

English-Czech Machine Translation Using TectoMT

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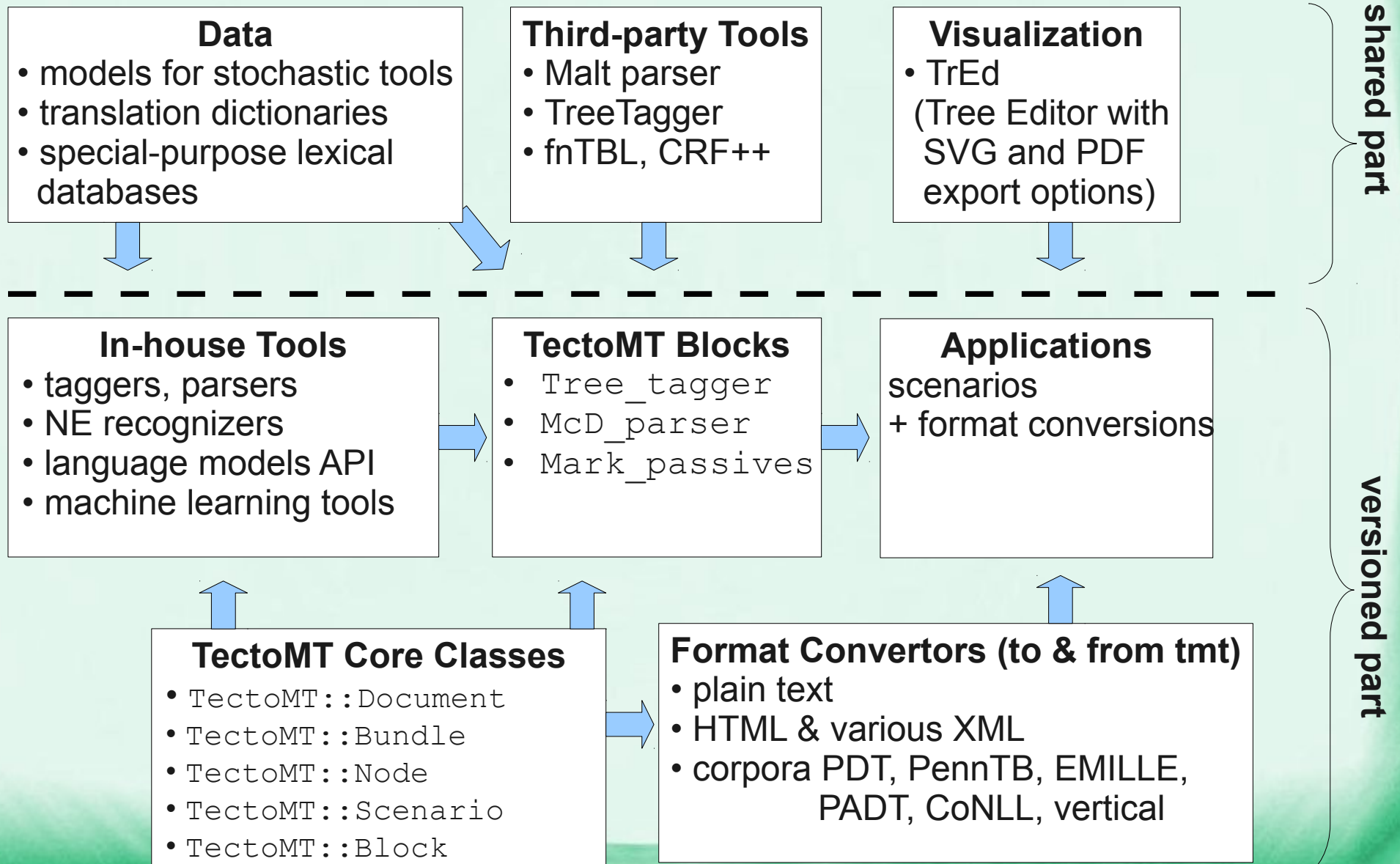
19th Week of Doctoral Students, June 3, 2010

Outline

- TectoMT – NLP framework and MT system
- Demo translation step by step
- Hidden Markov Tree Models (HMTM)
- Results – three metrics of translation quality

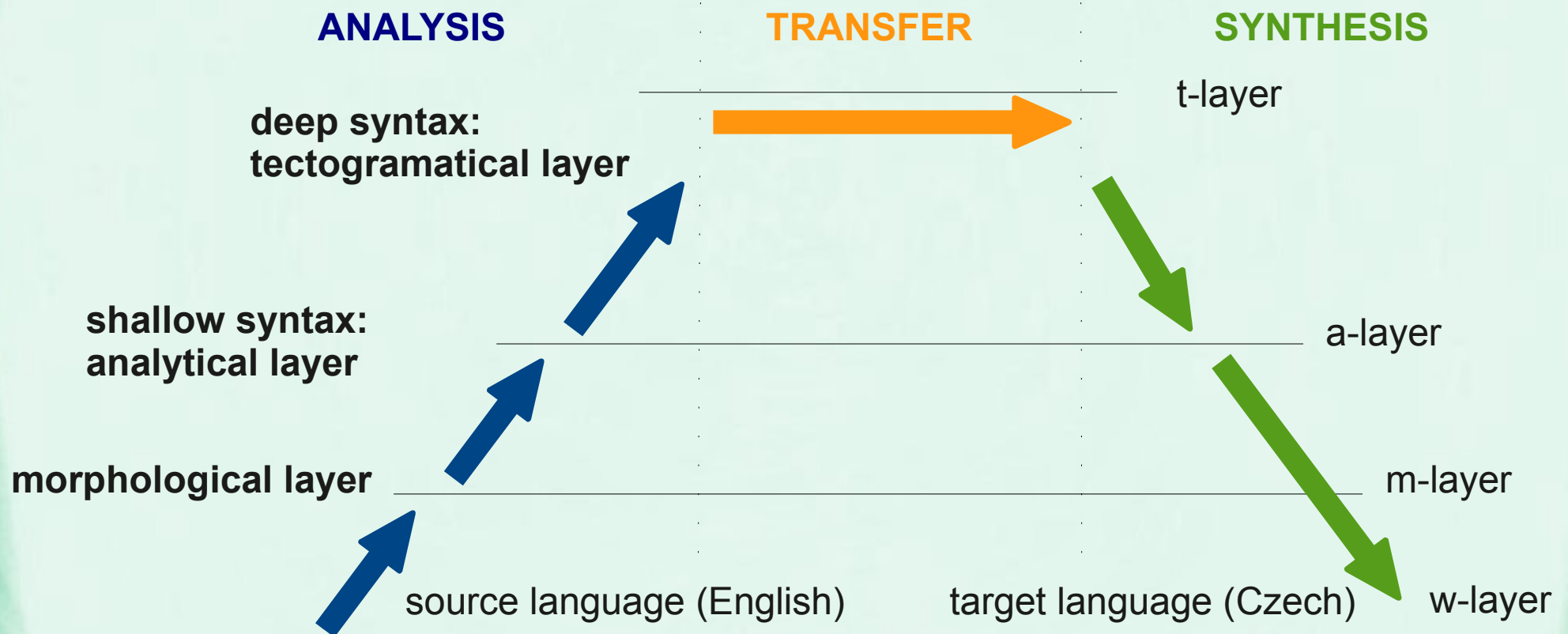
TectoMT – framework for NLP

modular, open source, Perl, Linux, OOP-style



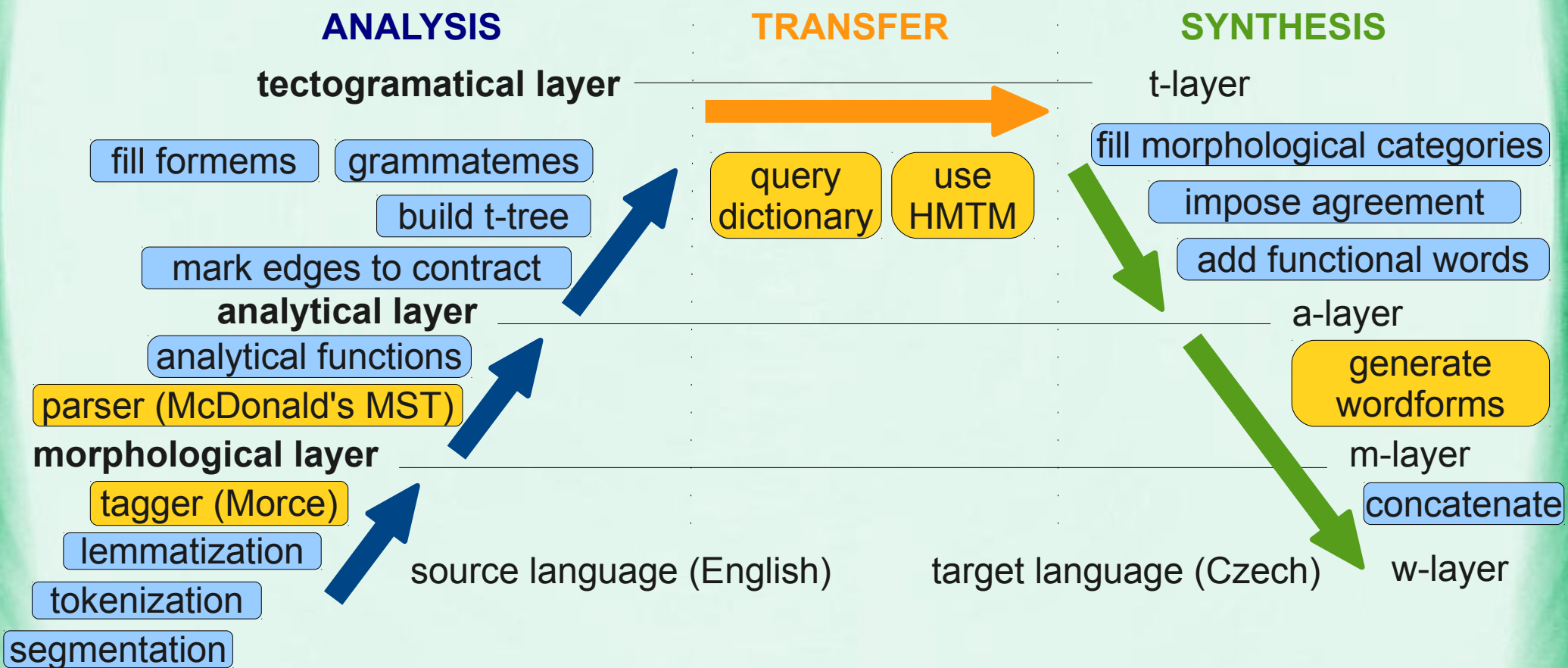
TectoMT – MT system

transfer over the tectogrammatical layer



TectoMT – MT system

rule based & statistical blocks



Demo Translation – Analysis

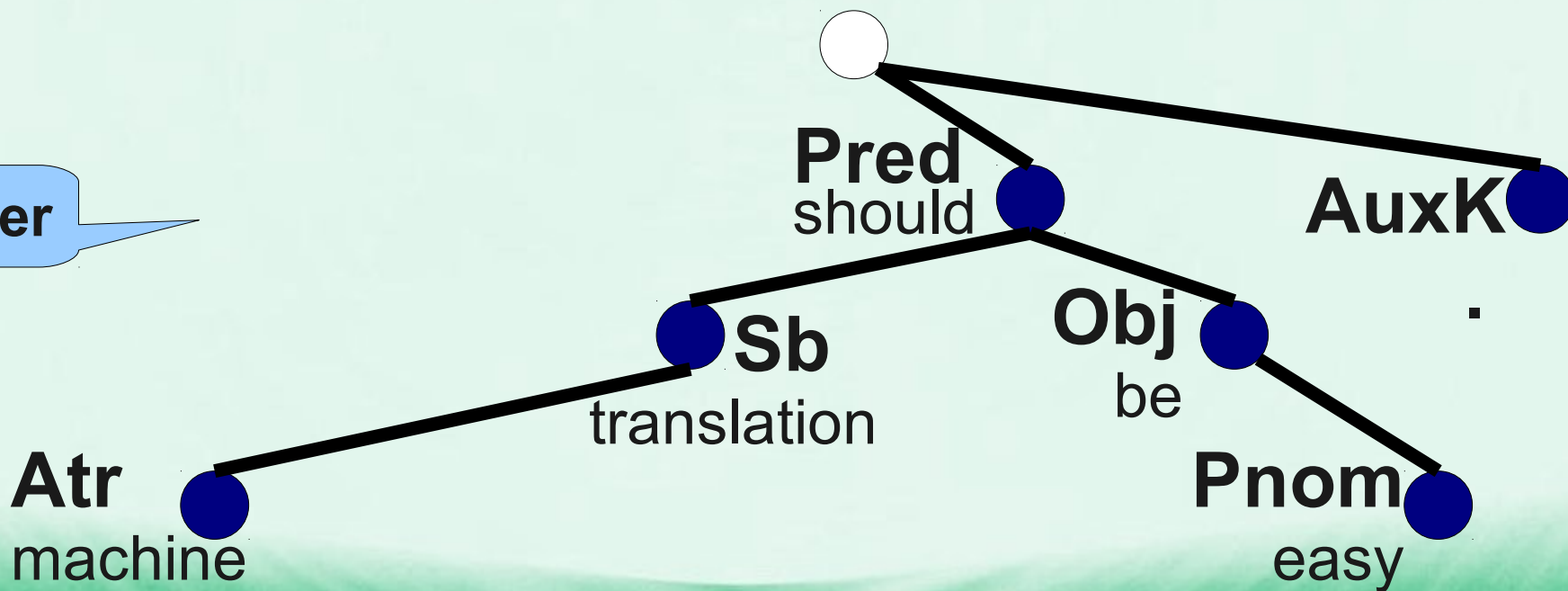
raw text

Machine translation should be easy.

