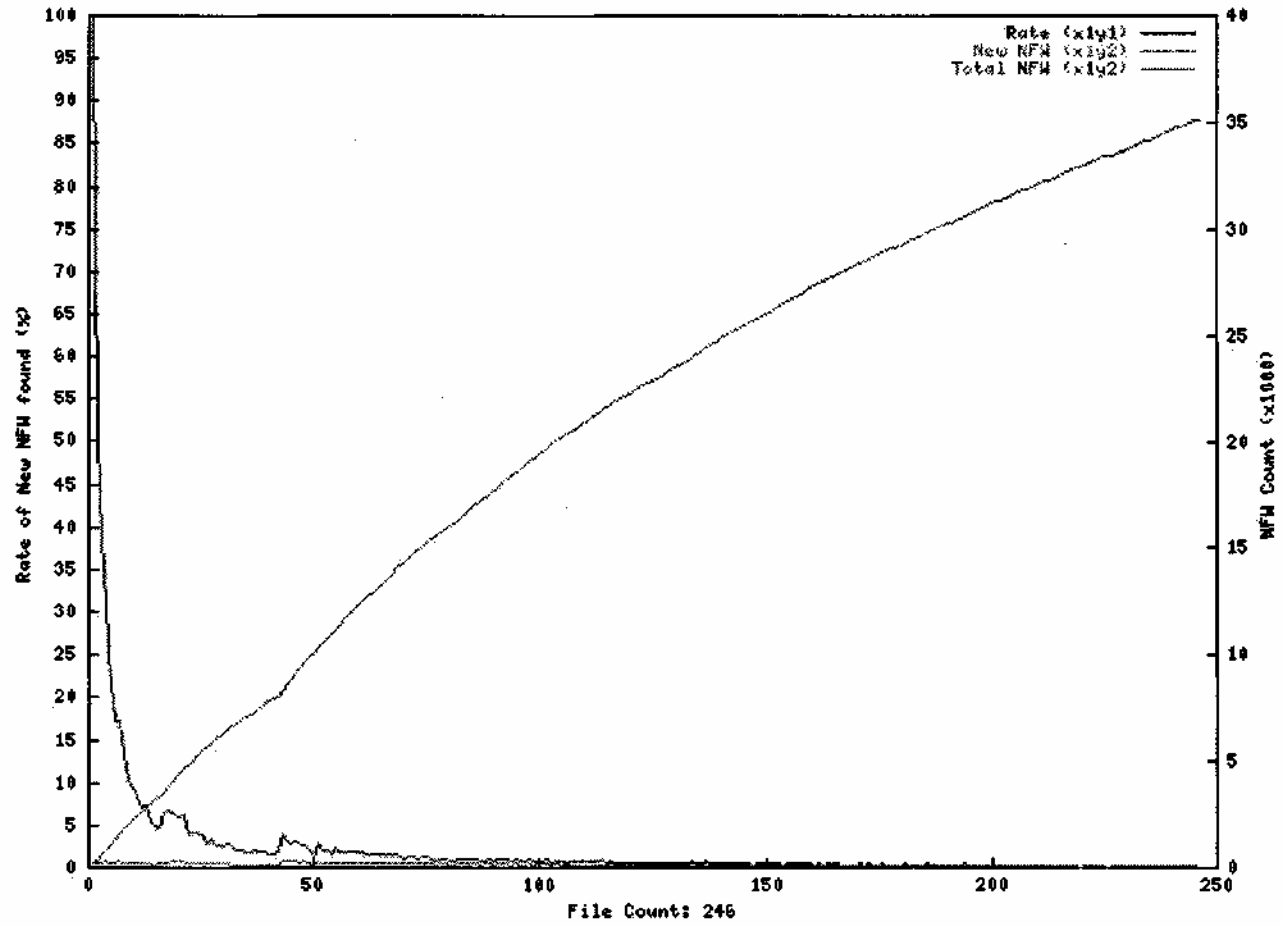
(2) Measuring Translatability

- Eg, IBM translatability index (Bernth99)
- Frequency of
 - -ing words
 - Problematic grammatical words ('to',...)
 - Complex coordinate structures
 - Complex sub-clauses
- Suppressing problematic constructions
 - Controlled Languages

