Eco-Friendly JEJU Travel Route Recommender System

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Carbon Footprint Calculator

Background

Limitation of Traditional Calculator



User has to enter an accurate number for the amount of electricity, gas of energy used.

However it is hard to measure the exact usage, which creates a barrier to use.

Redesigned Carbon Footprint Calculator



We implemented an

easy-to-use calculator

for travelers who want to know
their carbon emissions
during their trip

4 sections of travel

Transportation Accommodation
Food Tourism

Users can calculate their carbon footprint through approximate travel information instead of accurate energy usage.

(e.g., type of meal or accommodation)

Transportation

Carbon Footprint Calculator (1) Transportation

Data Used

[Shinhan Card] Rent car types booked for trips **t2) RENT.csv** Sep.-Nov. 2021 & Mar.-May. 2022

YR	RANK	MODEL	TYPE
2021	1	3세대 K 5	중형
2021	2	올뉴아반떼	중소형

40 rows x 4 columns

YR	Year
RANK	Ranking
MODEL	Vehicle Model
TYPE	Vehicle Type

t3) BSP.csv

Airline passenger sales settlement data for Sep.-Nov. 2021 & Mar.-May. 2022

LSP_RID	MCT_NM	DPF_AOT_CD_VL	ARV_AOT_CD_VL	CNT
20211103	주)대한항공	GMP	CJU	6
20210920	주)대한항공	GMP	CJU	6
			13856 rows × 8 cc	lumns

LSP_RID	Sales Slip Reception Date
MCT_NM	Franchise Name
	•••
DPF_AOT_CD_VL	Departure Airport Code val
ARV_AOT_CD_VL	Arrival Airport Code val
CNT	Sales

c2) TRANS_CO2.csv

Carbon Emissions by types of transportation

LG_CAT	MD_CAT	SM_CAT	FUEL_TYPE	FUEL_COST	SCALE	FACTOR
대중교통	버스	시내버스	CNG	NaN	kgCO2/km	0.030306
대중교통	버스	시내버스	경유	NaN	kgCO2/km	0.034620

4730 rows × 7 columns

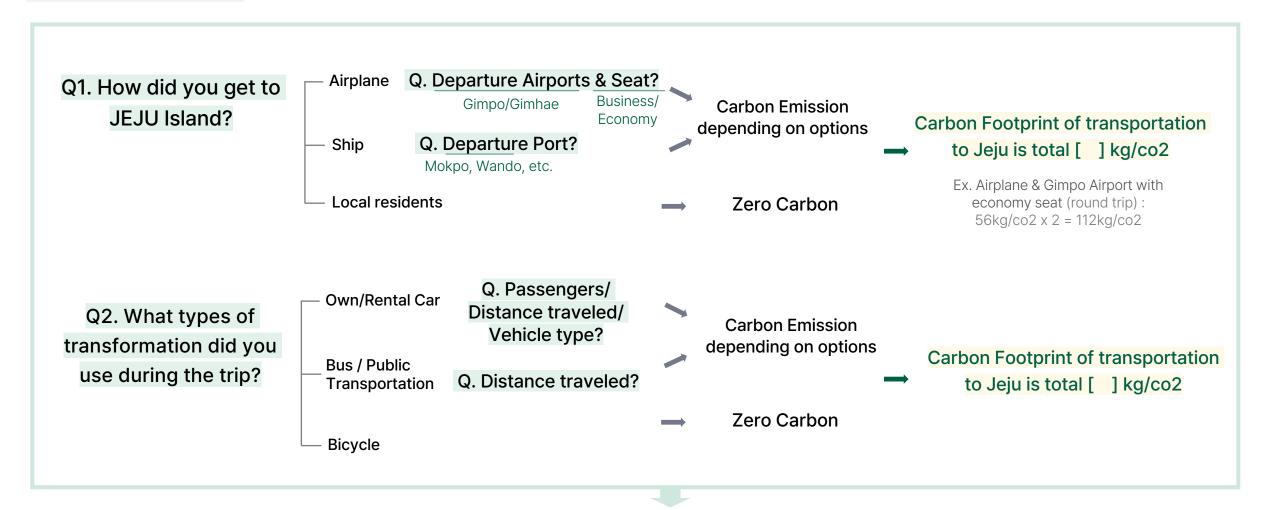
LG_CAT	Large Category
MD_CAT	Medium Category - Brand
SM_CAT	Small Category - Model
FUEL_TYPE	Fuel Type
FUEL_COST	Fuel Cost
SCALE	Scale
FACTOR	Carbon Emission Factor

Google Flight



Used to estimate carbon emissions By departure airport and seats

Calculation Logic



2 Accommodation

Carbon Footprint Calculator (2) Accommodation

Data Used

t5) JT_MT_ACCTO_TRRSRT_SCCNT_LIST.csv

Tourism Demand Prediction Data based on views of VISIT JEJU website

DEC_VIEWS_CO	BASE_YEAR	ADDR	AREA_NM	CL_NM	CL_CD
NaN	2021	제주특별자치도 서귀포시 안덕면 신화역사로 304번길 38	메리어트관 제주신화월드 호텔앤리조트	숙박	c3
NaN	2021	제주특별자치도 서귀포시 성산읍 성산등용로 14	1915 지오하우스	숙박	c3
22 220 rows x 8 columns					

CL_CD	Classification Code
CL_NM	Classification Name
AREA_NM	Area Name
ADDR	Address
BASE_YEAR	Base Year
ALL_TOTAL_CO	Total Views of year
JAN_VIEWS_CO	Views of January
	•••
DEC_VIEWS_CO	Views of December

c3) TB_ECO_BUILDING_GHG_GIS_JEJU_1920.csv

Geolocation Data by city and district: GHG emissions for Buildings In Jeju

LTNO_ADDR	ROAD_NM_ADDR		ELCTY_USQNT	CITY_GAS_USQNT	SUM_NRG_USQNT		SUM_GRGS_DSAMT
제주특별자치 도 제주시 이 도이동 1987- 1번지		• • •	18492	19731	38223	• • •	12.159453

329365 rows × 19 columns

LTNO_ADDR	Region Name Address
ROAD_NM_ADDR	Road Name Address
ELCTY_USQNT	Electricity Usage Quantity
CITY_GAS_USQNT	City Gas Usage Quantity
SUM_NRG_USQNT	Sum of Energy Usage Quantity
SUM_GRGS_DSAMT	Sum of Gas Emission

Data Processing

if the user's accommodation information exists in DB

(1) Actual carbon emission of accommodations

분류명	지역명	주소		도로명주소		합계온실가스배출량
CL_NM	AREA_NM	ADDR		ROAD_NM_ADDR		SUM_GRGS_DSAMT
숙박	메리어트관 제주신화월드 호텔앤리조트	제주특별자치도 서귀포시 안덕면 신화역사로 304번길 38	Merge — by — address	제주특별자치도 제	• • •	12.159453
숙박	1915 지오하우스	제주특별자치도 서귀포시 성산읍 성산등용로 14	auuless	주시 구남동1길 2		12.103400

[c3 Data] ['CL_NM' t5 Data == 숙박]

. . .

if the user's accommodation information doesn't exist in DB

(2) Calculated carbon emission of accommodation type

<u>호텔</u>		레이크힐스 제주 리조트	5 727280
리조트		-11-12-17-17-1	0.727200
· ·	Classified	마린포트리조트	4.364010
모텔			
펜션	accommodations to 6 types	벙커호텔앤리조트	2.113933
HIDI		비스타리조트	3.740727
<u></u> 빌라		미드디디포트	0.740727
게스트하우스			

Calculated carbon emission for types of accommodations based on the average of the actual value

