# That's Optional: A Contemporary Exploration of "that" Omission in English Subordinate Clauses

**Ella Rabinovich** 

The Academic College of Tel Aviv-Yaffo, Israel ellara@mta.ac.il

#### Abstract

The Uniform Information Density (UID) hypothesis posits that speakers optimize the communicative properties of their utterances by avoiding spikes in information, thereby maintaining a relatively uniform information profile over time. This paper investigates the impact of UID principles on syntactic reduction, specifically focusing on the optional omission of the connector "that" in English subordinate clauses. Building upon previous research, we extend our investigation to a larger corpus of written English, utilize contemporary large language models (LLMs) and extend the informationuniformity principles by the notion of entropy, to estimate the UID manifestations in the usecase of syntactic reduction choices.

## 1 Introduction

Exploiting the expressive richness of languages, speakers often convey the same messages in multiple ways. A body of research on *uniform information density* (UID) puts forward the hypothesis that speakers tend to optimize the communicative effectiveness of their utterances when faced with multiple options for structuring a message. The UID hypothesis (Frank and Jaeger, 2008; Collins, 2014; Hahn et al., 2020) suggests that speakers tend to spread information evenly throughout an utterance, avoiding large fluctuations in the per-unit information content of an utterance, thereby decreasing the processing load on the listener.

The UID hypothesis has been used as an explanatory principle for phonetic duration (Bell et al., 2003; Aylett and Turk, 2006), the choice between short- and long-form of words that can be used interchangeably, such as "info" and "information" (Mahowald et al., 2013), and word order patterns (Genzel and Charniak, 2002; Maurits et al., 2010; Meister et al., 2021; Clark et al., 2023). Our work studies how UID principles affect the phenomenon of syntactic reduction – the situation where a speaker has the choice of whether marking a subordinate clause in sentence with an optional subordinate conjunction (SCONJ) "that" or leave it unmarked, as in "My daughter mentioned [that] he looked good". The only study that tested the UID hypothesis computationally in the context of syntactic reduction is Levy and Jaeger (2006), followed by Jaeger (2010), who studied the effect of multiple factors on the speaker choice of explicit or implicit "that" conjunction. Investigating sentences with main clause (MC, e.g., "My daughter mentioned") and subordinate clause (SC, e.g., "[that] he looked good"), connected by the optional SCONJ, the authors found that UID optimization was the most prominent factor affecting a speaker choice of "that" omission. Specifically, Jaeger (2010) investigated 6700 sentences extracted from the SwitchBoard spoken English dataset, and operationalized the UID principle by computing the surprisal (non-predictability) of the SC opening word (SC onset) using a statistical bigram language model computed from the corpus itself.

Our work studies the role of UID principle in syntactic reduction in multiple differing ways. First, we extend the investigation to a much larger corpus of informal written English collected from social media. Second, we use contemporary large language models (LLMs) to estimate the operationalizations of information uniformity in syntactic reduction, suggesting the robustness of our findings. Finally, inspired by the information-theoretic nature of UID and prior art (Maurits et al., 2010; Meister et al., 2021), we extend the SC onset surprisal UID manifestation with the notion of SC onset entropy - the information entropy of LLM distribution over SC opening word, conditioned on the main clause - factor that turns out to have a complementary and significant effect.

The contribution of this work is, therefore, twofold: First, we collect and release a large and diverse corpus of nearly 100K sentences, where

main and subordinate clauses are connected by the optional SCONJ "that".<sup>1</sup> Second, we go above and beyond prior work by using transformer-based LLMs (Vaswani et al., 2017), thereby providing a sound empirical evidence for UID principles associated with syntactic reduction decision, shedding a new and interesting light on the manifestation of UID in spontaneous written language.

#### 2 Dataset

#### 2.1 Data Collection

Our dataset in this work was collected from the Reddit discussions platform. Reddit is an online community-driven platform consisting of numerous forums for news aggregation, content rating, and discussions. Communication on discussion platforms often resembles a hybrid between speech and more formal writing, and findings from spoken language may extend to the spontaneous and informal style of social media. As such, Reddit data has been shown to exhibit code-switching patterns, similar to those found in spoken language (Rabinovich et al., 2019). We, therefore, believe that this data presents a good testbed for our analysis.