m-layer

●	●	●	●	●	●
machine	translation	should	be	easy	.
NN	NN	MD	VB	JJ	.

a-layer



Demo Translation – Analysis

raw text

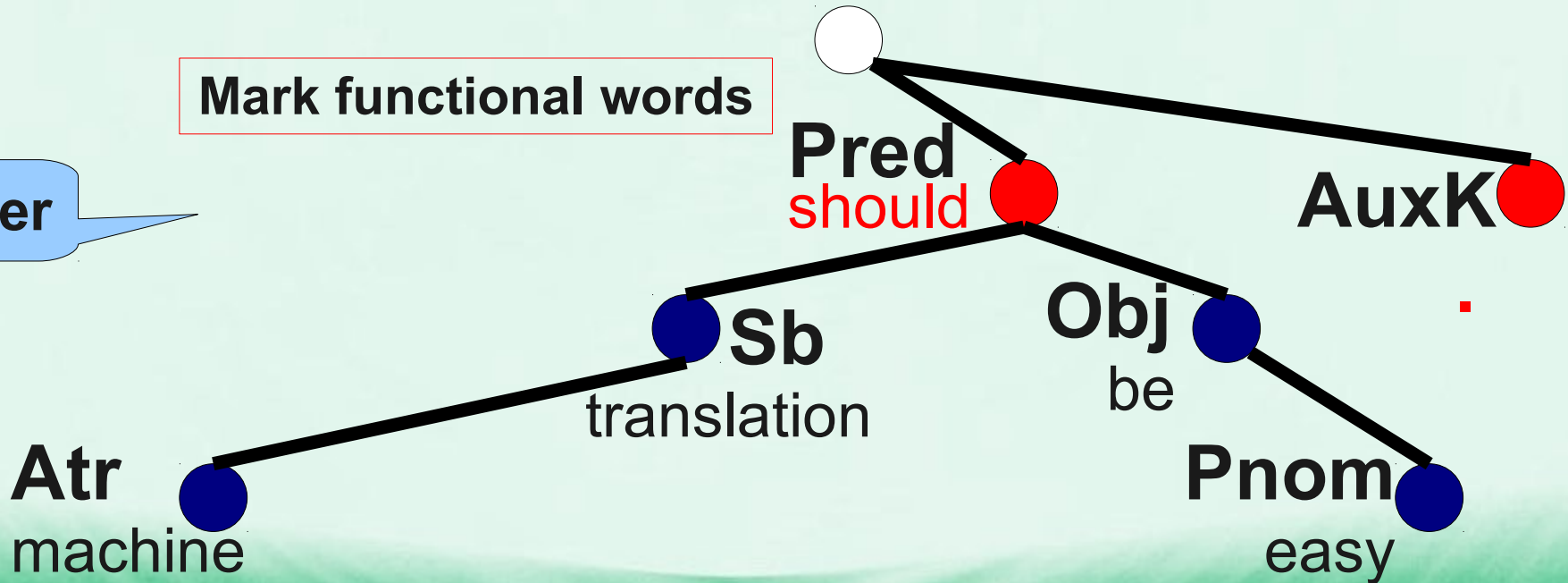
Machine translation should be easy.

m-layer

●	●	●	●	●	●
machine	translation	should	be	easy	.
NN	NN	MD	VB	JJ	.

Mark functional words

a-layer



Demo Translation – Analysis

raw text

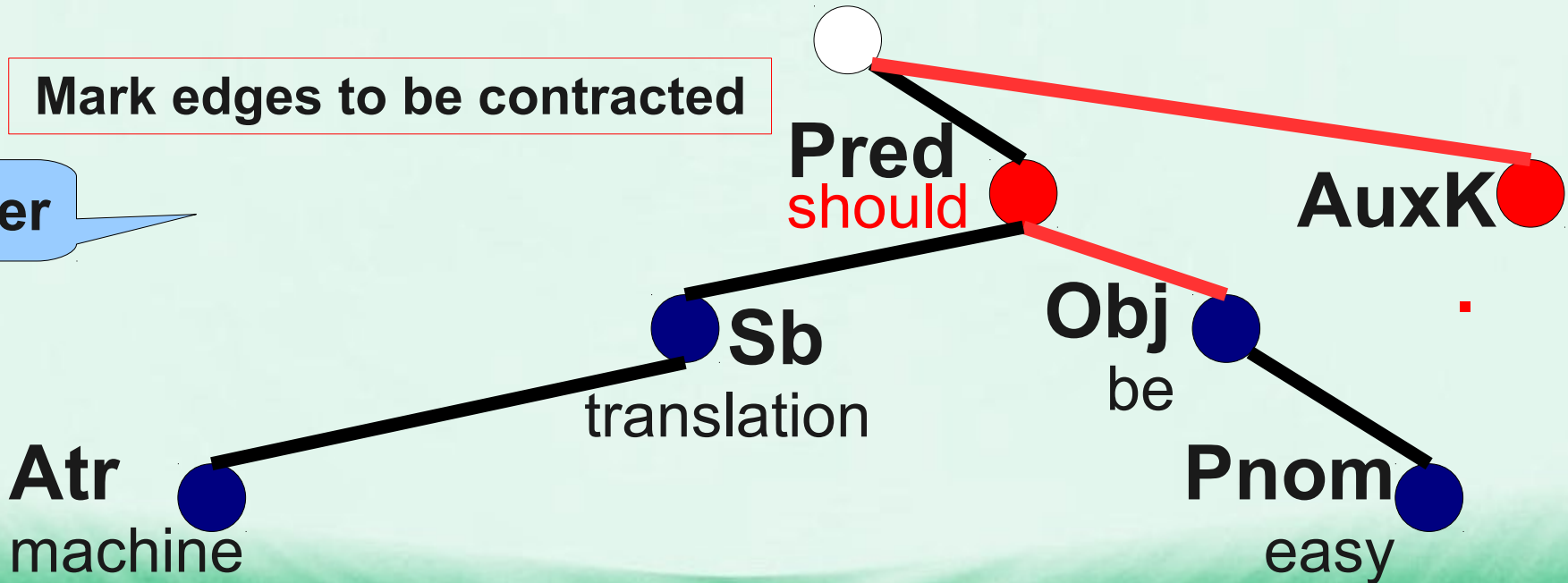
Machine translation should be easy.

m-layer

●	●	●	●	●	●
machine	translation	should	be	easy	.
NN	NN	MD	VB	JJ	.

Mark edges to be contracted

a-layer



Demo Translation – Analysis

raw text

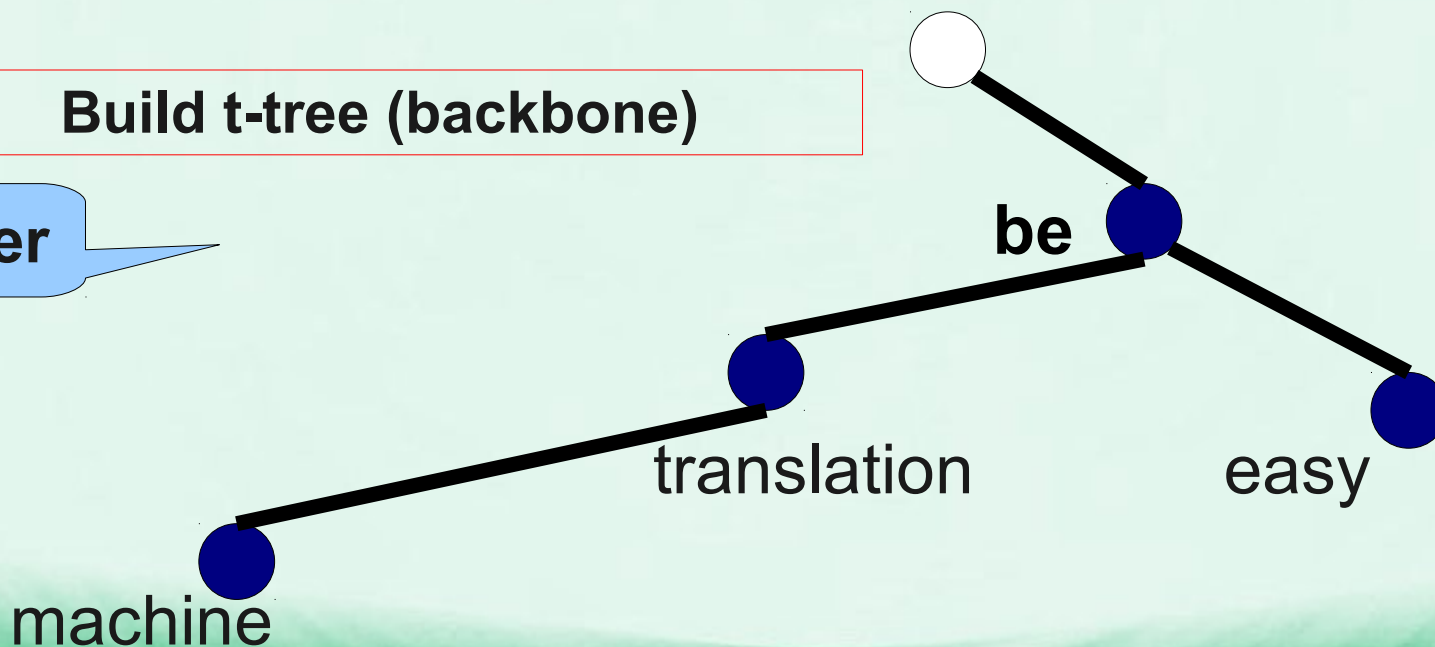
Machine translation should be easy.

m-layer

●	●	●	●	●	●
machine	translation	should	be	easy	.
NN	NN	MD	VB	JJ	.

Build t-tree (backbone)

t-layer



Demo Translation – Analysis

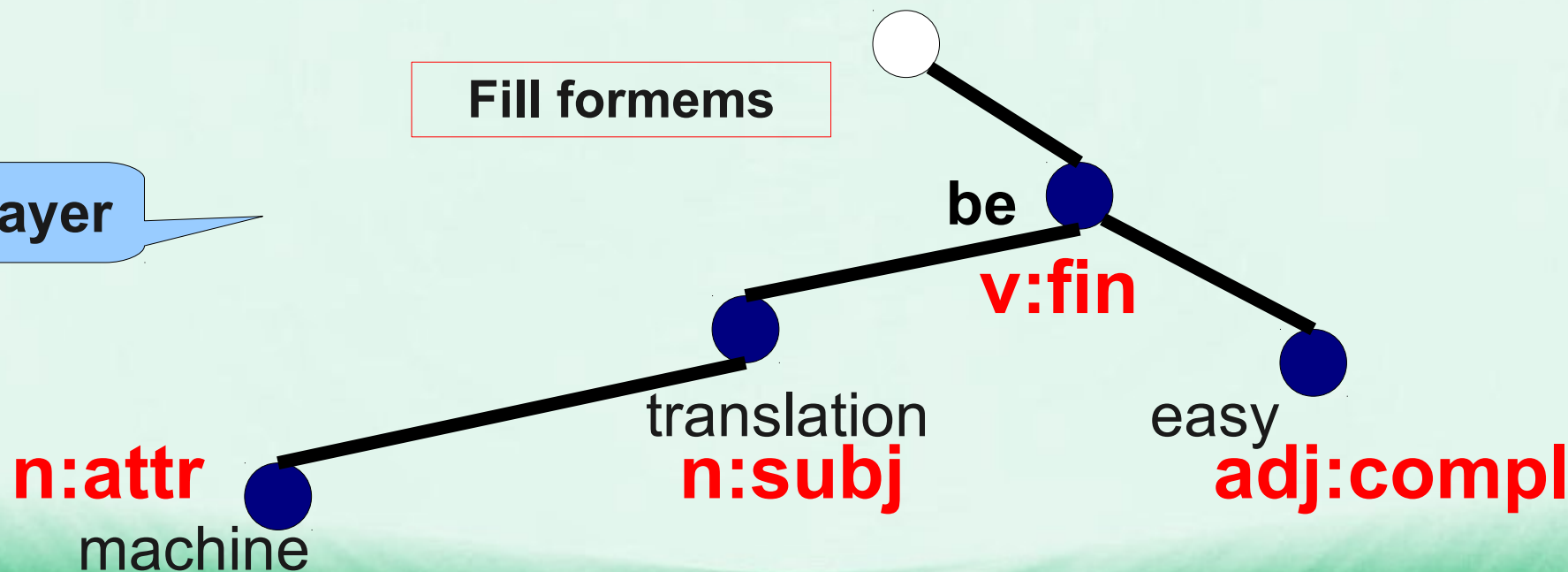
raw text

Machine translation should be easy.

m-layer

●	●	●	●	●	●
machine	translation	should	be	easy	.
NN	NN	MD	VB	JJ	.

