

LoonyBin:

**Keeping Language Technologists Sane
through Automated Management of
(Hyper)Workflows**

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Carnegie-Mellon University

LREC 2010

Thursday, May 20, 2010



Outline

- Empirical NLP Research
 - Day-to-day issues
 - Current problems
 - LoonyBin's solutions
- Workflows
- HyperWorkflows



Empirical NLP

- Plumbing: Gluing (Linux) tools together
- Recording results
- Sanity checking
- Running variations
- Moving between clusters & schedulers



Empirical NLP

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Empirical NLP

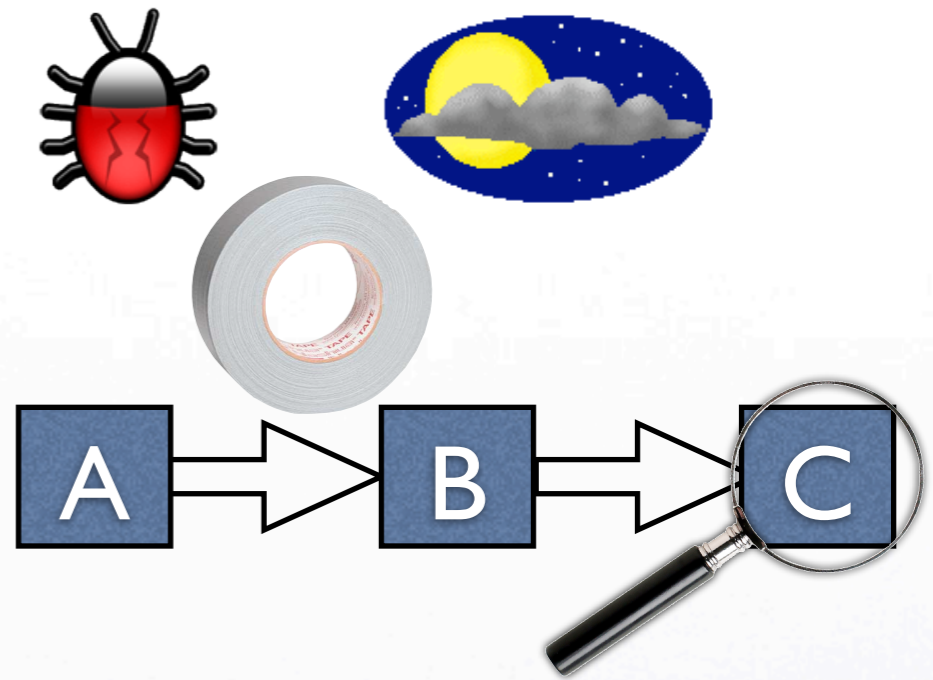
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Empirical NLP