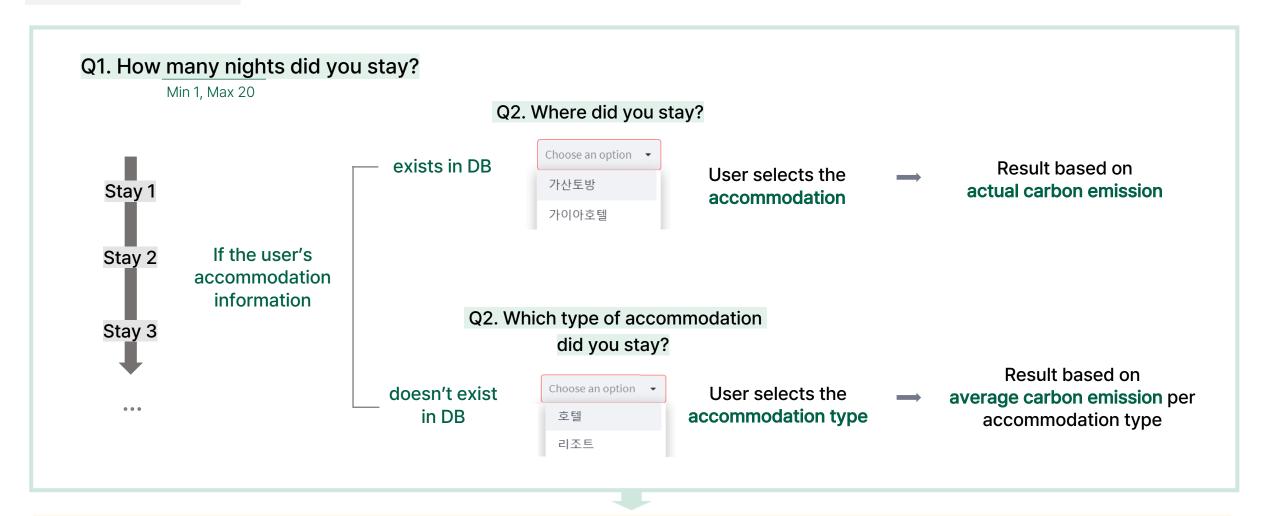
숙박업종 co2 6.788652 호텔컬리넌제주 15.894569 화인호텔 16.206313 호텔더블유 탑동점 10.458882

Carbon Footprint Per accommodation

	숙박업종	co2
0	호텔	32.859921
1	리조트	9.524720
2	모텔	4.325946
3	펜션	2.901318
4	캠핑&글램핑	1.507504
5	게스트하우스	2.077207

Carbon Footprint Per type of accommodation

Calculation Logic



Food

Data Used

t1) JEJU_MERCHANT.csv

Top franchise store data based on sales in Jeju Sep.-Nov. 2021 & Mar.-May. 2022

	YR	MCT_NM	MCT_BRN	LG_CAT	LG_CAT_NM	MD_CAT	MD_CAT_NM	MCT_BSE_AR	MNTH_SALES_PCTL	DAW_CCD	APV_TMT_CD
0 2	2021	젠	2110164178	1	요식/유흥	2	일식/중식/양식	제주 서귀포시 안 덕면 사계남로 186-8	3_25%~50%	1	4_09_12
1 2	2021	젠	2110164178	1	요식/유흥	2	일식/중식/양식	제주 서귀포시 안 덕면 사계남로 186-8	3_25%~50%	2	6_15_18
										316,1/4rov	vs x 14 columns

YR	Base Year
MCT_NM	Franchise Name
	-
LG_CAT	Large Category
LG_CAT_NM	Large Category Name
MD_CAT	Medium Category
MD_CAT_NM	Medium Category Name
	-
UE_CT	Num. of Authorization

Carbon Calculator for food

Additional data for carbon emissions by food

c1) FOOD_ITEM.csv

Carbon footprint data by grocery category

	item	CO2
0	1.1.1.1 Rice	0.073
1	1.1.1.2 Bread	0.073

Item	식료품명
CO2	탄소배출량

313 rows × 2 columns

NAVER Map Grocery store Menu Crawling Data 🖳



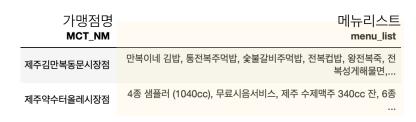
	MCT_NM	naver_map_url	menu_list
328	제주김만복동문시장점	https://m.place.naver.com/restaurant/37609800/	만복이네 김밥, 통전복주먹밥, 숯불갈비주먹밥, 전복컵밥, 왕전복죽, 전 복성게해물면,
329	제주약수터올레시장점	https://m.place.naver.com/restaurant/177724476	4종 샘플러 (1040cc), 무료시음서비스, 제주 수제맥주 340cc 잔, 6종

Crawling the menu of grocery store in t1 Data

Data Processing

if the user's restaurant information exists in DB

(1) Carbon Emission of Restaurant



[c3 Data]

if the user's restaurant information doesn't exist in DB

Classified

restaurant to 15 types

(2) Carbon Emission of Restaurant Type



After querying [Jeju Restaurant] In Naver Map

Calculated carbon footprint by the average of the menu of the restaurant

Ex. Western Restaurant

Chicken: 0.5 kgCO2 / Pizza : 0.3 kgCO2 → Average : (0.5+0.3)/2=0.4
 MCT_NM
 carbon_avg

 젠
 3.80

 가치
 1.14

Carbon Footprint of the restaurant (per capita)

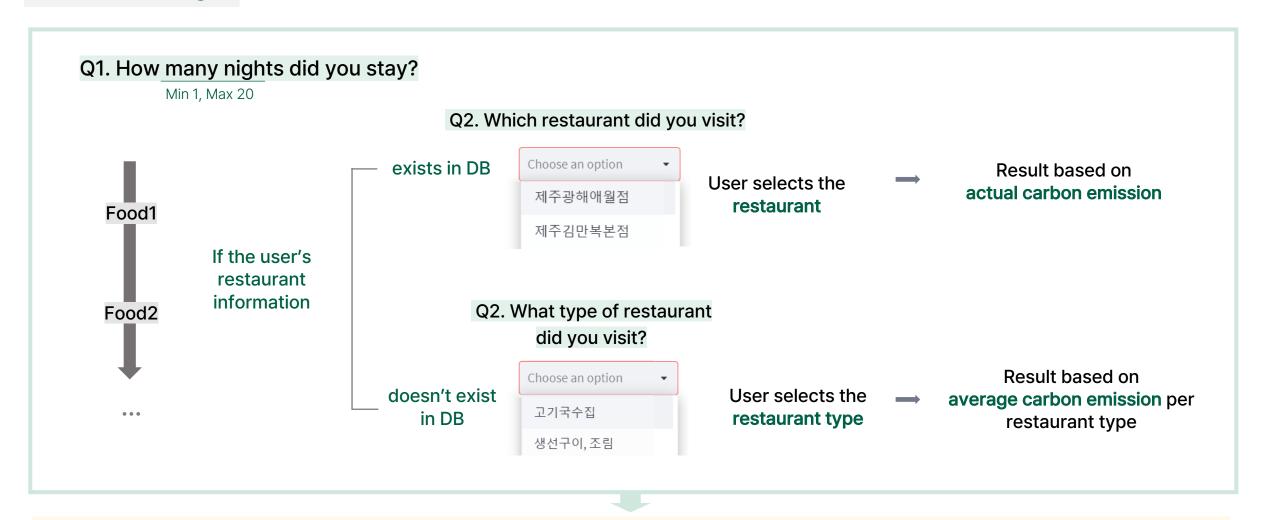
Calculated carbon footprint for types of restaurant based on the average of the actual restaurant value

Ex. Meat Noodles Restaurant Average carbon emissions : ~~



Carbon Footprint
of the type of restaurant
(per capita)

Calculation Logic



4 Tourism

Carbon Footprint Calculator (4) Tourism

Data Used

t4) JT_TRRSRT_ENTRN_LIST.csv

	L_NM	TRRSRT_NM	ADDR	TEL_NO	TOT_ENTRN_NMPR_CO	SETLE_PRICE	ENTRN_DE
0	기타	봄그리고가을리조트	제주 서귀포시 성산읍 해맞이해안로 2660 시흥근생 및주택	647842211.0	2	18000	20220301

c3) TB_ECO_BUILDING_GHG_GIS_JEJU_1920.csv

LTNO_ADDR ROAD_NM_ADDR	ELCTY_USQNT CITY_G	AS_USQNT SUM_NRG	_USQNT	SUM_GR	GS_DSAMT
제주특별자치 도 제주시 이 제주특별자치도 제 •••• 도이동 1987- 주시 구남동1길 2 1번지	18492	19731	38223	• • •	12.159453

VISIT JEJU Crawled Data for Tourism 💿



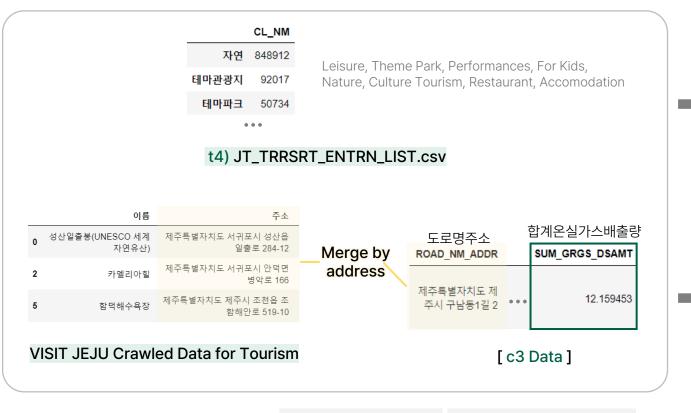
	이름	주소	태그	주요목적	주요목적기타
O	성산일출봉(UNESCO 세계 자연유산)	제주특별자치도 서귀포시 성산읍 일출로 284-12	#일출 #오름 #경관/포토\n#부모 #자연경관 #포토스팟 #유네스코	등산	산책로, 올레코 스, 오름
2	카멜리아힐	제주특별자치도 서귀포시 안덕면 병악로 166	#경관/포토 #커플 #아이\n#맑음 #겨울 #힐링 #자연경 관 #포토스팟 #어린이 #	공연/전시,포 토스팟	NaN
5	함덕해수욕장	제주특별자치도 제주시 조천읍 조 함해안로 519-10	#해수욕장 #액티비티 #아이\n#맑음 #여름 #자연경관 #체험 #레저/체험 #해변	NaN	NaN

