#### Getting Started

- At Student machines, ÚFAL machines, or your laptop...
- "Install" eman
  - > go to ufal.cz/eman
  - visit the Download page
  - get the automatic installation script
  - source it to install eman:
    - . install-all.sh mtm15
  - (This will put everything in the mtm15 directory.)

#### Setup Corpora

- Czech $\rightarrow$ English translation
- Training data: roughly 0.1% of CzEng 1.0 (15k sentence pairs)
- ▶ Dev set: 10% of WMT 2012 (300 sentence pairs)
- ▶ Test set: 10% WMT 2013 (300 sentence pairs)

Download the data:

http://bit.ly/mtmarathon15

Extract it into a subdirectory your playground, e.g.:

mkdir mtm15/ufal-smt-playground/playground/corpora

#### Importing the Corpora

- Every corpus has to "enter the world of eman".
- This can be done using the seed corpus.
- "eman init corpus" requires the following variables:
  - TAKE\_FROM\_COMMAND command which produces the corpus
  - OUTCORP corpus name
  - OUTLANG corpus language
  - OUTFACTS description of factors
  - OUTLINECOUNT number of lines that we are expecting to get, used as a sanity check

### Importing the Corpora

 $\mathsf{E}.\mathsf{g}.$  for training data, the Czech side:

```
TAKE_FROM_COMMAND="cat ../corpora/train.cs" \
OUTLINECOUNT=15000 \
OUTCORP=train OUTLANG=cs \
OUTFACTS=lc+lemma+tag \
eman init --start corpus
```

Inspect the step directory. Where is the corpus stored?
 Create a bash script/ "one-liner" to import all corpora: train/dev/test, cs/en (loop over sections and languages).

#### Did it work? Find out:

```
eman 1s --stat
```

Frequent mistake: wrong OUTLINECOUNT for dev and test.

#### Listing and Printing Corpora

Corpman links symbolic names with corpus steps:

./corpman ls # show all registered corpora

Corpman ensures uniform pre-processing:

./corpman train/cs+lemma --dump

# (Construct and) print the corpus as lemmas.

Bonus: Calculate the OOV (out-of-vocabulary) rate of the test data given the training data for:

English vs. Czech and lowercase forms vs. lemmas Use ufal-smt-playground/scripts/count-oov.pl or oov.pl from Moses. (Or write your own.)

### Compiling Moses

In eman's philosophy, software is just data.

- Binaries should be compiled in timestamped step dirs.
- ... so we know the exact code that was used.

Compile moses and GIZA++:

```
MOSESBRANCH=RELEASE-1.0 \
```

eman init --start mosesgiza

**Warning:** This won't work on local Unix machines. Instead, import an existing Moses step:

eman addremote \ ~tamca7am/ufal-smt-playground/u

~tamca7am/ufal-smt-playground/playground tamchyna

eman reindex

#### Baseline Experiment

```
cat corpora/baseline.traceback \ | eman clone --start
```

🖄 While the experiment runs:

- Copy the traceback into your playground.
- Modify it to train word alignment on **lemmas** instead of **lc**. (But preserve the translation lc→lc!)
  - Note that ALILABEL is somewhat arbitrary but has to match between align and tm.

Bonus: do the required edits using substitution in eman. Hint: eman --man, look for the "traceback" command.

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- Language model: lm.1.gz

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 Why are longer *n*-grams more probable than short ones?

Phrase table: tm.1/model/phrase-table.0-0.gz
 How do you say "hi" in Czech?
 Phrase scores are P(f|e), lex(f|e), P(e|f), lex(e|f).

Given that, what do the counts in the last column mean?

(Let's look e.g. at the phrase "ahoj ||| hi".)



## $\bigcirc$ How many iterations did MERT take?



# How many iterations did MERT take? How did the BLEU score on the devset change?

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- Standard Unix tool: eman du -sh s.mert.\*
- Fman status:

eman eman 1s mert --dus --stat

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Look at evaluator steps. Which one is the baseline?