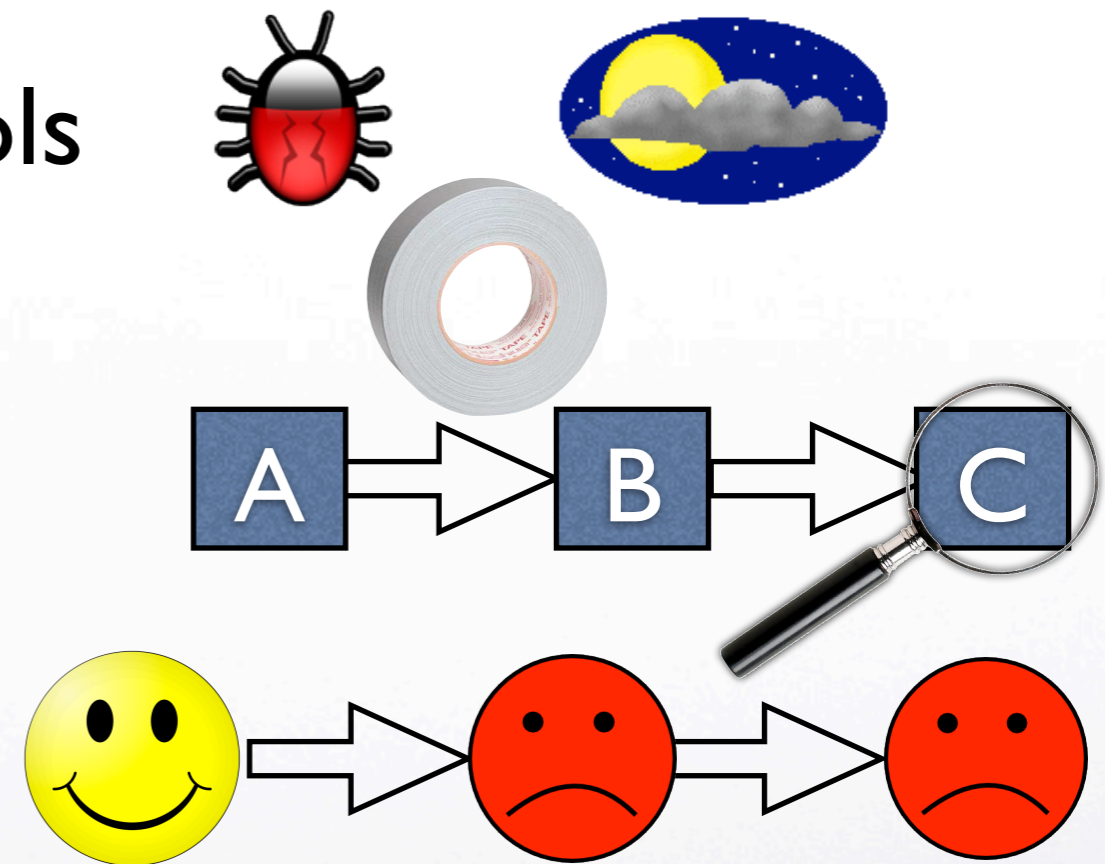
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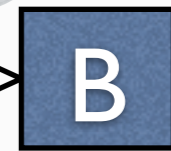
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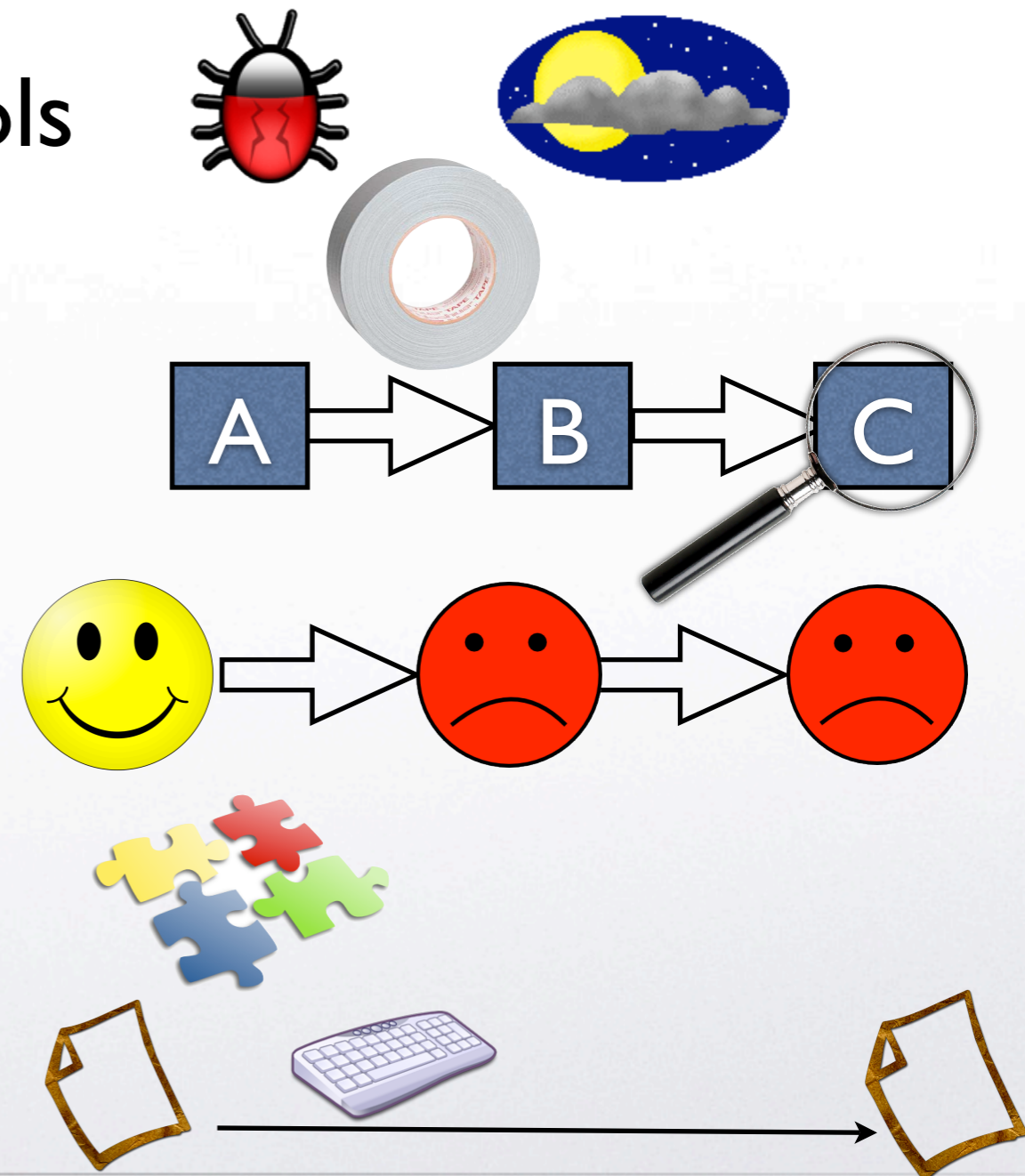
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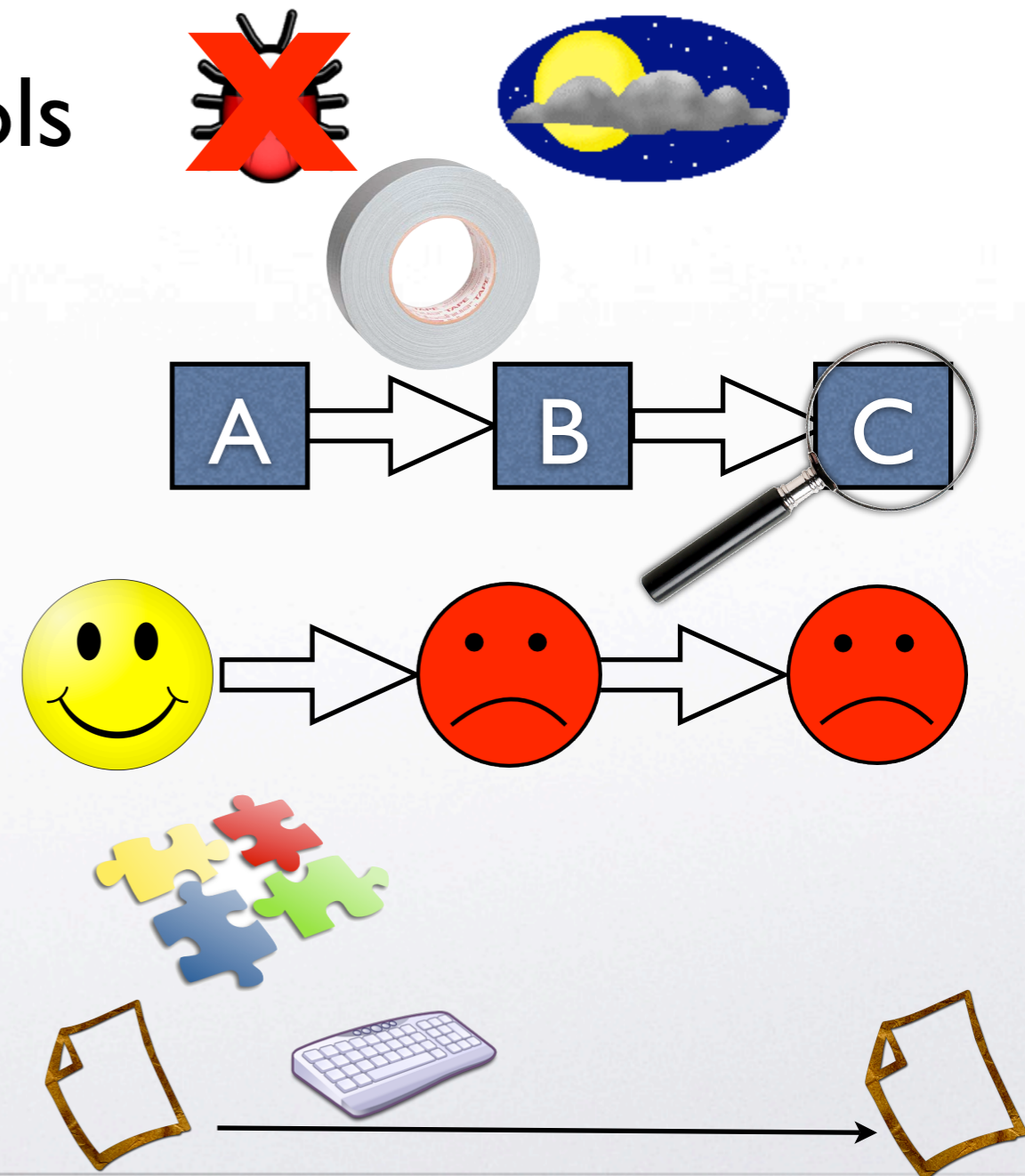
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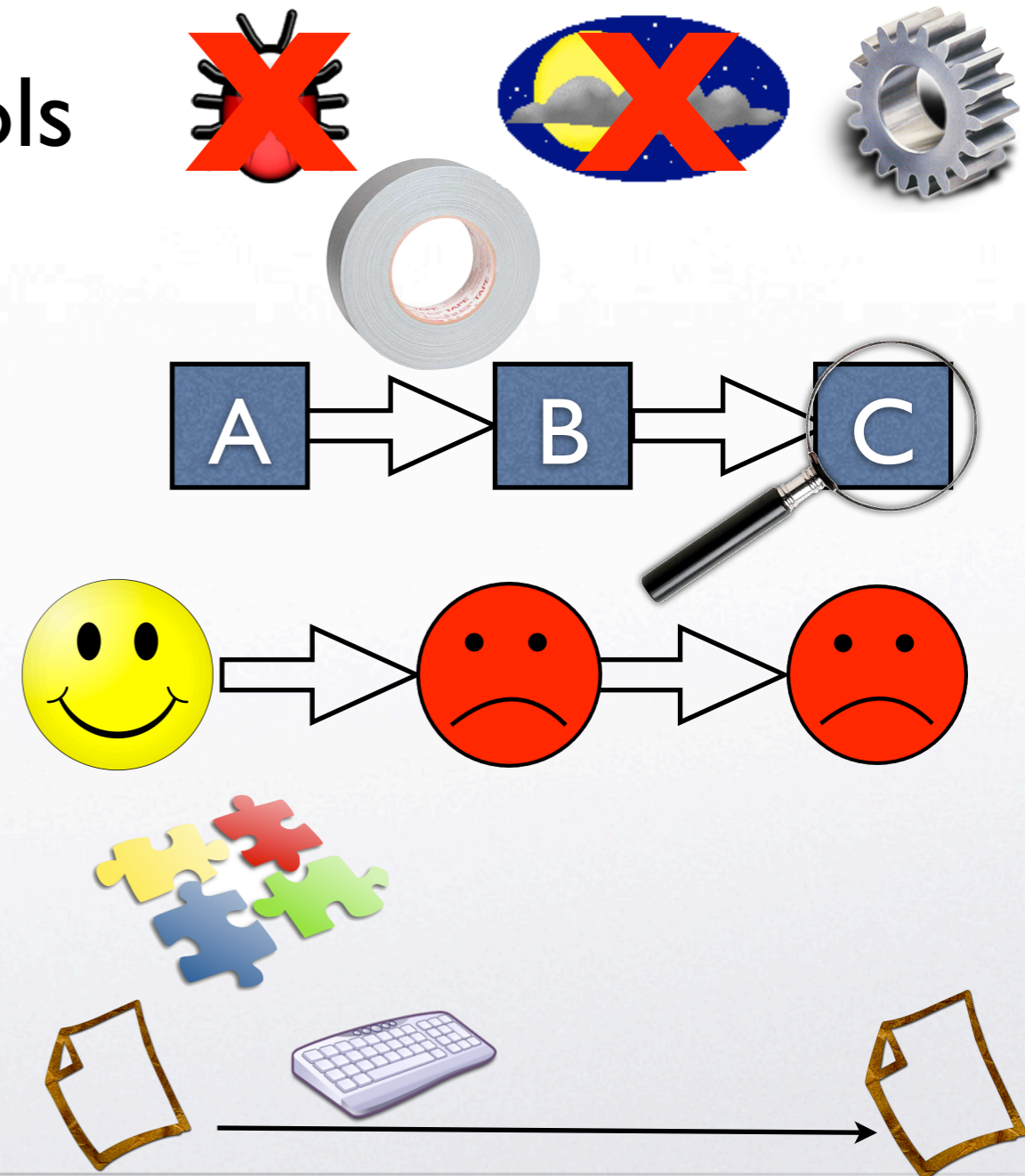
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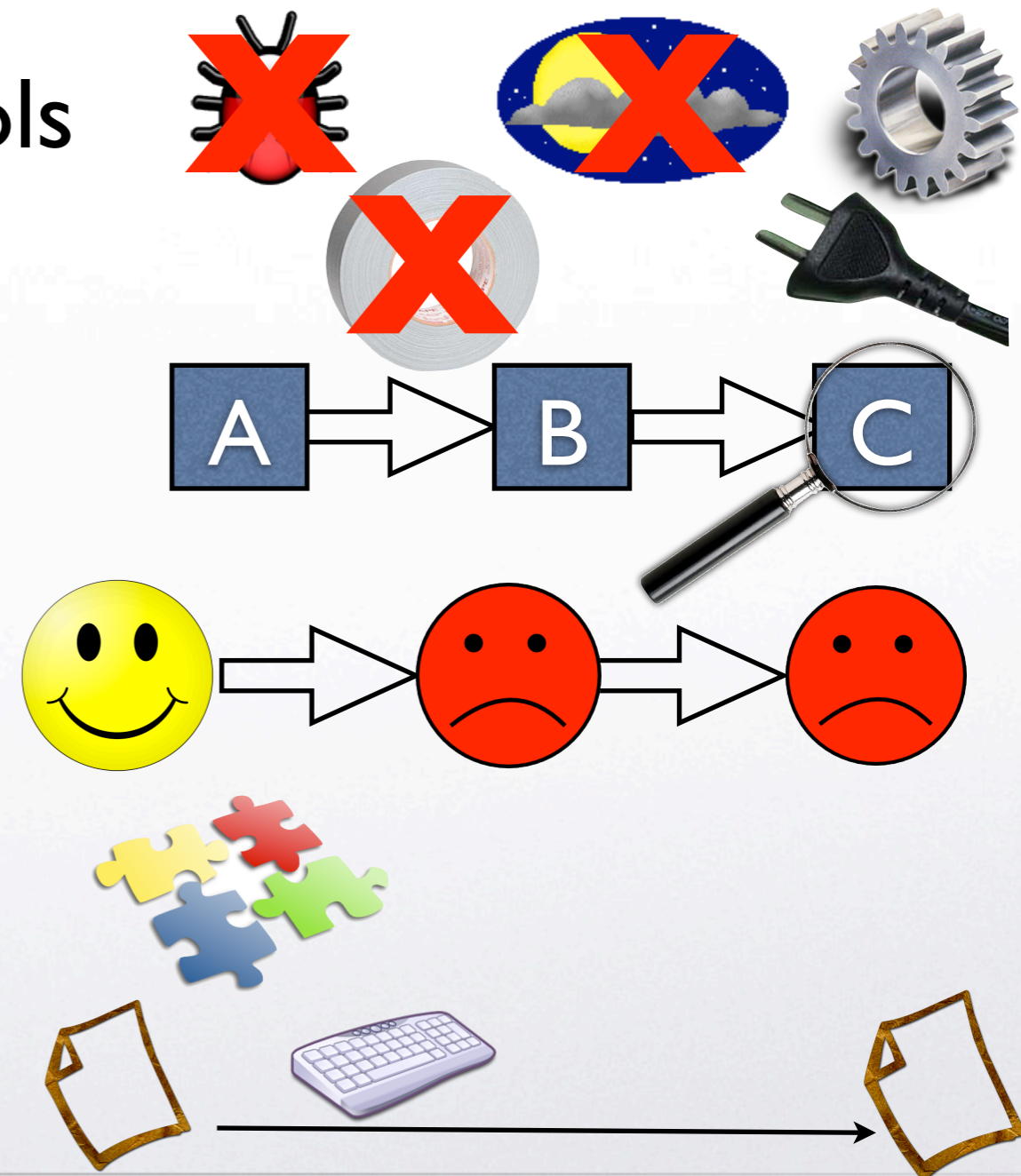