CL_NM	Classification Name
TRRSRT_NM	Tourism Destination Name
ADDR	Address
TEL_NO	Telephone Number
TOT_ENTRN_NMPR_CO	Total number of people entering
SETLE_PRICE	Payment Amount
ENTRN_DE	Entering Date

LTNO_ADDR	Land Number Address
ROAD_NM_ADDR	Road Name Address
	-
ELCTY_USQNT	Usage Quantity of Electricity
CITY_GAS_USQNT	Usage Quantity of City Gas
SUM_NRG_USQNT	Sum of Energy Consumptions
	-
SUM_GRGS_DSAMT	Sum of GHG Emissions

Data Processing

Carbon emission of Tourist Destination



	Ig_cat	TOT_ENTRN_NMPR_CO
0	공연/전시	3203.421053
1	레저/체험	1155.758621
2	자연	177718.666667
3	테마파크/테마관광지	9140.738095

In and TOT ENTEN NIMED CO

(1) Average number of visitors of each category

	lg_cat	co2
0	공연/전시	158.372926
1	레저/체험	122.924570
2	자연	168.860904
3	테마파크/테마관광지	227.015613

(2) Average carbon emission of each category

Divide (2) into (1)

lg_cat	final_carbon
공연/전시	0.049439
레저/체험	0.106358
자연	0.000950
테마파크/테마관광지	0.024836

Carbon footprint of each category (per capita)

Classified **Tourist Destination to 4 types** Leisure / Experience

Theme park / Attraction

Nature

Performance / Exhibition

Calculation Logic

Q1. Which tourist destination did you visit in Jeju Island?

- 1. Nature
- a. Mountain b. Ocean

Ex. 후포해변 Ex. 성산일출봉

- 2. Theme Park / Attraction
- a. cultural heritage

Ex. 제주고산리유적

b. other

Ex. 윈트1947 카트 테마파크

- 3. Performance / Exhibition
- a. Yes

b. No

Ex. 이중섭미술관

4. Leisure / Experience

Golf, workshop, drive, horseback riding, cruise ship/submarine, observatory, experience farm, camping, marine leisure, healthcare

Carbon Footprint of that activity in Jeju Island is total [] kg/co2

Carbon Footprint Calculator

Carbon Footprint Calculator (1) Implementation

Implementation

Implementation

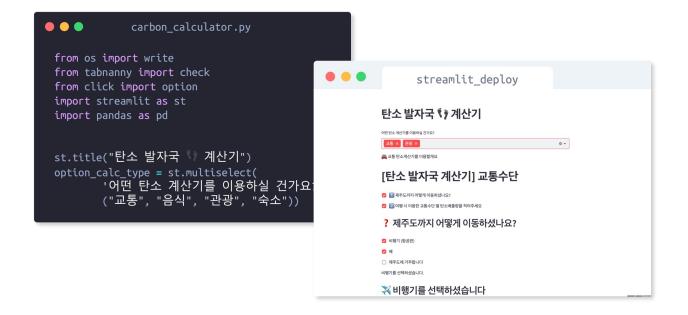
Carbon calculator based on calculation Logic

Traffic / Food / Accomodation / Toursim

Deployment

Carbon Footprint Calculator

Interactive, easy-to-use calculator





66

Persona



I will take an economy class from flight Gimpo Airport.

I with travel with my friend who lives in Jeju Island by her car!

탄소 발자국 👣 계산기

어떤 탄소 계산기를 이용하실 건가요?







Tips for reducing carbon emissions!

- EV can save carbon!
- You can also save carbon by riding bicycles!

💢 비행기를 선택하셨습니다

출발했던 공항을 선택해주세요

다른 공항을 탑승하셨다면, 김포공항(GMP)와 김해공항(PUS) 중 더 가까운 공항을 선택해주세요

김포공항(GMP)

어떤 좌석에 앉으셨나요?

비즈니스, 이코노미 중에 선택해주세요

이코노미 (Economy)

11 총 탄소 배출량은 112kgCO2입니다

? 여행 시 이용한 교통수단 별 탄 소배출량을 적어주세요



Persona



66 I will stay in OO Hotel for two days!

탄소 발자국 👣 계산기

어떤 탄소 계산기를 이용하실 건가요?







Tips for reducing carbon emissions!

Hotels release a lot more carbon than other accommodations. If you want to help Earth, consider other types!

때머무시는 숙소의 이름과 숙박일 수를 알려주세요

어디 숙소에 묵으셨나요?

그랜드 조선 제주 × ⊗ -

얼마나 그랜드 조선 제주에 머무르셨나요?

그랜드 조선 제주에 머무르며 발생된 탄소 배출량은 28.2kgCO2입니다

숙소의 총 탄소 배출량 합계는 28.2kgCO2입니다

머무시는 숙소의 형태와 숙박일수 를 알려주세요

⊗ •

숙소의 형태가 어떠셨나요

호텔 X

얼마나 호텔에 머무르셨나요?

호텔에 머무르며 발생된 탄소 배출량은 30.49kgCO2입 니다

총 탄소 배출량 합계는 30.49kgCO2입니다



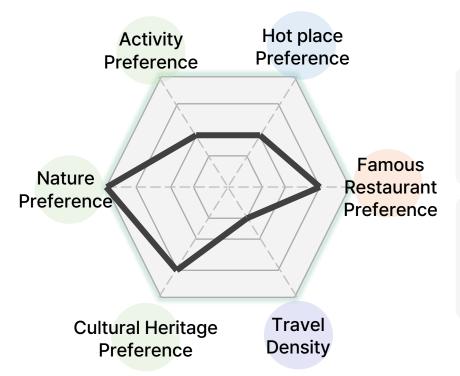
User Dataset

User Index

Attractiveness of travel route is also important as well as

minimizing carbon emissions

for personalized travel route recommendations



User can rate from 1 to 10 for each index

Preference for activity / nature / cultural heritage

Used to recommend **Tourist Destination**

→ Traveling spots that belongs to the category with higher score are included in the final route.

Famous Restaurant Preference

Used to recommend restaurant

→ The higher the score, the more famous restaurant is recommended.

Hot Place Preference

Reflects popularity of the Tourist Destination

→ The higher the score, the more famous place is recommended.

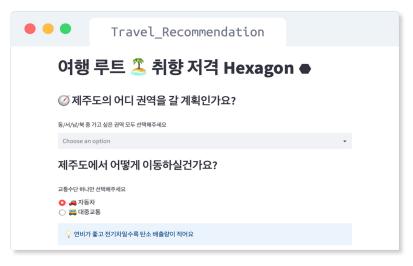
Travel Density

Used to choose the **number of Tourist Destination**

→ The higher the score, the more traveling spots are included in the final route.

STEP 1

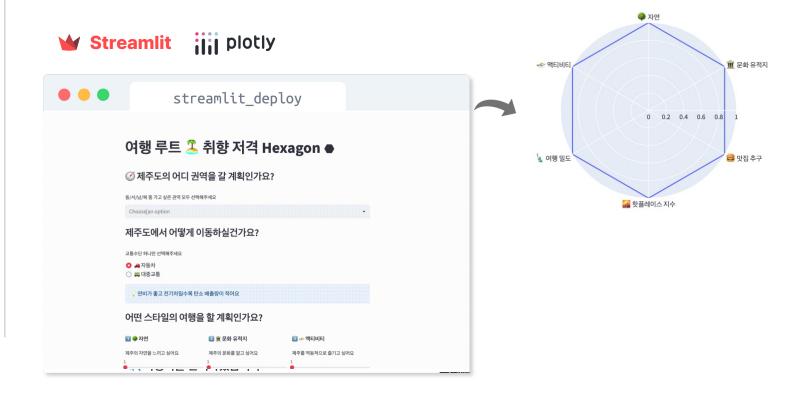
- Q. Which part of Jeju do you want to travel? User can choose N/S/E/W area in JEJU.
- Q. What transportation will you use?User can choose between private/public transportation.