**Data Extraction** We collected 2M posts and comments by over 20K distinct redditors spanning over 5K topical threads and years 2020–2022. We then split the data into sentences and filtered out sentences shorter than five or longer than 50 words. The remaining 487,614 sentences were parsed using the SOTA benepar syntactic parser, extracting two sentence types with main and subordinate clause, possibly connected by "that":

(1) Explicit usage, as in "do you agree that his suggestion sounds better?" More specifically, we identified sentences where SCONJ "that" immediately follows the main verb, as with the main verb "agree" in the example above. A set of rules was devised for identifying relevant sentences, filtering out cases where "that" was used in roles other than SCONJ, such as *demonstrative determiner* ("I have never been to that part of the city"), *demonstrative pronoun* ("that is a beautiful view"), or *relative pronoun*, ("Ann is on the team that lost.").<sup>2</sup>

(2) Implicit usage, as in "my brother thinks [that] partners should always choose the former alternative", where SCONJ "that" could have been used

but was deliberately omitted. The set of rules used for identifying these sentences is identical to the rules used for detection of explicit usages, except that we required the absence of "that" in the appropriate syntactic role. Appendix A.1 provides details on syntactic analysis and rules used to extract relevant sentences. Table 1 reports the details of the collected dataset.

type	sentences	mean sent. len
explicit "that" SCONJ	40,786	21.85
implicit "that" SCONJ	57,845	18.07
other "that" usages	51,802	19.57

Table 1: Dataset details: out of over 487K sentences, almost 150K contain "that" in various syntactic roles. Note the slightly higher mean sentence length in sentences with explicit "that" SCONJ compared to implicit. We return to this observation in Section 3.

**Evaluation** A random subset of 500 sentences split equally between explicit and implicit "that" usages was selected for manual evaluation by one of the authors of this paper. The evaluator was guided to check whether omitting "that" in explicit SCONJ cases would result in equally valid, meaning-preserving utterance, and vise versa – whether adding explicit "that" in places it was omitted, would not hurt the sentence fluency and semantics. 96.4% of the first sentence set were found valid, and 95.7% of the second sentence set. Invalid cases include mainly ungrammatical utterances and sentences in languages other than English.

#### 2.2 Data Analysis

We next tokenized and lemmatized the sentences using the the spacy python package. Table 2 presents example sentences, taken verbatim from our dataset, with explicit and implicit usages of "that" conjunction. Note that sentences with the same verb lemma (e.g., "forget") show syntactic reduction in some cases but not in others.

Studying "that" omission in native and learner English, Olohan and Baker (2000) found that the optional usage of "that" conjunction typically follows *reporting* main verbs – such as "say", "think", "suggest". Our data largely supports this observation: while the total of 434 distinct main verb lemmas were found to precede the optional "that", roughly two thirds (64.7%) of all usages (or potential usages – omissions) are covered by the top-10 most frequent lemmas in the dataset. Additionally, different verbs exhibit different distribution of ex-

<sup>&</sup>lt;sup>1</sup>All data and code are available at https://github.com/ ellarabi/uid-that-sc-omission.

<sup>&</sup>lt;sup>2</sup>Due to its much lower frequency, we leave the investigation of "that" as a *relative conjunction* to future work.

explicit	sentence
~	so the people of such places are easily fooled by the extremists and <i>think</i> that polio vaccine is dangerous
×	Well, I initially <i>thought</i> [that] it seemed somewhat credible with a large volume of sources, and while
$\checkmark$	Have you forgotten that republicans openly admitted that their #1 priority was giving him a fight ?
×	Christ, I keep forgetting [that] you guys don't have the right to speak broadly of revolution.

Table 2: Example sentences from the dataset with two verb lemmas – "think" and "forget", with explicit and implicit (in square brackets) "that" usage. The main verb is in *italic* and (explicit or implicit) SCONJ appears in blue.

plicit and implicit usages: while "that" is omitted in the majority of cases following lemmas "think" and "guess", other lemmas, like "say", "know", "believe", and "realize" show more balanced behavior. Figure 1 presents the relative frequency of the top-10 most common lemmas in the dataset (bar height), and the split between explicit and implicit "that" SCONJ usages immediately following those main verbs. In particular, the findings in Figure 1 imply that the lemma alone does not carry sufficient predictive power about the potential syntactic reduction in subsequent subordinate clause.



Figure 1: Top-10 most frequent lemmas in the data; a bar height denotes the relative ratio out of the total, and each bar is split by the relative usage of explicit and implicit "that" SCONJ. Sentences with the top-10 lemmas account for 64.7% of all sentences in the dataset.

