

부스트캠프 AI Tech 2기

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# BART

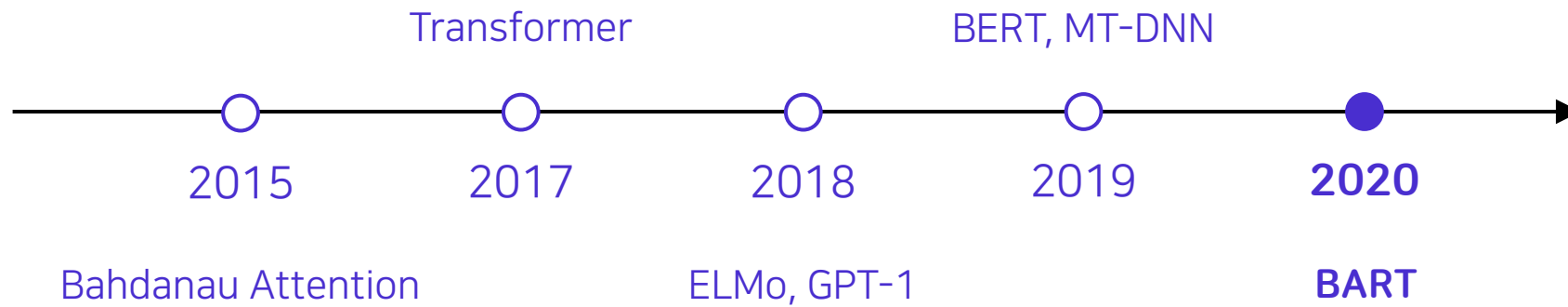
**BART: Denoising Sequence-to-Sequence Pre-training for Natural Language Generation, Translation, and Comprehension, ACL 2020**

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Huggingface Hub: [huggingface.co/jinmang2](https://huggingface.co/jinmang2)

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# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## Lifelog of BART

[Submitted on 29 Oct 2019]

### BART: Denoising Sequence-to-Sequence Pre-training for Natural Language Generation, Translation, and Comprehension

Mike Lewis, Yinhan Liu, Naman Goyal, Marjan Ghazvininejad, Abdelrahman Mohamed, Omer Levy, Ves Stoyanov, Luke Zettlemoyer

We present BART, a denoising autoencoder for pretraining sequence-to-sequence models. BART is trained by (1) corrupting text with an arbitrary noising function, and (2) learning a model to reconstruct the original text. It uses a standard Transformer-based neural machine translation architecture which, despite its simplicity, can be seen as generalizing BERT (due to the bidirectional encoder), GPT (with the left-to-right decoder), and many other more recent pretraining schemes. We evaluate a number of noising approaches, finding the best performance by both randomly shuffling the order of the original sentences and using a novel in-filling scheme, where spans of text are replaced with a single mask token. BART is particularly effective when fine tuned for text generation but also works well for comprehension tasks. It matches the performance of RoBERTa with comparable training resources on GLUE and SQuAD, achieves new state-of-the-art results on a range of abstractive dialogue, question answering, and summarization tasks. We also report ablation studies on only target language pretraining. We also report ablation studies on only target language pretraining. We also report ablation studies on only target language pretraining.

Subjects: **Computation and Language (cs.CL)**, Machine Learning  
Cite as: [arXiv:1910.13461 \[cs.CL\]](https://arxiv.org/abs/1910.13461)  
(or [arXiv:1910.13461v1](https://arxiv.org/abs/1910.13461v1) [cs.CL] for this version)

#### Submission history

From: Marjan Ghazvininejad [view email]

[v1] Tue, 29 Oct 2019 18:01:00 UTC (143 KB)

## Submission history

From: Marjan Ghazvininejad [view email]

[v1] Tue, 29 Oct 2019 18:01:00 UTC (143 KB)

 ACL Anthology    [FAQ](#)   [Corrections](#)   [Submissions](#)

## Proceedings of the 58th Annual Meeting of the Association for Computational Linguistics

Dan Jurafsky, Joyce Chai, Natalie Schluter, Joel Tetreault (Editors)

**Anthology ID:** 2020.acl-main  
**Month:** July  
**Year:** 2020  
**Address:** Online  
**Venue:** ACL  
**SIG:** —  
**Publisher:** Association for Computational Linguistics  
**URL:** <https://www.aclweb.org/anthology/2020.acl-main>  
**DOI:** —

 PDF (full)  
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**Bib Export formats:** [BibTeX](#)   [MODS XML](#)   [EndNote](#)  
**PDF:** <https://www.aclweb.org/anthology/2020.acl-main.pdf>



### BART: Denoising Sequence-to-Sequence Pre-training for Natural Language Generation, Translation, and Comprehension

<https://arxiv.org/pdf/1910.13461.pdf>

#### Introduction

BART is sequence-to-sequence model trained with denoising as pretraining objective. We show that this pretraining objective is more generic and show that we can match RoBERTa results on SQuAD and GLUE and gain state-of-the-art results on summarization (XSum, CNN dataset), long form generative question answering (ELI5) and dialog response generation (ConvAI2). See the associated paper for more details.

#### Pre-trained models

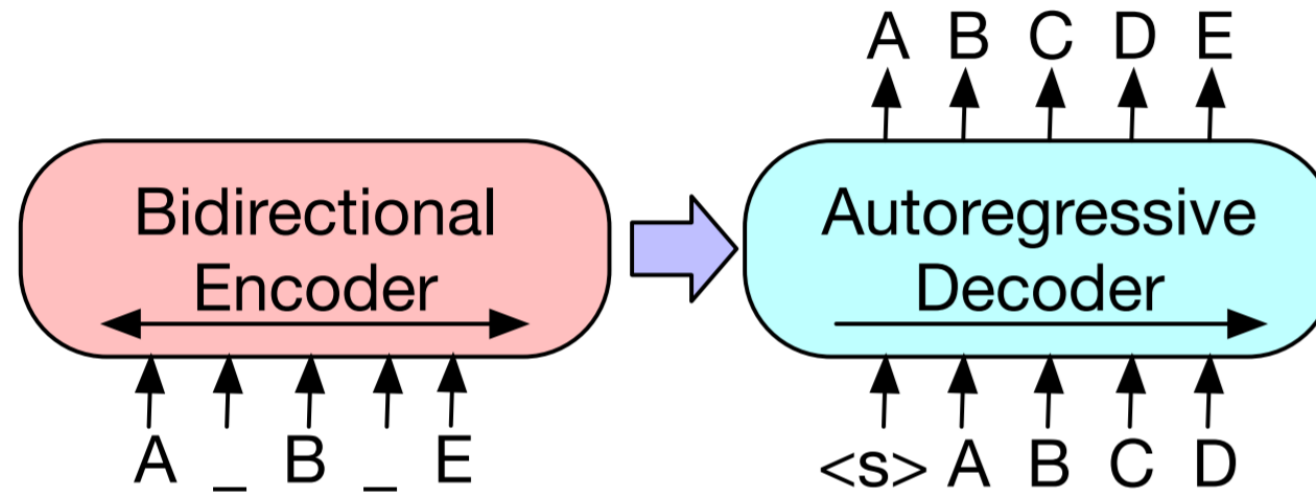
Model	Description	# params	Download
<code>bart.base</code>	BART model with 6 encoder and decoder layers	140M	<a href="#">bart.base.tar.gz</a>
<code>bart.large</code>	BART model with 12 encoder and decoder layers	400M	<a href="#">bart.large.tar.gz</a>
<code>bart.large.mnli</code>	<code>bart.large</code> finetuned on MNLI	400M	<a href="#">bart.large.mnli.tar.gz</a>
<code>bart.large.cnn</code>	<code>bart.large</code> finetuned on CNN-DM	400M	<a href="#">bart.large.cnn.tar.gz</a>
<code>bart.large.xsum</code>	<code>bart.large</code> finetuned on Xsum	400M	<a href="#">bart.large.xsum.tar.gz</a>

<https://github.com/pytorch/fairseq/tree/master/examples/bart>

<https://arxiv.org/abs/1910.13461>  
<https://www.aclweb.org/anthology/2020.acl-main.703/>