t-layer



Demo Translation – Analysis

raw text

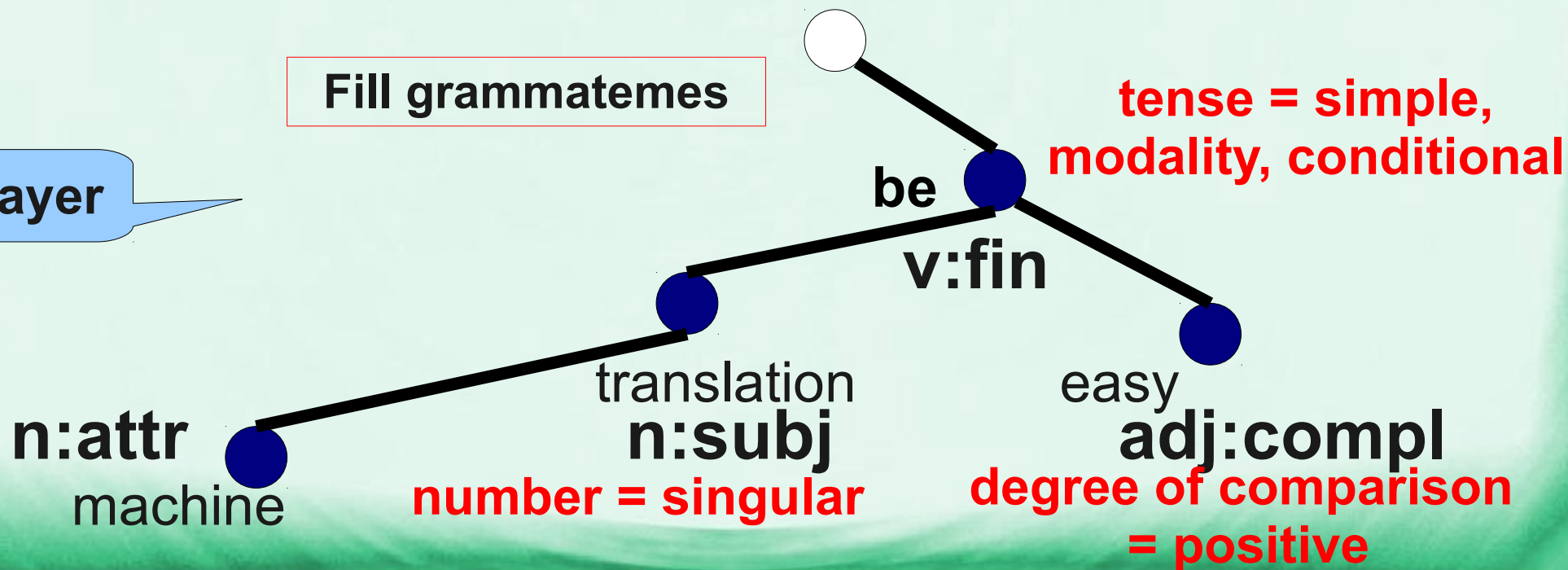
Machine translation should be easy.

m-layer

●	●	●	●	●	●
machine	translation	should	be	easy	.
NN	NN	MD	VB	JJ	.