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   eman tf \$(eman sel t align vre 'SRC.\*lc')
- Or just one select query: eman sel t evaluator br t align vre 'SRC.\*lc'
   BLEU is in the "s.evaluator.../scores" file.

#### Team Work

- ► MERT is unstable ⇒ multiple runs needed for a better estimate of "true" system performance.
- ▶ We do have multiple runs! ...among us.
- We will use eman addremote to share experiments.

Caveat: Your home directory is not accessible to other users. Let's fix that first:

cd ~ ; fs setacl -dir . -acl system:authuser rl ; find ufal-smt-playground -type d  $\setminus$  -exec fs setacl -dir {} -acl system:authuser rl  $\setminus$ ;

#### Team Work

- Import your colleague's experiments, e.g.: eman addremote \ ~mtm999/ufal-smt-playground/playground fred
- Also add Aleš's playground for pre-compiled multeval: ~mtm003/multeval/playground
- Reindex (your playground): eman reindex && ./corpman reindex

... from now on, eman 1s is better than plain 1s.

#### Team Work

Use eman select --remote to find evaluator steps.
 Bonus: import evaluator steps from more playgrounds to get more reliable statistics (2 runs is too few).
 Run multeval (Clark et al. 2011):

MEVALBIN=s.mevalbin.f6750437.20130906-1727 \
BASELINE\_EVALSTEPS="s.evaluator.XYZ,s.evaluator.WXY" \
IMPROVED\_EVALSTEPS="s.evaluator.ABC,s.evaluator.DEF" \
eman init --start multeval

Results are written to scores file.

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- $^{\circ}$  Try different orders of the language model (3, 4, 6).
- Translate from Czech lemmas into English forms (1c).
- $\sim$  Try the opposite translation direction: English $\rightarrow$ Czech.
- Set up a factored system:
  - Ic $\rightarrow$ Ic (baseline path), and
  - lemma $\rightarrow$ lc (alternative path).

#### Summary

Hopefully, you now understand:

- within (PB)MT:
  - ▶ the structure of a (PB)MT experiment,
  - what is the language model and the translation model,
- meta-level:
  - eman's organization of the experimentation playground,
  - the idea of <u>cloning</u> of experiments.

If you want to help:

- use eman,
- contribute to the "Commonspector" project.

#### Extra Slides

#### Eman is Versatile

What types of steps should I have?

• Any, depending on your application.

What language do I write steps in?

Any, e.g. bash.

What are the input and output files of the steps?

- Any, just make depending steps understand each other.
- Steps can have many output files and serve as prerequisites to different types of other steps.

What are measured values of my experiments?

Anything from any of the files any step produces.

#### What the User Implements: Just Seeds

Technically, a seed is any program that:

- responds to arbitrary environment variables,
- runs eman defvar to register step variables with eman,
- produces another program, ./eman.command that does the real job.
- The seed is actually run twice:
  - At "init": to check validity of input variables and register them with eman.
  - At "prepare": to produce **eman.command**.
- The user puts all seeds in **playground/eman.seeds**.
  - Eman runs a local copy of the seed in a fresh step dir.

#### eman redo

On cluster, jobs can fail nondeterminically.

- Bad luck when scheduled to a swamped machine.
- ▶ Bad estimate of hard resource limits (RAM exceeds the limit ⇒ job killed).
- Eman to the rescue:
  - eman redo step creates a new instance of each failed step, preserving the experiment structure.
  - eman redo step --start starts the steps right away.
- To make sure eman will do what you expect, first try:
  - eman redo step --dry-run

#### eman clone

CLONING is initing a new step using vars of an existing one. Cloning of individual steps is useful:

- when a step failed (used in eman redo),
- when the seed has changed,
- when we want to redefine some vars:
   ORDER=4 eman clone s.lm.1d6f791c...
- Cloning of whole tracebacks:
  - The text of a traceback gets instantiated as steps.
  - Existing steps are reused if OK and with identical vars.
  - eman traceback step | eman clone
  - eman traceback step | mail bojar@ufal followed by eman clone < the-received-mail.</p>

#### eman tag or eman ls --tag shows tags

 $T \ensuremath{\mathrm{AGS}}$  and  $\operatorname{AUTOTAGS}$  are:

- arbitrary keywords assigned to individual steps,
- inherited from dependencies.