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

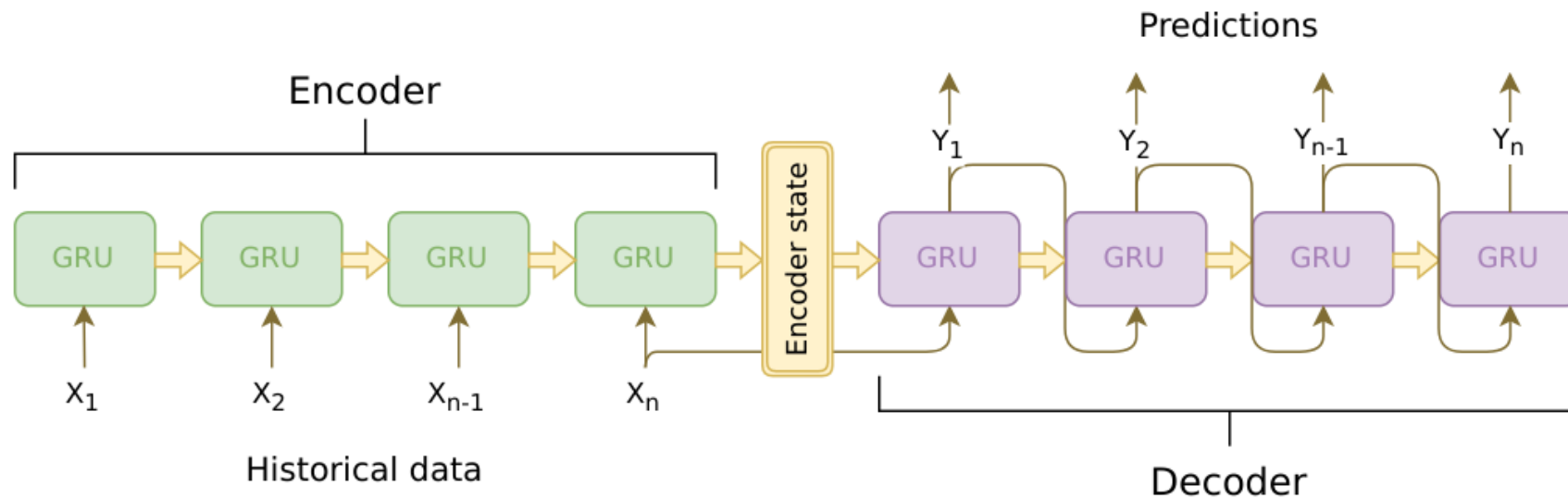
What is BART? 🤔



Sequence-to-Sequence model trained with denoising as pretraining objective

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

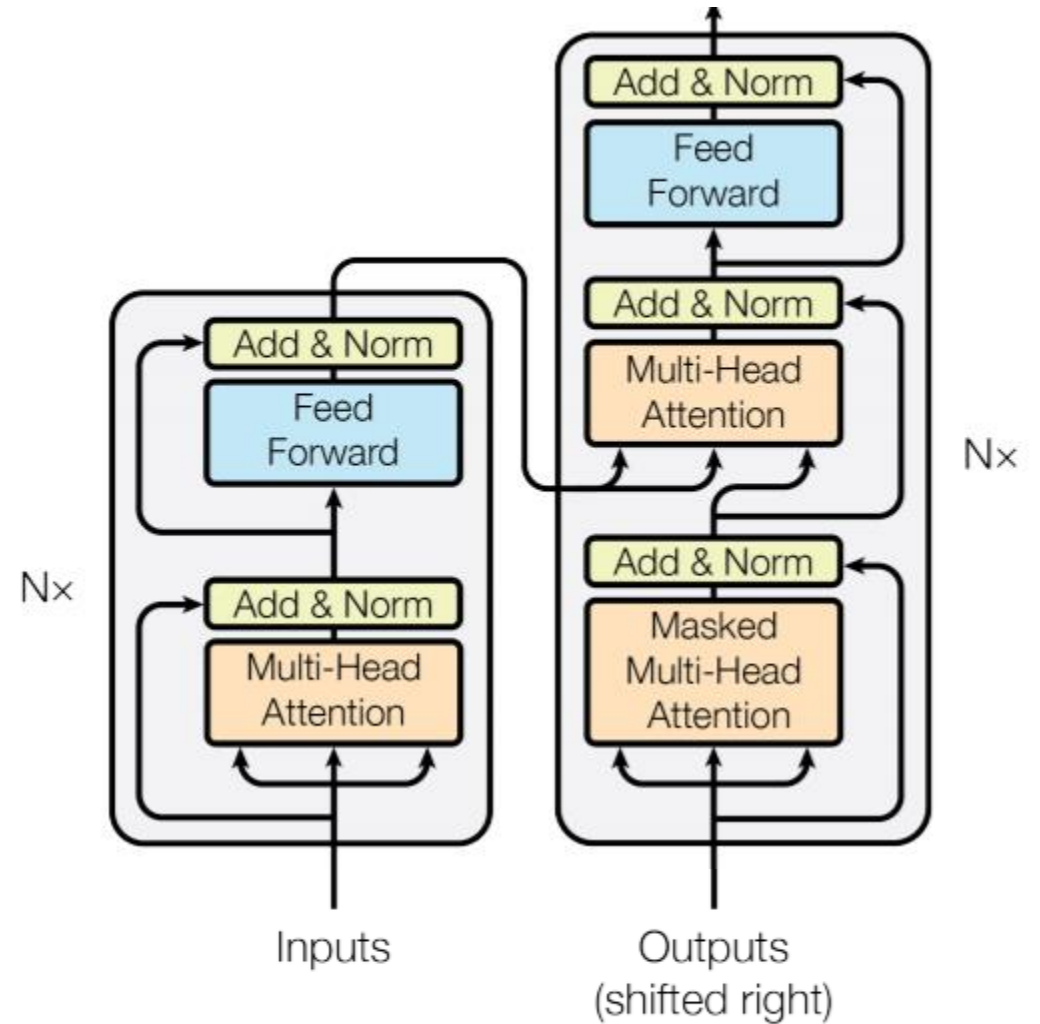
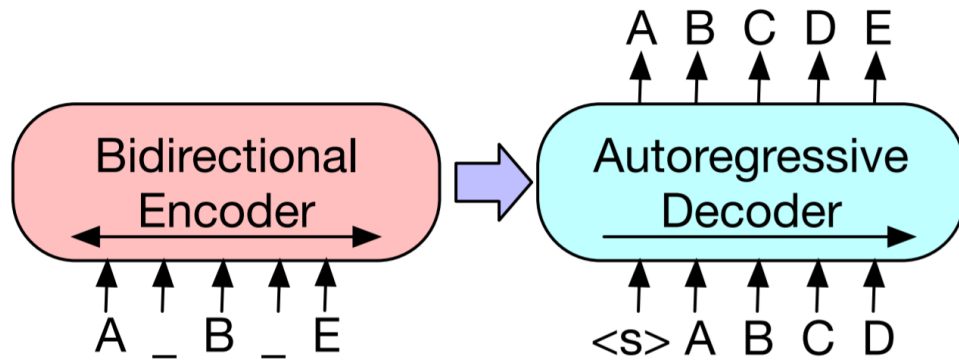
## BART Architecture & Denoising Objectives 🐼



Seq2Seq: Input Sequence를 입력으로 받고 Output Sequence를 출력하는 모델 !! (AutoEncoder)