Fill grammatememes

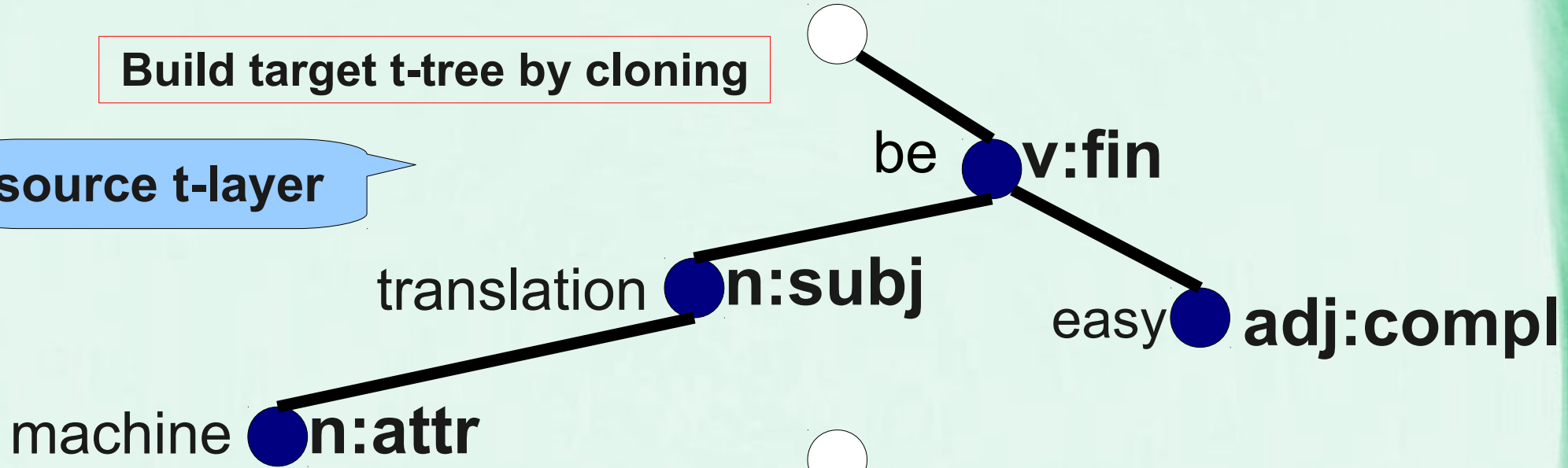
t-layer



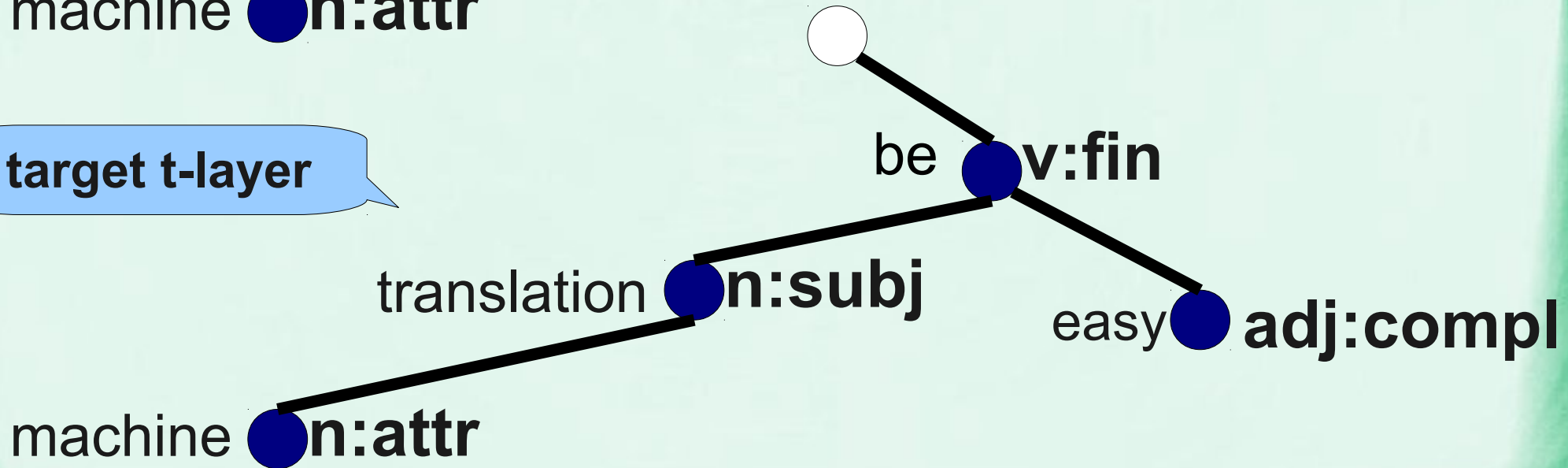
Demo Translation – Transfer

Build target t-tree by cloning

source t-layer



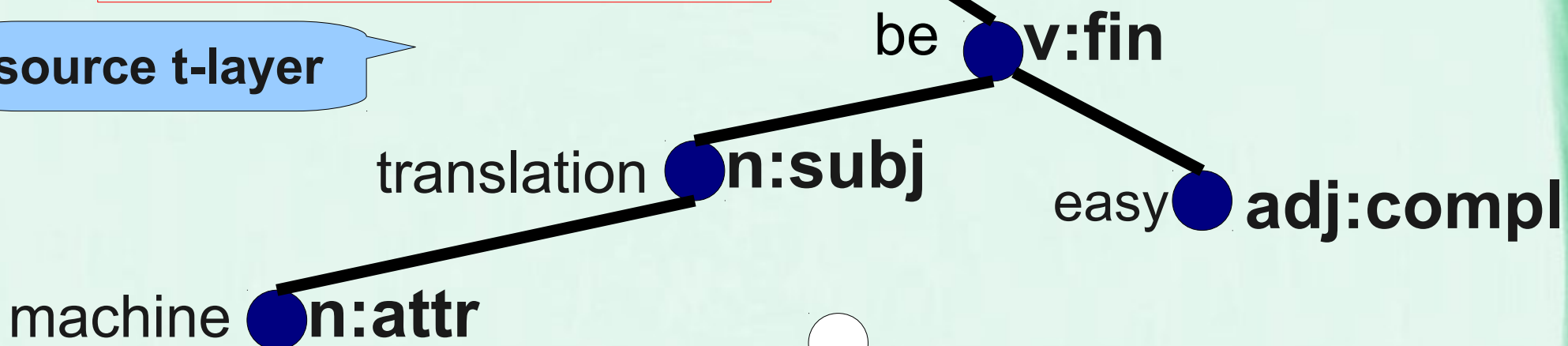
target t-layer



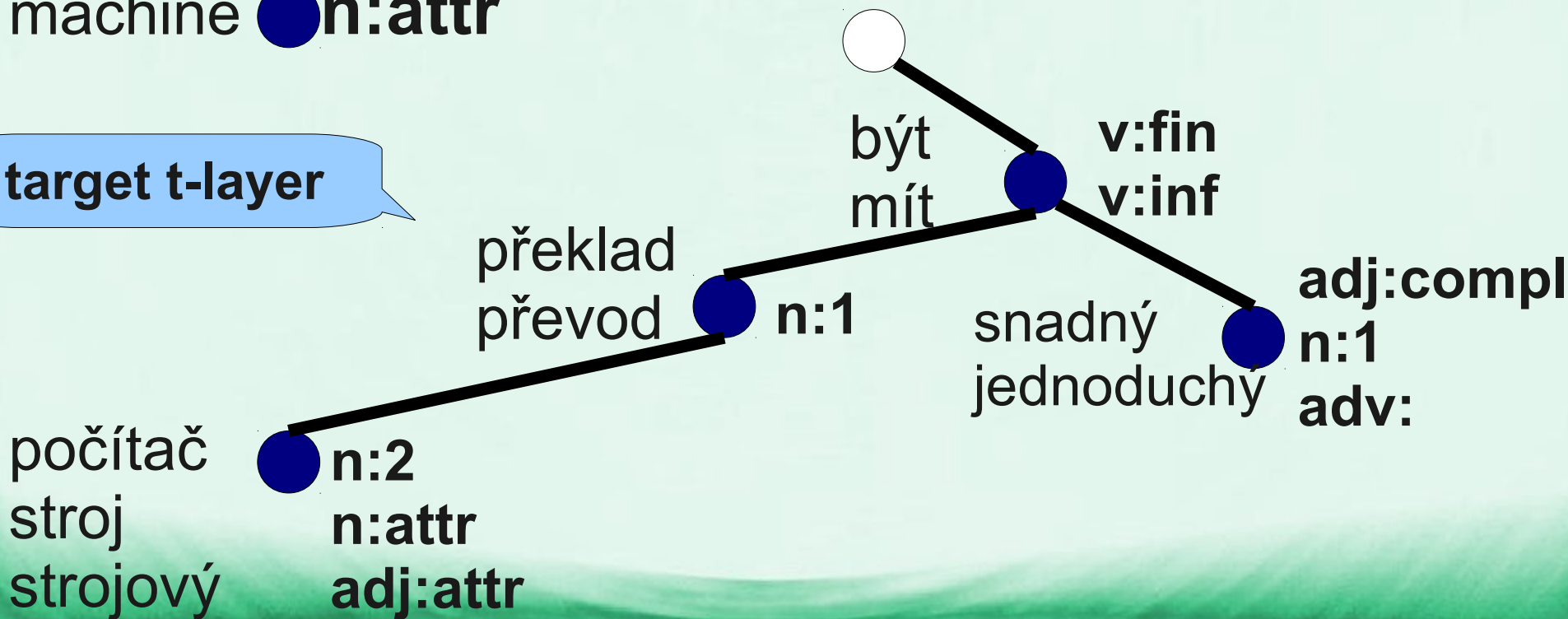
Demo Translation – Transfer

Get translation variants for lemmas and formems

source t-layer



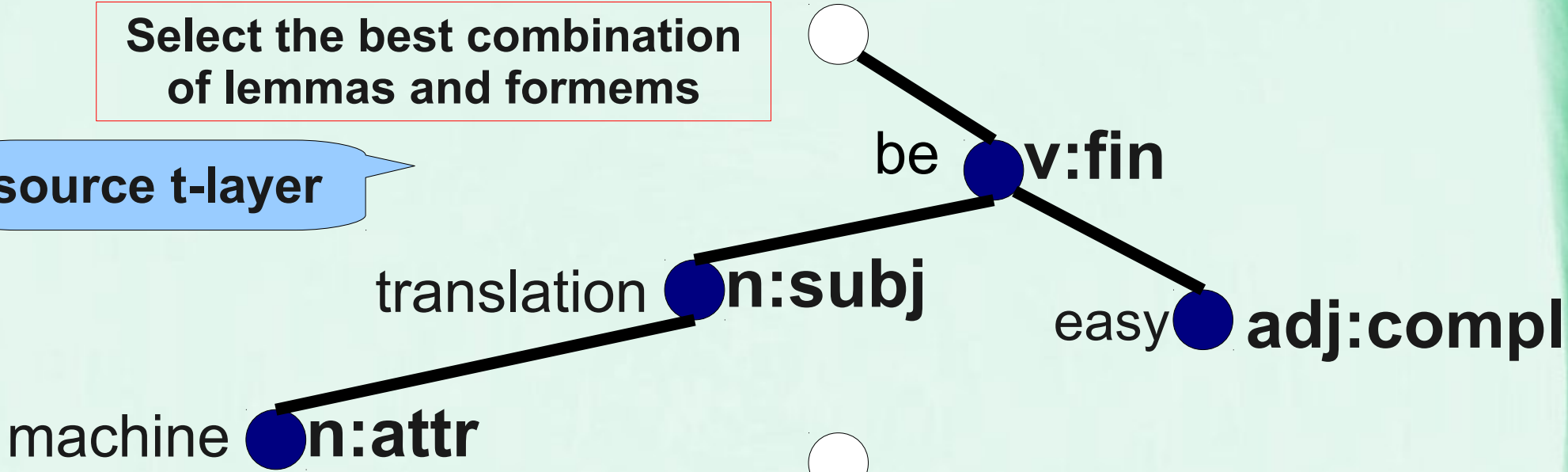
target t-layer



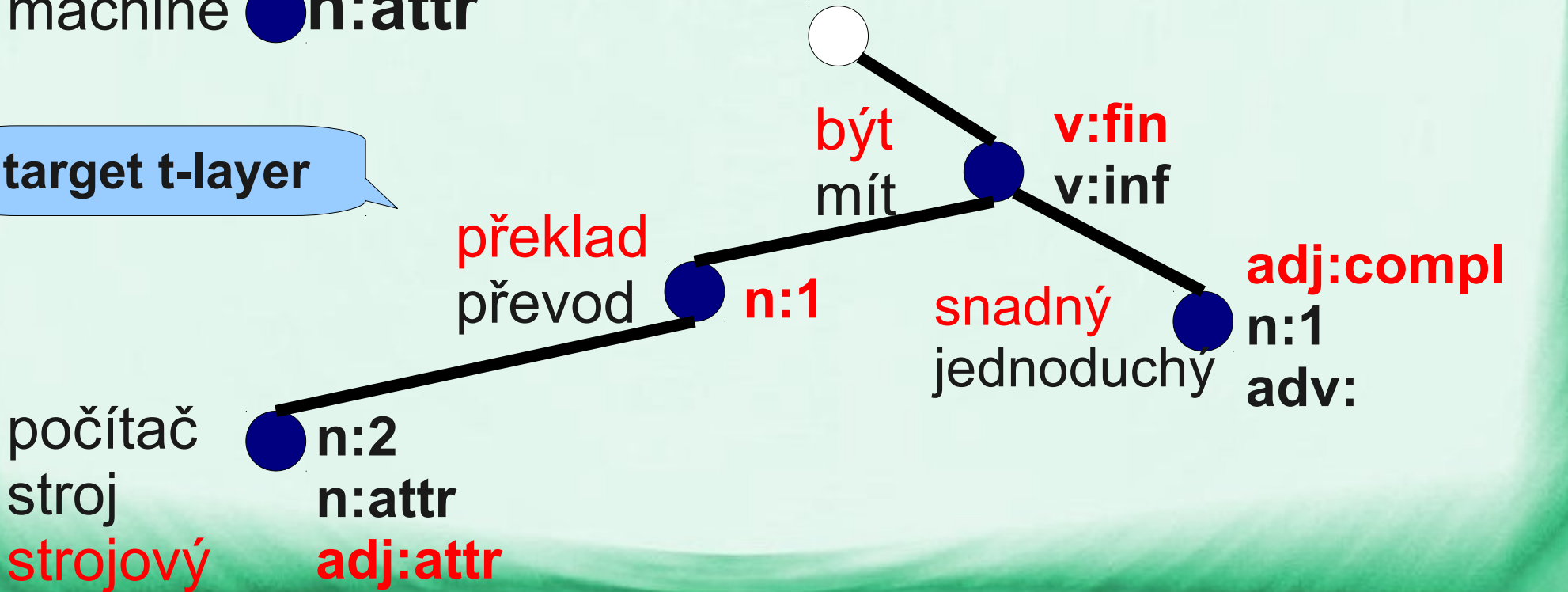
Demo Translation – Transfer

Select the best combination of lemmas and formems

source t-layer



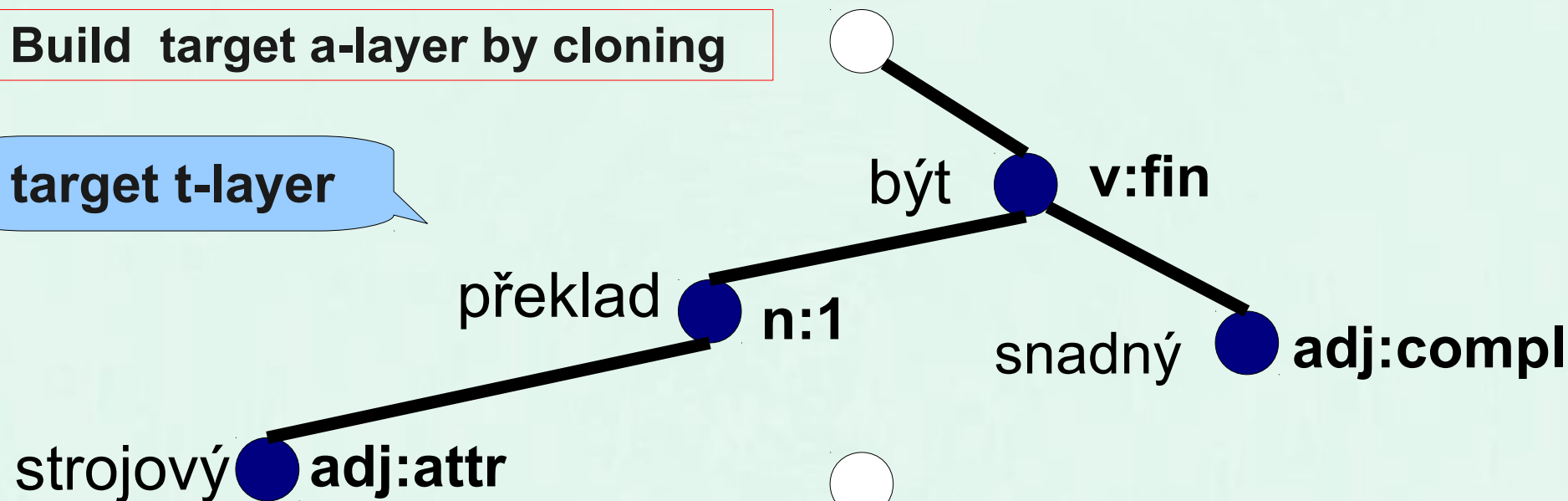
