

Domain Adaptation for Semantic Parsing

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Background



utterance: how long is the weekly standup meeting

logical form: listValue (getProperty en.meeting.weekly_standup (string length))

Background



target domain: calendar few

Background



target domain: calendar few

source domain: housing, restaurants, ..., publications

sufficient





| Domain | Instance | | | |
|----------|--|--|--|--|
| calendar | <pre>utterance: meetings attended by two or more people logical form: listValue (countComparative (getProperty (singleton en.meeting) (string !type)) (string attendee) (string >=) (number 2))</pre> | | | |
| housing | <pre>utterance: housing units with 2 neighborhoods logical form: listValue (countComparative (getProperty (singleton en.housing_unit) (string !type)) (string neighborhood) (string =) (number 2))</pre> | | | |



Motivation

| Domain | Instance | | | | |
|----------|--|--|--|--|--|
| calendar | <pre>utterance: meetings attended by two or more people logical form: listValue (countComparative (getProperty (singleton en.meeting) (string !type)) (string attendee) (string >=) (number 2))</pre> | | | | |
| housing | <pre>utterance: housing units with 2 neighborhoods logical form: listValue (countComparative (getProperty (singleton en.housing_unit) (string !type)) (string neighborhood) (string =) (number 2))</pre> | | | | |



Motivation



utterance: how long is the weekly standup meeting

coarse stage

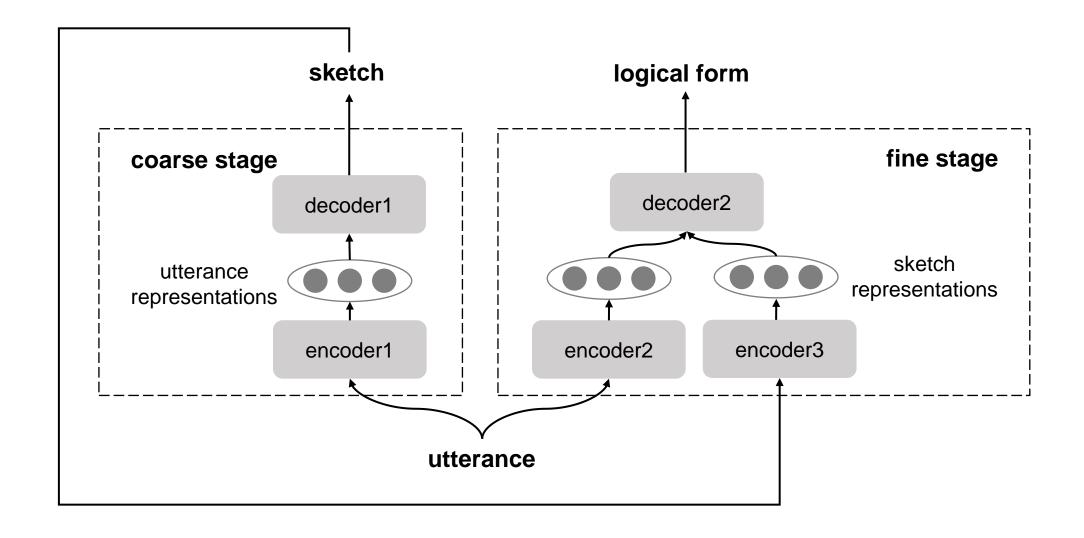
sketch: listValue (getProperty@1 (string@1))

fine stage

logical form: listValue (getProperty en.meeting.weekly_standup (string length))