STEP 2

Q. Which travel do you prefer?

User will rate each index based on his/her preference.



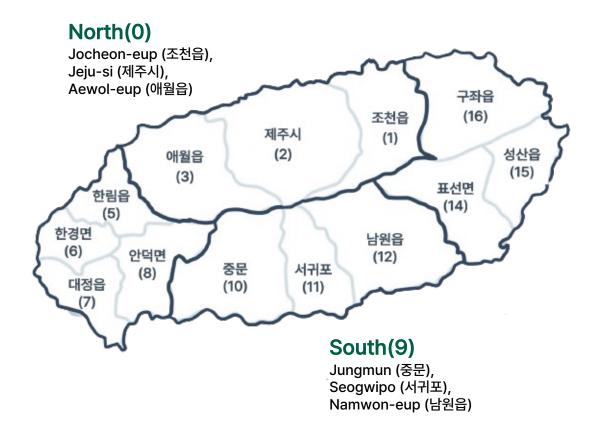
Region Labeling

- Divided Jeju in East, West, South, and North
- Subdivided regional divisions in counter-clockwise direction

[Reference] "2025 Jeju Island Development Blueprint", Province of Jeju, 2016

West(4)

Hanlim-eup (한림읍), Hangyeong-myeon (한경면), Daejeong-eup (대정읍), Andeok-myeon (안덕면)



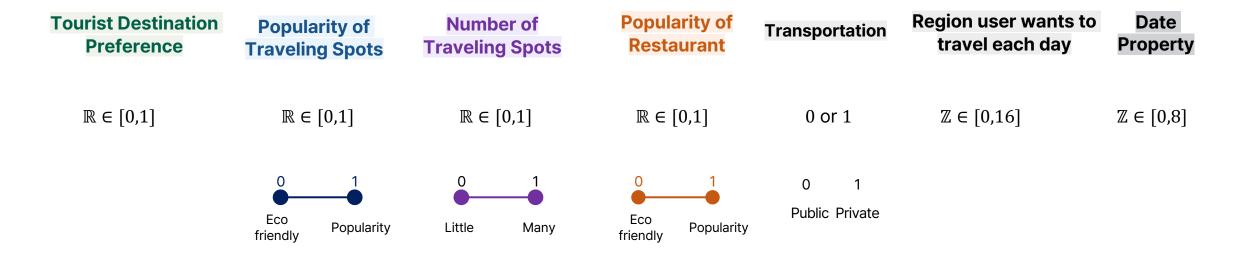
East(13)

Pyoseon-myeon (표선면), Seongsan-eup (성산읍), Gujwa-eup (구좌읍)

ECO JEJU TOUR User Dataset 4 Final Data

User Dataset

	Nature Preference	Activity Preference	Cultural Heritage Preference	Hot Place Preference	Travel Density	Famous Restaurant Preference	Transportation	Day1	Day2	Day3	Day4	Day
0	0.329639	0.778846	0.290843	0.205825	0.345948	0.26456	0	1	2	6	7	7

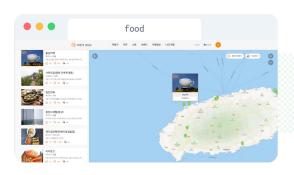


Tourism Dataset

ECO JEJU TOUR Tourism Dataset 1 Food Data

Data Collection

List of restaurant in tourist destination



Basic info., interest level, usage guide, detailed info.

	이름	지역
0	봄날카페	제주시 > 애윌
1	서연의집(영화 건축학개론)	서귀포시 > 남원
2	명진전복	제주시 > 구좌
3	몽상드애뒬(몽상)	제주시 > 애윌
4	제주김만복(만복이네김밥집)	제주시 > 제주시내

		기타상세	상세텍스트
	0	NaN	상세정보\n확장됨\n\n드라마의 주인공이 일하던 카페라서 유명해졌다.\n해변을 바라
	1	NaN	상세정보\n확장됨\n\n위미 포구 근처 가정을 영화 때문에 리모델링한 세트장이었지만
•	2	NaN	상세정보\n확장됨\n\n수요미식회 TV프로그램을 통해 소개된 적이 있는 명진전복은
	3	NaN	상세정보\n확장됨\n\n애륄에 위치한 봄날카페와 인접하여 많은 관광객들이 찾으며,
	4	NaN	상세정보\n확장됨\n\n제주공항과 가까운 전복김밥이 유명한 분식집이다. 본점은 포장

Preprocessing

Classified restaurant types based on tags and calculated carbon emission of each restaurant

Name	Tag
봄날카페	#카페 #커피 #음료 #Food #콜드브루 #아메리카노 ···
가시아방	#고기국수 #비빔국수 #향토Food #Food
메종드쁘띠푸루	#빵집 #베이커리 #Food #빵 #감바스 #파스타 ···

Tag Dict. for Restaurant Type Classification

유형	태그
카페	밀크티, 주스, 아메리카노 , 케이크, ···
고기국수	고기국수 , 고기 국수
이탈리안	파스타, 리조또, 피자, 스테이크, …

(1) if the restaurant belongs to more than one type Calculated the average carbon footprint for each type

(2) If it is difficult to classify as a specific type Replaced it with the average value of all restaurant types

restaurant types classification

	유영
	카페
	고기국수
	카페, 이탈리안
•	

Carbon footprint of restaurant type

8	유형	CO2
8	카페	0.35
	고기국수	2.00
8	이탈리안	3.20
8		

Calculate

C	Carbon Emissions
	CO2
	0.35
	2.00
	1.775

Data Collection

List of accommodations in tourist destination from VISIT JEJU



Basic info., interest level, usage guide, detailed info.

	이름	지역
0	나미송 머무는 곳	제주시 > 애윌
1	해비치호텔앤드리조트	서귀포시 > 표선
2	신라호텔제주	서귀포시 > 중문•
3	롯데호텔 제주	서귀포시 > 중문
4	제주조천스위스마을게스트하우스	제주시 > 조천

	기타상세	상세텍스트
0	NaN	상세정보\n확장됨\n\n애뒬읍 시인의 마을에 위치한 나미송 머무는 곳 민박은 요즘
1	NaN	상세정보\n확장됨\n\n해가 처음 비추는 곳이라는 뜻의 해비치 호텔&리조트는 에메랄
2	NaN	상세정보\n확장됨\n\n중문관광단지에 위치한 제주 신라호텔은 90년 개관 이후 이국
3	NaN	상세정보\n확장됨\n\n푸른 제주바다와 하늘이 맞닿은 곳에 위치한 롯데호텔 제주는
4	NaN	상세정보\n확장됨\n\n조천읍 와산리에 위치한 제주조천스위스마물은 총 4개 단지,

Preprocessing

Classified accommodation types

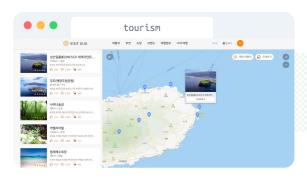
Accommodation	Туре
해비치호텔앤드리조트	호텔
제주조천스위스마을게스트하우스	NaN
호텔더블유합동점	NaN
제주푸른산푸른바다	펜션
	•••

Classified types based on name Else classified through direct search

_		
	Accommodation	Туре
	해비치호텔앤드리조트	호텔
	제주조천스위스마을게스트하우스	게스트하우스
	호텔더블유합동점	호텔
-	제주푸른산푸른바다	펜션
-		

Data Collection

List of tourist destinations from VISIT JEJU



Basic info., interest level, usage guide, detailed info., nearby accommodation

	이름	지역	
0	성산일출봉(UNESCO 세계자연유산)	서귀포시 > 성산	
1	우도(해양도립공원)	섬 속의 섬 > 우도	
2	사려니숲길	제주시 > 조천	• •
3	카멜리아힐	서귀포시 > 안덕	
4	협재해수욕장	제주시 > 한림	

	주변숙박개수	주변숙박
	28.0	['아름다운리조트', '플레이스 캠프 제주', '골든튤립 제주 성산호텔', '봄그리
	20.0	['우도피아', '소섬바당', '우도사랑', '우도쉼팡게스트하우스', '뽀요요펜션'
	0.0	0
	7.0	['디아넥스 호텔', '중문훼미리리조트', '서귀포호텔 카라반', '레이크힐스 제주
	35.0	['inn jeju 인제주 게스트하우스', '객의하우스', '블루하와이리조트', '

Preprocessing

(1) Data Used

c3) TB_ECO_BUILDING_GHG_GIS_JEJU_1920.csv

Greenhouse Gas Emissions from Jeju Buildings: Location Information Combination Data by City, County and District