#### 3 Methodology

We define a set of factors that we were found to affect syntactic reduction choices (Levy and Jaeger, 2006; Jaeger, 2010), and further study the magnitude of their predictive power by casting the usecase as a classification scenario. We harness the power of contemporary LLMs for reliable computation of SC onset surprisal, as well as for computation of its complementary predictor: SC onset entropy. We define the following predictors:

**Main clause (MC) length** Previous work suggested that the conjunction is likely to be spelled out explicitly in longer sentences; in particular after

a longer main clause. This predictor is computed by the number of tokens preceding the (explicit or implicit) SCONJ. As an example, in the sentence "Do you realize [that] I've never actually seen him at the office?", MC length will be assigned 3.

**Subordinate clause (SC) length** Similar intuition suggests that the length of a subordinate clause (and more generally, the rest of the sentence) can be used as another predictor. In the example sentence above, SC length will be assigned 9.

**Main verb frequency** Jaeger (2010) found negative correlation between the main clause verb frequency and the tendency to spell out "that" SCONJ. We compute the frequency of main verbs in all sentences as their relative count in the entire corpus of over 480K sentences (see Section 2).

**SC subject distance** This predictor is defined as the number of words at the SC onset up to and including the SC subject. Multiple studies found positive correlation of this factor with the tendency to spell out SCONJ (Hawkins, 2001, 2004; Jaeger, 2010). We extract the SC subject using the *nsubj* annotation assigned by spacy's dependency parser to the subordinate clause subject.

SC onset information density (ID) Levy and Jaeger (2006) and Jaeger (2010) computed this factor by using the simplest possible estimation, where the information of the SC onset is only conditioned on the main verb, and is operationalized by the notion of *surprisal*:  $-\log p(SC \text{ onset } | \text{ main verb})$ . All counts (and probabilities) were calculated from the dataset at hand. Harnessing the power of modern pretrained LLMs, we define this predictor as the probability of SC onset, conditioned on entire main clause, namely  $-\log p(SC \text{ onset } | MC)$ .

Notably, Levy and Jaeger (2006) trained the bigram model in a controlled setting where all "that" conjunctions had been omitted. Without this control, results may be circular, e.g., in cases where "that" is explicitly spelled out, the computation  $-\log p(SC \text{ onset } | MC)$  could be

self-evident because "that" is normally inserted between MC and SC onset (recall that SC onset denotes the opening word of the subordinate clause, "that" excluded). Since training a language model from scratch on corpora with omitted SCs is often impractical, we marginalize out the presence of "that", re-defining the SC onset surprisal to be:

$$-\log \left( p(SC \text{ onset } | MC) + p(SC \text{ onset } | MC \circ "that") \right)$$

This refined definition of SC onset surprisal eliminates the need to re-train a language model on a corpus where the SC "that" had been omitted.

**SC onset entropy** We argue that the information density of the subordinate clause onset can be extended by the complementary notion of *entropy* – the expected value of the surprisal across all possible SC onsets:  $H(p) = -\sum_i p_i * \log(p_i)$ ; for a given main clause MC,  $p_i = p(w_i | MC)$ , where  $w_i$  is the  $i^{th}$  word in the model's vocabulary  $\mathcal{V}$ . For a certain sentence prefix, entropy calculation involves the computation of the probability distribution over the model's vocabulary  $\mathcal V$  for next word prediction. While the computation is practically impossible with a small corpus and an N-gram LM, this information is easily obtainable from pretrained LLMs. Although conceptually related, SC onset entropy and SC onset surprisal were found to be uncorrelated in our dataset: Pearson's r of -0.02 was found between these two predictors.

Other predictors Among additional factors investigated in prior studies are (1) SC onset frequency, (2) SC subject frequency, (3) the distance of the main verb from the SC onset, and (4) SC ambiguity ("garden path"). The first two factors were found to moderately correlate with SC onset surprisal (Pearson's r=-0.57) in our experiments, and hence omitted from the predictor set - not a surprising finding given that in 84.5% of cases SC onset is also the SC subject. The third predictor turns irrelevant in our experimental setup, where SC immediately follows the main verb. Finally, and most notably, Jaeger (2010) manually annotated their sentence set for SC ambiguity ("garden path"), and found this factor non-predictive of "that" omission; we, therefore, refrain from using this predictor here due to the manual effort required for "garden path" annotation in our ample data.