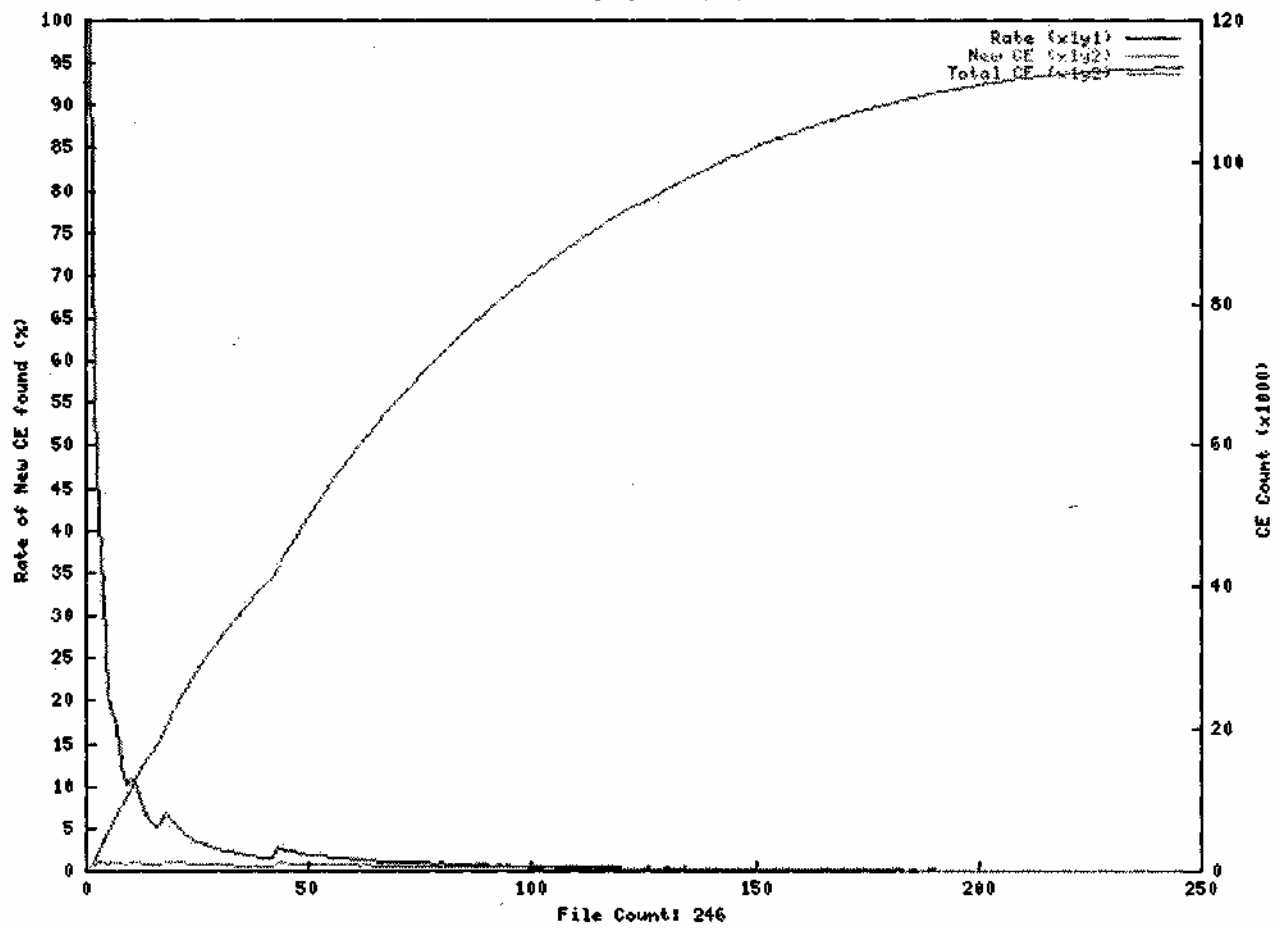
(2) Linguistic Closure

- Lexical closure:
 - Count open-class words/expressions not in the system's dictionaries
 - Check lexical growth graphs
- Syntactic closure:
 - Approximate by counting function words
- Idiomaticity:
 - Check for flowery language, metaphors, culturally loaded constructions.

notes-nfw NFW - (09/20/02)



notes-ce CE - (09/20/02)