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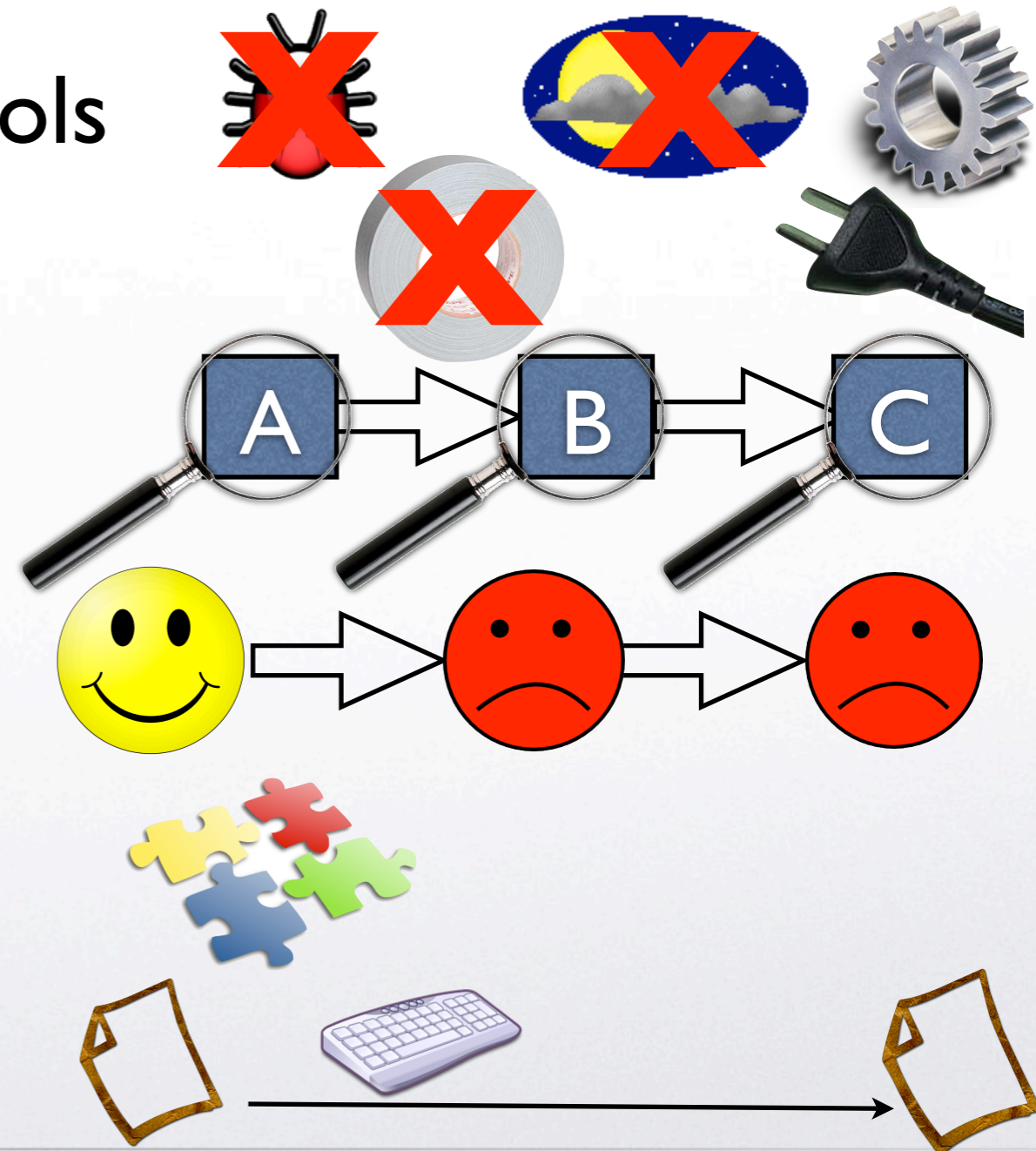
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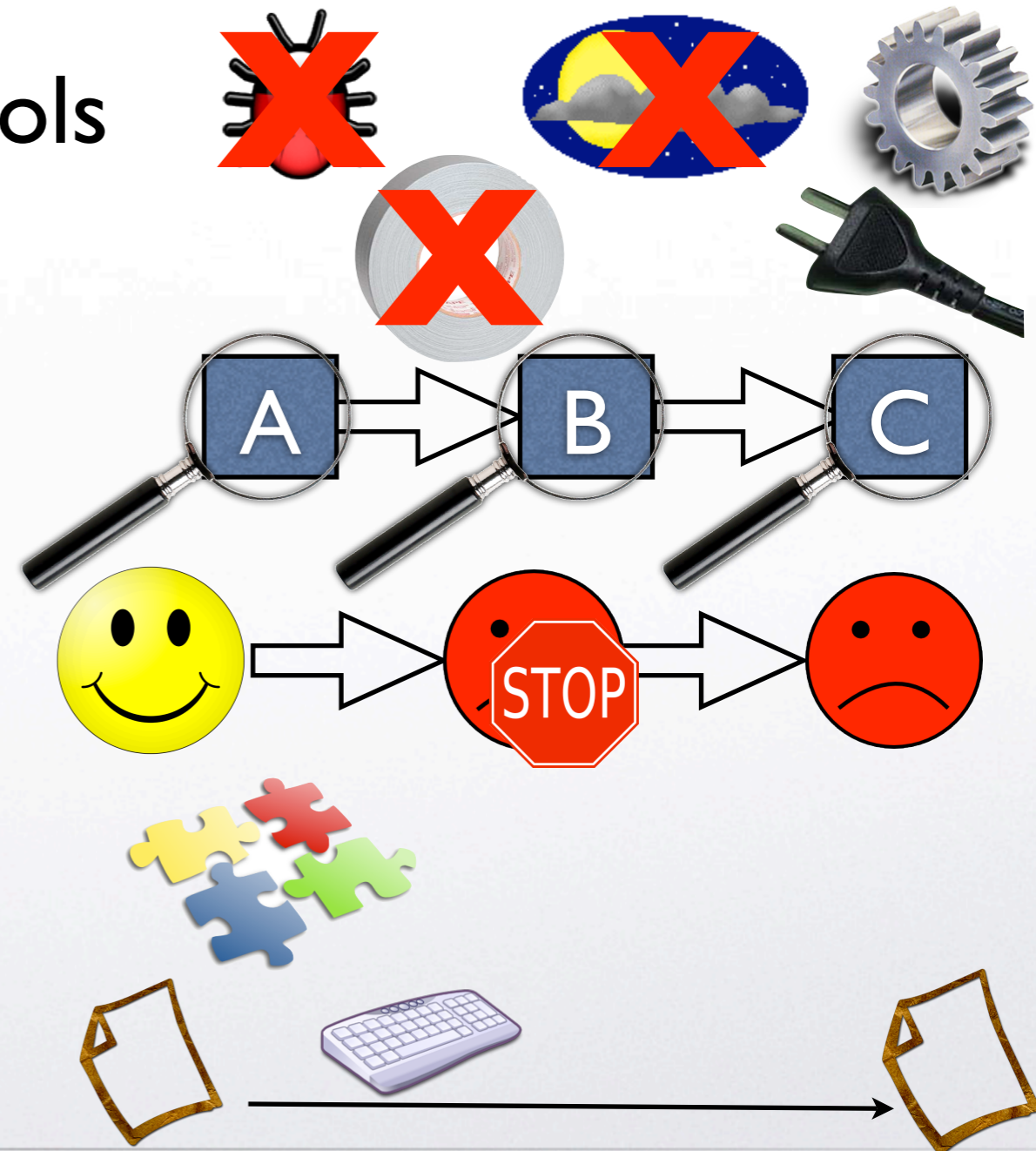
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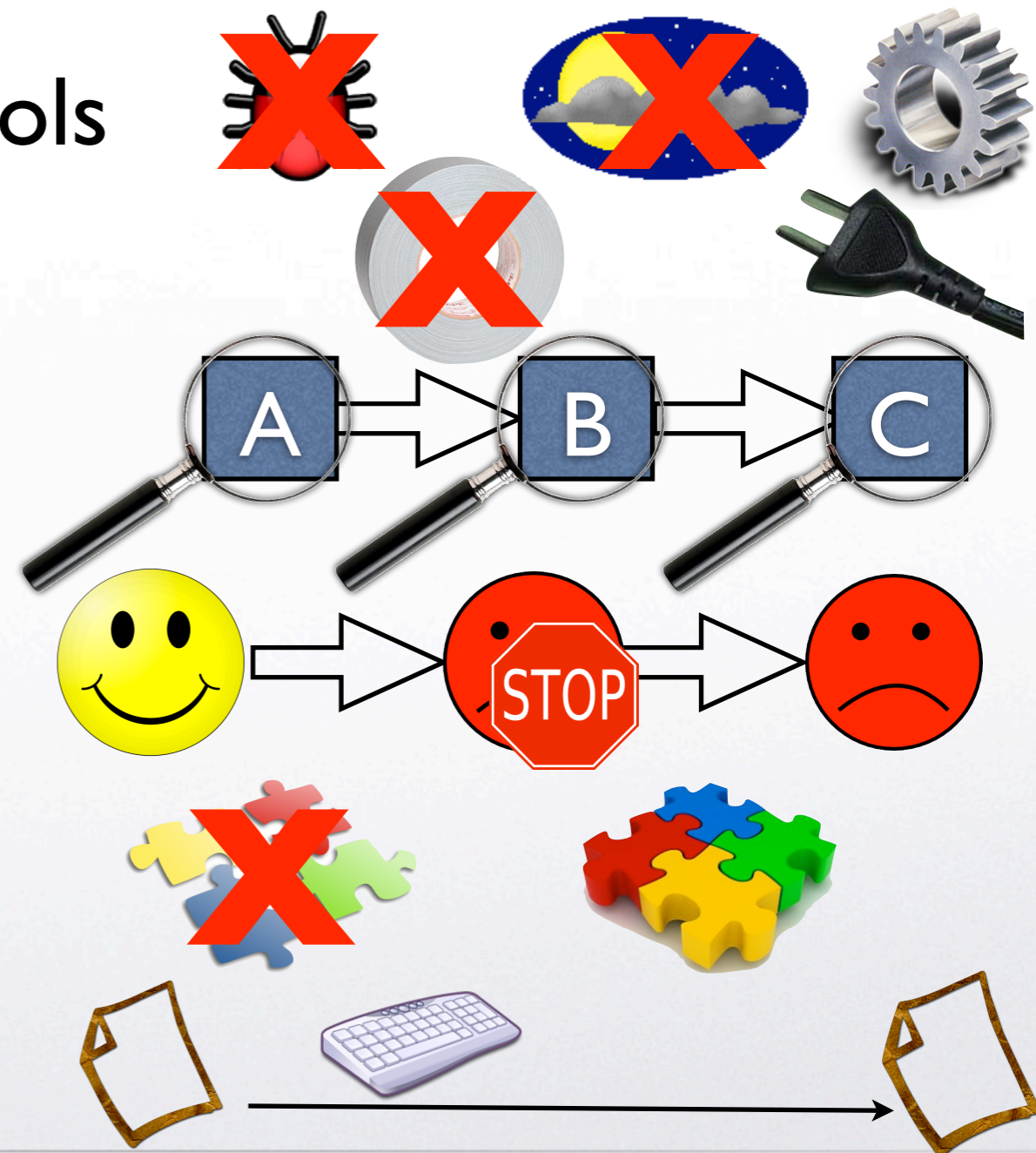
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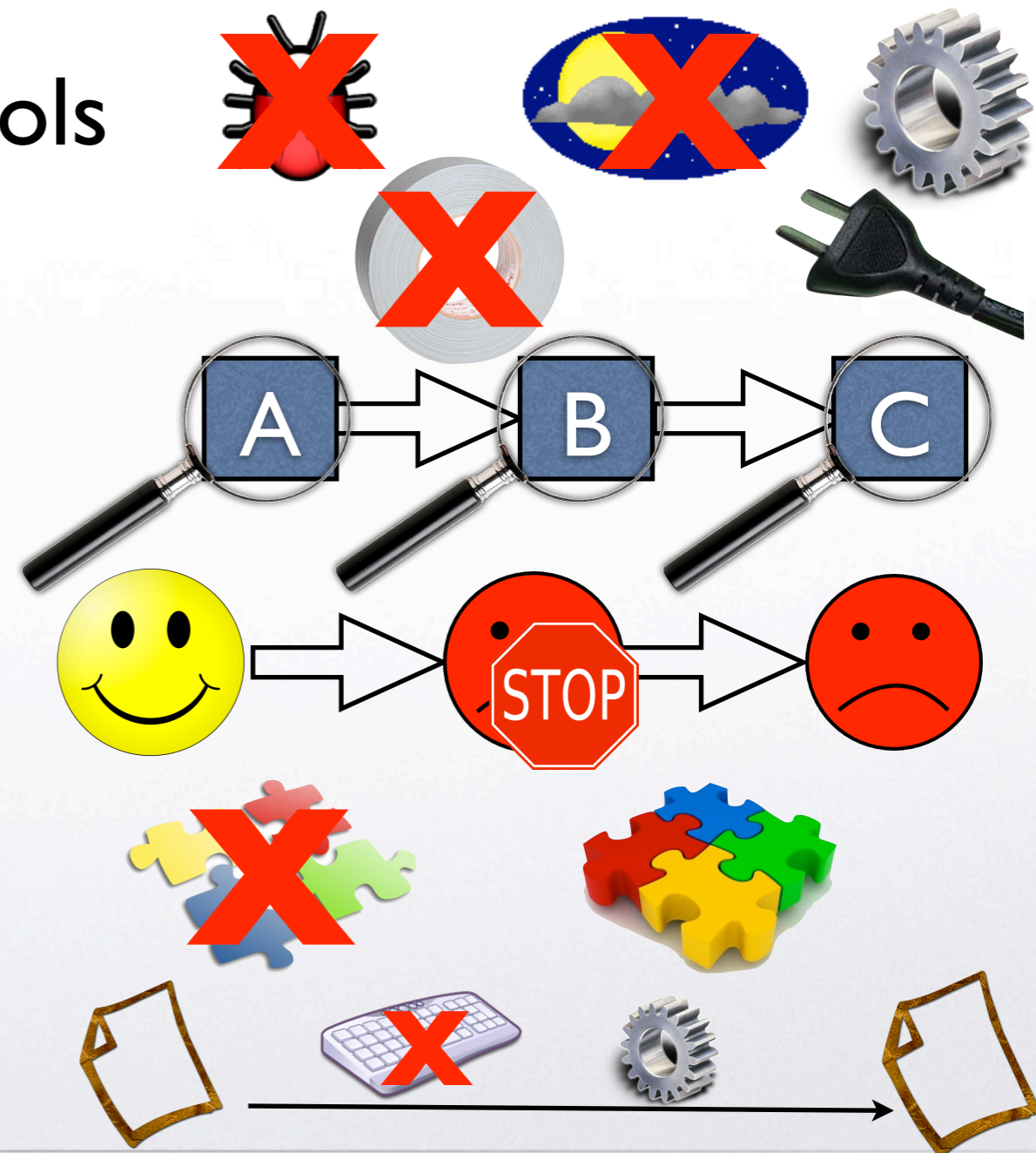
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Proposed Solution:

HyperWorkflow Management



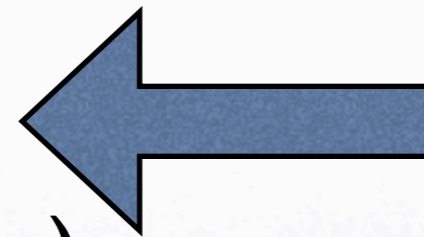
LoonyBin

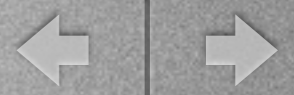
- Define the tools
(inputs/outputs/parameters → shell commands)
- Define the workflow
(DAG of steps and dependencies)
- Generate & run a shell script



LoonyBin

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LoonyBin HyperDAG Designer V0.4.0

Pipeline Options

Mouse Mode Scrolling Selecting Editing Transforming Mode

Tools

- MANUAL FILESYSTEM
- MANUAL HDFS
- OR
- PARAMETER BOX
- Machine Translation
 - Decoders
 - Grammars and Tables
 - Language Modeling
 - Mono Corpus
 - Output
 - Parallel Corpus
 - Parsing
 - Scoring
 - Tuning
 - Word Alignment
- Trashed Tools
 - Errors

Untitled Workflow **gale-p4-audio-eval.pipe**

```
graph TD; FS_lexicons[FS-lexicons] --> 7180_get_target_vocab[7180-get-target-vocab]; 7180_get_target_vocab --> 7110_prune_pt[7110-prune-pt]; 7180_get_target_vocab --> 7190_filter_lm[7190-filter-lm]; 7110_prune_pt --> 7120_add_phrase_penalty[7120-add-blank-leaf]; 7120_add_phrase_penalty --> 7121_add_lex_probs[7121-add-lex-probs]; 7121_add_lex_probs --> 7122_format_for_joshua[7122-format-for-joshua]; 7122_format_for_joshua --> 7200_decode[7200-decode]; 7200_decode --> 7210_unstitch_shadow[7210-unstitch-shadow]; 7210_unstitch_shadow --> 7220_shadow_topbest[7220-shadow-topbest]; 7220_shadow_topbest --> 7230_score_shadow[7230-score-shadow]; 7190_filter_lm --> 7230_score_shadow; 7230_score_shadow --> 7340_package[7340-package]; 7180_get_target_vocab --> 7320_format_nbest[7320-format-nbest]; 7110_prune_pt --> 7320_format_nbest; 7320_format_nbest --> 7320_extract_top_best[7320-extract-top-best]; 7320_extract_top_best --> 7330_unstitch_sgml[7330-unstitch-sgml]; 7330_unstitch_sgml --> 7340_package;
```

Tool Name: GALE Packager

Step Name: 7340-packag

sysName: CMU-StatXfer-2011

occasion: P4 Audio Evaluation

Machine Config: barrow



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Untitled Workflow gale-p4-audio-eval.pipe

7340-package ((default))

7330-unstitch-sgml ((default))

7320-extract-top-best ((default))

7320-format-nbest ((default))

7230-score-shadow ((default))

7220-shadow-topbest ((default))

7210-unstitch-shadow ((default))

7200-decode ((default))

7190-filter-lm ((default))

7128-format-for-joshua ((default))

7122-add-lex-probs ((default))

7121-add-blank-leaf ((default))

7120-add-phrase-penalty ((default))

7110-prune-pt ((default))

FS-lm ((default))

FS-lexicons ((default))

7180-get-target-vocab

7230-score-shadow ((default))

7220-shadow-topbest ((default))

7210-unstitch-shadow ((default))

7200-decode ((default))

7190-filter-lm ((default))

7128-format-for-joshua ((default))

7122-add-lex-probs ((default))

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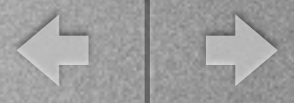
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Drag and Drop

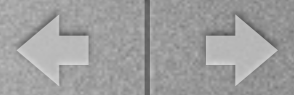
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CMU-StatXfer-201

P4 Audio Evaluatio

barrow

topbestOut

refs

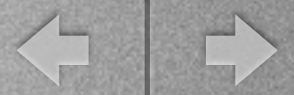
hyps

OK Cancel Auto

7110-prune-pt ((default))

FS-lexicons ((default))

7180-get-target-vocab



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7340-package ((default)) []

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FS-lexicons ((default)) []

FS-lm ((default)) []

7180-get-target-vocab ((default)) []

Drag and Drop

Tooltips for Params

Available Tools

Tool Name:	GALE Packager
Step Name:	7340-packag
sysName:	CMU-StatXfer-201
occasion:	P4 Audio Evaluatio
Machine Config:	barrow



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Untitled Workflow gale-p4-audio-eval.pipe