#### **4** Experimental Results and Discussion

**Experimental Setup** We use the OPT-125m autoregressive pretrained transformer model (Zhang et al., 2022), roughly matching the performance and sizes of the GPT-3 class of models, for computation of SC onset surprisal and entropy. Given a sentence prefix, we first extract next token logits and convert them to a probability distribution over the lexicon by applying the softmax function. SC onset surprisal was computed by applying the natural log on the SC onset token probability given the relevant sentence prefix. SC onset entropy was computed by applying the entropy equation (see Section 3) on the outcome probability distribution.<sup>3</sup>

Estimating the contextual surprisal (or entropy) per word with decoder LLMs operating at the subword level is hard; we, therefore, approximate these metrics by computing the surprisal (or entropy) over the subwords. Pimentel et al. (2023) show that this is practically equivalent to computing a lower bound on the true contextual measurements.

Finally, logistic regression is used as a predictive model due to its effectiveness and intrepretability.

**Experimental Results** Our main results are presented in Table 3. We report two scenarios: (1) all main verb lemmas preceding the SC are considered, and (2) only sentences with the most-frequent "think" main verb lemma are considered. Using these two different experimental setups, we test whether observations evident for the full set of main verbs, also emerge in a single main verb scenario. All predictors are standard-scaled for comparative analysis. The effectiveness of our predictors is supported by the considerable (in particular, much higher than chance) classification accuracy in both cases: 0.63 when using all main verbs, and 0.88 when using the "think" verb lemma only.

Analysis and Discussion Several observations emerge from the table: inline with prior studies, sentence length – manifested in both MC and SC – has significant positive effect on the explicit usage of "that" connecting the two clauses. One of the highest (absolute value) coefficients is assigned to SC onset *surprisal*, confirming the findings by Jaeger (2010). The UID hypothesis is further strengthened by the high (the highest in the all

<sup>&</sup>lt;sup>3</sup>Experiments with larger OPT models and decoder models from additional model families resulted in similar findings, while less efficient (higher latency). We, therefore, adhere to our choice of advanced, yet relatively small, model.

predictor	all MC main verb lemmas			"think" MC main verb lemma				
	β	[0.025	0.975]	pval sig.	β	[0.025	0.975]	pval sig.
const	-0.383	-0.41	-0.35	***	-2.159	-2.25	-2.07	***
MC length (tokens)	0.302	0.28	0.33	***	0.242	0.17	0.32	***
MC verb frequency	-0.043	-0.07	-0.02	**		_		_
SC length (tokens)	0.197	0.17	0.22	***	0.196	0.12	0.27	***
SC subject distance	0.036	0.01	0.06	**	0.031	-0.03	0.09	
SC onset surprisal	0.301	0.27	0.32	***	0.458	0.38	0.54	***
SC onset entropy	0.432	0.41	0.46	***	0.232	0.15	0.32	***

Table 3: Logistic regression summary.  $\beta$  coefficients of the scaled features mirror the sign and the relative predictor importance. 95% CIs and p-values are reported, where "\*\*\*" denotes pval < 0.001 and "\*\*" denotes pval < 0.01. The MC verb frequency predictor is irrelevant in the single-main-verb-lemma experimental scenario.



Figure 2: Kernel density estimation plots: SC onset surprisal for explicit and implicit "that" usages, using the full lemma set (A) and the "think" lemma (B). SC onset entropy for explicit and implicit "that" usages, for the full lemma set (C) and "think" main verb lemma only (D).

MC verb lemmas case) coefficient assigned to SC onset *entropy*; that is, SC onset (non-)predictability can be viewed in a more holistic manner, where both the low predictability of the specific SC onset and the high entropy of the potential sentence continuation, carry over complementary and uncorrelated predictive power on syntactic reduction decision. The overall picture remains consistent in the scenario where the single lemma "think" is considered (albeit SC subject distance shows insignificant), implying the robustness of our findings.

Our main findings are further strengthened by the illustration in Figure 2. Kernel density estimation of SC onset surprisal with explicit "that" usages is shifted to the right (A), reflecting the lower predictability of SC onset in this cases compared to those where "that" was omitted. This observation stays sound when only "think" main verb is considered for experiments (B). Sub-figures C and D depict the complementary entropy plots – higher SC onset entropy in explicit "that" usages is mirrored by the right shift of the red line in both full main verb set and "think"-only cases.

The definition of surprisal inherently implies the correlation of SC onset surprisal with its frequency. Indeed, these two factors exhibit moderate negative correlation for both all lemma set and "think" lemma only (Pearson's r of -0.57 and -0.47, re-

spectively). Replacing SC onset surprisal with its frequency resulted in a slightly weaker regression model in our case, suggesting that surprisal introduces additional predictive power beyond frequency. While surprisal and frequency are highly correlated, they are typically associated with different psycholinguistic behaviours, and we leave a more thorough investigation for future work.