(2) Customization assessment

- Start from an existing system
- Measure gap between current and target translation quality
- Typical unbridgeable gap between target quality (human-level) and achievable quality: 10-20%

(2) Customization assessment

1. Measure lexical gap:
 1. Extract terms not in the systems dictionaries
2. Measure syntactic gap:
 1. Select representative documents and build custom dictionary
 2. Manually assess number and frequency of translation problems (Analysis, Transfer, Generation)
3. Identify unbridgeable issues:
 1. Format: no format or poorly formatted documents
 2. Spelling: spelling errors, abbreviations, etc.
 3. Language: poor grammar, telegraphic style, punctuation, etc.
4. Assess level of achievable quality (and effort)
 - This produce initial customization plan

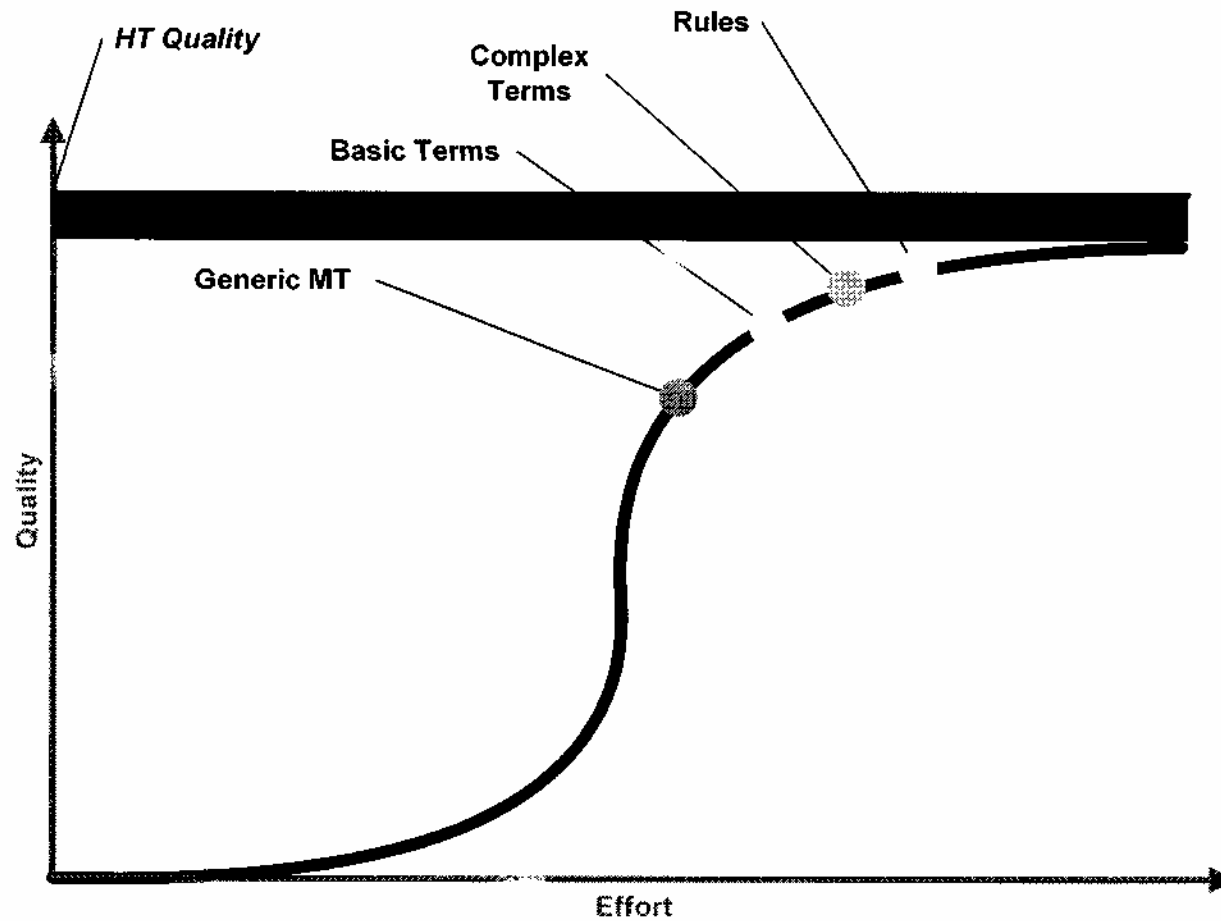
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(3) Customization process outline