Drag and Drop

Available Tools

Tool Name: GALE Packager

Step Name: 7340-packag

sysName: CMU-StatXfer-201

occasion: P4 Audio Evaluation

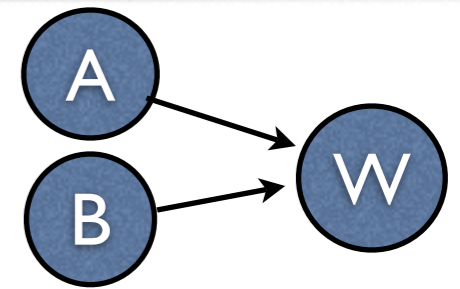
Machine Config: barrow

Machine Assignment

Tooltips for Params



Generating a Script for



INPUTS

foreignCorpus

nativeCorpus

PARAMETERS

fertility

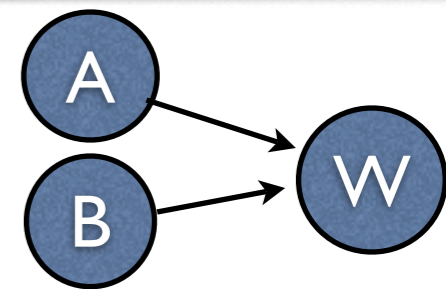
Python Tool
Descriptor

OUTPUTS

alignments



Generating a Script for



INPUTS

foreignCorpus	A's output "x"
nativeCorpus	B's output "y"

OUTPUTS

alignments

PARAMETERS

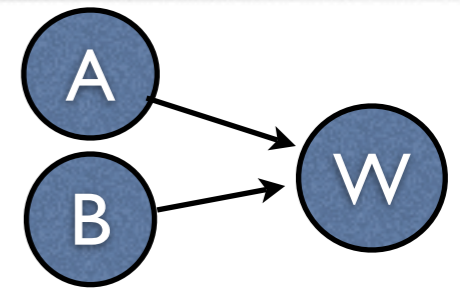
fertility	0.01
-----------	------

Parameters & dependencies from workflow

Python Tool Descriptor



Generating a Script for



INPUTS

foreignCorpus	A's output "x"	.../inputs/f
nativeCorpus	B's output "y"	.../inputs/n

OUTPUTS

alignments	.../outputs/wa
------------	----------------

PARAMETERS

fertility	0.01
-----------	------

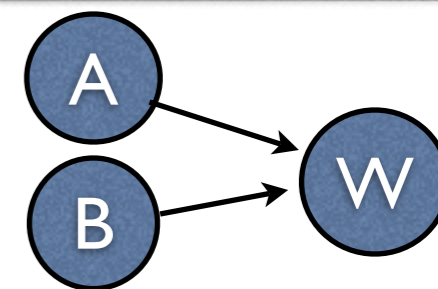
LoonyBin assigns paths

Parameters & dependencies from workflow

Python Tool Descriptor



Generating a Script for



INPUTS

foreignCorpus	A's output "x"	../inputs/f
nativeCorpus	B's output "y"	../inputs/n

OUTPUTS

alignments	../outputs/wa
------------	---------------

PARAMETERS

fertility	0.01
-----------	------

LoonyBin assigns paths

Parameters & dependencies from workflow

Python Tool Descriptor

```

java edu.cmu.Tokenizer ../inputs/f
../inputs/n > ../outputs/wa
  
```



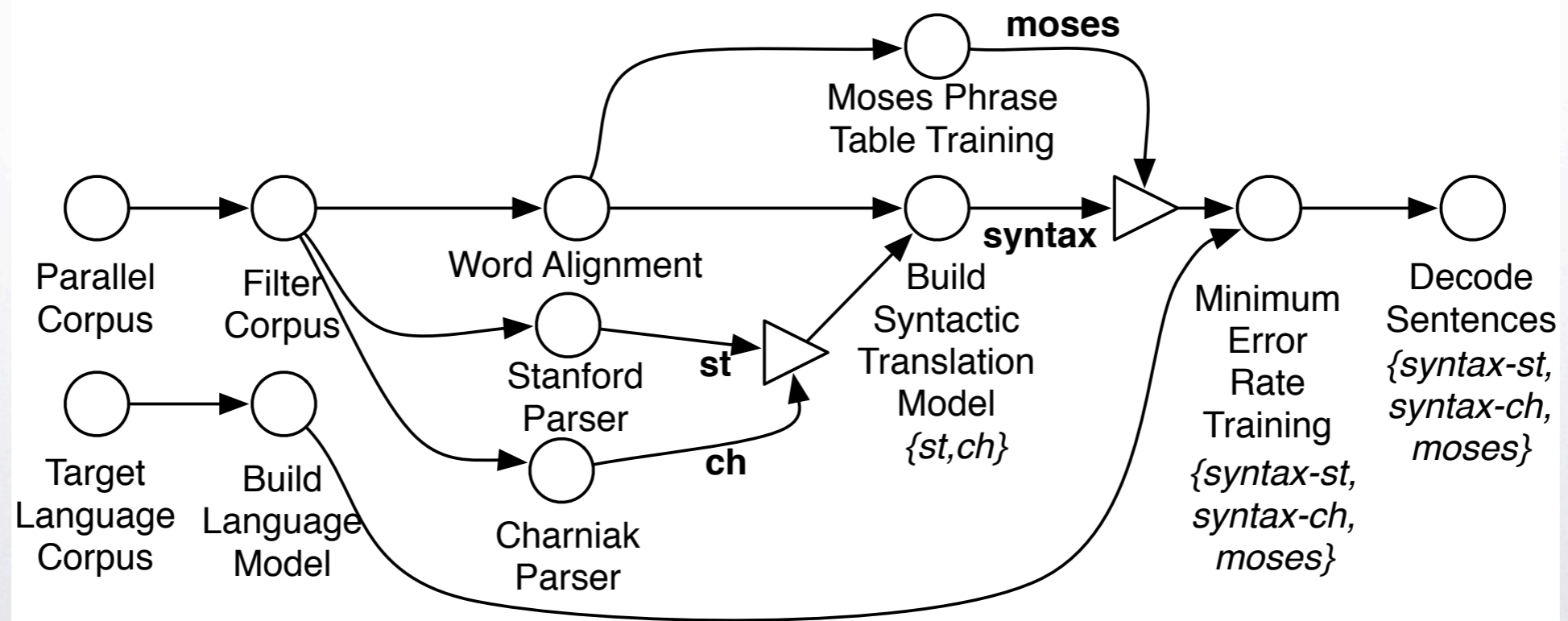
So far...

- Complaints about current implementation of empirical NLP experiments
- Define the tools
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(DAG of steps and dependencies)
- Generate & run a shell script



HyperWorkflows

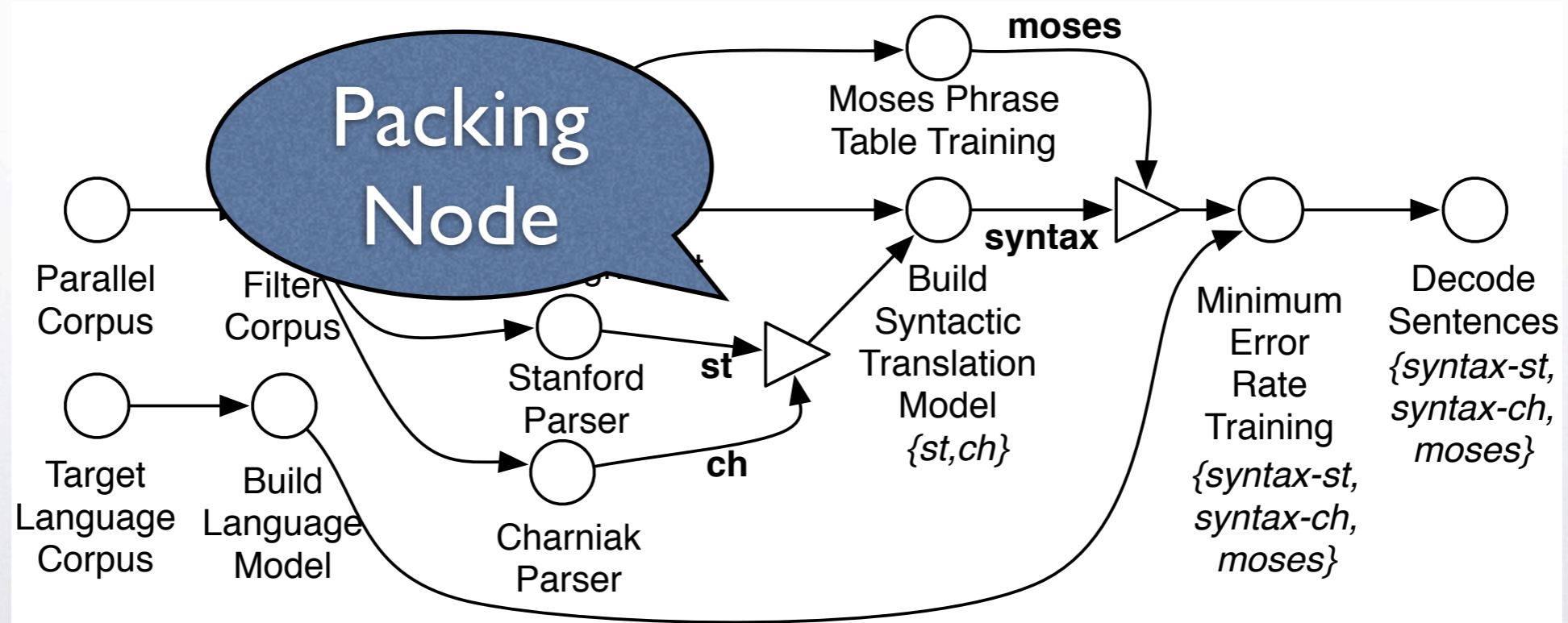
- **HyperWorkflows:** Shared substructure in experiments
- Encode small variations in a HyperDAG