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

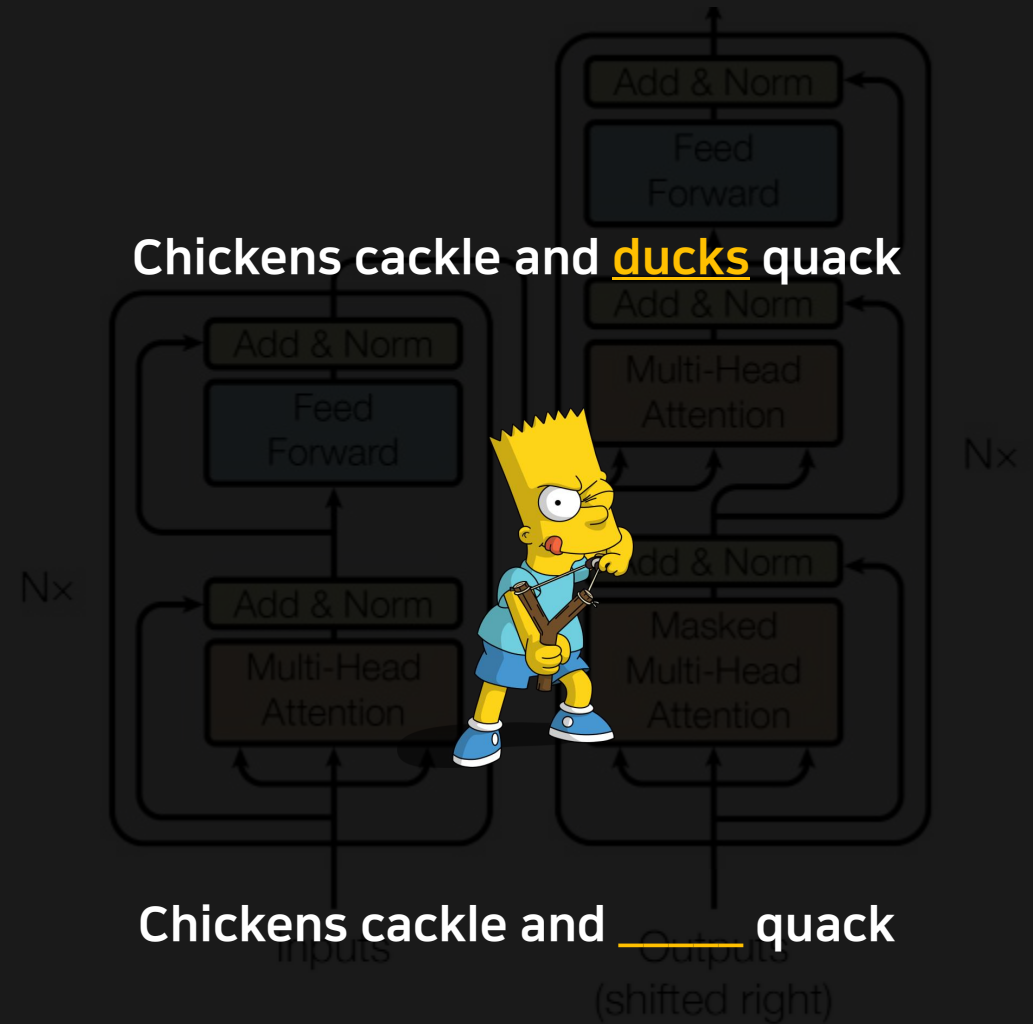
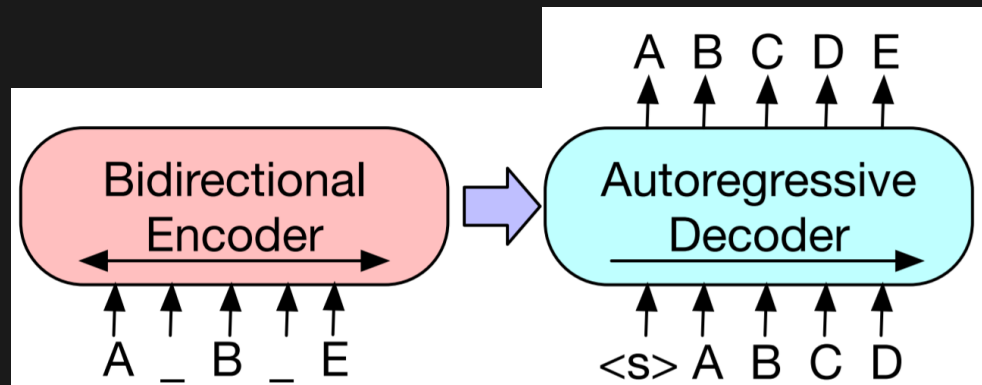
BART Architecture & Denoising Objectives 🐼



BART의 Encoder-Decoder를 Transformers로! (BERT-GPT)

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives



Sequence-to-Sequence model trained with **denoising as pretraining objective**

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🧠

**Self-supervised** 방법론들은 광범위한 NLP task에서 괄목할 성과를 거둠

- Word2Vec, ELMo, BERT, SpanBERT, XLNet, Roberta

이 중 가장 성공적인 접근은 **Cloze Tasks**에서 영감을 받은 **MLM(Masked Language Models)**의 변형

- Wilson L Taylor. 1953. Cloze procedure: A new tool for measuring readability. *Journalism Bulletin*
- In *XLNet*, Masked Token이 예측될 순서를 개선 (Permutation Operation)
- In *SpanBERT*, Masked Token의 분포를 개선 (많은 NLP Task에서 text span 간 관계 추론이 필요)
- In *UniLM*, Masked Token을 대체할 Context를 개선

그러나 기존의 방법론들을 특정 End Task 형태에 집중하여 **활용성이 떨어짐**

- XLNet, SpanBERT, UniLM





# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Architecture & Denoising Objectives 🥚



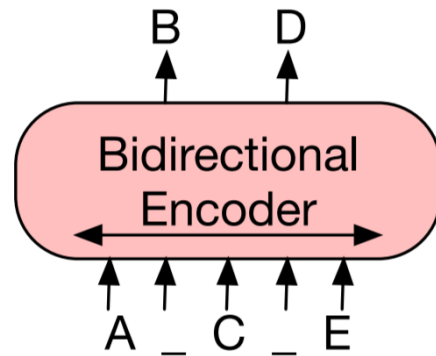
**BERT**



**BART**

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🐼



# BERT

- ✓ Transformers의 Encoder로 모델 구축
- ✓ Cloze Task의 영감을 받은 MLM Pre-Train 목적함수와
- ✓ Next Sentence Prediction Pre-Train 목적함수로 학습
- ✓ Albert, Roberta 등 후속 연구에 의하면 MLM이 진또배기!
- ✓ By XLNet Paper, BERT is based on denoising auto-encoding

$$\log p_{\theta}(\bar{x}|\hat{x}) \approx \sum_{t=1}^T m_t \log p_{\theta}(x_t|\hat{x})$$

- ✓ Independence Assumption  
모든 masked token들은 독립적으로 재구축됨
- ✓ Input Noise  
Pretrain-Finetune discrepandancy
- ✓ 위의 단점을 XLNet은 Autoregressive한 LM으로 해결코자 함  
PLM(Permutation Language Model)

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🐼

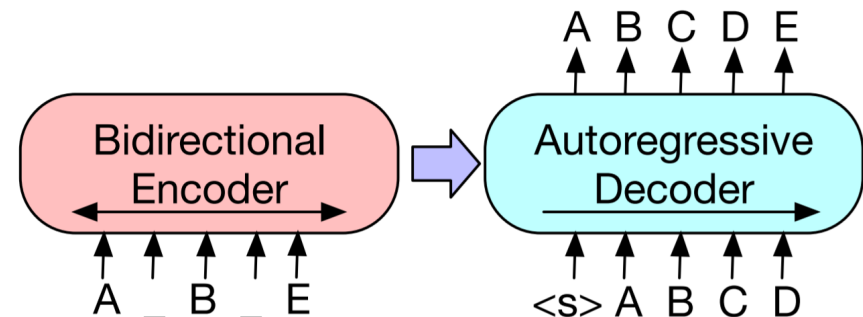
Base: 6 layers

Large: 12 layers



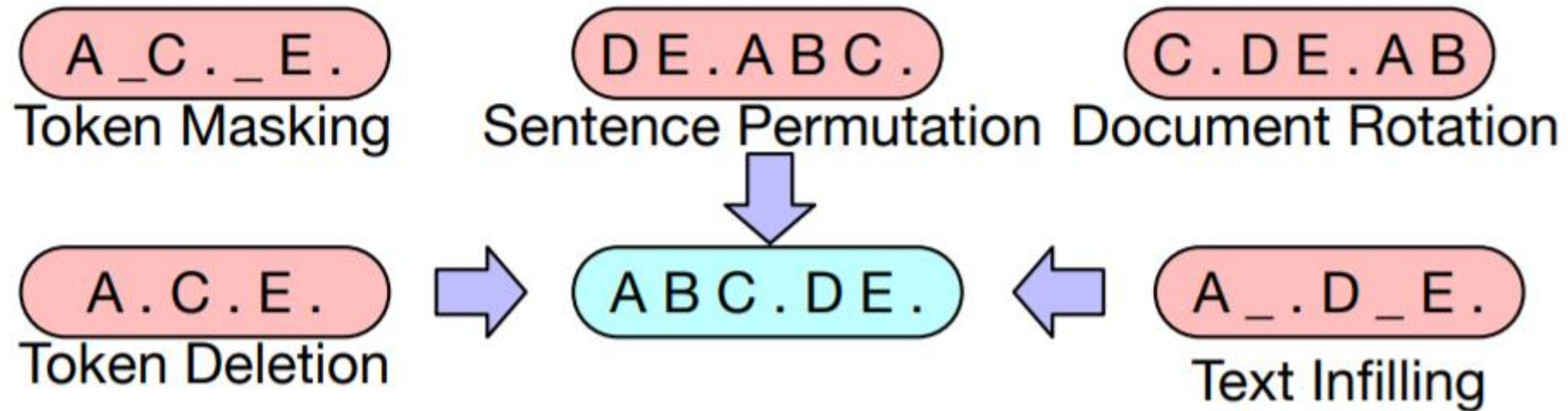
**BART**

- ✓ BART는 **Encoder-Decoder** 모델! (Transformers)
- ✓ **Bidirectional Transformer's Encoder** (as like BERT)
  - Decoder의 각 Layer별 Cross-Attention을 수행
  - Word Prediction 전 추가적인 FFN 필요 X
- ✓ **Autoregressive Transformers' Decoder** (as like GPT)
  - ReLU대신 GeLUs 사용
  - Parameter를  $N(0, 0.02)$ 로 초기화
- ✓ BERT의 단점들을 개선 가능
- ✓ XLNet, SpanBERT, UniLM 등 기존의 **MLM 변형체**들 채용
- ✓ **Noise Flexibility**; origin text에 임의의 변환을 적용할 수 있음



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Architecture & Denoising Objectives 🐣



어떤 Noise를 줘을까??