LTNO_ADDR	ROAD_NM_ADDR		ELCTY_USQNT	CITY_GAS_USQNT	SUM_NRG_USQNT		SUM_GRGS_DSAMT
제주특별자치 도 제주시 이 도이동 1987- 1번지	제주특별자치도 제 주시 구남동1길 2	• • •	18492	19731	38223	• • •	12.159453

LTNO_ADDR	Region Name Address				
ROAD_NM_ADDR	Road Name Address				
ELCTY_USQNT	Electricity Usage Quantity				
CITY_GAS_USQNT	City Gas Usage Quantity				
SUM_NRG_USQNT	Sum of Energy Usage Quantity				
SUM_GRGS_DSAMT	Sum of Gas Emission				

Preprocessing

- (2) Outlier Detection
- ① Too low carbon emission for Cruise ships and Submarines

	AREA_NM	주소	태그	주요목 적	주요목적 기타	co2	lg_cat	md_cat	
107	서귀포잠수함(대국해 저관광)	제주특별자치도 서귀포시 남성중 로 40	#액티비티 #커플 #아이\n#우수관광사업체 #체험 #레저/체험 #어린이 #수상레저	NaN	NaN	1.525711	레저/체 험	유람선&잠 수함	
389	그린크루즈(산방산유 람선)	제주특별자치도 서귀포시 안덕면 화순해안로106번길 16	#경관/포토 #부모 #맑음\n#봄 #포토스팟	NaN	NaN	3.913918	레저/체 험	유람선&잠 수함	

Carbon mission from ticket offices, not from cruise ships and submarines

	AREA_NM	주소	태그	주요목 적	주요목적 기타	co2	lg_cat	md_cat
1	07 서귀포잠수함(대국해 저관광)	제주특별자치도 서귀포시 남성중 로 40	#액티비티 #커플 #아이\n#우수관광사업체 #체험 #레저/체험 #어린이 #수상레저	NaN	NaN	179.495797	레저/체 험	유람선&잠 수함
1	95 우도잠수함(제주씨월 드)	제주특별자치도 서귀포시 성산읍 성산등용로 130-21	#액티비티 #부모 #아이\n#체험 #레저/체험 #어린 이 #수상레저 #어트랙션	NaN	NaN	179.495797	레저/체 험	유람선&잠 수함

Adjusted value to (carbon emission of ships per km) + (ticket offices)

② Too high carbon emission for landscape

	AREA_NM	주소	태그	주요목적	주요목적기타	co2	g_cat	md_cat	
128	신양섭지해수욕장	제주특별자치도 서귀포시 성 산읍 섭지코지로 107	#해수욕장 #액티비티 #커플\n#맑음 #여름 #자연경관 #체험 #레저/체험 #해변	NaN	NaN	224.019160	자연	바다	
8	섭지코지	제주특별자치도 서귀포시 성 산읍 섭지코지로 107	#일출 #해변 #경관/포토\n#커플 #맑음 #가을 #자연경관 #포토스팟 #봄꽃 #유 채꽃	등산,기타	산책로	224.019160	자연	바다	

Total sum of the carbon emission of all buildings that belong to the area



Removed outliers through IQR and replaced with average values of traveling spot categories

Preprocessing

(3) Carbon emission calculation of each category

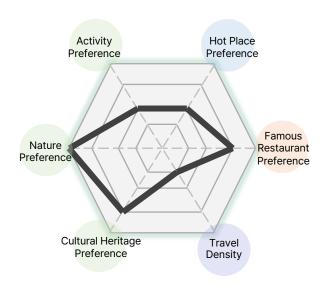
Average carbon emission of each tourist destination category

	lg_cat	md_cat	co2
0	레저/체험	골프	62.642068
1	레저/체험	공방	1.962184
2	레저/체험	드라이브	0.572844
3	레저/체험	승마	6.519183
4	레저/체험	유람선&잠수함	179.495797
5	레저/체험	전망대	22.357629
6	레저/체험	체험농장	5.018057
7	레저/체험	캠핑	0.652027
8	레저/체험	해양레저	3.474841
9	레저/체험	헬스케어	28.627041
10	자연	바다	1.639161
11	자연	산	4.831689

Calculated carbon emission of each tourist destination

	AREA_NM	주소	태그	주요목 적	주요목적 기타	co2	lg_cat	md_cat
1	사려니숲길	제주특별자치도 제주시 조천읍 교 래리 산 137-1	#숲길 #걷기/등산 #친구\n#커플 #흐림 #봄 #자연경관 # 도보여행 #도보 #숲 #단풍	NaN	NaN	4.831689	자연	산

Tourist Destination Index



To reflect preference of the user, we calculated Activity, Nature, and Cultural Heritage Score of each traveling spot.



Text Preprocessing

Used explanations of each tourist destination to rate scores

Word Embedding

Transformed words and sentences into numerical vectors

Clustering

Calculated scores based on clustering result

Cultural **Nature Activity** Heritage

자연 액티비티 문화유적 성산일출봉(UNESCO 세계자연유산) 0.771565 0.682662 0.948563

ECO JEJU TOUR Tourism Dataset 3 Tourism Data

Tourist Destination Index

(1) Text Preprocessing Used explanations of each tourist destination to rate scores



상세정보\n확장됨\n\n현재 성산일출봉은 새로운 일상을 위하여 사회적 거리두기 의무화 조치가 해제되었습니다. 이에, 사적모임 인원수 제한 등이 해제되었으나, 각 Tourism지마다 적용하고 있는 기준이 다를 수 있으니,

방문 전에는 전화 등을 통해 이용 방법을 미리 확인해주시기 바랍니다. …

Text Cleansing

- Removed Spaces
- Removed Repetitive Expressions Ex. 상세정보 확장됨

Removing Stopwords

- Used Business Stopwords Dictionary
- Removed terms such as suffixes, conjunctions, etc.

Tokenization

Extract nouns and adjectives after POS tagging



Result

Noun

['현재', '성산일출봉', '일상', '위', '사회', '거리', '두기', '의무', '조치', '해제', '이', ...]

Adjective

['새로운', '다를', '있으니', '유효하오니', '있', '뜨거운', '차가운', '완벽하게', '오목한', ...]

Tourist Destination Index

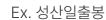
(2) Word Embedding

Transformed words and sentences into **numerical vectors** for text data analysis





Popular algorithm for generating word embedding





현재

성산일출봉 일상

Word2Vec



Word Vector

150 dimensional vector

[0.42 1.55 -1.26 0.08 -0.18 -0.15 ...] [-0.56 0.20 0.09 -0.80 0.64 -0.30 -0.49 ...] [0.73 -0.08 0.29 0.46 0.09 -0.37 0.33 ...]





Sentence Vector

Average of word vectors that constructs the sentence

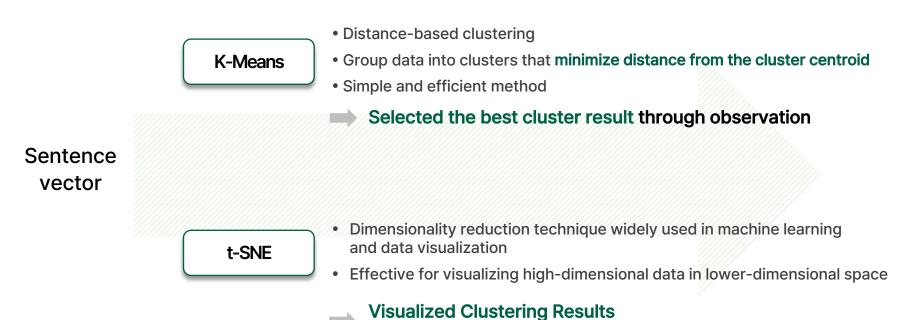
[1.59 1.27 0.078 0.096 -0.13 0.16 ...]