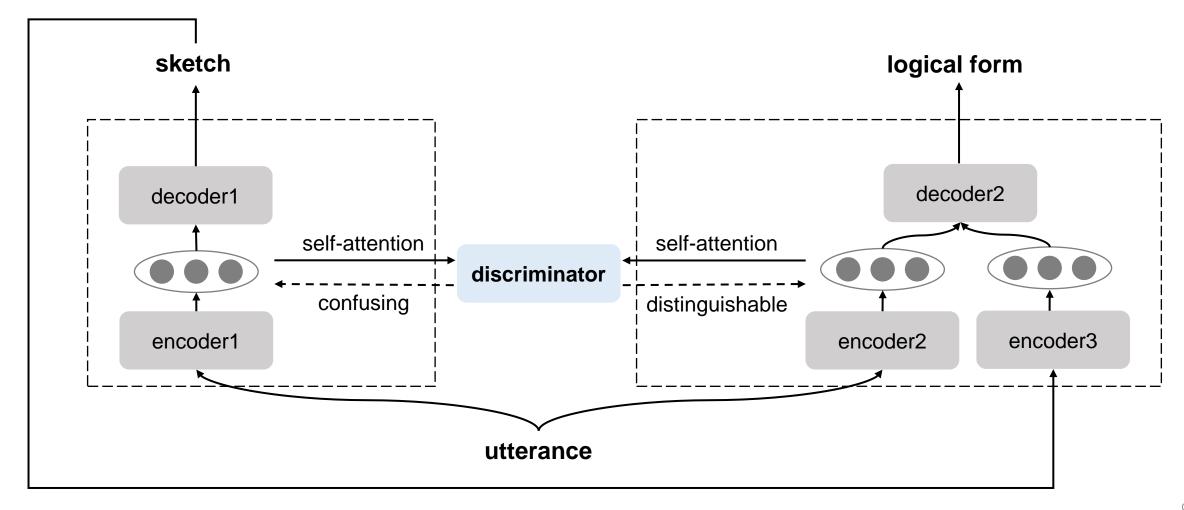
Domain-Aware seMantic Parser





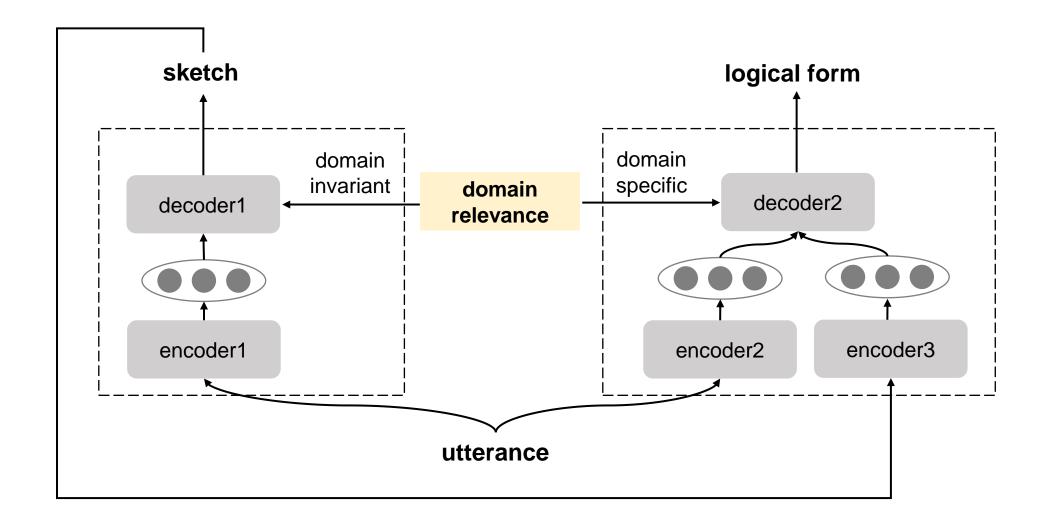
Domain Discrimination





Domain Relevance Attention





Domain Relevance Attention



$$\alpha_t = softmax(\mathbf{U} \cdot \mathbf{d}_t)$$

$$\mathbf{c}_t = \mathbf{U} \cdot \alpha_t$$

$$[\mathbf{d}_t; \mathbf{c}_t]$$





$$\begin{aligned} \boldsymbol{\alpha}_t &= softmax(\boldsymbol{U} \cdot \boldsymbol{d}_t) \\ \boldsymbol{c}_t &= \boldsymbol{U} \cdot \boldsymbol{\alpha}_t \\ \boldsymbol{\alpha}_t^{pri} &= softmax((\boldsymbol{U} \cdot \boldsymbol{d}_t) \circ \boldsymbol{q}^c) \\ \boldsymbol{c}_t^{pri} &= \boldsymbol{U} \cdot \boldsymbol{\alpha}_t^{pri} \end{aligned} \qquad \begin{bmatrix} \boldsymbol{d}_t; \boldsymbol{c}_t \\ \boldsymbol{d}_t; \boldsymbol{c}_t; \boldsymbol{c}_t^{pri} \end{bmatrix}$$





| | recipes | publications | calendar | housing | average |
|-------------|---------|--------------|----------|---------|---------|
| seq2seq | 58.80 | 36.64 | 34.52 | 36.50 | 41.62 |
| coarse2fine | 62.96 | 38.51 | 38.10 | 39.15 | 44.68 |
| p-share | 51.39 | 27.33 | 27.97 | 33.86 | 35.14 |
| pre-train | 59.72 | 40.99 | 43.45 | 42.32 | 46.62 |
| adversarial | 68.06 | 40.37 | 44.04 | 41.27 | 48.44 |
| DAMP | 72.22 | 45.96 | 39.88 | 43.39 | 50.36 |