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Architecture & Denoising Objectives 🐼

## Token Masking

A B C . D E .

A \_ C . \_ E .

BERT (Devlin et al., 2019)와 동일하게,

Random Token들을 sampling하고 이를 [MASK] token으로 대체

어제 그녀와 만났다.

그녀와의 데이트는 너무나도 달콤했다.

어제 [MASK] 만났다.

[MASK] 데이트는 너무나도 달콤했다.



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Architecture & Denoising Objectives 🥚

## Token Deletion

A B C . D E .

A . C . E .

입력에서 임의로 token들을 제거

Token Masking과 다르게, Model은 어느 자리의 Token이 유실됐는지 결정해야 함.

어제 **그녀와** 만났다.

**그녀와의** 데이트는 너무나도 달콤했다.

어제 만났다.

데이트는 너무나도 달콤했다.



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🧠

### Text Infilling

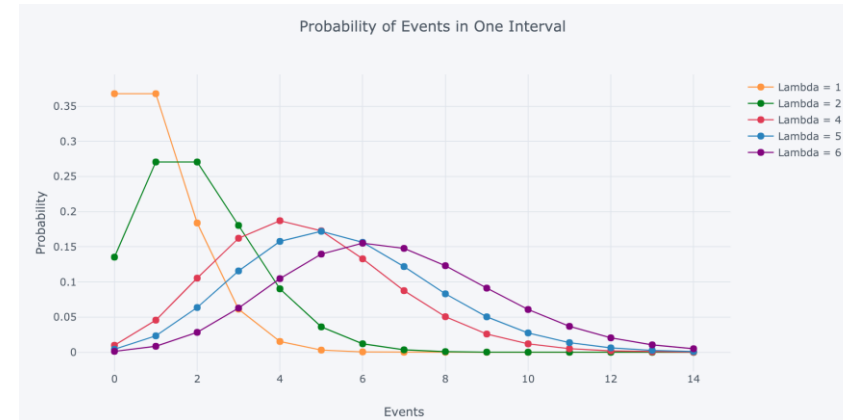
A B C . D E .

A \_ . D \_ E .

Poisson( $\lambda = 3$ ) 분포에서 Span Length를 추출한 길이 만큼의 Text Span을 Sampling하고 각 Token을 단일 [MASK] token으로 대체한다.  
길이가 0일 경우에는 [MASK] token을 삽입하는 것과 동일하다.  
이는 모델에게 Span에서부터 얼마나 많은 Token이 유실됐는지 예측하도록 학습시킨다.  
SpanBERT (Joshi et al., 2019)에서 영감을 받았다고 한다.

어제 그녀와 만났다.  
그녀와의 데이트는 너무나도 달콤했다.

어제 그녀와 [MASK] 만났다.  
[MASK] 너무나도 달콤했다.



$$\lambda = \mathbb{E}(X) = \text{Var}(X)$$



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Architecture & Denoising Objectives 🐣

## Sentence Permutation

A B C . D E .

D E . A B C .

Full Stop들을 기준으로 Document를 Sentences로 나누고  
이 문장들을 임의의 순서로 섞어준다.

어제 그녀와 만났다.  
그녀와의 데이트는 너무나도 달콤했다.

그녀와의 데이트는 너무나도 달콤했다.  
어제 그녀와 만났다.





# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Architecture & Denoising Objectives 🐼

## Document Rotation

A B C . D E .

C . D E . A B

임의로 Token을 선택하고 Document를 해당 Token으로 시작하도록 Rotate  
이 Task는 Model이 문장의 시작이 어딘지 학습할 수 있게 도와준다.

어제 그녀와 만났다.

그녀와의 데이트는 너무나도 달콤했다.

만났다.

그녀와의 데이트는 너무나도 달콤했다.

어제 그녀와


# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🧠

### How to use (and preferably finetune) BART for text infilling? #5428

New issue

Closed tomaszgarbus opened this issue on 1 Jul · 3 comments




tomaszgarbus commented on 1 Jul

Here is shown how to use BART for simple mask filling (one token = one generated token), but how to use it for text infilling? The BART paper states that the model was pretrained on such task so it should be possible.


Is the only solution to simply take the `facebook/bart-large` model for summarization and finetune it on a dataset with tokens or is there a better way?

👍 10



orena1 commented on 13 Jul

@julien-c , @sshleifer ?



sshleifer commented on 14 Jul · edited

Sorry for the slow response.

Unfortunately, text infilling is not yet supported. It would be a welcome contribution! I think the equivalent fairseq task is called `DenoisingTask`.

<https://github.com/pytorch/fairseq/blob/aa79bb9c37b27e3f84e7a4e182175d3b50a79041/fairseq/tasks/denoising.py#L27>

sshleifer added the Help wanted label on 14 Jul

sshleifer added this to To do in Examples/seq2seq via automation on 14 Jul

sshleifer added the Examples label on 14 Jul

Assignees

No one assigned

Labels

Examples Help wanted wontfix

Projects

Examples/seq2seq Done

Milestone

No milestone

Linked pull requests

Successfully merging a pull request may close this issue.


None yet

Notifications

Subscribe

You're not receiving notifications from this thread.

3 participants



<https://github.com/huggingface/transformers/issues/5428>

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🐼

```
# Copyright (c) Facebook, Inc. and its affiliates.
#
# This source code is licensed under the MIT license found in the
# LICENSE file in the root directory of this source tree.
```

```
import logging
import os
```

```
from fairseq.data import (
    data_utils,
    Dictionary,
    AppendTokenDataset,
    DenoisingDataset,
    PrependTokenDataset,
    StripTokenDataset,
    TokenBlockDataset,
)
```

```
from fairseq.data.encoders.utils import get_whole_word_mask
from fairseq.tasks import FairseqTask, register_task
from fairseq import utils
```

```
logger = logging.getLogger(__name__)
```

```
@register_task('denoising')
```

```
class DenoisingTask(FairseqTask):
```

```
    """
    Denoising task for applying sequence to sequence denoising. (ie. BART)
    """
```

```
class DenoisingDataset(FairseqDataset):
```

```
    """
```

```
    A wrapper around TokenBlockDataset for BART dataset.
```

```
    def __getitem__(self, index):
```

```
    Args:
```

```
        dataset (TokenBlockDataset)
        sizes (List[int])
        vocab (~fairseq.Dictionary)
        mask_idx (int): index of the mask token in the vocab
        mask_whole_words (bool): whether to mask whole words
        shuffle (bool, optional): whether to shuffle the dataset
        Default: ``True``
        seed: Seed for random number generation
        args: argparse namespace
```

```
    """
```

```
        with data_utils.numpy_seed(self.seed, self.epoch, index):
```

```
            tokens = self.dataset[index]
```

```
            assert tokens[-1] == self.eos
```

```
            source, target = tokens.clone()
```

```
            if self.permute_sentence_ratio > 0.0:
```

```
                source = self.permute_sentences(source, self.permute_sentence_ratio)
```

```
            if self.mask_ratio > 0:
```

```
                source = self.add_whole_word_mask(source, self.mask_ratio)
```

```
            if self.insert_ratio > 0:
```

```
                source = self.add_insertion_noise(source, self.insert_ratio)
```

```
            if self.rotate_ratio > 0.0 and np.random.random() < self.rotate_ratio:
```

```
                source = self.add_rolling_noise(source)
```

```
            # there can be additional changes to make:
```

```
            if self.item_transform_func is not None:
```

```
                source, target = self.item_transform_func(source, target)
```

```
            assert (source >= 0).all()
```

```
            assert (source[1:-1] >= 1).all()
```

```
            assert (source <= len(self.vocab)).all()
```

```
            assert source[0] == self.vocab.bos()
```

```
            assert source[-1] == self.eos
```

```
            return {
```

```
                "id": index,
```

```
                "source": source,
```

```
                "target": target,
```

```
            }
```

Noise Flexibility


<https://github.com/pytorch/fairseq/blob/master/fairseq/tasks/denoising.py>

[https://github.com/pytorch/fairseq/blob/master/fairseq/data/denoising\\_dataset.py](https://github.com/pytorch/fairseq/blob/master/fairseq/data/denoising_dataset.py)

<https://github.com/pytorch/fairseq/issues/2303>


# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension


## BART Architecture & Denoising Objectives 🤖



astariul commented on 31 Oct 2019 • edited by sshleifer ▾

Contributor 😊 ⋮

 **New model addition**



**Model description**


method for pre-training seq2seq models by de-noising text. BART outperforms previous work on a bunch of generation tasks (summarization/dialogue/QA), while getting similar performance to RoBERTa on SQuAD/GLUE

[BART: Denoising Sequence-to-Sequence Pre-training for Natural Language Generation, Translation, and Comprehension](#)



Amazing results on text summarization.