이름	문장벡터
성산일출봉(UNESCO 세계자연유산)	[1.59384653e-01 1.27016619e-01 7.80506432e
사려니숲길	1.74861196e-02 -3.92737612e-02 -4.39658324e
카멜리아힐	[0.15226805 0.17677808 0.22964895 0.205246
협재해수욕장	[0.00995103 0.00769248 0.07662856 0.134402
월정리해변	[0.10971704 0.2394778 0.10183809 0.164624

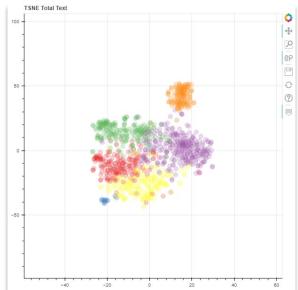
Tourist Destination Index

(3) Clustering Unsupervised learning to group data points based on their inherent similarities or patterns



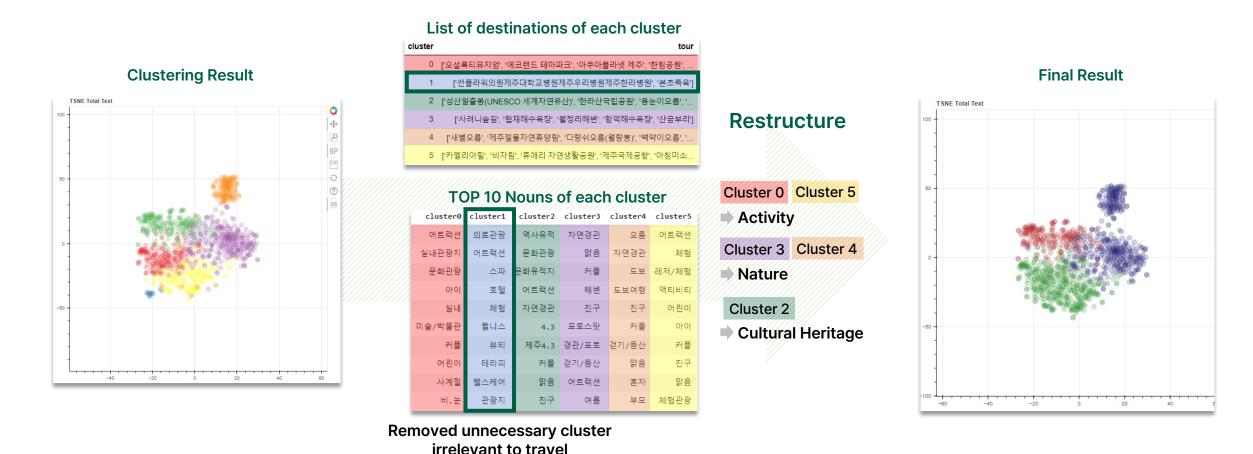
by reducing 150 dimensional sentence vectors to 2 dimension

Clustering Result



Tourist Destination Index

(3) Clustering Unsupervised learning to group data points based on their inherent similarities or patterns



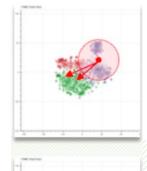
ECO JEJU TOUR Tourism Dataset 3 Tourism Data

Tourist Destination Index

(4) Scoring



Cluster 3 Cluster 4



Rated scores based on distance from cluster centroid to each data point

Scaling

이름	nature	activity	history	nature_scaled	activity_scaled	history_scaled	nature_score	activity_score	history_score
성산일출봉(UNESCO 세계자연유산)	0.250492	0.295974	0.849157	0.100429	0.132540	0.466720	0.809227	0.752487	0.284387
사려니숲길	0.297651	0.292119	0.875527	0.133274	0.130072	0.482981	0.751213	0.756774	0.267308
카멜리아힐	0.167756	0.222251	1.080659	0.042807	0.085355	0.609478	0.916218	0.836576	0.152507
새별오름	0.607294	0.692936	0.336697	0.348929	0.386609	0.150706	0.423893	0.376249	0.721300
섭지코지	0.287539	0.168912	0.997374	0.126232	0.051216	0.558120	0.763471	0.900192	0.195258

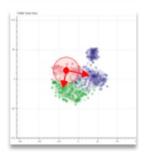
Final Score Calculation

 $(1 - distance(scaled))^2$

Cluster 2

Nature

Cultural Heritage



Final score of each cluster

Cultural Heritage Activity Nature

	nature_score	activity_score	history_score	
category_new				
문화유적지	0.376759	0.355032	0.670845	
액티비티	0.284036	0.533730	0.351672	
자연	0.625013	0.351415	0.437761	

ECO JEJU TOUR Tourism Dataset 3 Final Data

Tourism Dataset

		Nature Score	Activity Score	Cultural Score	Hot Place Score	CO2	Regi num		Nearby traveling spots	Nearby restaurant	Nearby accommodations
(성산일출봉) (UNESCO 세계자 연유산)		0.682662	0.948563	0.692564	7.606409	15	13	['성산일출봉(UNESCO 세계 자연유산)', '광치기해변', '우 도잠수함(제주씨월드	['맛나식당', '성산회관', '경 미네집(경미휴게소)', '바다의 집', '그리운바다	['아름다운리조트', '플레이스 캠프 제주', '골든튤립 제주 성 산호텔', '봄그리
1	l 사려니숲길	0.376859	0.325865	0.345421	0.693147	4.831689	1	0	['사려니숲길', '제주돌문화공 원', '노루생태관찰원', '샤이니 숲길', '물찻오름	0	0

Tourist Destination Scores	Popularity of the Destination	Carbon Emission	Region Nu of each Des		Nearby Information
$\mathbb{R} \in [0,1]$	$\mathbb{R} \in [0,1]$	\mathbb{R}	$\mathbb{Z} \in [1,3], [5,8],$ $[10,12], [14,16]$	N(0)/W(4) S(9)/E(13)	
	Website views (Log scaled)				

Travel Route Recommender System

Personalized Recommendation

Tourist Destinations

Popularity

Based on user's Nature, Activity, Cultural **Heritage Preference**

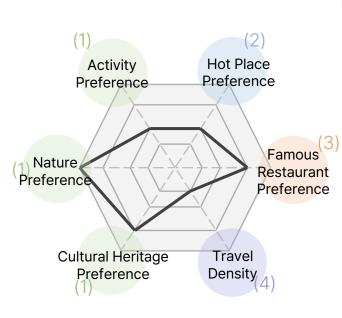
Based on user's Hot Place **Preference**

User	Nature	Activity	Cultural	Hot
USEI	Preference	Preference	Preference	Place
Α	0.6	0.3	0.5	0.4

VS.

Destination	Nature Activity Score Score		Cultural Score	Popularity
А	0.7	0.3	0.4	0.3
В	0.2	0.6	0.9	0.6

→ Select tourist destination based on similarity between user preference and tourist destination score



Restaurant

Based on user's Famous Restaurant Preference

→ The higher the score, the more famous restaurant recommended

Number of Tourist Destination

Based on Travel Density

Travel Density	Private Car	Public Transportation
0~0.3	3	2
0.3~0.7	4	3
0.7~1	5	4

→ The higher the score, the more tourist destinations are recommended

STEP 1. Tourist Destination Filtering

	이름	purpose1	purpose2	purpose3	popularity	co2	loc1	loc2
1	사려니숲길	0.376859	3.258648e-01	0.345421	0.693147	4.831689	1	0
0	성산일출봉(UNESCO 세계자연유산)	0.771565	6.826621e-01	0.948563	0.692564	7.606409	15	13
12	비자림	0.588894	7.084264e-01	0.496272	0.691981	4.532505	16	13
579	무비랜드왁스뮤지엄	0.183546	5.206298e-01	0.401657	0.005811	1.564037	10	9
747	제주베스트힐	0.406613	5.728497e-01	0.385180	0.004651	4.831689	1	0
843	해빛	0.175198	4.998554e-01	0.236963	0.003490	16.114343	1	0



List of 858 Tourist Destinations Some not well-known destinations enough to be recommended are included



Major Category(Ex.North): remove 'popularity<0.5'

Minor Category (Ex. Aeworl): remove 'popularity < 0.25'

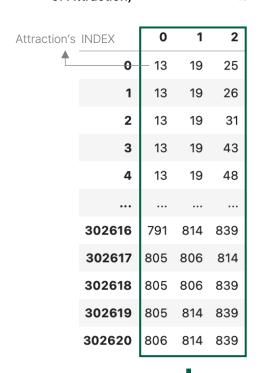
To recommend more hidden tourist attractions

Region	Numbers
북부(0)	113
서부(4)	84
남부(9)	67
동부(13)	56
조천(1)	48
제주(2)	113
애월(3)	61
한림(5)	39
한경(6)	30
대정(7)	36
안덕(8)	54
중문(10)	21
서귀포(11)	83
남원(12)	35
표선(14)	27
성산(15)	35
구좌(16)	56

Filtered Regional **Tourist Attractions**

STEP 2. Combination of Attraction

combination (Number of attraction (Total Number of Attraction) to visit)



Combination of 3 tourist attractions to visit

STEP 3. Calculate carbon emissions by combination of destination

	0	1	Ca:	rbon Emission
0	13	19	25	22.278586
1	13	19	26	12.962554
2	13	19	31	27.177649
3	13	19	43	27.177649
4	13	19	48	27.177649
302616	791	814	839	30.490135
302617	805	806	814	21.840575
302618	805	806	839	28.484213
302619	805	814	839	30.508753
302620	806	814	839	16.922895