1. Corpus processing and term extraction
2. Term translation and coding
3. Assess linguistic customization needs
4. Implement customized linguistic rules
5. Evaluate customized system
6. Fine-tune dictionary and rules
7. User testing

(3) Customization effort



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(4) Term extraction

- Words not in the system's dictionaries
 - 'Not Found Words' - NFWs
- Expressions that should not be translated
 - 'Do Not Translate' - DNTs
 - proper names, product names, command names, etc.
- Multiword expressions not in the system's dictionaries
- Most frequent words/expressions found in dictionary
- Subcategorization patterns: verbs, deverbals, adjectives, adverbs.

(4) NFWs

| | | | | | | | |
|------|-------------|------|-------------|-----|------------|-----|---------------|
| 4419 | Openvms | 1021 | Executables | 663 | apps | 503 | jserv |
| 2843 | Metalink | 967 | Exec | 635 | adpatch | 495 | sysdate |
| 2739 | Patchset | 905 | Readme | 634 | netware | 482 | multibyte |
| 2614 | Flexfield | 869 | Dvoid | 629 | intermedia | 446 | dbkey |
| 2258 | Sqlplus | 852 | metadata | 624 | e-business | 442 | subinventory |
| 1713 | webdb | 800 | ename | 618 | ias | 429 | unhandled |
| 1525 | jinitiator | 783 | flexfields | 601 | datatypes | 426 | appletviewer |
| 1454 | controlfile | 780 | autoinvoice | 593 | setenv | 422 | desc |
| 1345 | hp-ux | 780 | sid | 574 | istore | 411 | loadjava |
| 1329 | datatype | 755 | logminer | 562 | relinking | 390 | jserver |
| 1243 | emp | 739 | rowid | 558 | multi-org | 387 | jdeveloper |
| 1212 | bugcheck | 726 | cd-rom | 543 | rel | 383 | iprocurement |
| 1179 | relink | 719 | deptno | 511 | adadmin | 382 | multiversion |
| 1123 | mini-pack | 707 | empno | 509 | minipack | 380 | bugchecks |
| 1113 | servlet | 668 | compaq | 506 | archivelog | 373 | characteraset |

(4) DNTs

Proper Name

Association of Support Professionals

Acronyms

WWW

Software commands

Click Yes

Product names

Microsoft Word

File names

<http://www.systemsoft.com>

Misc.

best effort

(4) MWEs

| | | | | | |
|------|-----------------------|------|----------------------|------|-----------------------|
| 3865 | windows nt | 1624 | concurrent manager | 1189 | enterprise edition |
| 3477 | operating system | 1580 | standby database | 1184 | environment variables |
| 3195 | error message | 1495 | enterprise manager | 1177 | package body |
| 2605 | solution description | 1483 | primary key | 1157 | web server |
| 2334 | java class | 1471 | control file | 1140 | installation guide |
| 2238 | environment variable | 1459 | applications release | 1109 | logical name |
| 2186 | software errors fixed | 1412 | parallel server | 1088 | http server |
| 2164 | command line | 1378 | exec sql | 1088 | sales order |
| 2110 | application server | 1378 | database link | 1036 | general ledger |
| 2046 | known problems | 1334 | family pack | 1035 | configuration file |
| 1948 | rollback segment | 1251 | rdb release | 1034 | file name |
| 1940 | sql statement | 1226 | system administrator | 1003 | concurrent program |
| 1825 | release notes | 1224 | intelligent agent | 981 | user's guide |
| 1824 | storage area | 1217 | default value | 941 | file system |
| 1765 | search words | 1195 | error messages | 904 | storage map |

(4) Frequent Words/Expressions

| | | |
|------------|------|---|
| abandon | verb | If no carrier is detected within the specified time, the call is abandoned. |
| abort | verb | Aborted frames. |
| abort | noun | 22 input errors, 0 CRC, 0 frame, 0 overrun, 22 ignored, 0 abort. |
| absence | noun | Absence of downstream digital modulated signal. |
| access | noun | The device provides physical layer T1 access. |
| access | verb | How do I access the Netscape FastTrack administrative server? |
| account | noun | Will it allow dynamic creation of accounts? |
| accounting | noun | Accounting. |
| achieve | verb | Achieve Optimal Routing. |
| action | noun | That action can cause poor performance. |
| activate | verb | During a switchover, the secondary protocol activates the local interface. |
| active | adj | What command displays the active console? |
| active | noun | commands are " defined and active. |
| addition | noun | The interface command requires additions. |
| address | verb | XOPR addresses the need for network connections. |
| address | noun | Why can not I ping my own interface address? |
| adjustment | noun | The modem continues to transmit requests and perform adjustments. |