## **5** Conclusions

We study the UID hypothesis manifestation in syntactic reduction using a large, diverse and carefully compiled corpus of English sentences with explicit or implicit "that" subordinate conjunction. Harnessing the power of contemporary pretrained LLMs, we show that SC onset surprisal and entropy are the main factors affecting a speaker's choice to spell out the optional conjunction "that".

Last but not least, a large body of linguistic literature has studied the conditions under which complementizers (like "that" subordinate conjunction) can or cannot be omitted (inter alia Erteschik-Shir (1997); Ambridge and Goldberg (2008)). We believe that future work in this field should better engage with this literature, incorporating insights for more linguistically-informed approach to the task of syntactic reduction analysis.

## 6 Ethical Considerations

We use publicly available data to study the manifestation of UID in syntactic reduction. The use of publicly available data from social media platforms, such as Reddit, may raise normative and ethical concerns. These concerns are extensively studied by the research community as reported in e.g., Proferes et al. (2021). Here we address two main concerns. (1) Anonymity: Data used for this research can only be associated with participants' user IDs, which, in turn, cannot be linked to any identifiable information, or used to infer any personal or demographic trait. (2) Consent: Jagfeld et al. (2021) debated the need to obtain informed consent for using social media data mainly because it is not straightforward to determine if posts pertain to a public or private context. Ethical guidelines for social media research (Benton et al., 2017) and practice in comparable research projects (Ahmed et al., 2017), as well as Reddit's terms of use, regard it as acceptable to waive explicit consent if users' anonymity is protected.

We did not make use of AI-assisted technologies while writing this paper. We also did not hire human annotators at any stage of the research.

# 7 Limitations

We believe that the main limitation of this work is the relatively restrictive experimental setup of sentences used to study UID principles in syntactis reduction. As an example, additional syntactic setting of interest includes sentences where "that" is used as a relative conjunction, as in "the book [that] I read last week made me quite sad...". Due to its much lower frequency in our data, we leave the investigation of "that" omission before a relative clause to future work.

The current study also limits its set of main clauses to those where the SCONJ immediately follows MC verb, not considering cases like "My boyfriend has mentioned several times [that] we should approach this guy with the offer", where the main verb "mentioned" is separated from the SC onset "we" by the "several times" phrase. However, we have reasons to believe that similar findings would be evident in these scenarios, and plan to extend the research to those cases as well.

#### Acknowledgements

We are grateful to Shuly Wintner for much advice during the early stages of this work. We are also thankful to Alon Rabinovich for his help with the annotation effort for this study.

#### References

- Wasim Ahmed, Peter A Bath, and Gianluca Demartini. 2017. Using twitter as a data source: An overview of ethical, legal, and methodological challenges. *The ethics of online research*, 2:79–107.
- Ben Ambridge and Adele E Goldberg. 2008. The island status of clausal complements: Evidence in favor of an information structure explanation.
- Matthew Aylett and Alice Turk. 2006. Language redundancy predicts syllabic duration and the spectral characteristics of vocalic syllable nuclei. *The Journal of the Acoustical Society of America*, 119(5).
- Alan Bell, Daniel Jurafsky, Eric Fosler-Lussier, Cynthia Girand, Michelle Gregory, and Daniel Gildea. 2003. Effects of disfluencies, predictability, and utterance position on word form variation in english conversation. *The Journal of the acoustical society of America*, 113(2):1001–1024.
- Adrian Benton, Glen Coppersmith, and Mark Dredze. 2017. Ethical research protocols for social media health research. In *Proceedings of the first ACL workshop on ethics in natural language processing*, pages 94–102.
- Thomas Hikaru Clark, Clara Meister, Tiago Pimentel, Michael Hahn, Ryan Cotterell, Richard Futrell, and Roger Levy. 2023. A Cross-Linguistic Pressure for Uniform Information Density in Word Order. *Transactions of the Association for Computational Linguistics*, 11:1048–1065.
- Michael Xavier Collins. 2014. Information density and dependency length as complementary cognitive models. *Journal of Psycholinguistic Research*, 43.
- Nomi Erteschik-Shir. 1997. *The dynamics of focus structure*. Cambridge University Press.
- Austin F Frank and T Florain Jaeger. 2008. Speaking rationally: Uniform information density as an optimal strategy for language production. In *Proceedings of the annual meeting of the cognitive science society*, volume 30.
- Dmitriy Genzel and Eugene Charniak. 2002. Entropy rate constancy in text. In *Proceedings of the 40th annual meeting of the Association for Computational Linguistics*, pages 199–206.
- Michael Hahn, Dan Jurafsky, and Richard Futrell. 2020. Universals of word order reflect optimization of grammars for efficient communication. *Proceedings of the National Academy of Sciences*, 117(5):2347–2353.
- John A Hawkins. 2001. Why are categories adjacent? Journal of linguistics, 37(1):1–34.