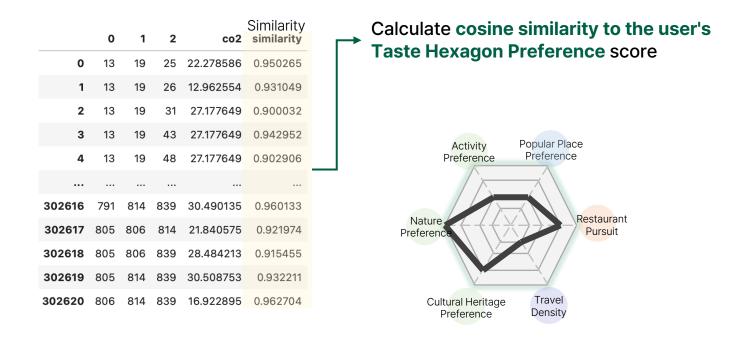
Set Threshold of **Carbon Emission**

Mean	32.468987	
std	19.241773	
Min	0.142393	
Max	181.671537	
25%	20.675181	
50%	29.373847	
75%	39.189104	

Select only low-carbon tourist destination combinations with the bottom 25% carbon emissions

→ Eliminate rich-carbon tourist destination combinations for eco-friendly travel

STEP 4. Calculate Similarity with users by Attraction Combination



Choose the most similar tourist destination combination

→ Selected as a personalized tourist destination combination

STEP 5. Closest Distance

Reduce carbon emissions from transportation by reducing travel distance

		0	1	2	 877	878	879
	0	0.000000	27.982931	56.188593	 44.580294	26.436862	3.991053
	1	27.982931	0.000000	28.656421	 19.821806	10.440169	27.020414
	2	56.188593	28.656421	0.000000	 24.555824	31.314689	54.603683
	3	65.252372	37.526944	16.616512	 23.441149	43.634991	64.535818
	4	16.427955	21.859265	49.650862	 32.213764	26.780620	18.916690
	882	65.275245	37.520627	16.329368	 23.615866	43.546742	64.534944
1	883	62.505821	34.974590	16.712549	 20.135483	41.608493	61.918430
	884	35.363124	10.388595	21.346259	 23.134036	10.019503	33.463548

latitude and longitude via Naver Map API for each location

Calculate the straight distance from GeoPy Library for the calculated latitude/longitude



Compute for all paths with full navigation

STEP 6. Recommend the closest restaurant and lodging

Restaurant

[Tourist Site Data Crawling from VISIT JEJU]

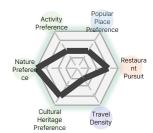
이름 결	주변음식점 개 수	주변음식점
카멜리아힐	7.0	['아뜰리에 제주명월', '숨비나리카페', '창천삼거리식당', '숨비나리', '헬로
협재해수욕장	40.0	['명랑스낵', '피어22', '협재해녀의집', '앤트러사이트', '수우동', '명

Restaurant Surrounding Tourist Site

[Restaurant Data Crawling from VISIT JEJU]

이름	pop	co2_rank
봄날카페	0.692525	0.614967
서연의집(영화 건축학개론)	0.691281	0.614967
명진전복	0.692214	0.165715
	-1-1-	

인기도 탄소배출량



Recommended Restaurant by **Restaurant Pursuit Score**

High: Consider Popularity than Carbon Emission Low: Consider Carbon Emission than Popularity

Accomodation

[Accomodation Data Crawling from VISIT JEJU]

이름	주변숙박개수	주변숙박
SCO 세계자연유산)	28.0	['아름다운리조트', '플레이스 캠프 제주', '골든튤립 제주 성산호텔', '봄그리
우도(해양도립공원)	20.0	['우도피아', '소섬바당', '우도사랑', '우도쉼팡게스트하우스', '뽀요요펜션'

Accomodation Surrounding Tourist Site

[Accomodation Data Crawling from VISIT JEJU]

이름	지역
나미송 머무는 곳	제주시 > 애윌
해비치호텔앤드리조트	서귀포시 > 표선
신라호텔제주	서귀포시 > 중문



Recommended Accommodations by **Travel Density**

High: Recommend Cheaper Accomodations

Low: Recommend More Expensive Accomodations

Travel Route Recommendation Example

Recommended Route Example 1 Persona 1

Persona 1

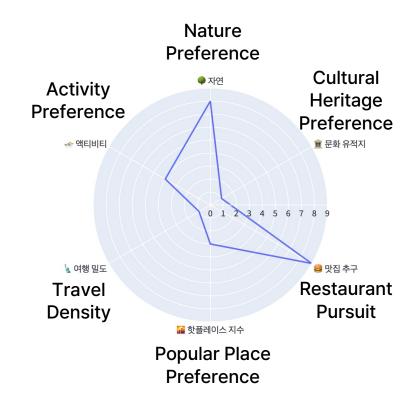


Likes to Heal in Nature and Hates Activity

It's good to just **go around** a couple of places

I only want to go to a famous restaurant

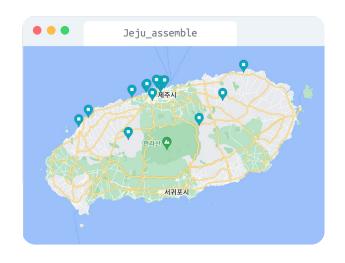
It doesn't have to be a famous tourist destination



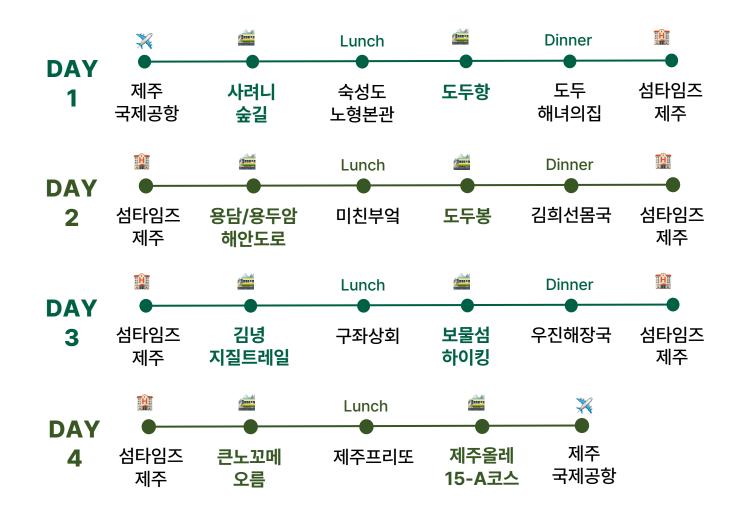
- Q. Which part of Jeju Island are you going to travel to?
- → I want to travel to the northern part of Jeju Island
- Q. What transportation will you use?
- → Going to use Public Transportation

Recommended Route Example 1 Persona 1

Recommended Route





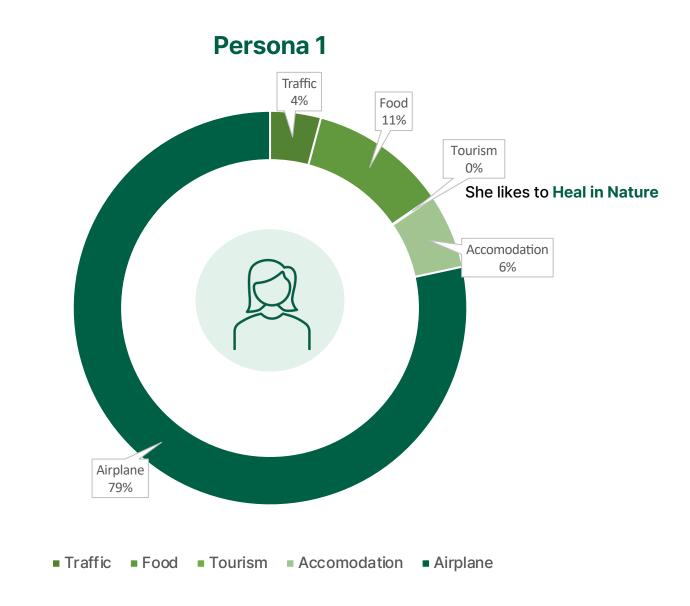


ECO JEJU TOUR Recommended Route Example 1 Persona 1

Recommended Route







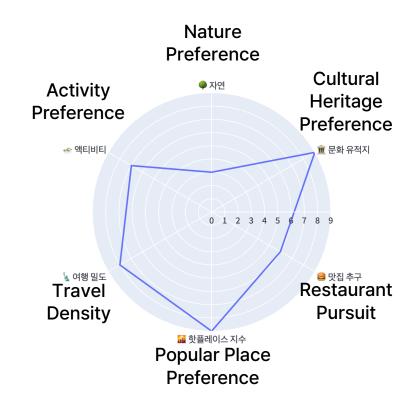
Recommended Route Example 1 Persona 2

Persona 2



I'm okay with nature, but I prefer History and Activities.