target t-layer



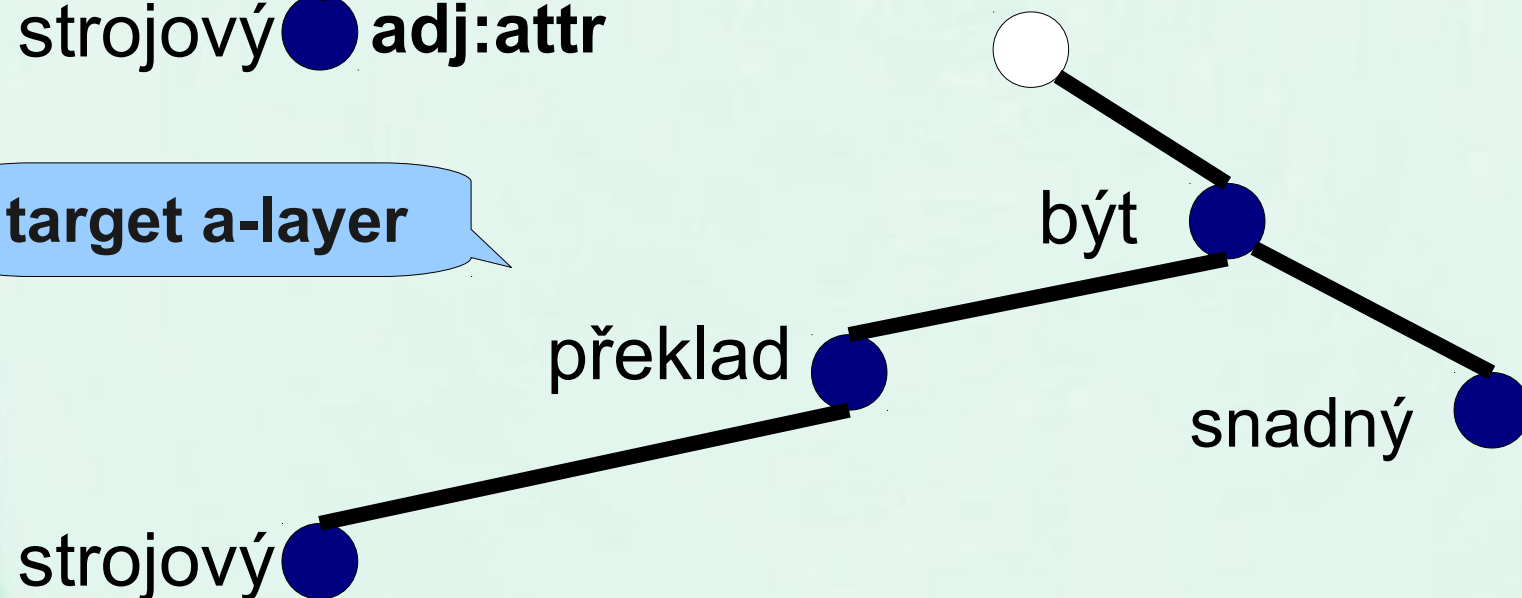
Demo Translation – Synthesis

Build target a-layer by cloning

target t-layer



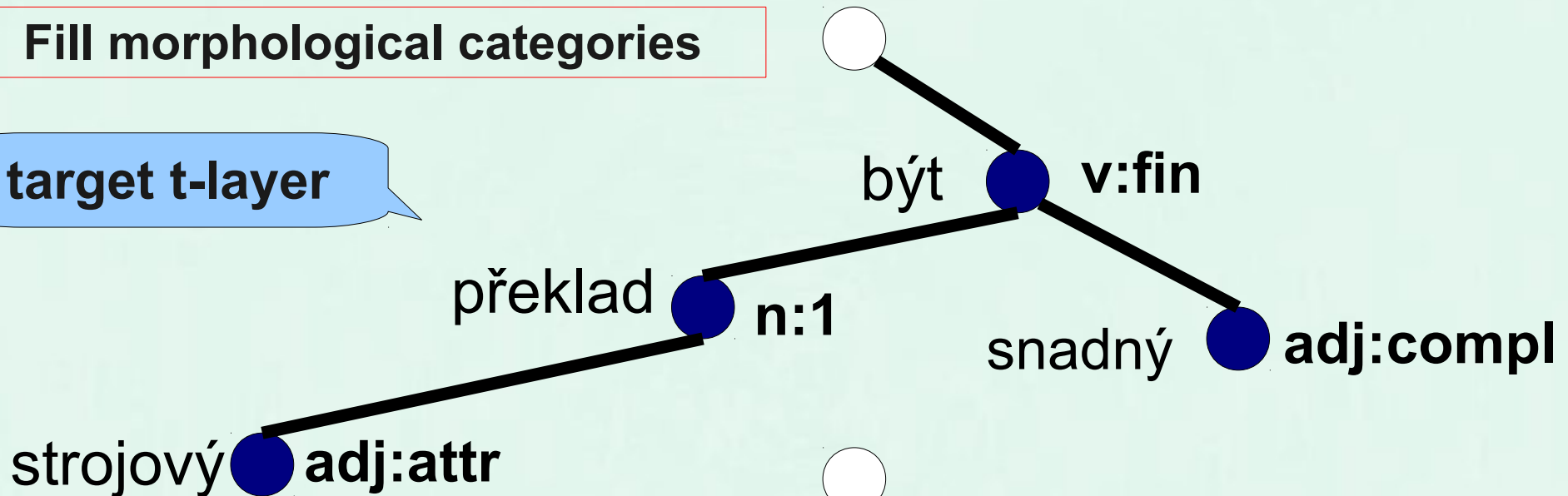
target a-layer



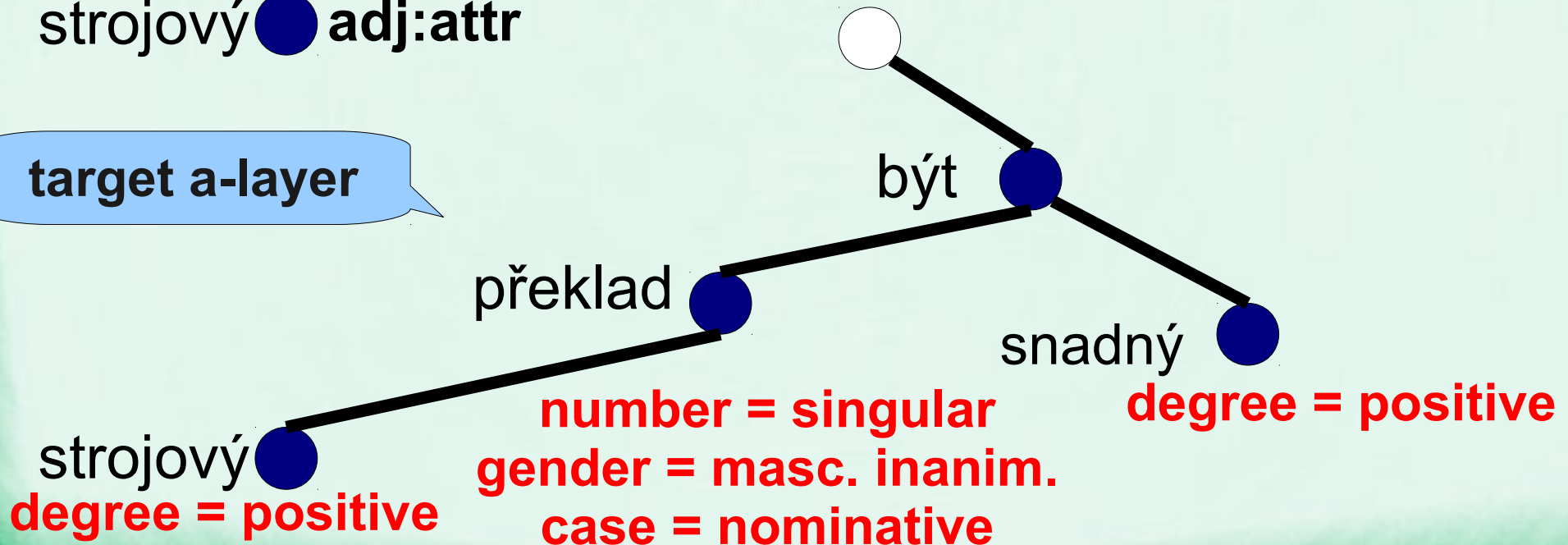
Demo Translation – Synthesis

Fill morphological categories

target t-layer



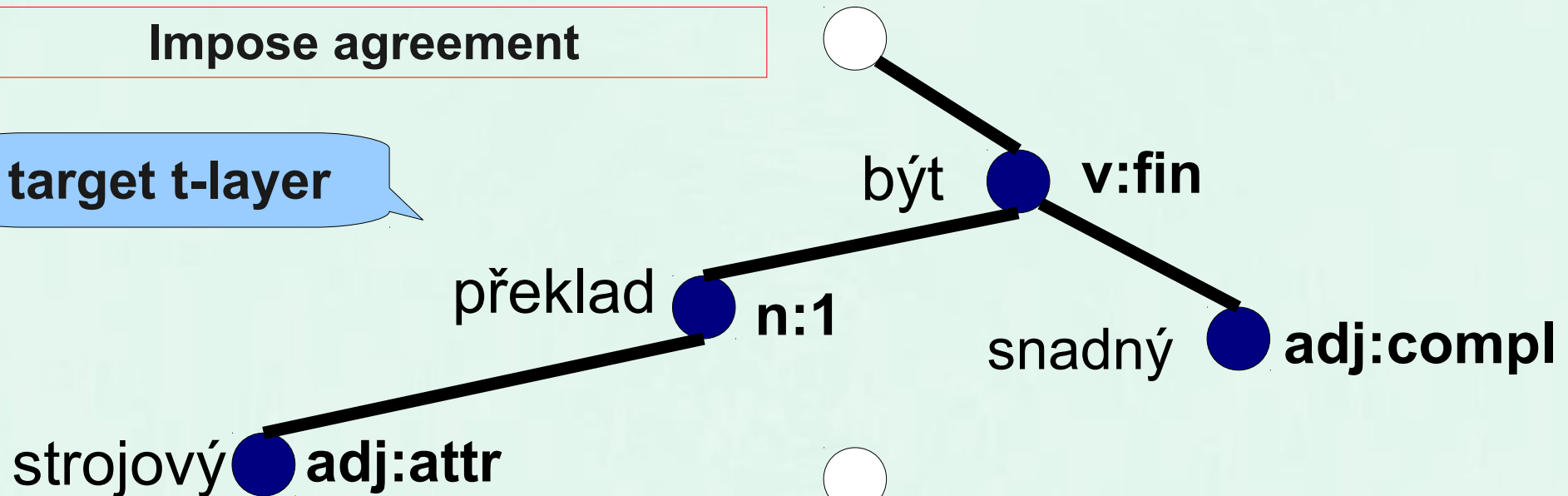
target a-layer



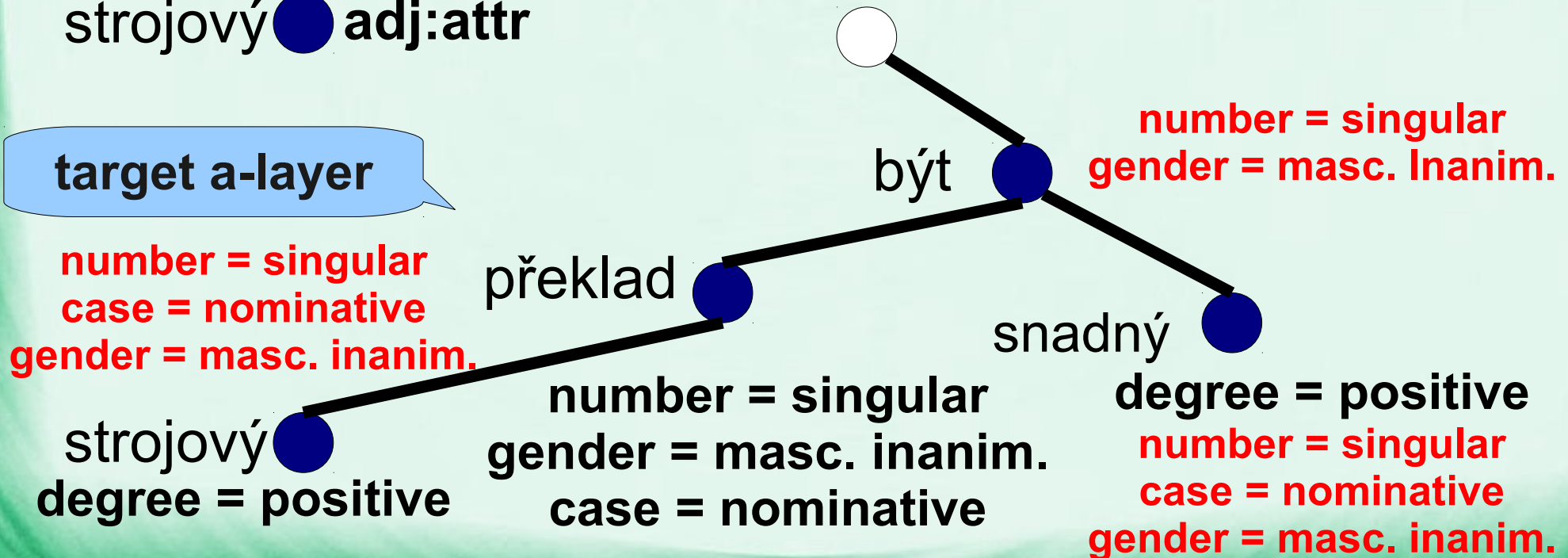
Demo Translation – Synthesis

Impose agreement

target t-layer



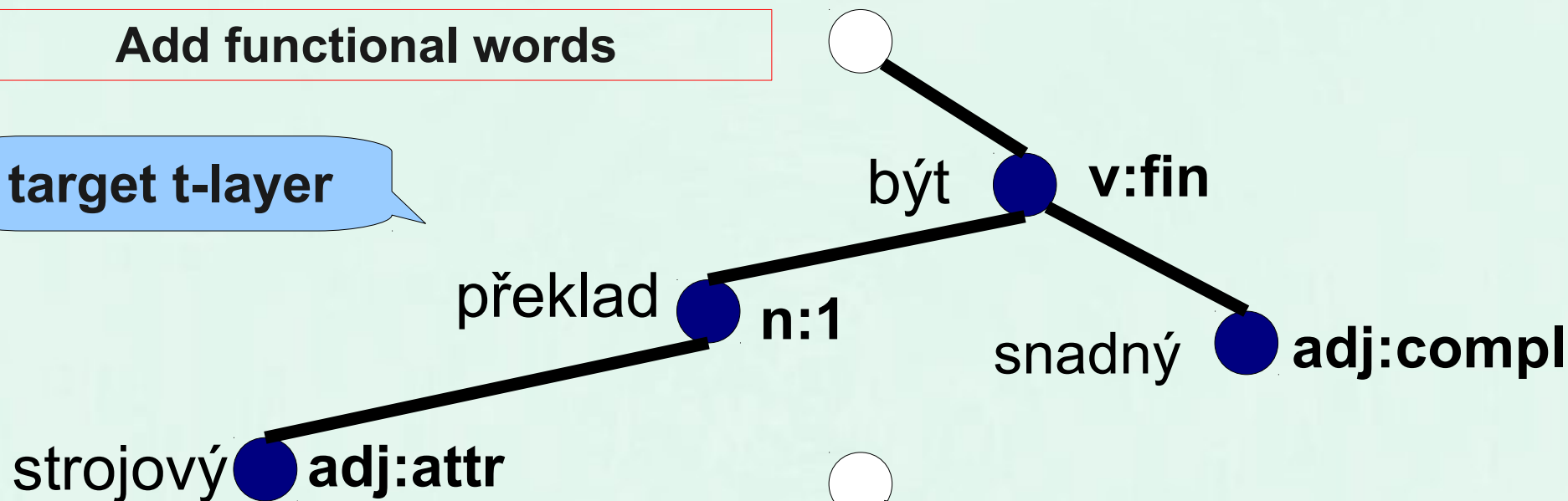
target a-layer



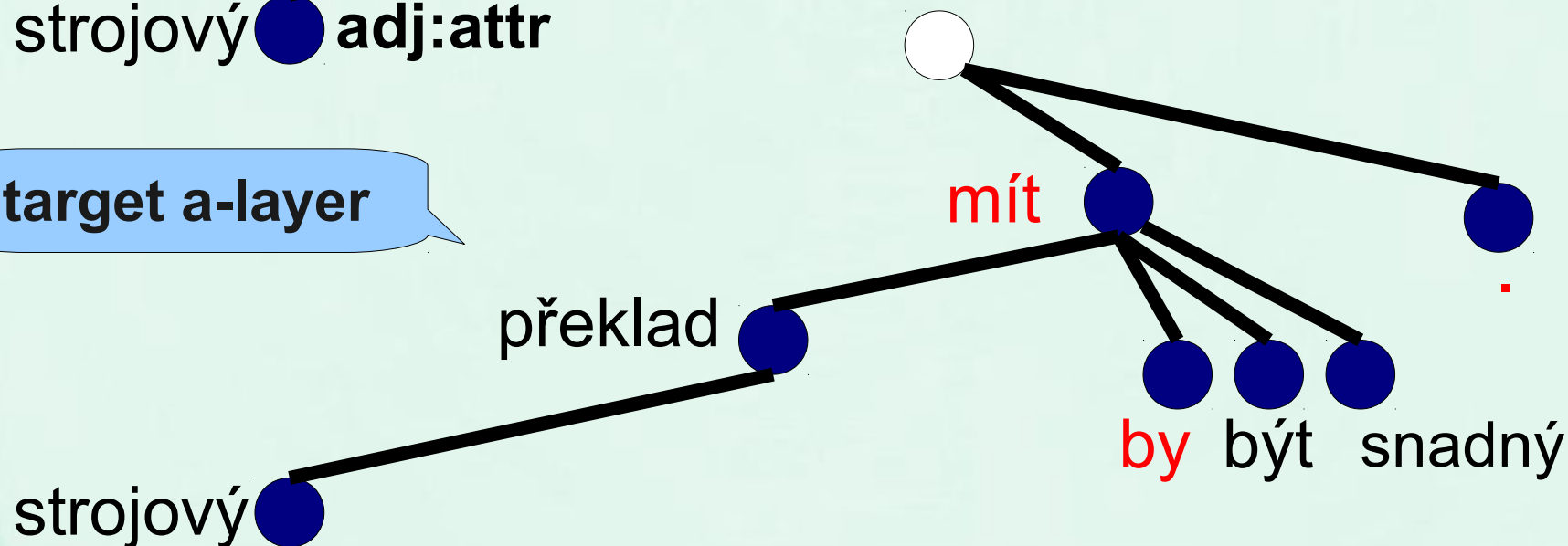
Demo Translation – Synthesis