**Open Source status**


- ☒ the model implementation is available: not yet
- ☒ the model weights are available: not yet
- ☐ who are the authors: [@yinhanliu](#) [@ernamangoyal](#)

 13

**BART: Denoising Sequence-to-Sequence Pre-training for Natural Language Generation, Translation, and Comprehension**  
[Mike Lewis](#), [Yinhan Liu](#), [Naman Goyal](#), [Marjan Ghazvininejad](#), [Abdelrahman Mohamed](#), [Omer Levy](#), [Ves Stoyanov](#), [Luke Zettlemoyer](#)


  **julien-c** mentioned this issue on 6 Nov 2019

**BART #1738**  
 0 of 3 tasks complete




# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🐼



rlouf commented on 6 Nov 2019


@thomwolf another encoder-decoder



stefan-it commented on 9 Nov 2019

Was released today: <https://github.com/pytorch/fairseq/tree/master/examples/bart> 🐼


👍 7



yinhanliu commented on 23 Nov 2019

Let me know if you guys plan to add xsum/eli5/cnn-dm ft with our released bart into hugging face.


👍 3



nicola-decao commented on 17 Jan


Is there any news on this?

Contributor



hamediramin commented on 23 Jan

any progress on this one? also thanks :)




sshleifer commented on 28 Jan


Member

I'm getting started on this Feb 4!

❤️ 11 👁️ 4




sshleifer self-assigned this on 8 Feb



sshleifer linked a pull request that will close this issue on 11 Feb

Add BartModel #2745

📋 6 of 8 tasks complete



sshleifer closed this in #2745 on 21 Feb

Merged

**Sam Shleifer**  
sshleifer

Research Engineer doing NLP.  
Previously @huggingface @kensho  
@Stanford.

Unfollow

👤 235 followers · 17 following · ☆ 17

🏠 @facebookresearch

📍 New York

<https://github.com/sshleifer>

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🐼

The screenshot shows a GitHub pull request interface. At the top, it displays repository statistics: 115 conversations, 168 commits, 0 checks, and 20 files changed. The pull request is titled 'sshleifer commented on 6 Feb • edited' and is marked as a 'Member' pull request. The main content area contains a comment from sshleifer explaining that the pull request ports BART, a 'sequence-to-sequence model trained with denoising as pretraining objective,' from the fairseq repository. It notes that the decoder is left-to-right and the encoder is bidirectional, using a causal attention mask in the decoder. Below the comment is a 'TODO' list with four items: conversion of pretrained weights, some unit testing, inference produces the same results as the fairseq version, and deciding on signature/splitting of encoder/decoder arguments. A code snippet is shown, highlighting the 'prepare\_model\_kwargs' function in 'transformers/src/transformers/modeling\_encoder\_decoder.py'. To the right of the comment, there are sections for 'Reviewers' (listing julien-c, thomwolf, Liyang90, LysandreJik, pnpnpn, and patrickvonplaten), 'Assignees' (none assigned), 'Labels' (seq2seq), 'Projects' (none yet), 'Milestone' (none), 'Linked issues' (BART), and 'Notifications' (a 'Subscribe' button). At the bottom, a commit history shows 31 commits added by sshleifer on Jan 24, with a list of commit messages including '3 new files', 'Lots of fairseq copy paste', 'typo idiocy', 'Copy paste code that we know we wont use', and 'before consider Roberta way'.

Conversation 115 Commits 168 Checks 0 Files changed 20 +1,766 -59

sshleifer commented on 6 Feb • edited Member

This ports BART, a "sequence-to-sequence model trained with denoising as pretraining objective." from <https://github.com/pytorch/fairseq/tree/master/examples/bart>

The decoder is left-to-right, the encoder is bidirectional. As such, the code only uses a causal attention mask in the decoder.

**TODO:**

- ☒ conversion of pretrained weights
- ☒ some unit testing
- ☒ inference produces the same results as the fairseq version.
- ☒ decide on signature/splitting of encoder, decoder arguments (see

```
transformers/src/transformers/modeling_encoder_decoder.py
Line 240 in 808bbd5
240 def prepare_model_kwargs(**kwargs):
)
☒ Docstrings
☒ More comments for code readers
```

**Future PRs**

- ☐ example with correct pretraining objective
- ☐ BartForSummarization.from\_pretrained('bart-large-cnn')

sshleifer added 31 commits on 24 Jan

- 3 new files
- Lots of fairseq copy paste
- typo idiocy
- Copy paste code that we know we wont use
- before consider Roberta way

Reviewers

- julien-c ✓
- thomwolf
- Liyang90
- LysandreJik ✓
- pnpnpn
- patrickvonplaten ✓

Assignees

No one assigned

Labels

seq2seq

Projects

None yet

Milestone

No milestone

Linked issues

Successfully merging this pull request may close these issues.

BART

Notifications Customize

Subscribe

You're not receiving notifications from this thread.

8 participants

## TODO

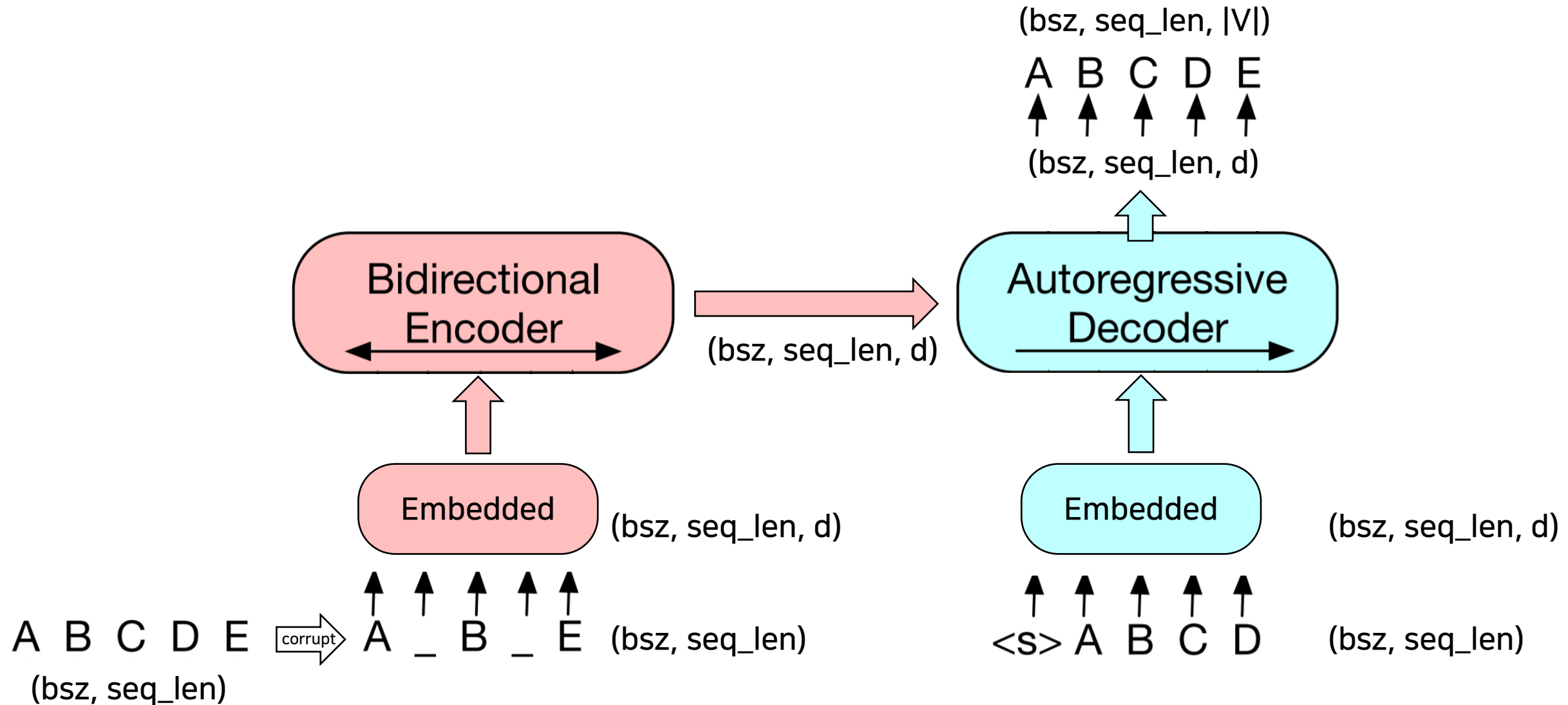
- Pretrained weight conversion
- Some unit testing
- fairseq 버전과 동일한 추론 결과
- Encoder, Decoder arguments
- Docstrings
- 코드 reader들을 위한 주석 작업