HyperWorkflows

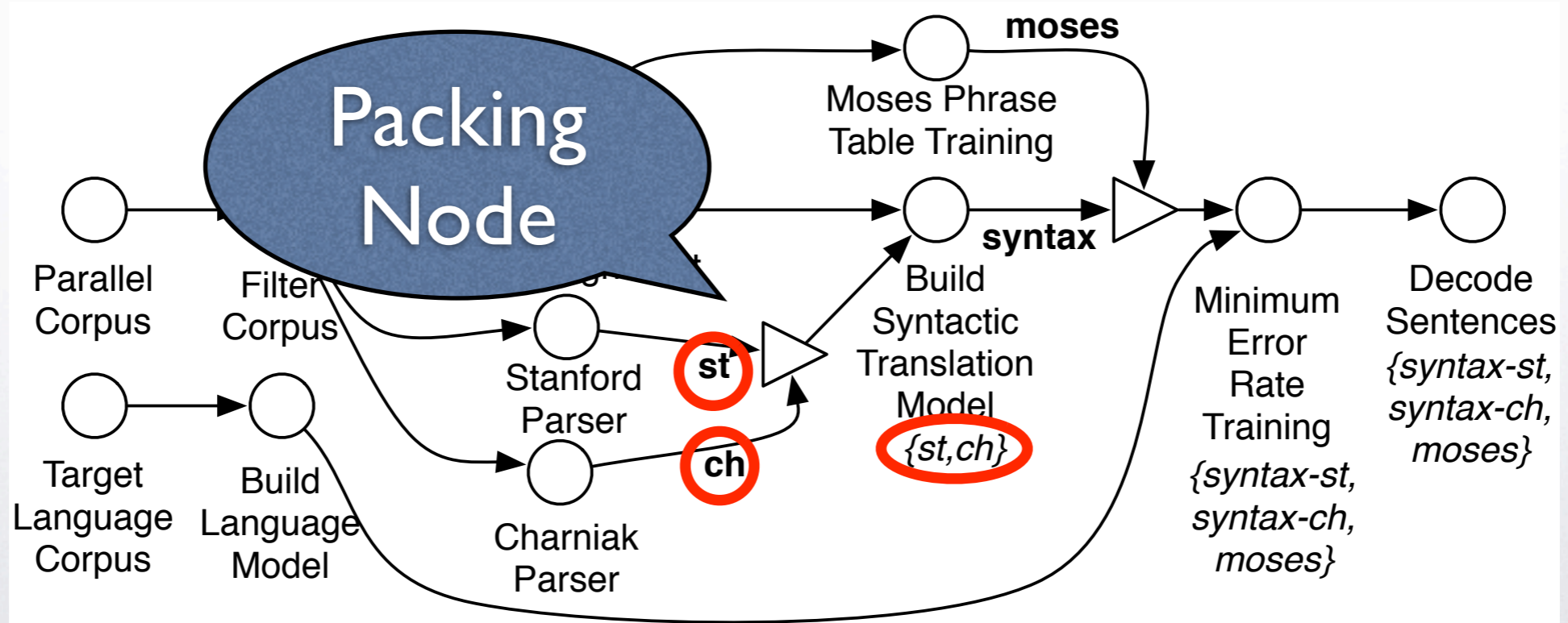
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HyperWorkflows

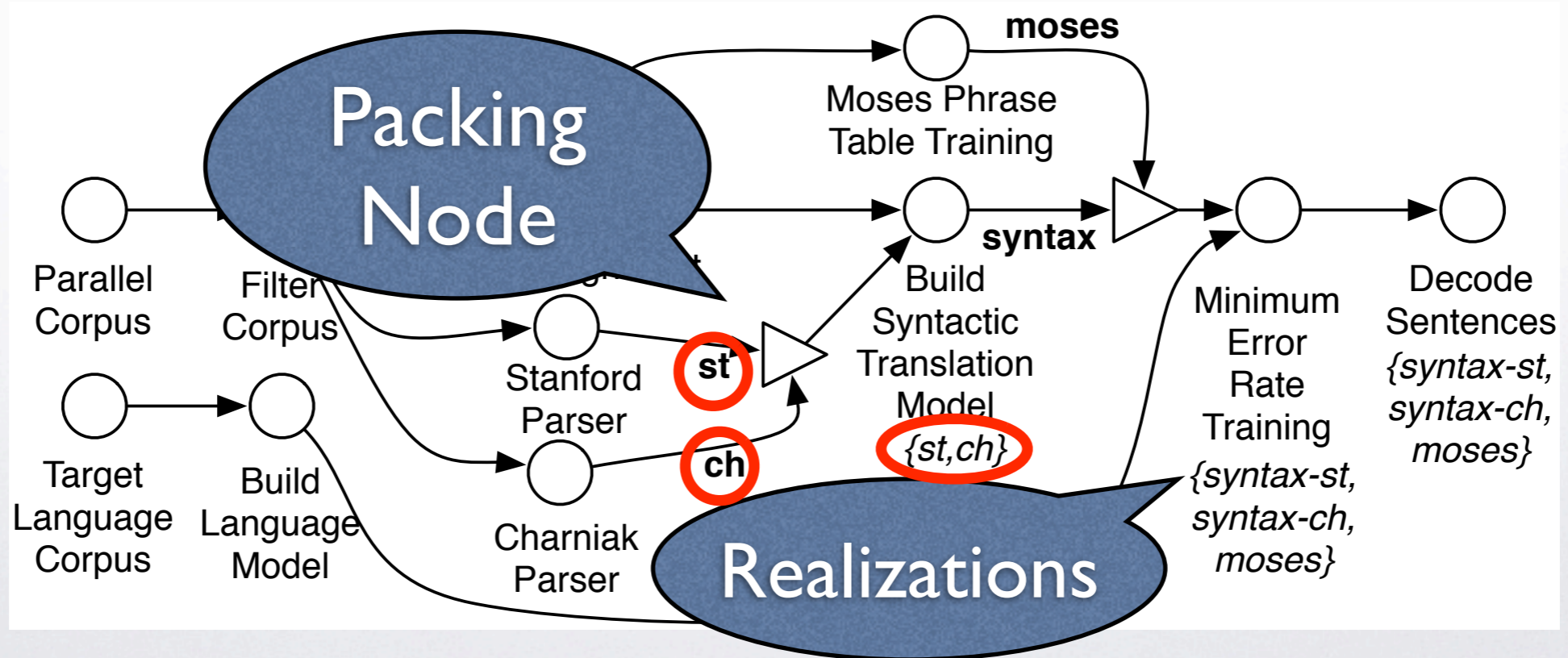
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HyperWorkflows

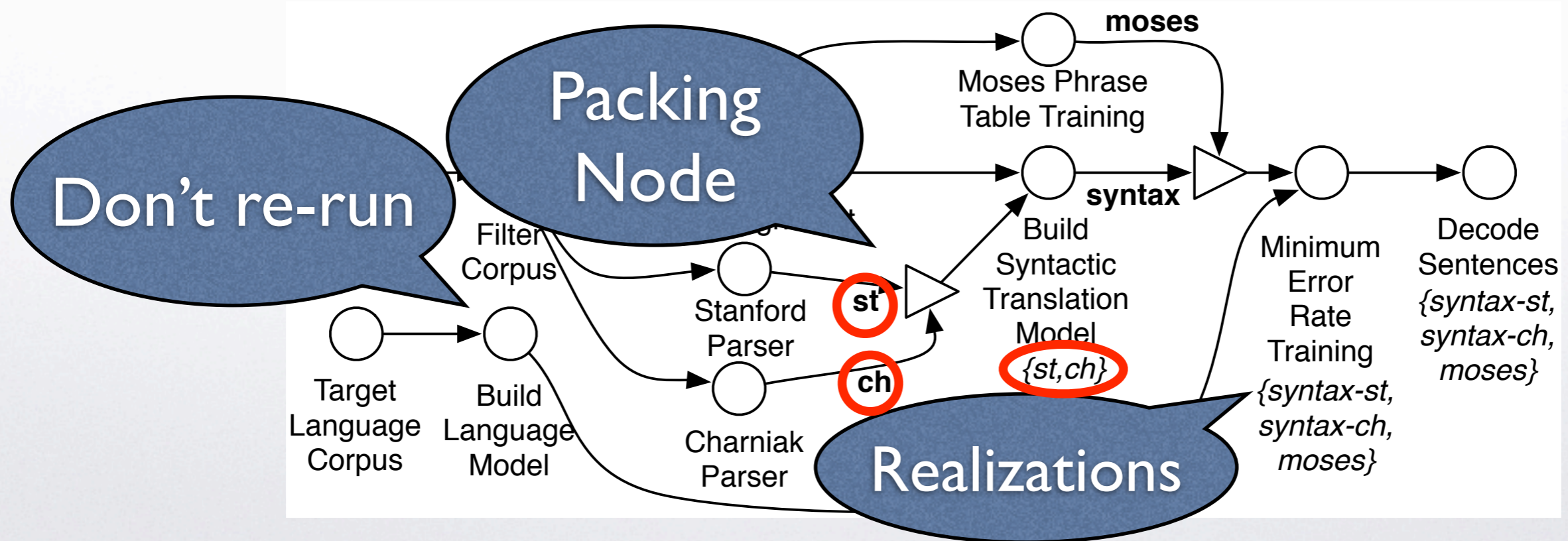
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HyperWorkflows

- **HyperWorkflows:** Shared substructure in experiments
- Encode small variations in a HyperDAG