Add functional words

target t-layer



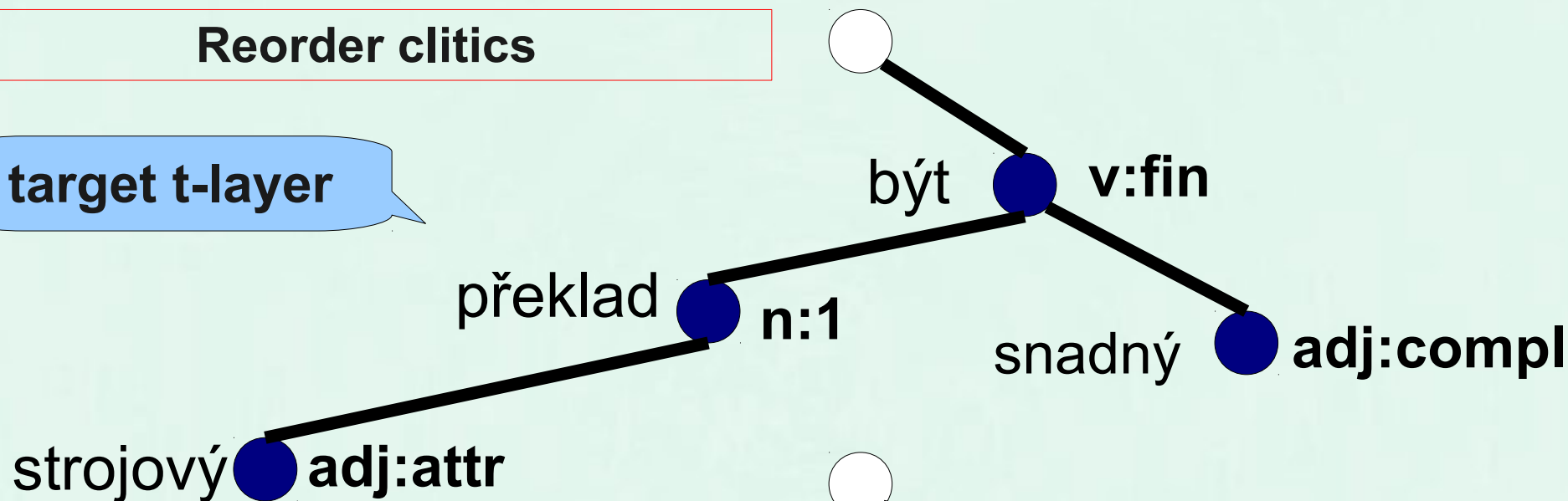
target a-layer



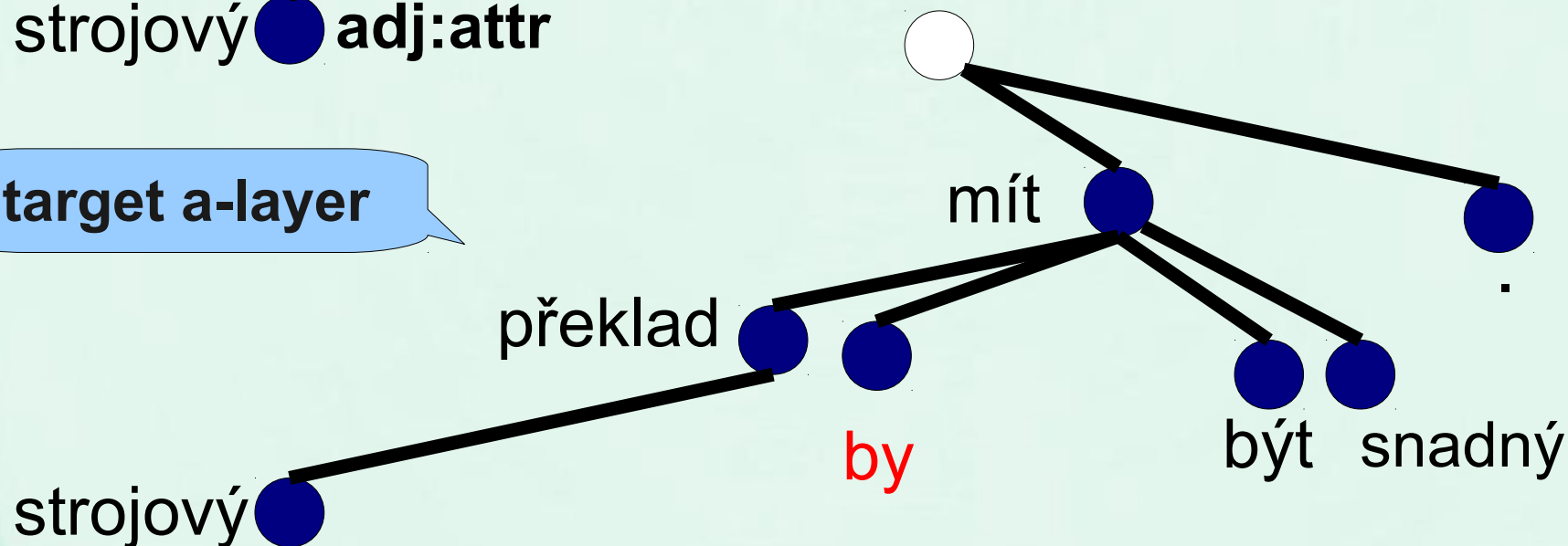
Demo Translation – Synthesis

Reorder clitics

target t-layer



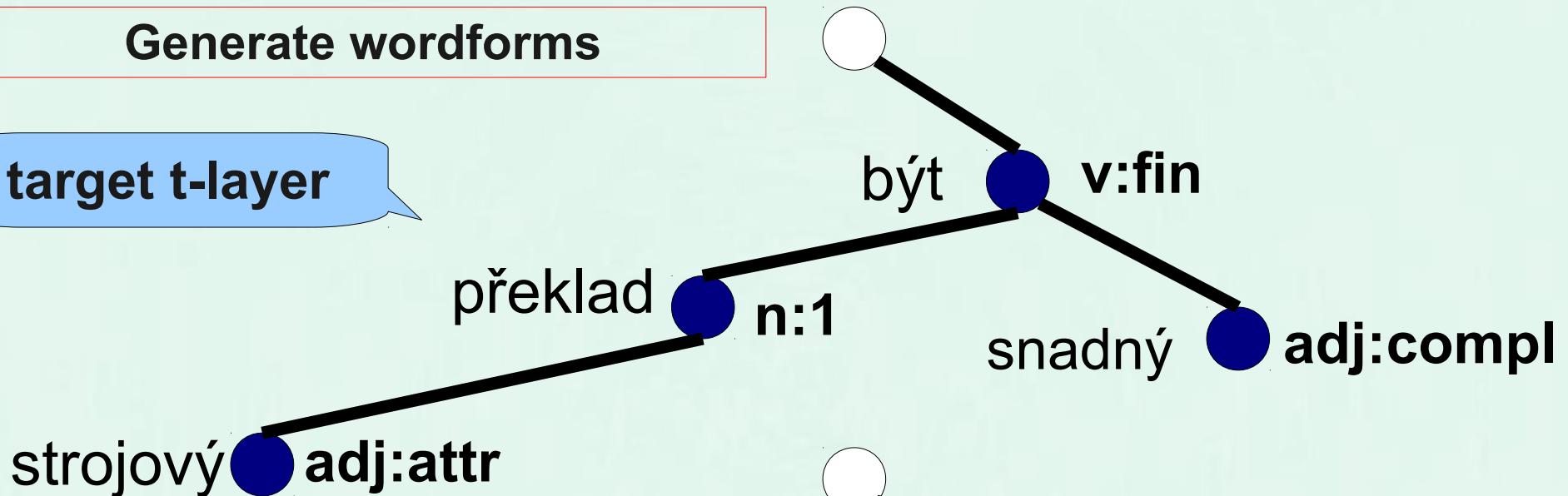
target a-layer



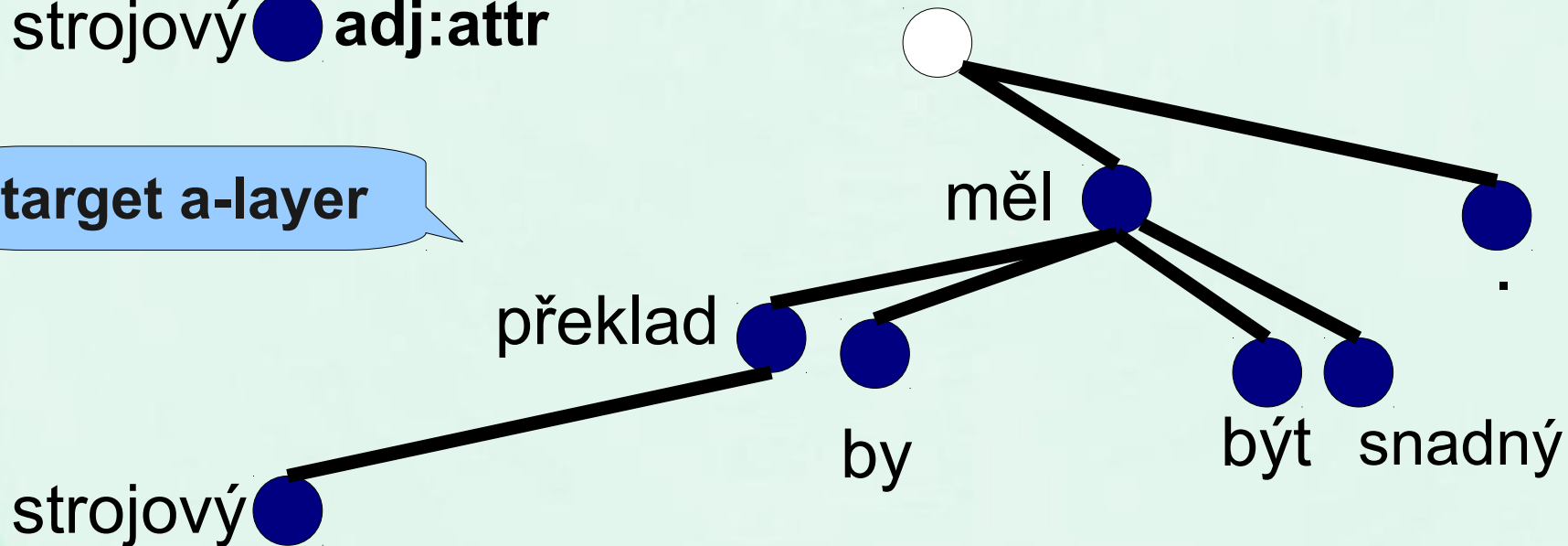
Demo Translation – Synthesis

Generate wordforms

target t-layer



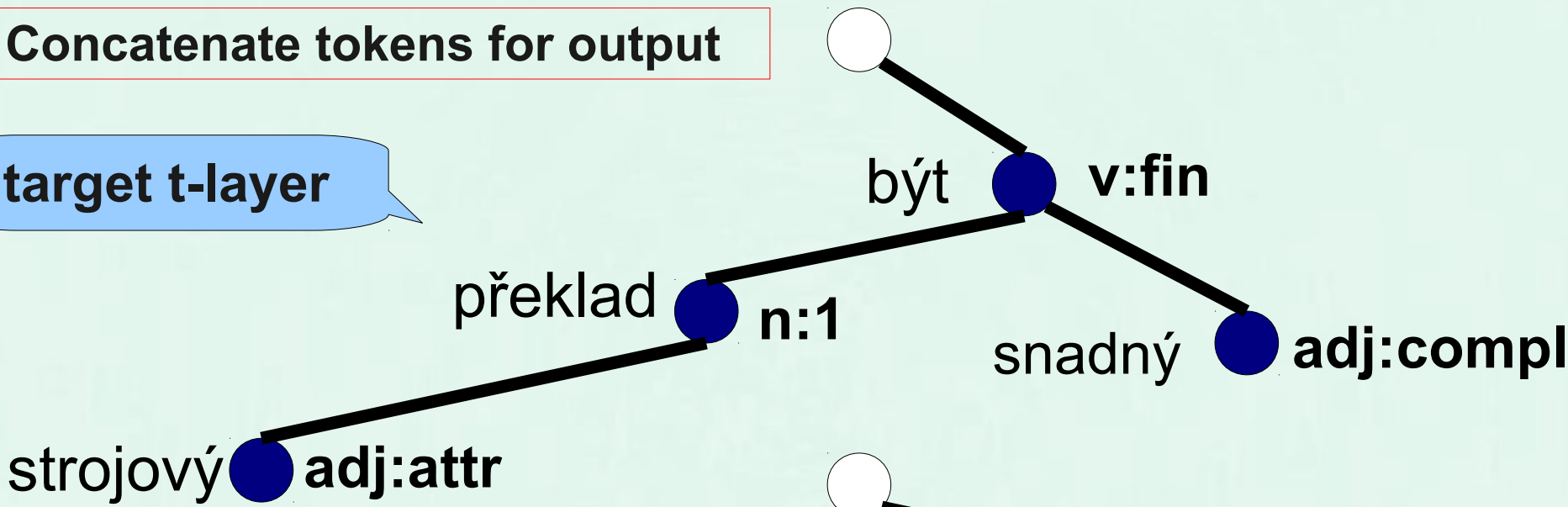
target a-layer



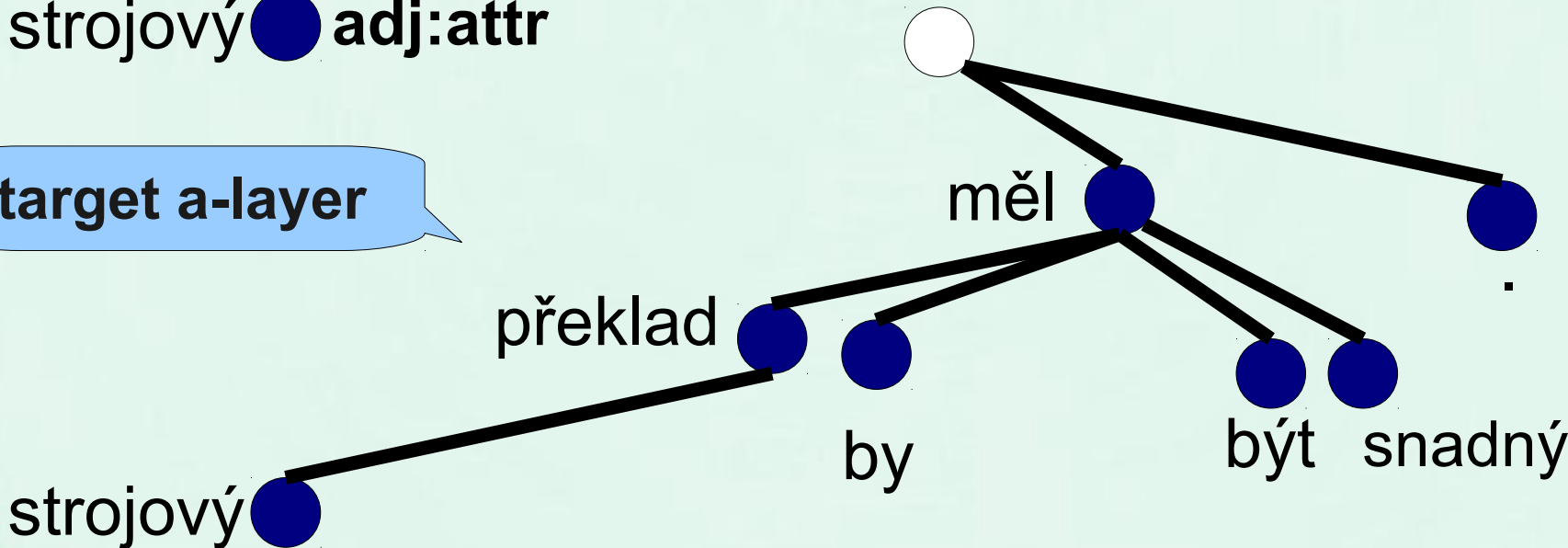
Demo Translation – Synthesis

Concatenate tokens for output

target t-layer



target a-layer



Strojový překlad by měl být snadný.