(4) Lexical Patterns

| <i>Relationship</i> | <i>Extracted instance</i> | <i>From sentence</i> |
|-----------------------------------|---|---|
| Verb-Object | configure <bridging> | How do I configure bridging on ARM ? |
| Verb-Object-Preposition | specify <direction> (in) | The direction must be specified in later software releases. |
| Verb-Object-Infinitival | configure <client> <obtain> | ...the client is configured to obtain an IP address |
| Verb-Particle-Object | find out <number> | How do I find out the number of files that a process has open? |
| Verb-Preposition-Object | refer (to <code>) | For more details refer to the debug codes. |
| Noun-Preposition-Noun | configuration (for <authentication>) | Configurations for login authentication. |
| Adjective-Preposition-Noun | available (to <customer>) | available to end users and customers |
| Adjective-Preposition | equivalent (to) | is equivalent to: |

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(5) Term translation

- Out-sourced to translation company
- Information:
 - Source term
 - POS
 - Default translation
 - Examples of sentences
 - (Examples of translations)

(5) Linguistic coding

- Add linguistic codes:
 - POS
 - Inflectional class
 - Irregular stems and forms
 - Headword of expressions
- Use automated coding tools
 - Guess POS and inflectional classes
 - Guess headwords

(5) Test and debug

- Compile inflected dictionary
- Check sample inflected entries
- Run translation on test DB
- Check changed translations
- Tool show which entries were fired

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(6) Major linguistic issues

- Homographs: disambiguation rules
- PP attachment
- Conjunctions and complex clauses
- Transfer rules for function words

(6) Homographs

| <i>Term</i> | <i>Guessed</i> | <i>Correct</i> |
|------------------------|----------------|----------------|
| (go to) feature | Verb | Noun |
| drop | Noun | Verb |
| console | Verb | Noun |
| separate | Verb | Noun |

(6) PP attachment

Displays **[errors during] Phase 2**

Enable **[failover using] the following command**

Compare **the [values before] the download**

Configuring **[timers after] failed dial attempts**

(6) Transfer rules

- Check whether the errors appear
 - Subcategorized clause for 'check' should be generated as sentence in Korean
- Both of the modems work well
 - Two meanings in Korean: both sides, or both of them.

(6) Complex constructions

■ Consequence:

■ Temporal

- ▣ Install the nut and then attach the bolt

■ Causal

- ▣ If the belt breaks, then a new one must be installed

■ Obligation:

■ Factual

- ▣ The paths must be the same.

■ Moral

- ▣ The user must enter the password

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(7) Testing and evaluation

Testing

- Development-oriented
- Linguistic criteria
- Precise metrics
- Feedback to dev team

Evaluation

- User-oriented criteria
- Translation quality
- Translation usability
 - Readability
 - Utility

(7) Testing

■ Regression testing

- Database of test sentences
- Record of previous translations
- Evaluate sentences which translation has changed:
 - Better, Worse, Similar
- Decide if the ratio of improvements versus degradation is acceptable

■ Linguistic testing

- Database of sentences
- Mark translation errors (J2450):
 - Terminology
 - Grammar
 - Format
- Score:
 $1 - (3.5 * T + 3 * G + 2 * F) / W$
- Generate feedback: new pbs not identified during initial term extraction and linguistic assessment

(7) What to evaluate

- Linguistic quality
 - Question: rate the quality of this translation on a scale of 0-4.
 - Negative focus: on translation errors
 - Precise metric better done using detailed linguistic testing
- Utility:
 - Question: Can you solve your problem using this document?
 - Positive focus: problem-solving
- Usability and user satisfaction
 - Positive focus: overall impression
 - Question on readability, not quality: rate the readability of this document on a scale of 0-4
- Sometimes large differences between positive and negative approaches to evaluation