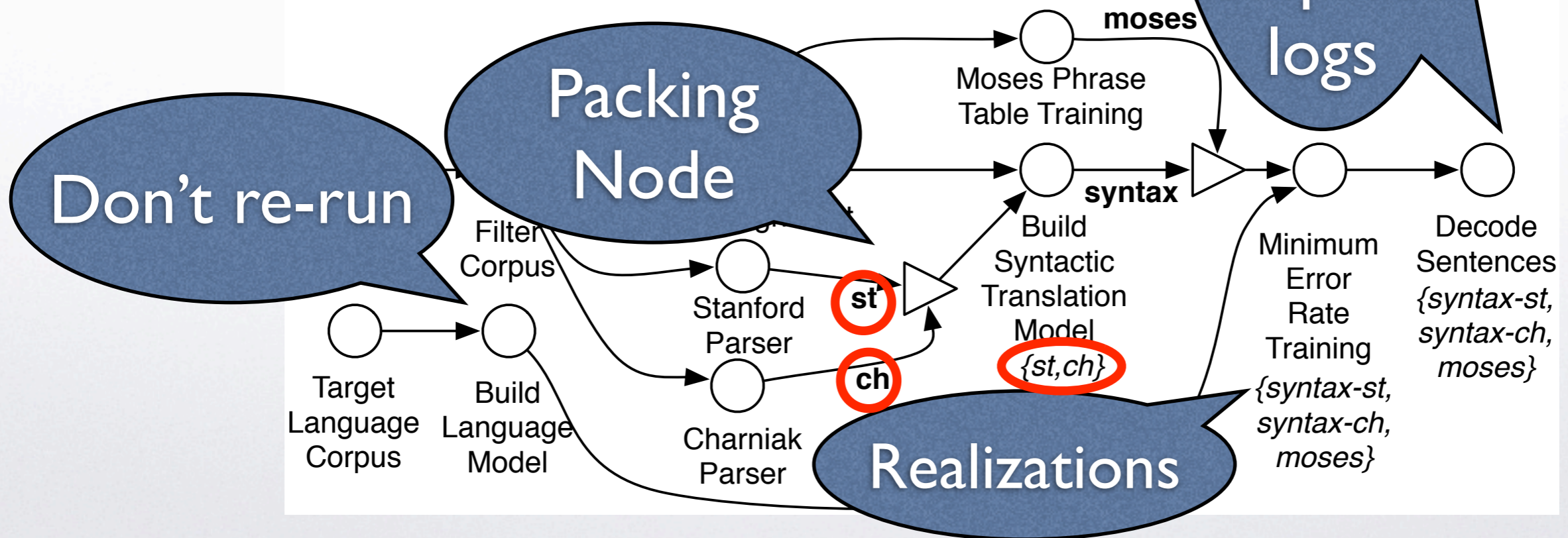




HyperWorkflow

- **HyperWorkflows:** Shared s in experiments
- Encode small variations in a Hyp

Organized directory structure & easy-to-parse logs





Multiple Machines and Schedulers

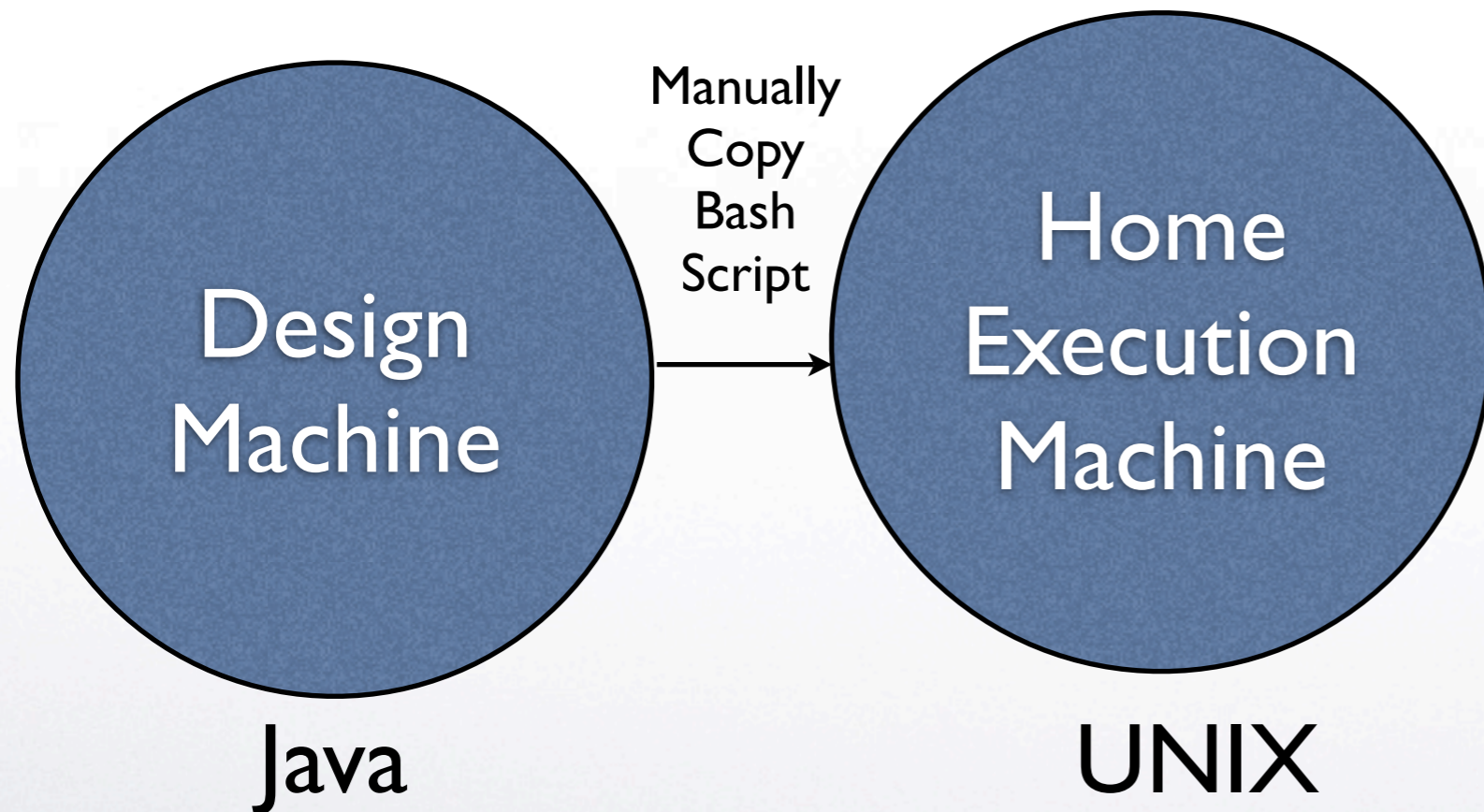
A large blue circle with a black outline, containing the text "Design Machine" in white.