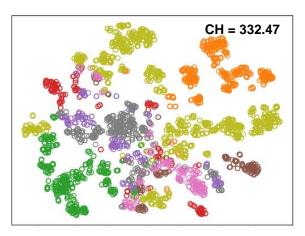




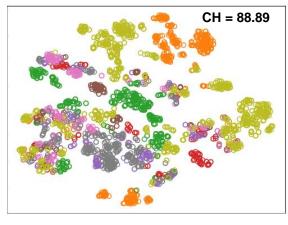
| Model | Sketch | LF_{oracle} | LF |
|---------------|--------|---------------|-------|
| DAMP | 83.80 | 85.19 | 72.22 |
| $DAMP_{-dis}$ | 82.87 | 85.19 | 70.83 |
| $DAMP_{-att}$ | 81.94 | 82.41 | 68.06 |
| coarse2fine | 73.61 | 82.87 | 62.96 |



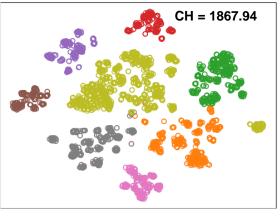




(a) coarse2fine



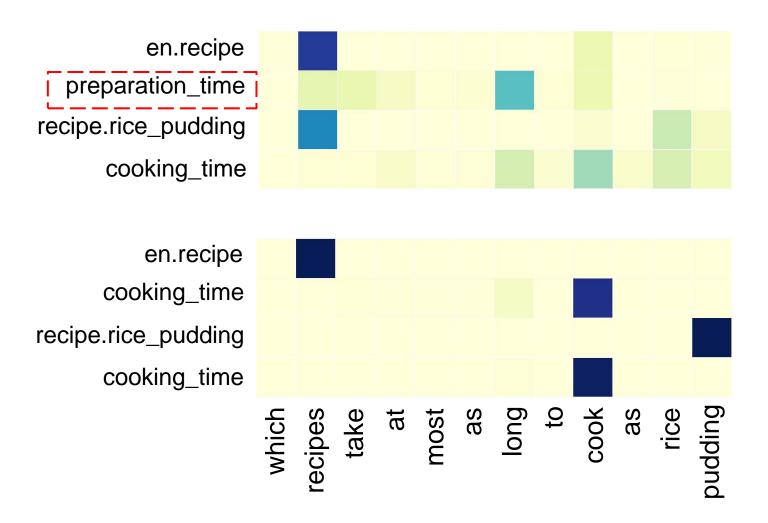
(b) DAMP - coarse



(c) DAMP - fine





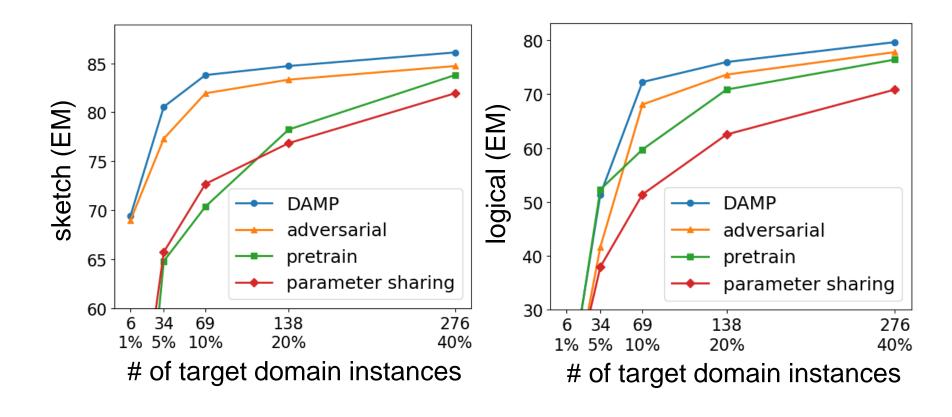


(a) coarse2fine - fine

(b) DAMP - fine











Thank you!