Demo Translation – Real Scenario



SEnglishW_to_SEnglishM::

Tokenization

Normalize_forms
Fix_tokenization

TagMorce

Fix_mtags

Lemmatize_mtree

SEnglishM_to_SEnglishN::

Stanford_named_entities
Distinguish_personal_names

SEnglishM_to_SEnglishA::

McD_parser

Fill_is_member_from_deprel
Fix_tags_after_parse

McD_parser REPARSE=1

Fill_is_member_from_deprel

Fix_McD_topology

Fix_nominal_groups

Fix_is_member

Fix_atree

Fix_multiword_prep_and_conj

Fix_dicendi_verbs

Fill_afun_AuxCP_Coord

Fill_afun

SEnglishA_to_SEnglishT::

Mark_edges_to_collapse

Mark_edges_to_collapse_neg

Build_tree

Fill_is_member

Move_aux_from_coord-
_to_members

Fix_tlemmas

Assign_coap_funcctors

Fix_either_or

Fix_is_member

Mark_clause_heads

Mark_passives

Assign_funcctors

Mark_infin

Mark_relclause_heads

Mark_relclause_coref

Mark_dsp_root

Mark_parentheses

Recompute_deepord

Assign_nodetype

Assign_grammatemes

Detect_formeme

Rehang_shared_attr

Detect_voice

Fix_imperatives

Fill_is_name_of_person

Fill_gender_of_person

Add_cor_act

Find_text_coref

SEnglishT_to_TCzechT::

Clone_ttree

Translate_LF_phrases

Translate_LF_joint_static

Delete_superfluous_tnodes

Translate_F_try_rules

Translate_F_add_variants

Translate_F_rerank

Translate_L_try_rules

Translate_L_add_variants

Translate_LF_numerals_by_rules

Translate_L_filter_aspect

Transform_passive_constructions

Prune_personal_name_variants

Remove_unpassivizable_variants

Translate_LF_compounds

Cut_variants

Rehang_to_eff_parents

Translate_LF_tree_Viterbi

Rehang_to_orig_parents

Fix_transfer_choices

Translate_L_female_surnames

Add_noun_gender

Add_relpron_below_rc

Change_Cor_to_PersPron

Add_PersPron_below_vfin

Add_verb_aspect

Fix_date_time

Fix_grammatemes_after_transfer

Fix_negation

Move_adjectives_before_nouns

Move_genitives_to_postposit

Move_relclause_to_postposit

Move_dicendi_closer_to_dsp

Move_PersPron_next_to_verb

Move_enough_before_adj

Fix_money

Recompute_deepord

Find_gram_coref_for_refl_pron

Neut_PersPron_gender_from_antec

Override_pp_with_phrase_translation

Valency_related_rules

Fill_clause_number

Turn_text_coref_to_gram_coref

TCzechT_to_TCzechA::

Clone_atree

Distinguish_homonymous_mlemmas

Reverse_number_noun_dependency

Init_morphcat

Fix_possessive_adjectives

Mark_subject

Impose_pron_z_agr

Impose_rel_pron_agr

Impose_subjpred_agr

Impose_attr_agr

Impose_compl_agr

Drop_subj_pers_prons

Add_prepositions

Add_subconjs

Add_reflex_particles

Add_auxverb_compound_passive

Add_auxverb_modal

Add_auxverb_compound_future

Add_auxverb_conditional

Add_auxverb_compound_past

Add_clausal_expletive_pronouns

Resolve_verbs

Project_clause_number

Add_parentheses

Add_sent_final_punct

Add_subord_clause_punct

Add_coord_punct

Add_apposition_punct

Choose_mlemma_for_PersPron

Generate_wordforms

Move_clitics_to_wackernagel

Recompute_ordering

Delete_superfluous_prepos

Delete_empty_nouns

Vocalize_prepositions

Capitalize_sent_start

Capitalize_named_entities

TCzechA_to_TCzechW::