## Future PRs

- Pretraining objective 예제
- BartForSummarization 구현

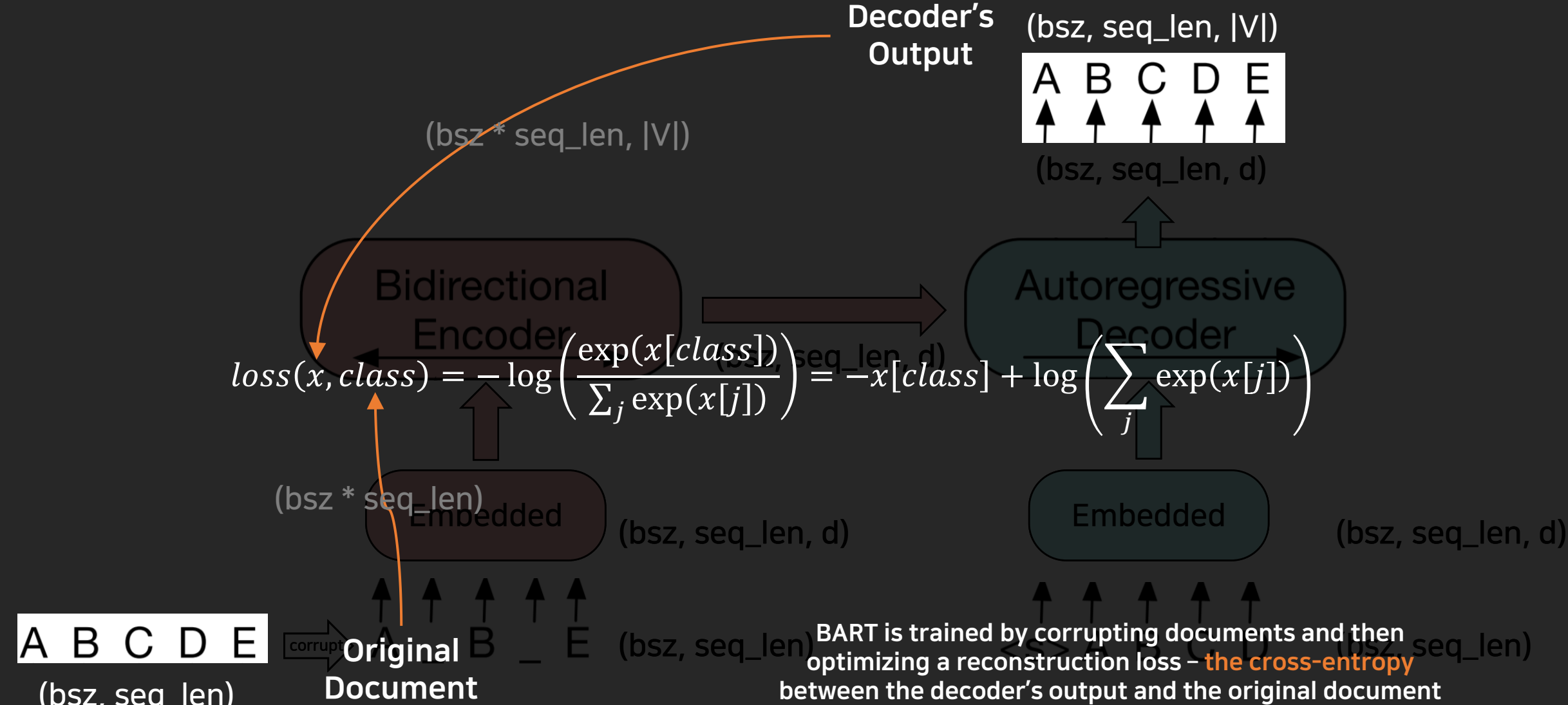
# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives 🧠



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Architecture & Denoising Objectives

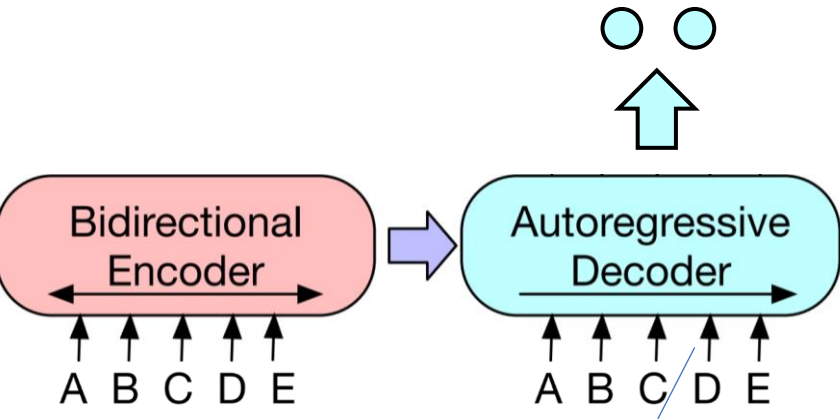




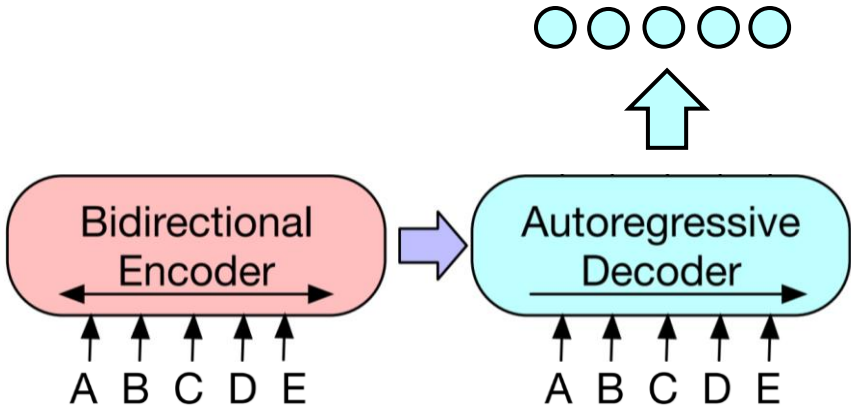
# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