(7) How (not) to evaluate

- Absolute ratings have little significance
- Need comparison points
 - Other MT systems
 - Other language pairs
 - Previous versions
- Human translation baseline mandatory

(7) Machines against humans

- Human translation is the benchmark
- But even the benchmark is not perfect:
 - Human translation typically degrades text quality
 - Can sometime improve the original if the original is badly written
- And even the original text is imperfect
 - Bad spelling
 - Incorrect grammar
 - Simply badly written and not understandable

(7) Machines against humans II

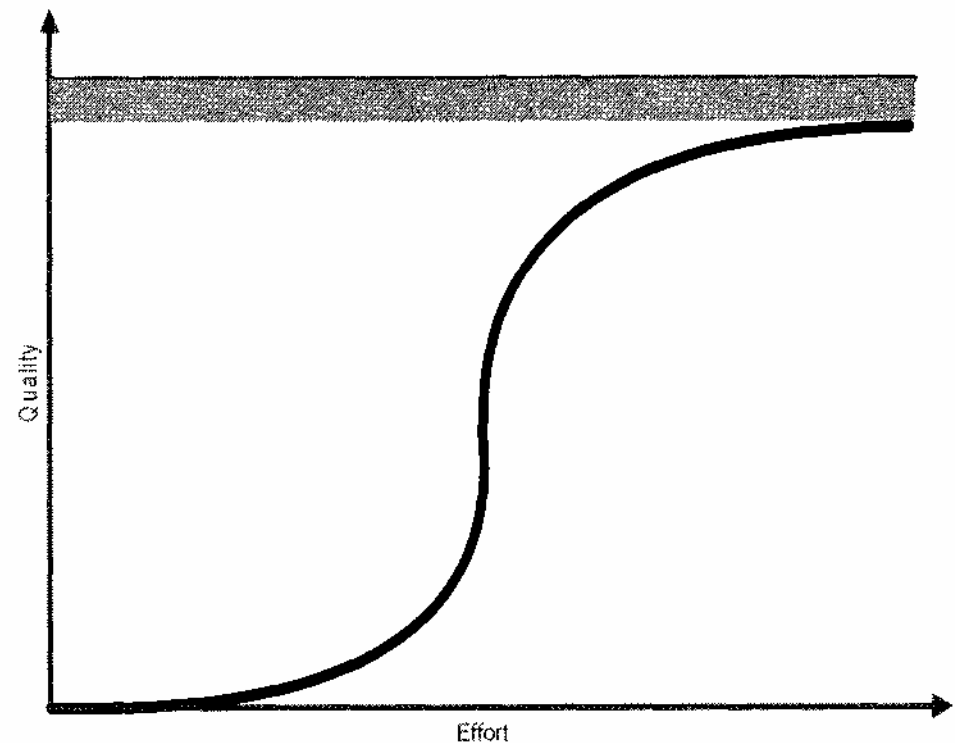
- Evaluation scheme.
 - double-blind evaluation
 - of a statistically significant set of documents
- Evaluate a mixed pool of human and machine translated documents
- Set goals as a percentage of human baseline scores

(7) Machines against humans III

- Utility scores
 - Can you solve your problem using this document?
 - Human translation: 90% of documents rated Yes
 - Machine translation: 70-95% of HT
- Readability scores
 - Rate readability of this document on a scale of 0-4
 - Human translation: 2.5-3.5
 - Machine translation: 60-90% of HT

(7) Machines against humans IV

- Early efforts bring a lot of improvements
- Later efforts follow the law of diminishing returns
- Quality gap can be narrowed, not by investing more on MT, but on controlled structured authoring



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(8) Automating customization

- Term extraction: improving precision/recall
- Term translation: using TM and bitexts
- Term coding: using Intuitive Coding
- Testing and evaluation: using SRM
- Linguistic assessment: SRM
- Linguistic customization: open

(8) Manual/automatic customization

- Comparison with MSR:
 - Same basic transfer architecture
 - Same level of analysis ('deep syntax')
 - Uses trained statistical parser instead of hand-crafted heuristics
- Current MSR system:
 - Learn lexicalized transfer rules
 - No customization of parsing/generation
 - Current results: slightly better than non-customized system
- Current SYSTRAN system:
 - All components are customized

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