Concatenate_tokens

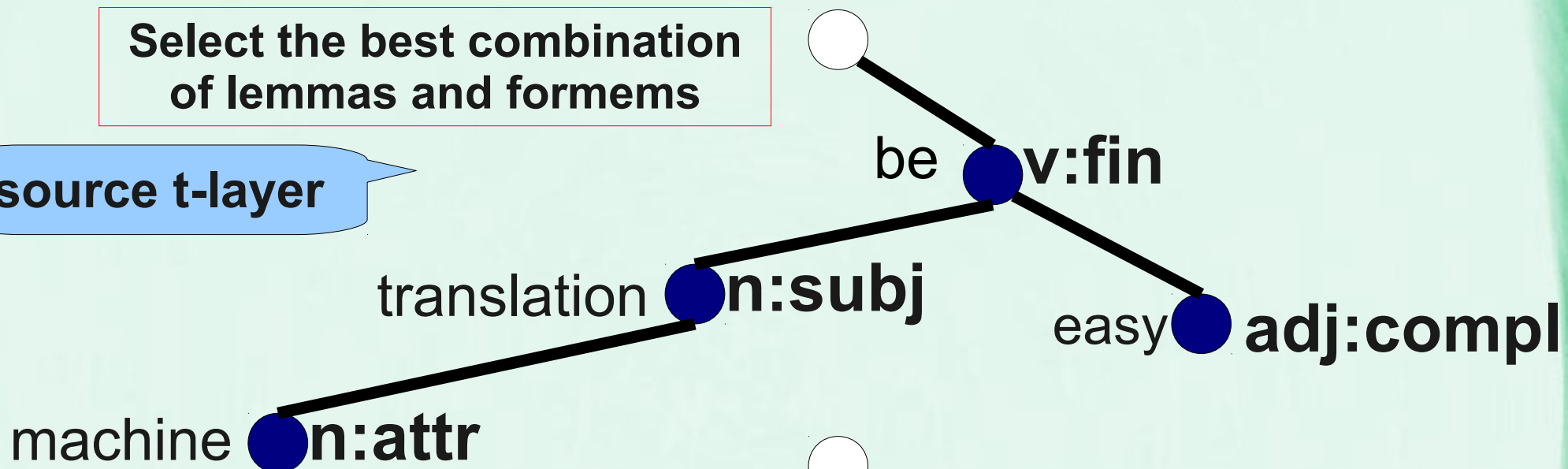
Ascii_quotes

Remove_repeated_tokens

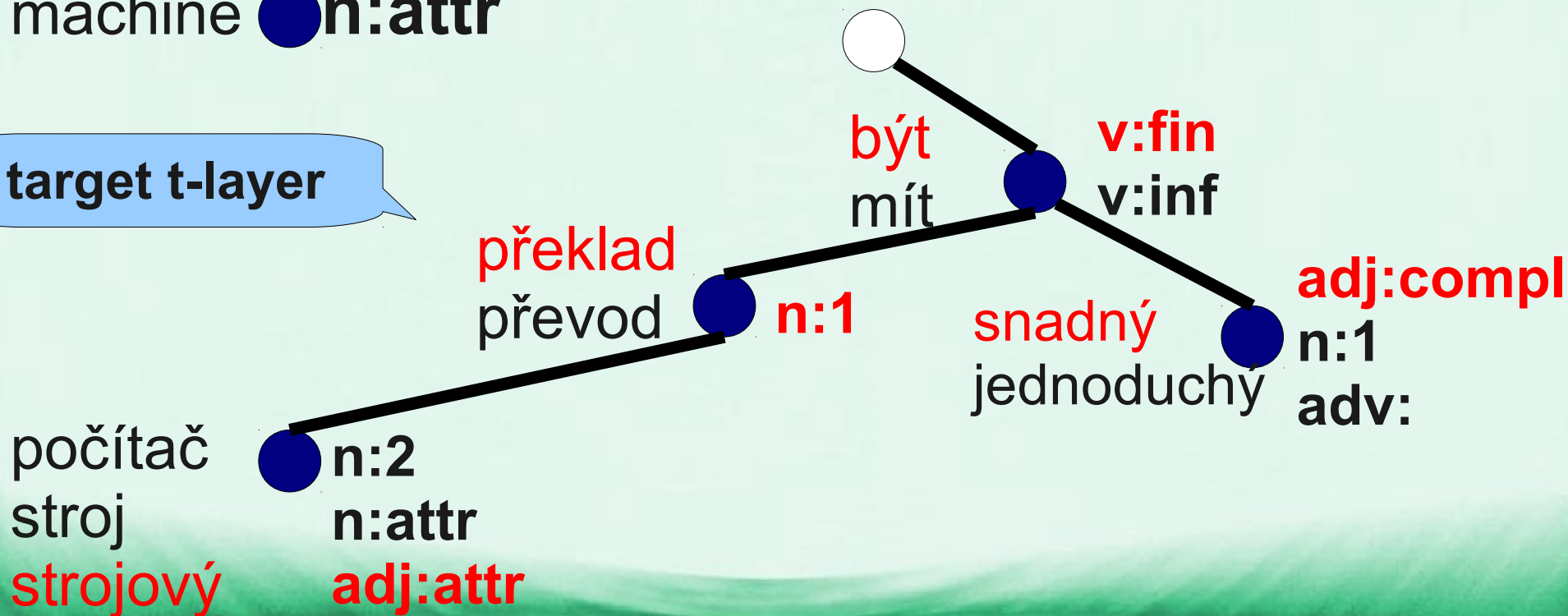
HMTM – Motivation

Select the best combination of lemmas and formems

source t-layer



target t-layer



HMTM – Motivation

Select the best label for each node

source t-layer

machine **n:attr**

translation
n:subj

be **v:fin**

easy **adj:compl**

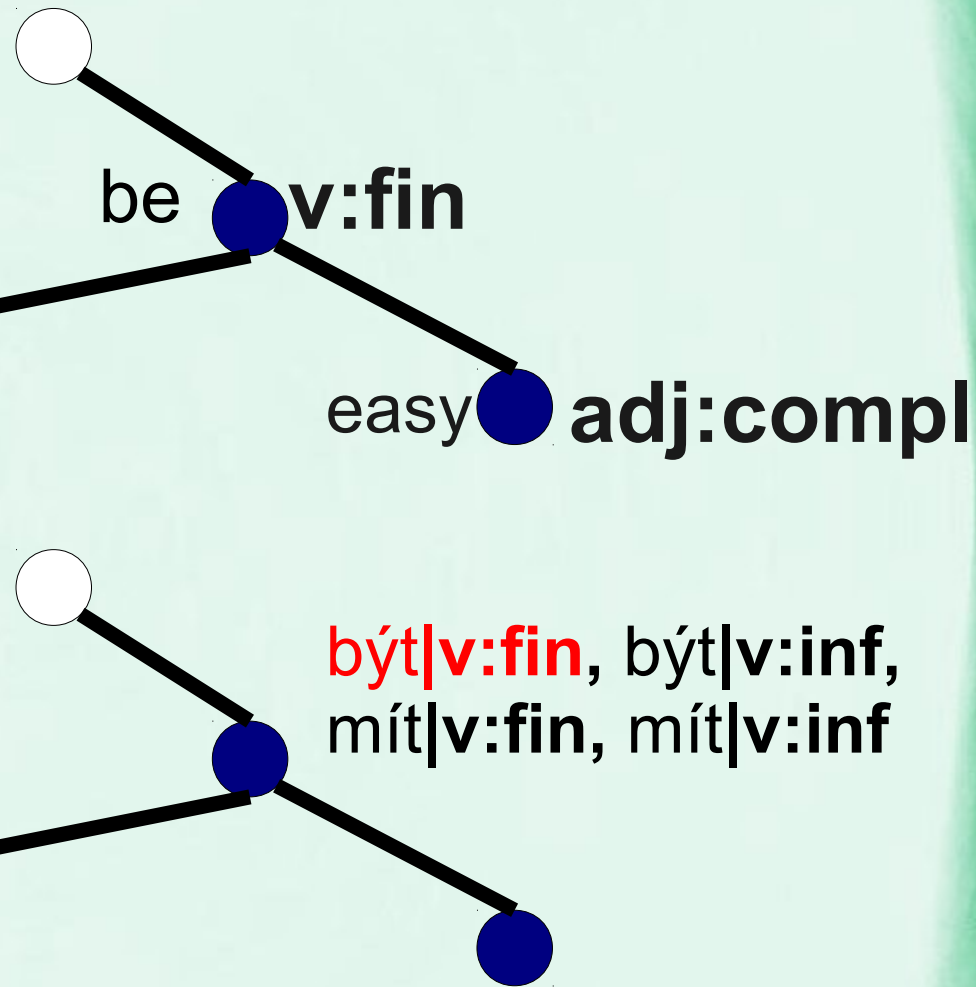
target t-layer

překlad|n:1,
převod|n:1

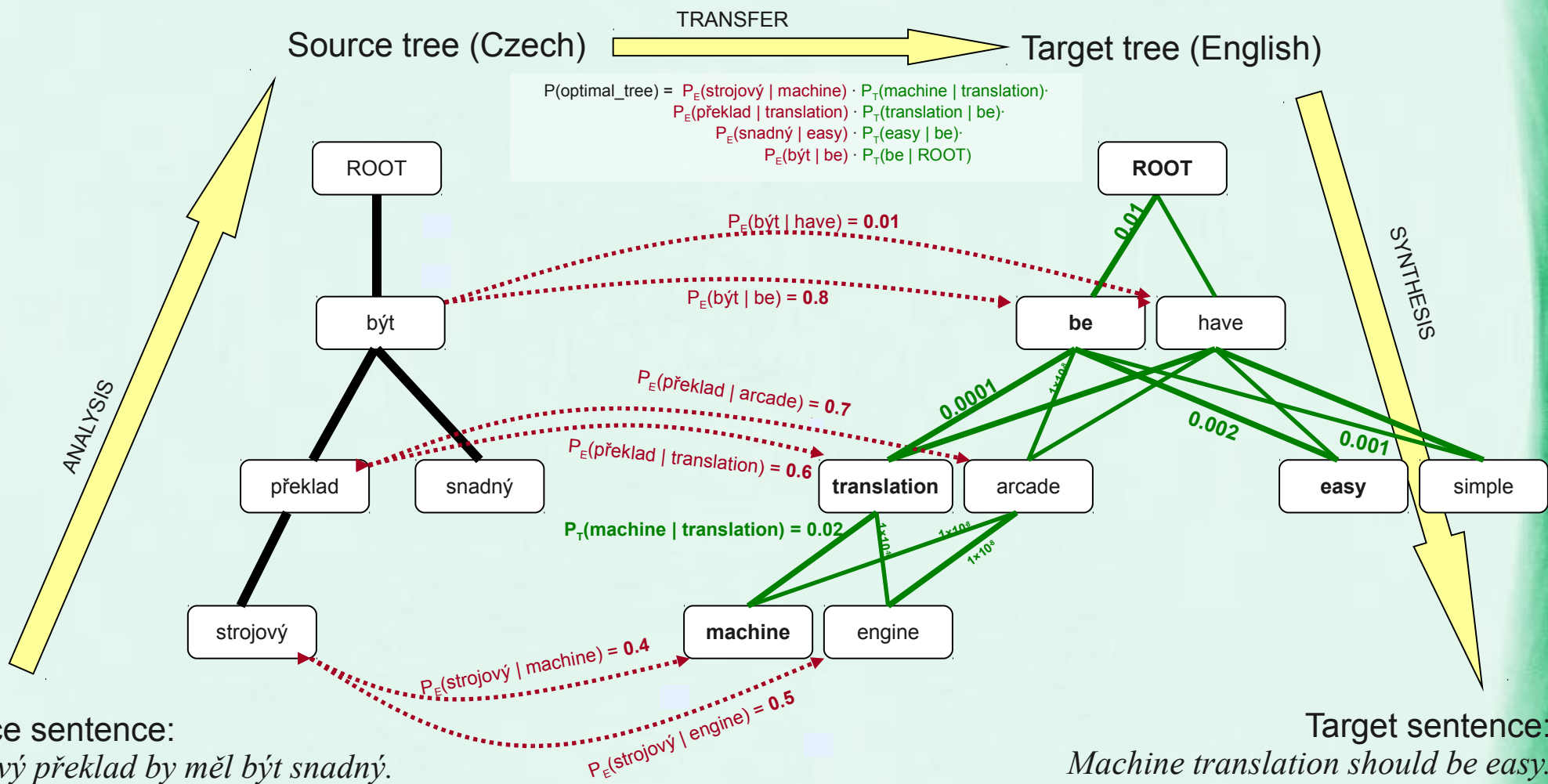
být|v:fin, být|v:inf,
mít|v:fin, mít|v:inf

počítač|n:2,
počítač|n:attr,
strojový|adj:attr, ...

snadný|adj:compl,
jednoduchý|adj:compl, ...



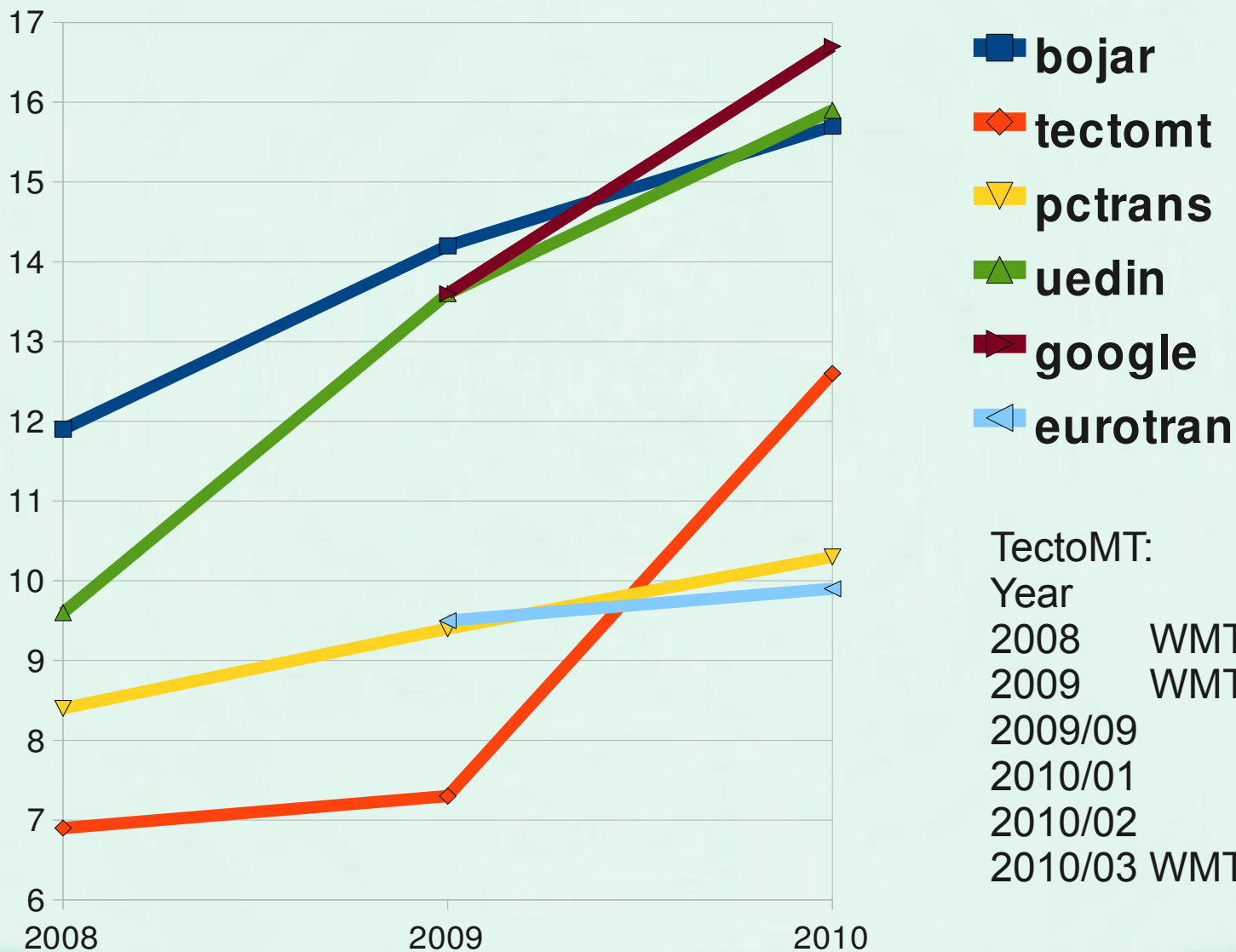
HMTM in MT



$P_E(\text{source | target})$... emission probabilities ... **translation model**
 $P_T(\text{dependent | governing})$... transition probabilities ... **target-language tree model**

Results – BLEU

WMT = Workshop on Statistical Machine Translation

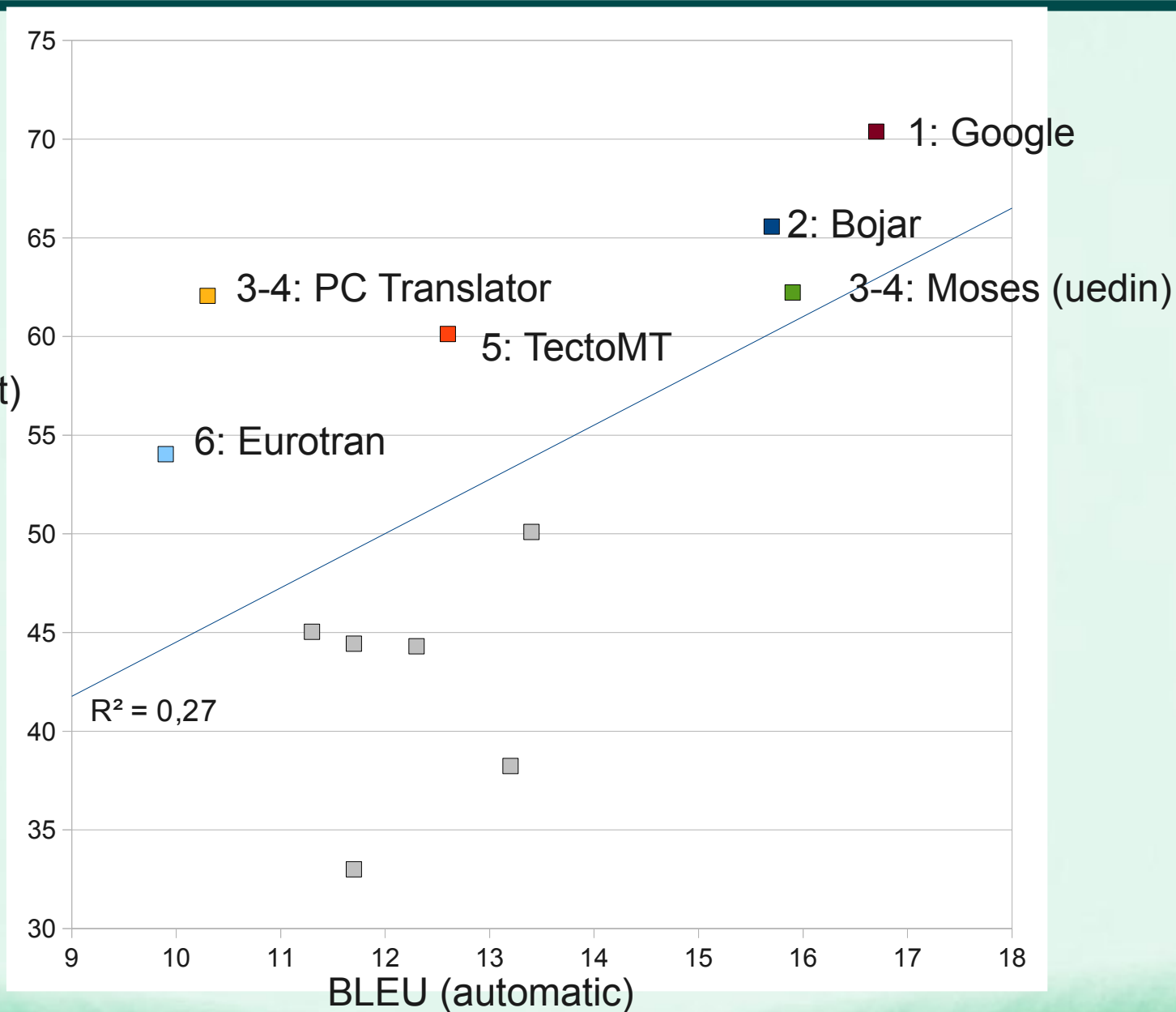


TectoMT:

Year	WMT	BLEU
2008	WMT	6,9
2009	WMT	7,3
2009/09		10,2
2010/01		10,4
2010/02		11,3
2010/03	WMT	12,6

Results – BLEU vs. Ranks

Rank
(human judgement)



Results – task-based evaluation

Example

- **Translated text:**

Bílý dům náčelník štábu Rahm Emanuel je naplánovaný k pojidany vsedě v budově Kongresu se sněmovnou diskutující Nancy Pelosi v 9 p.m.

- **Yes/No Statements:**

- *Nancy Pelosi je zaměstnankyní Bílého domu.*
- *Schůzka se koná dopoledne.*
- *Schůzka se koná v Bílem domě.*

Results

TectoMT	PC Translator	Google	Moses
80.56	80.23	78.68	73.58

Examples of Translation

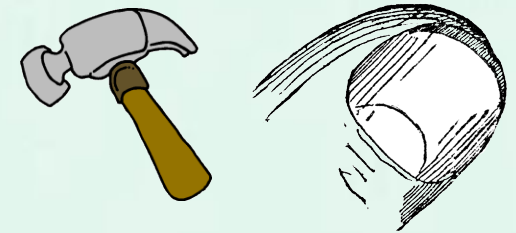
A miss by an inch
is a miss by a mile.

Slečna palec je slečna miliónu.



I'd rather be a hammer
than a nail.

Spíše bych byl kladivo než nehet.



A bird in the hand is worth
two in the bush.

Pták v ruce je cenný
dvakrát v Bushovi.