Fine-tuning BART 🐼

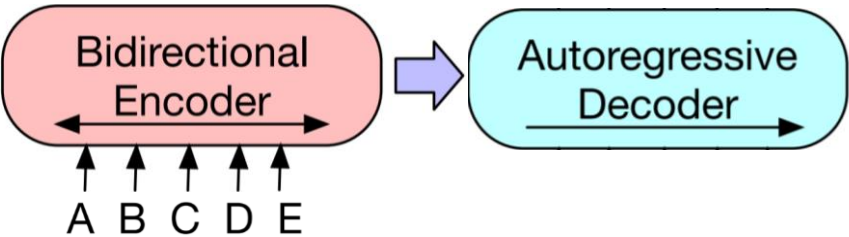
## Sentence Classification Tasks



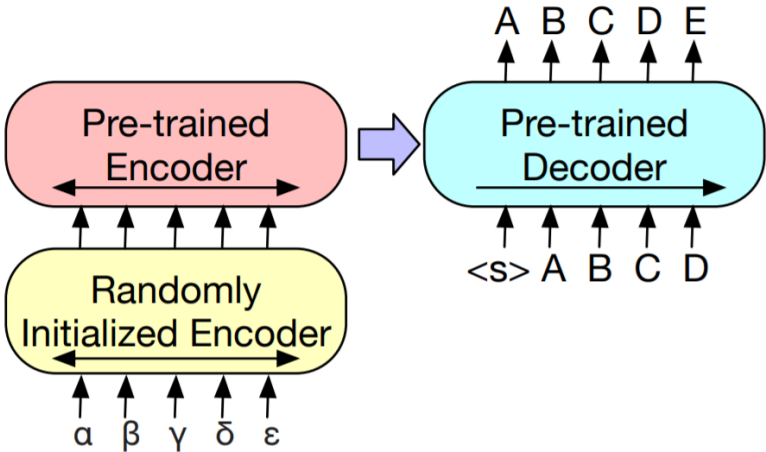
## Token Classification Tasks



## Sequence Generation Tasks

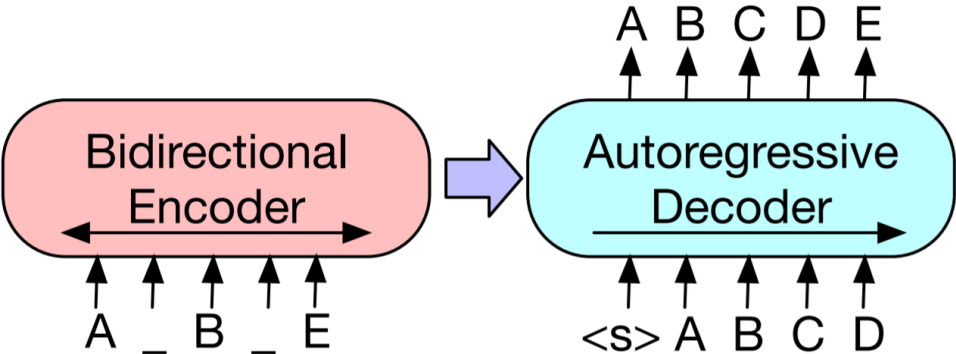


## Machine Translation Tasks



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Performance @ NLP Tasks 🐧



Task	Description
SQuAD	wikipedia 단락에 대한 대한 질문/답변, 질문과 연결된 컨텍스트를 BART의 인코더에 대한 입력으로 사용, 추가 디코더에 전달
MNLI	Fine-tuned model은 EOS 토큰이 추가된 두 문장을 연결, BART 인코더와 디코더에 전달, EOS 토큰은 문장 관계를 분류 하는데 사용
ELI5	긴 형식의 추상적인 질문/응답 데이터 질문과 supporting document의 연결을 조건으로 답변 생성
XSum	매우 추상적 요약이 포함된 뉴스 요약 데이터
ConvAI2	context와 페르소나를 조건으로 하는 대화 응답 생성
CNN/DM	뉴스 요약 데이터

Model	Description
Language Model(CLM)	GPT와 유사하게 left-to-right transformer 모델을 학습
Permuted Language Model(PLM)	XLNet을 기반으로 토큰의 1/6을 샘플링하고 auto regressively 방식으로 생성
Masked Language Model(MLM)	BERT에 따라 15% token을[MASK]로 대체하고 학습
Multitask Masked Language Model	UniLM과 같이 additional self-attention mask. Self attention mask -> 1/6 left-to-right, 1/6 right-to-left, 1/3 un-masked, 1/3의 50%는 un-masked, 나머지는 left-to-right
Masked Seq-to-Seq(MASS)	토큰의 50%를 포함하는 범위를 mask, masked된 토큰을 예측하기 위한 seq-to-seq 모델로 훈련

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Performance @ NLP Tasks 🐧

Model	SQuAD 1.1 F1	MNLI Acc	ELI5 PPL	XSum PPL	ConvAI2 PPL	CNN/DM PPL
BERT Base (Devlin et al., 2019)	88.5	<b>84.3</b>	-	-	-	-
Masked Language Model	90.0	83.5	24.77	7.87	12.59	7.06
Masked Seq2seq Language Model	87.0	82.1	23.40	6.80	11.43	6.19
Permutated Language Model	76.7	80.1	<b>21.40</b>	7.00	11.51	6.56
Multitask Masked Language Model	89.1	83.7	24.03	7.69	12.23	6.96
	89.2	82.4	23.73	7.50	12.39	6.74
BART Base						
w/ Token Masking	90.4	84.1	25.05	7.08	11.73	6.10
w/ Token Deletion	90.4	84.1	24.61	6.90	11.46	5.87
w/ Text Infilling	<b>90.8</b>	84.0	24.26	<b>6.61</b>	<b>11.05</b>	5.83
w/ Document Rotation	77.2	75.3	53.69	17.14	19.87	10.59
w/ Sentence Shuffling	85.4	81.5	41.87	10.93	16.67	7.89
w/ Text Infilling + Sentence Shuffling	<b>90.8</b>	83.8	24.17	6.62	11.12	<b>5.41</b>

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Performance @ NLP Tasks 🐧

encoder와 decoder의 hidden size => 12

batch size => 8,000

train steps => 500,000

tokenizing method => BPE

Text Infilling + Sentence Shuffling => masking 30% of token, permute all sentences

train step의 마지막 10% => dropout off

pre-training data => 160Gb (news + books + stories + web text)

	MNLI	SST	QQP	QNLI	STS-B	RTE	MRPC	CoLA
	m/mm	Acc	Acc	Acc	Acc	Acc	Acc	Mcc
BERT	86.6/-	93.2	91.3	92.3	90.0	70.4	88.0	60.6
UniLM	87.0/85.9	94.5	-	92.7	-	70.9	-	61.1
XLNet	89.8/-	95.6	91.8	93.9	91.8	83.8	89.2	63.6
RoBERTa	<b>90.2/90.2</b>	96.4	92.2	94.7	<b>92.4</b>	86.6	<b>90.9</b>	<b>68.0</b>
BART	89.9/90.1	<b>96.6</b>	<b>92.5</b>	<b>94.9</b>	91.2	<b>87.0</b>	90.4	62.8

	SQuAD 1.1	SQuAD 2.0
	EM/F1	EM/F1
BERT	84.1/90.9	79.0/81.8
UniLM	-/-	80.5/83.4
XLNet	<b>89.0/94.5</b>	86.1/88.8
RoBERTa	88.9/ <b>94.6</b>	<b>86.5/89.4</b>
BART	88.8/ <b>94.6</b>	86.1/89.2

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Performance @ NLP Tasks 🐧

	CNN/DailyMail			XSum		
	R1	R2	RL	R1	R2	RL
Lead-3	40.42	17.62	36.67	16.30	1.60	11.95
PTGEN (See et al., 2017)	36.44	15.66	33.42	29.70	9.21	23.24
PTGEN+COV (See et al., 2017)	39.53	17.28	36.38	28.10	8.02	21.72
UniLM	43.33	20.21	40.51	-	-	-
BERTSUMABS (Liu & Lapata, 2019)	41.72	19.39	38.76	38.76	16.33	31.15
BERTSUMEXTABS (Liu & Lapata, 2019)	42.13	19.60	39.18	38.81	16.50	31.27
ROBERTASHARE (Rothe et al., 2019)	40.31	18.91	37.62	41.45	18.79	33.90
<b>BART</b>	<b>44.16</b>	<b>21.28</b>	<b>40.90</b>	<b>45.14</b>	<b>22.27</b>	<b>37.25</b>

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

BART Performance @ NLP Tasks 🐼

	<b>ELI5</b>		
	R1	R2	RL
Best Extractive	23.5	3.1	17.5
Language Model	27.8	4.7	23.1
Seq2Seq	28.3	5.1	22.8
Seq2Seq Multitask	28.9	5.4	23.1
BART	<b>30.6</b>	<b>6.2</b>	<b>24.3</b>

<b>RO-EN</b>	
Baseline	36.80
Fixed BART	36.29
Tuned BART	<b>37.96</b>



# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## BART Performance @ NLP Tasks

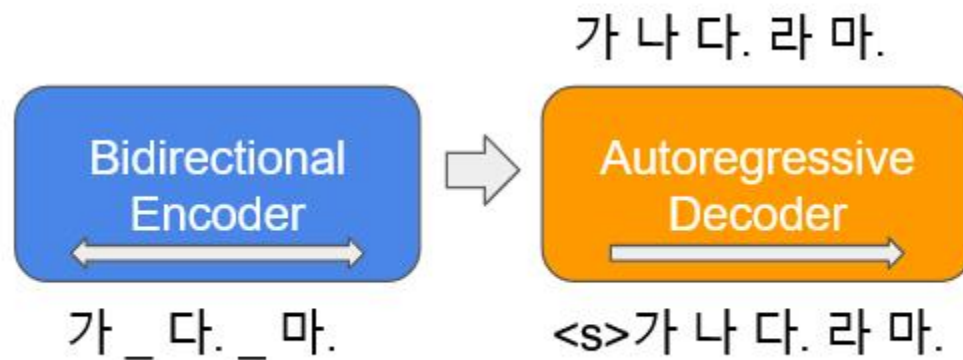
- 단순히 input 정보를 넘어서,  
background knowledge를 활용하는 모습을 보여줌
- "Source Document가 journal Science의 연구임"을 말함 (1st example)
  - "PG&E 가 California에 있다"고 말함 (5th example)