- John A Hawkins. 2004. *Efficiency and complexity in grammars*. OUP Oxford.
- T Florian Jaeger. 2010. Redundancy and reduction: Speakers manage syntactic information density. *Cognitive psychology*, 61(1):23–62.
- Glorianna Jagfeld, Fiona Lobban, Paul Rayson, and Steven H Jones. 2021. Understanding who uses reddit: Profiling individuals with a selfreported bipolar disorder diagnosis. *arXiv preprint arXiv:2104.11612*.
- Roger Levy and T Jaeger. 2006. Speakers optimize information density through syntactic reduction. Advances in neural information processing systems, 19.
- Kyle Mahowald, Evelina Fedorenko, Steven T Piantadosi, and Edward Gibson. 2013. Info/information theory: Speakers choose shorter words in predictive contexts. *Cognition*, 126(2):313–318.
- Luke Maurits, Dan Navarro, and Amy Perfors. 2010. Why are some word orders more common than others? a uniform information density account. Advances in neural information processing systems, 23.
- Clara Meister, Tiago Pimentel, Patrick Haller, Lena Jäger, Ryan Cotterell, and Roger Levy. 2021. Revisiting the uniform information density hypothesis. *arXiv preprint arXiv:2109.11635*.
- Maeve Olohan and Mona Baker. 2000. Reporting that in translated english. evidence for subconscious processes of explicitation? *Across languages and cultures*, 1(2):141–158.
- Tiago Pimentel, Clara Meister, Ethan G Wilcox, Roger P Levy, and Ryan Cotterell. 2023. On the effect of anticipation on reading times. *Transactions of the Association for Computational Linguistics*, 11:1624– 1642.
- Nicholas Proferes, Naiyan Jones, Sarah Gilbert, Casey Fiesler, and Michael Zimmer. 2021. Studying reddit: A systematic overview of disciplines, approaches, methods, and ethics. *Social Media*+ *Society*, 7(2):20563051211019004.
- Ella Rabinovich, Masih Sultani, and Suzanne Stevenson. 2019. Codeswitch-reddit: Exploration of written multilingual discourse in online discussion forums. *arXiv preprint arXiv:1908.11841*.
- Ashish Vaswani, Noam Shazeer, Niki Parmar, Jakob Uszkoreit, Llion Jones, Aidan N Gomez, Łukasz Kaiser, and Illia Polosukhin. 2017. Attention is all you need. *Advances in neural information processing systems*, 30.
- Susan Zhang, Stephen Roller, Naman Goyal, Mikel Artetxe, Moya Chen, Shuohui Chen, Christopher Dewan, Mona Diab, Xian Li, Xi Victoria Lin, Todor Mihaylov, Myle Ott, Sam Shleifer, Kurt Shuster, Daniel Simig, Punit Singh Koura, Anjali Sridhar, Tianlu Wang, and Luke Zettlemoyer. 2022. Opt: Open pretrained transformer language models.

## **A** Appendices

# A.1 Identification of Sentences with Optional "that" Subordinate Conjunction

Figures 3 and 4 depict two parsing trees of sentences with explicit and implicit usage of "that" SCONJ, respectively. After parsing a sentence, a set of rules was applied for identification of cases where "that" is used (or could have been used) in the role of subordinate conjunction connecting main and subordinate clause. As mentioned in Section 2, the extraction process was tuned for accurate (over 95%) performance.



Figure 3: Constituency parse tree of the sentence "He's smart enough to know that you are a good catch.". Note the main verb "know" followed by the explicit SCONJ "that" and subordinate clause "you are a good catch".



Figure 4: Constituency parse tree of the sentence "yeah, that, and I think they got a lower rent price compared to the renewal downtown". Note the main verb "think" followed by the omitted SCONJ "that" and subordinate clause "they got a lower rent price compared to the renewal downtown".