Tags are:

- added using eman add-tag the-tag steps,
- stored in s.stepdir.123/eman.tag.
- $\Rightarrow$  Use them to manually mark exceptions.

Autotags are:

- specified in playground/eman.autotags as regexes over step vars, e.g.: /ORDER=(.\*)/\$1gr/ for LM,
- (re-)observed at eman retag.

 $\Rightarrow$  Use them to systematically mark experiment branches.

#### eman collect

Based on rules in eman.results.conf, e.g.:

BLEU \*/BLEU.opt BLEU\s\*=\s\*([^\s,]+) Snts s.eval\*/corpus.translation CMD: wc -1

#### eman collects results from all steps into eman.results:

# Step Name	Status	Score	Value	Tage	s and Auto	otags	
s.evaluator.11ccf590.20120208-1554	DONE	TER	31.04	5gr	DEVwmt10	LMc-news	towards-
s.evaluator.11ccf590.20120208-1554	DONE	PER	44.61	5gr	DEVwmt10	LMc-news	towards-
s.evaluator.11ccf590.20120208-1554	DONE	CDER	33.97	5gr	DEVwmt10	LMc-news	towards-
s.evaluator.11ccf590.20120208-1554	DONE	BLEU	12.28	5gr	DEVwmt10	LMc-news	towards-
s.evaluator.11ccf590.20120208-1554	DONE	Snts	3003	5gr	DEVwmt10	LMc-news	towards-
s.evaluator.29fa5679.20120207-1357	OUTDATED	TER	17.66	5gr	DEVwmt10	LMc-news	
	•••						
s.evaluator.473687bb.20120214-1509	FAILED	Snts	3003				

- Perhaps hard to read.
- Easy to grep, sort, whatever, or **tabulate**.

#### eman tabulate to Organize Results

The user specifies in the file eman.tabulate:

- which results to ignore, which to select,
- ▶ which tags contribute to col labels, e.g. TER, BLEU,
- which tags contribute to row labels, e.g. [0-9]gr, towards-[A-Z]+, PRO.

Eman tabulates the results, output in eman.niceresults:<br/>PER CDER TER BLEU5gr towards-CDER 44.61 33.97 31.04 12.285gr 44.19 33.76 31.02 12.185gr PRO43.91 33.87 31.49 12.095gr towards-PER 44.44 33.52 30.74 11.95

#### Related Experiment Mgmt Systems

Eman is just one of many, consider also:

- ► LoonyBin (Clark et al., 2010)
  - ⊖ Clickable Java tool.
  - $\oplus\;$  Support for multiple clusters and scheduler types.
- Moses EMS (Koehn, 2010)
  - Experiment Management System primarily for Moses.
  - Centered around a single experiment which consists of steps.
- Pure Makefiles

Yes, you can easily live with fancy Makefiles.

- You will use commands like make init.mert or cp -r exp.mert.1 exp.mert.1b
- You need to learn to use \$\*, \$@ etc.
- ▶ You are likely to implement your own eman soon. ☺

There are also the following workflow management systems: DAGMan, Pegasus, Dryad.

#### References

- Jonathan H. Clark, Jonathan Weese, Byung Gyu Ahn, Andreas Zollmann, Qin Gao, Kenneth Heafield, and Alon Lavie. 2010. The Machine Translation Toolpack for LoonyBin: Automated Management of Experimental Machine Translation HyperWorkflows. <u>Prague Bulletin of</u> Mathematical Linguistics, 93:117–126.
- Philipp Koehn. 2010. An Experimental Management System. <u>Prague Bulletin of Mathematical</u> Linguistics, 94:87–96, September.