Plan on going around a lot
Any restaurant is fine
Love Popular Place

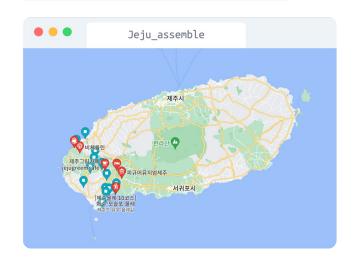


- Q. Which part of Jeju Island are you going to travel to?
- → I want to travel to the Southern part of Jeju Island
- Q. What transportation will you use?
- → Going to use Public Transportation

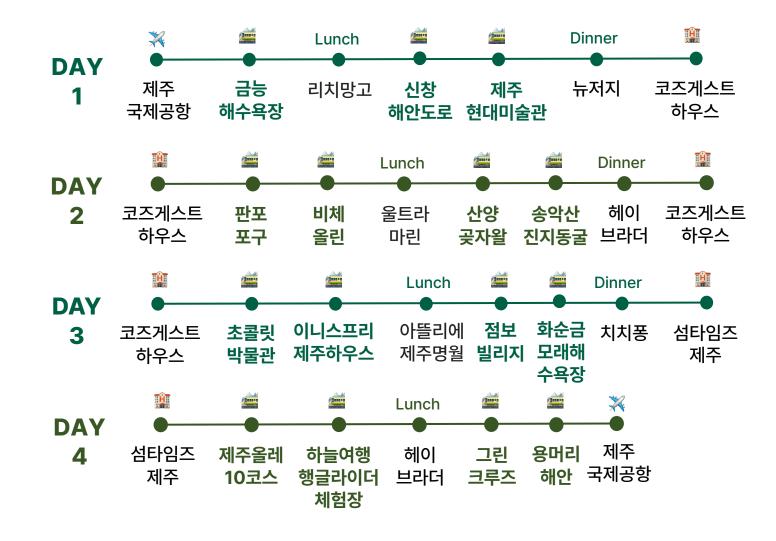
ECO JEJU TOUR

Recommended Route Example 1 Persona 2

Recommended Route

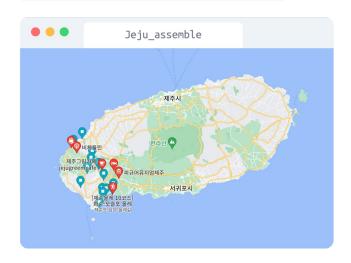






ECO JEJU TOUR Recommended Route Example 1 Persona 2

Recommended Route





€ Traffic 8.78

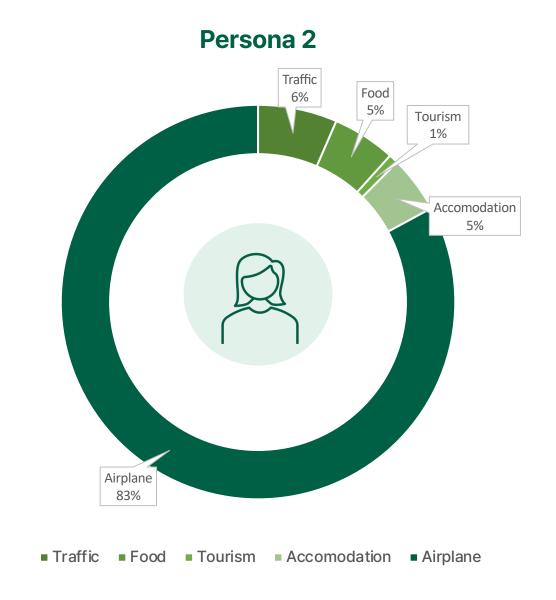
Food 7

Tourism 1.0473

Accomodation 6.28

Airplane 112

= <u>135.107kgCO2</u>



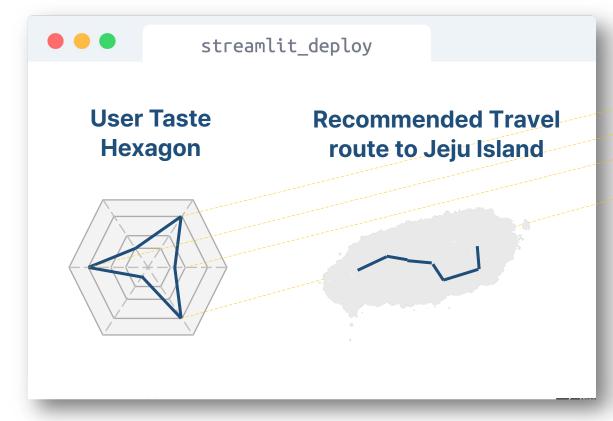


1 Instagram Marketing

Stars in the Blue Night Sky of Jeju Island

Implemented to look like a constellation according to Trace drawn based on the input received from User Taste Hexagon - Draw via Instagram Story/Post Event

Blue Night Sky # Jeju Horse # Constellation # the Big Dipper





Customer Communcation

② Eco-friendly performances tailored to JEJU

Jeju Island's Big Dipper Acoustic Busking Live





Busking

Citizen Welfare Town Plaza (Donam-dong, Jeju-si)

Park near <u>Chilseongdae Fountain</u> that shines brightly at night Historic Site of the Ancient Tamna Kingdom

VISIT JEJU Selected < Night Trip in the City of Jeju City>



Motivation

Jeju: a descendant of the Big Dipper

新增東國輿地勝覽 (Chosun, 1530)



"Chilseongdo Island is located in the main castle, and there is an old site built with stones." "I lived in a village by stacking stones that resemble the shape of the Big Dipper."

Customers

Selection of excellent reviewers from customers who have visited the recommended travel route (calculated about 100 people)

- (1) Whether you have been to Jeju Island as the recommended route
- (2) Calculation of scores through review sensitivity analysis
- (3) Limited to customers whose carbon footprint does not exceed the threshold value

Customer Communcation

3 Shinhan Card Contest



ESG Jeju Travel Contest

Route Recommendation Algorithm
Carbon Footprint Calculator

Let's go on a trip to Jeju Island as the recommended route! Calculation Carbon Emissions from Tourism in Jeju Island!

Carbon Footprint on Travel



Carbon Emission index in the consumption sector 'Shinhan Green Index'

Shinhan Card Payment

Events such as accumulating labeling points for purchased items and purposes are held

Shinhan Green Index

Calculate the user's carbon emissions Awarded prizes to outstanding users

VLOG Contest

Travel Influencer

Proposed shooting of carbon footprint travel vlog

Goal

New Trend of Carbon Footprint Travel vlog

Expectation

To alert everyone by informing them of their travel total carbon emissions

Carbon footprint travel trend not only in Jeju but also across the country





Design the Carbon Footprint Calculator & Develop the Travel Route Recommender System

1 Selection of indicators

2 User Taste Hexagon

3 Various Routes

The Definitely Popular Place!
vs. A hidden place that
only I want to know

Characteristic of Gen-Z

Reflects the tendency to prefer places that only you want to know in addition to famous places

#Popular Place Preference #Restaurant Pursuit Defines me & my preference

The reason why MBTI and psychological tests are so popular

User-Taste Hexagon

Attracting great interest to the Gen-Z

Enjoy sharing and comparing the results of each Hexagon and Root with friends

Benefits of receiving 6 metrics differently each time

Nature Preference Activity Preference Cultural Heritage Preference

Popular Place Preference Travel Density

Restaurant Pursuit

It's fun to modify indicators together when planning a trip with friends and find routes that everyone is satisfied with **Business Item Proposal**

Application of deep learning and natural language processing technology

Travel propensity analysis

Analysis of propensity by classifying the characteristics of travelers like MBTI



Can recommend travel routes that are better for travelers

Utilizing genetic algorithms

Development of Travel Route Recommender Algorithm Using Collaborative Filtering and Genetic Algorithm

Reference

<u>유전알고리즘을 이용한</u> <u>사용자 평가기반 여행계획</u> 모델링, 권순호 et al., 2020

Applying RNN

Development of personalized next travel recommendation model using RNN/GRU

Reference

Chatbot

Travel destinations and words received from users



Calculate travel routes and carbon emissions from LM

Team DAVENGERS

Construct a Carbon Footprint Calculator & Develop the JEJU Tour Recommender System

Project Official Webpage Official GitHub Repository

Carbon Footprint Travel Route

User Taste Hexagon

Calculator

Conclusion DAVENGERS Team



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