Design
Machine

Java

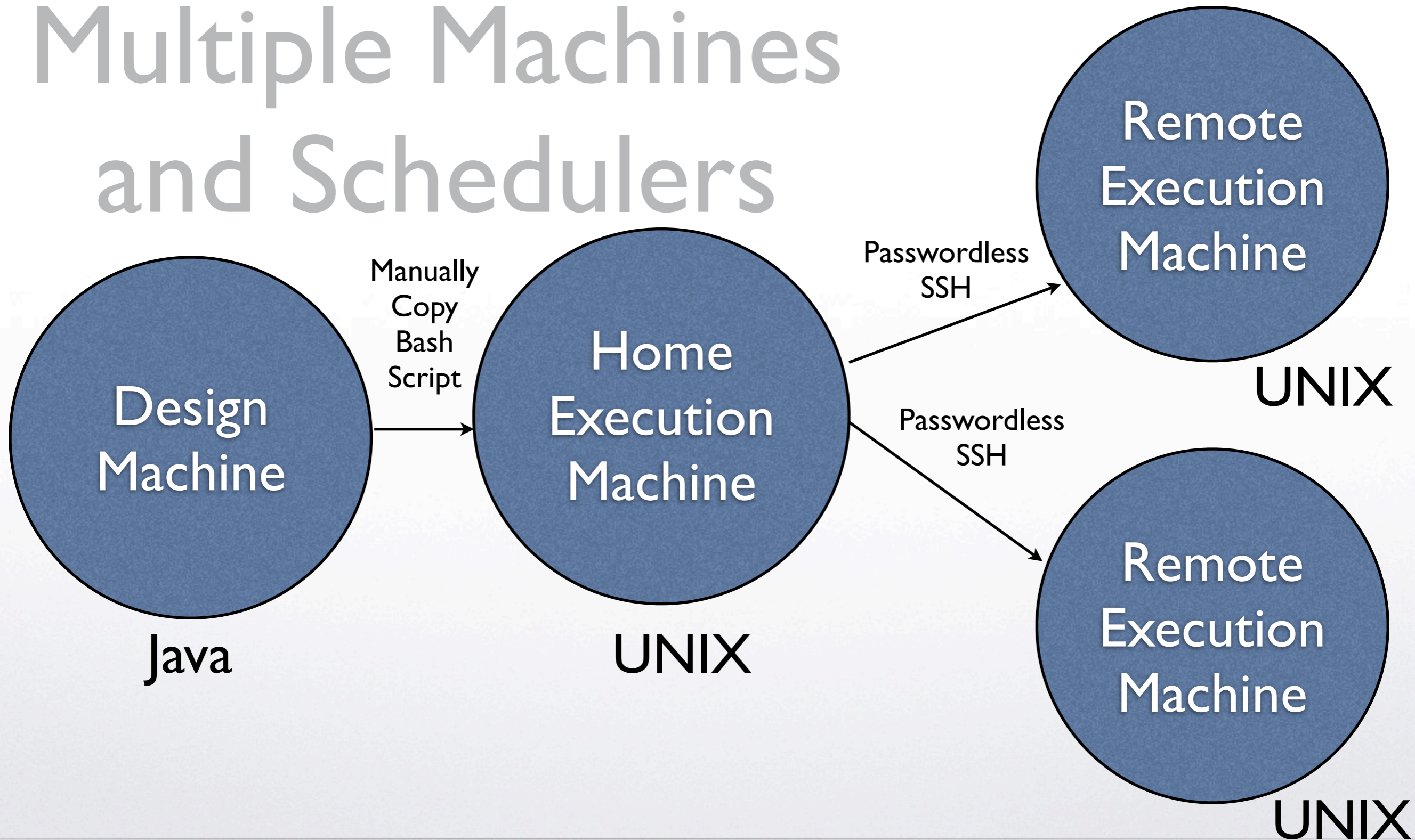


Multiple Machines and Schedulers



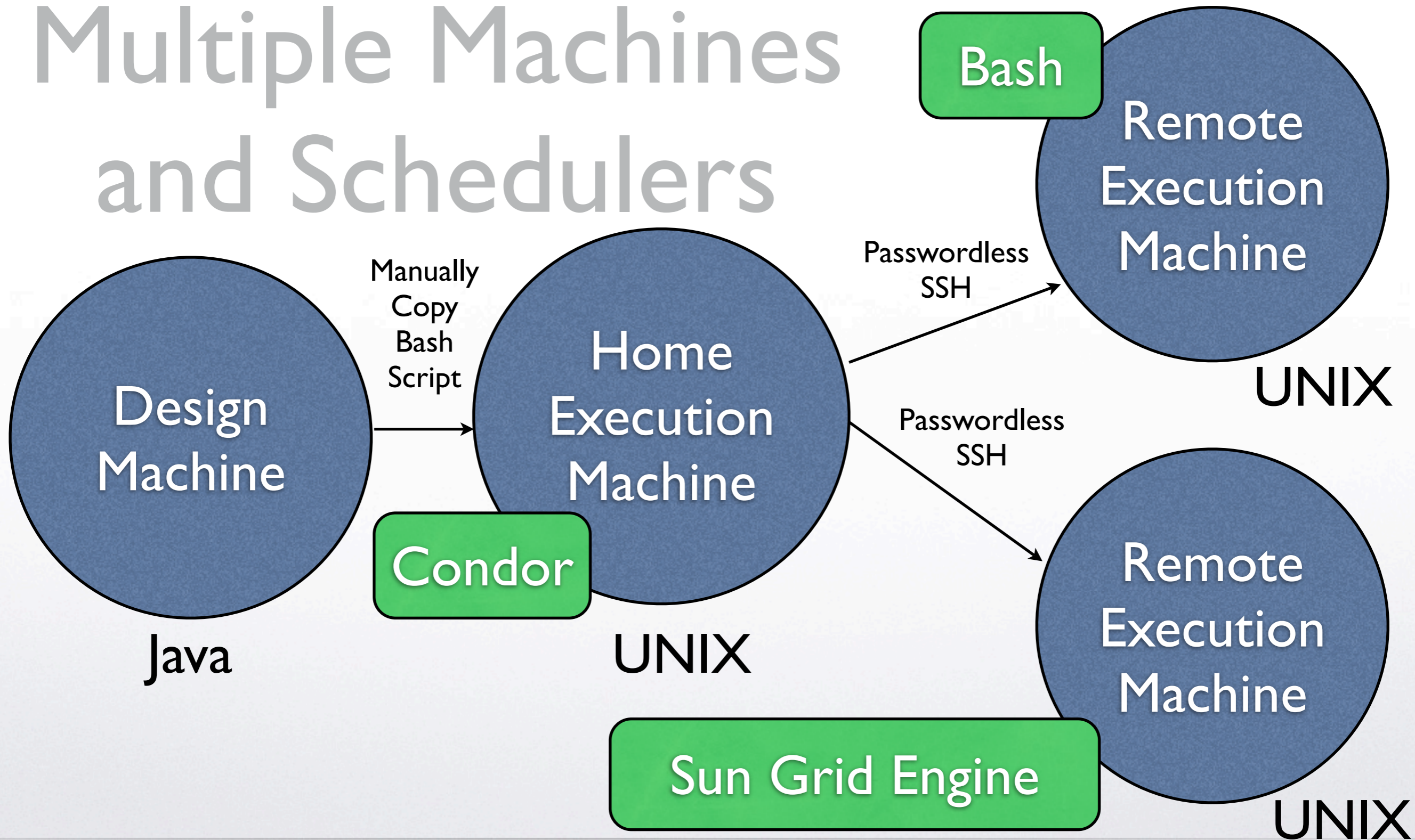


Multiple Machines and Schedulers





Multiple Machines and Schedulers





Other Things to Make Life Easier

- **Sanity checking at each step
(embedded in Tool Descriptors)**
- **Copying of files (including to HDFS)**
- **Text-based workflow definition
(in SVN)**
- **Open-source LGPL License**

WANTED

- Users & Contributors
- Machine Translation Toolpack (released)
- Corpus Processing Toolpack?
- Parsing Toolpack?
- Question Answering Toolpack?
- Resource Directory Toolpack?
- Speech Recognition Toolpack?



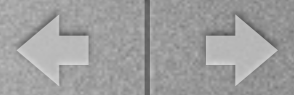
Conclusion

- Make your life easier
 - Automation
 - Sanity Checking
 - Logging
- Make your colleagues' lives easier
 - Reproducibility
 - Modularity

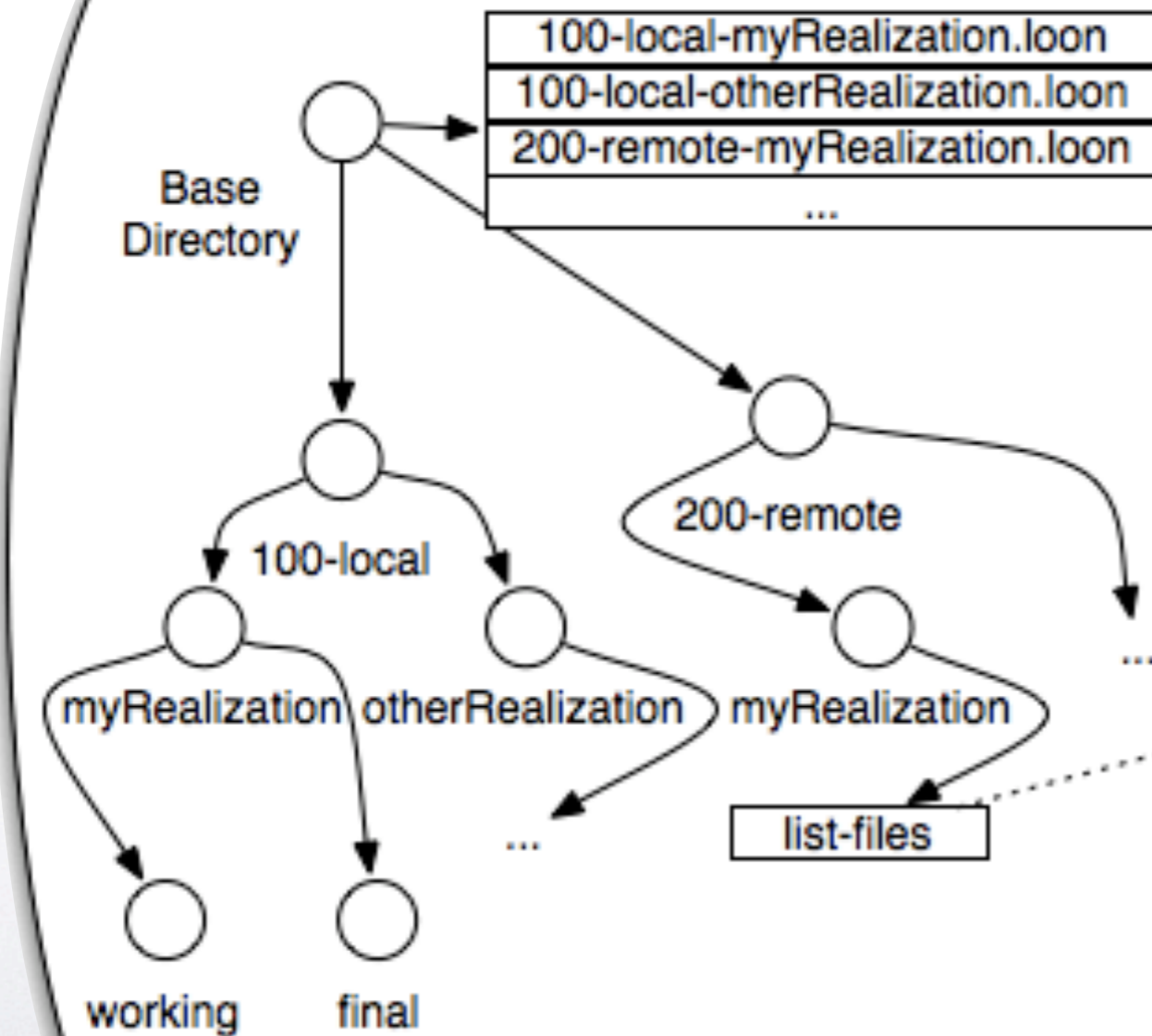
Questions?

Tutorial & Software at

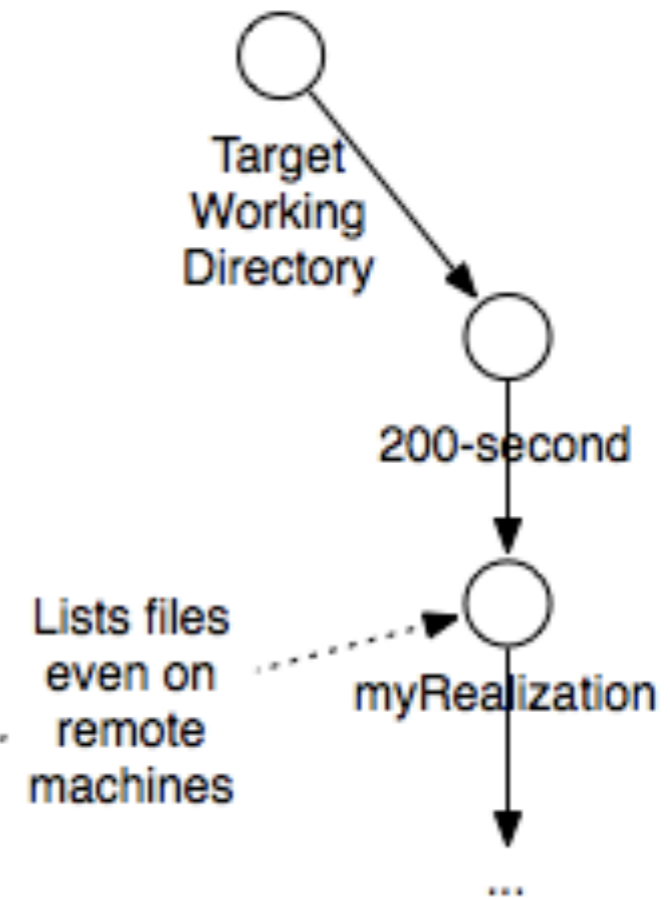
<http://loonybin.sourceforge.net>



Home Machine



Remote Machine 1





Practical Issues

- How does LoonyBin know when to run/rerun a step?
- Each vertex x realization has a loon log file. If the file does not exist, the step is (re)run
- What if I don't want that many steps?
- Workflows have many granularities!



Recommendations

- Store your workflow files in SVN
- Store your log files in SVN -- experimental data is useful long after we get annoyed with size of data files!
- Log the SVN revision of frequently changing tools in your Loon logs -- Build them from SVN every time to ensure you're executing that version



Future Work

- Default parameters -- Short-term
- Asynchronous DAG execution (currently all steps are run in serial) -- Mid-Term
- Workflow monitoring and reprioritization during execution -- Long-term
- Encapsulation of workflows as “tools” (hierarchical tools) -- Long-term
- Automatic file compression -- Long-term