Source Document (abbreviated)	BART Summary
The researchers examined three types of coral in reefs off the coast of Fiji ... The researchers found when fish were plentiful, they would eat algae and seaweed off the corals, which appeared to leave them more resistant to the bacterium <i>Vibrio coralliilyticus</i> , a bacterium associated with bleaching. The researchers suggested the algae, like warming temperatures, might render the corals' chemical defenses less effective, and the fish were protecting the coral by removing the algae.	Fisheries off the coast of Fiji are protecting coral reefs from the effects of global warming, according to a study in the journal Science.
Sacoolas, who has immunity as a diplomat's wife, was involved in a traffic collision ... Prime Minister Johnson was questioned about the case while speaking to the press at a hospital in Watford. He said, "I hope that Anne Sacoolas will come back ... if we can't resolve it then of course I will be raising it myself personally with the White House."	Boris Johnson has said he will raise the issue of US diplomat Anne Sacoolas' diplomatic immunity with the White House.
According to Syrian state media, government forces began deploying into previously SDF controlled territory yesterday. ... On October 6, US President Donald Trump and Turkish President Recep Tayyip Erdoan spoke on the phone. Then both nations issued statements speaking of an imminent incursion into northeast Syria ... . On Wednesday, Turkey began a military offensive with airstrikes followed by a ground invasion.	Syrian government forces have entered territory held by the US-backed Syrian Democratic Forces (SDF) in response to Turkey's incursion into the region.
This is the first time anyone has been recorded to run a full marathon of 42.195 kilometers (approximately 26 miles) under this pursued landmark time. It was not, however, an officially sanctioned world record, as it was not an "open race" of the IAAF. His time was 1 hour 59 minutes 40.2 seconds. Kipchoge ran in Vienna, Austria. It was an event specifically designed to help Kipchoge break the two hour barrier.	Kenyan runner Eliud Kipchoge has run a marathon in less than two hours.
PG&E stated it scheduled the blackouts in response to forecasts for high winds amid dry conditions. The aim is to reduce the risk of wildfires. Nearly 800 thousand customers were scheduled to be affected by the shutoffs which were expected to last through at least midday tomorrow.	Power has been turned off to millions of customers in California as part of a power shutoff plan.

Table 7: Example summaries from the XSum-tuned BART model on WikiNews articles. For clarity, only relevant excerpts of the source are shown. Summaries combine information from across the article and prior knowledge.

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

KOBART Summarization Example 🗣️





# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## KOBART Summarization Example 🗣️

### 🔗 Examples

- KoBART ChitChatBot
- KoBART Summarization
- NSMC Classification
- KoBART Translation

*KoBART를 사용한 흥미로운 예제가 있다면 PR 주세요!*

<https://github.com/haven-jeon/KoBART-chatbot>  
<https://github.com/seujung/KoBART-summarization>  
<https://github.com/SKT-AI/KoBART/tree/main/examples>  
<https://github.com/seujung/KoBART-translation>

### Data

Data	# of Sentences
Korean Wiki	5M
Other corpus	0.27B

한국어 위키 백과 이외, 뉴스, 책, 모두의 말뭉치 v1.0(대화, 뉴스, ...), 청와대 국민청원 등의 다양한 데이터가 모델 학습에 사용되었습니다.

### Tokenizer

`tokenizers` 패키지의 `Character BPE tokenizer` 로 학습되었습니다.

`vocab` 사이즈는 30,000 이며 대화에 자주 쓰이는 아래와 같은 이모티콘, 이모지 등을 추가하여 해당 토큰의 인식 능력을 올렸습니다.

| 😊, 😐, 😞, 😄, 🙄, .., :-), :) , -), (-: ...

또한 `<unused0>` ~ `<unused99>` 등의 미사용 토큰을 정의해 필요한 `subtasks` 에 따라 자유롭게 정의해 사용할 수 있게 했습니다.

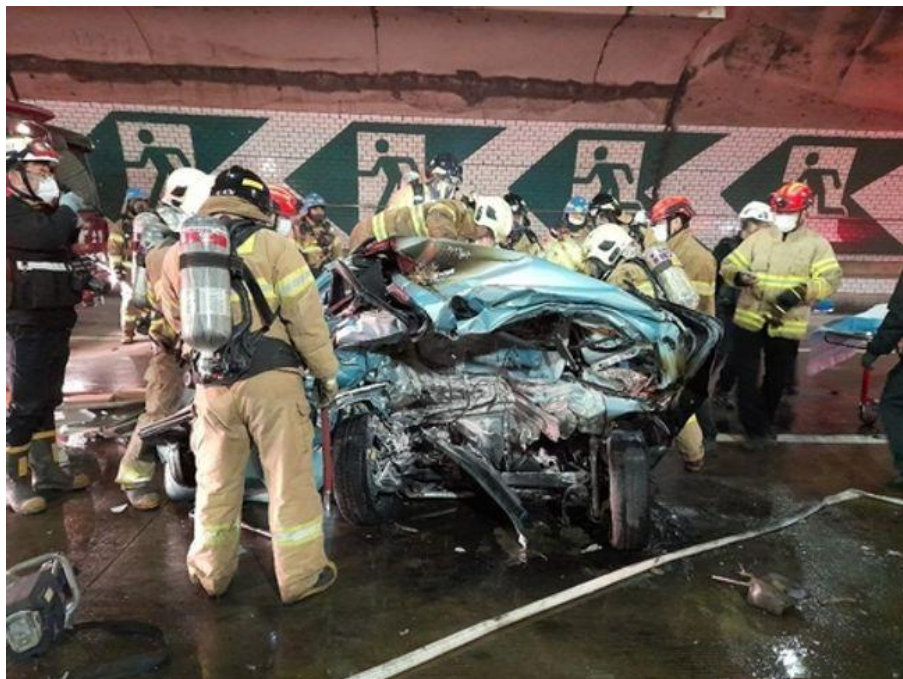
```
>>> from kobart import get_kobart_tokenizer
>>> kobart_tokenizer = get_kobart_tokenizer()
>>> kobart_tokenizer.tokenize("안녕하세요. 한국어 BART 입니다. 😊 :) 1^o")
['_안녕하', '세요.', '_한국어', '_B', 'A', 'R', 'T', '_입', '니다.', '😊', ':)', '1^o']
```

### Model

Model	# of params	Type	# of layers	# of heads	ffn_dim	hidden_dims
KoBART-base	124M	Encoder	6	16	3072	768
		Decoder	6	16	3072	768

# BART: Denoising Sequence-to-Sequence Pre-training for NLG, Translation, and Comprehension

## KOBART Summarization Example 🗞️



### 원문 뉴스

회식 후 만취 상태에서 벤츠 차량을 몰다 추돌사고를 내 앞차 운전자를 숨지게 한 40대 남성이 경찰에 붙잡혔다.

인천 중부경찰서는 17일 특정범죄가중처벌법상 위험운전치사(운창호법), 도로교통법상 음주운전 혐의 등을 적용해 A(44)씨를 붙잡아 조사하고 있다고 밝혔다.

A씨는 앞서가던 마티즈 차량을 들이받아 운전자 B(41)씨를 숨지게 한 혐의를 받고 있다.

A씨는 전날 오후 9시 10분쯤 인천시 중구 수도권 제2외곽순환고속도로 김포방향 북항터널 내 편도 3차로 가운데 2차로에서 차량을 몰던 중 마티즈 차량 후미를 들이받은 것으로 조사됐다.

마티즈 차량은 차선을 벗어났고 차량에 불이 났다. 이 사고로 운전자 B씨는 불붙은 차에서 미처 빠져 나오지 못하고 숨졌다. 불은 출동한 소방당국에 의해 19분만에 진화됐으나 마티즈 차량은 전소됐다.

당시 A씨의 혈중알코올농도는 면허취소 수치인 0.08% 이상으로 확인됐다.

A씨는 경찰 조사에서 "미추홀구에서 지인들과 회식을 했다"며 "사고 당시 기억이 잘 나지 않고 졸음 운전을 한 것 같다"고 진술했다.

경찰은 A씨에게 음주운전 중 사망사고를 내면 처벌을 강화하는 '운창호법'을 적용할 방침이다.

경찰 관계자는 "A씨를 상대로 운창호법을 적용해 구속영장을 신청할 방침이다"고 말했다.

### 요약된 뉴스

인천 중부경찰서는 회식 후 만취 상태에서 벤츠 차량을 몰다 추돌사고를 내 앞차 운전자를 숨지게 한 40대 남성을 특정범죄가중처벌법상 위험운전치사, 도로교통법상 음주운전 혐의 등을 적용해 조사하고 있다.

부스트캠프 AI Tech 2기

# Discussion

**boostcamp**<sup>ai tech</sup>



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Huggingface Hub: [huggingface.co/jinmang2](https://huggingface.co/jinmang2)

**진명훈\_T2216**