Kuhn PokerBot Group 18

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Welcome to Kuhn PokerBot Group 18's documentation!

This documentation is for APIs of the PokerBot of Group 18

Kuhn poker is an extremely simplified form of poker developed by Harold W. Kuhn as a simple model zero-sum two-player imperfect-information game, amenable to a complete game-theoretic analysis. In Kuhn poker, the deck includes only three playing cards, for example a King, Queen, and Jack. One card is dealt to each player, which may place bets similarly to a standard poker. If both players bet or both players pass, the player with the higher card wins, otherwise, the betting player wins. [KuhnPoker]

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AGENT MODULE

For agent class, we treat image classifiers and action generators as two components of the agent. So, two member variables *self.model* and *self.strategy* are introduced to provide services for the agent. By designing like this, our agent class will focus on how to pass information from image classifiers to the strategy generator. And the agent is responsible for passing information between internal components image classifiers, strategy generator and external controller. Also, we can easily use new image classifiers and new strategy generators to replace current components without having to consider the implementation of the agent. We just make sure the two components follow interface specifications and change the loaded *self.model* `and *self.strategy*. Then our agent can run normally without any further changes in the agent class.

class agent.PokerAgent

Bases: object

make_action(state: client.state.ClientGameState, round: client.state.ClientGameRoundState) → str

Next action, used to choose a new action depending on the current state of the game. This method implements your unique PokerBot strategy. Use the state and round arguments to decide your next best move.

Parameters

- **state** (ClientGameState) State object of the current game (a game has multiple rounds)
- round (ClientGameRoundState) State object of the current round (from deal to show-down)

Returns A string representation of the next action an agent wants to do next, should be from a list of available actions

Return type str in ['BET', 'CALL', 'CHECK', 'FOLD'] (and in round.get_available_actions())

on_error(error)

This methods will be called in case of error either from server backend or from client itself. You can optionally use this function for error handling.

Parameters error (*str*) – string representation of the error

```
on_game_end(state: client.state.ClientGameState, result: str)
```

This method is called once after the game has ended. A game ends automatically. You can optionally use this method for logging purposes.

Parameters

- state (ClientGameState) State object of the current game
- result (str in ['WIN', 'DEFEAT']) End result of the game

on_game_start(gametype: str)

This method will be called once at the beginning of the game when server confirms both players have connected.

on_image(image)

This method is called every time when card image changes. Use this method for image recongition procedure.

Parameters image (Image) – Image object

on_new_round_request(state: client.state.ClientGameState)

This method is called every time before a new round is started. A new round is started automatically. You can optionally use this method for logging purposes.

Parameters state (ClientGameState) - State object of the current game

on_round_end(state: client.state.ClientGameState, round: client.state.ClientGameRoundState)

This method is called every time a round has ended. A round ends automatically. You can optionally use this method for logging purposes.

Parameters

- **state** (ClientGameState) State object of the current game
- round (ClientGameRoundState) State object of the current round

CHAPTER

TWO

MODELS PACKAGE

2.1 Model handling:

As for model part, we hoped our model to be robust for different noise images so we generated different noise level images with big rotation and put all these images to training set. Our models would be able to learn many kinds of noisy images and finally the model had great accuracy on even very high noise. The CNN model performed better than FCN and we built both models with 3 and 4 classes outputs.

2.2 Submodules

2.3 models.CNN3 module

```
class models.CNN3.model
     Bases: models.base_model.PokerModelBase
     Model of Image classifier PokerModelBase provide the interfaces definition for image classifiers. model define
     output with 3 classes using CNN
     forward(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns 13 – Output tensor with score for classes
               Return type tensor
     predict(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns labels – The predicted labels are returned in shape [n_batches].
               Return type torch.tensor
     prob(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns The predicted probabilities for each class are returned in shape [n_batches,n_classes].
               Return type torch.tensor
     training: bool
```

2.4 models.CNN4 module

class models.CNN4.model

```
Bases: models.base_model.PokerModelBase
     Model of Image classifier PokerModelBase provide the interfaces definition for image classifiers. model define
     output with 4 classes using CNN
     forward(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns 13 – Output tensor with score for classes
               Return type tensor
     predict(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns labels – The predicted labels are returned in shape [n_batches].
               Return type torch.tensor
     prob(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns The predicted probabilities for each class are returned in shape [n_batches,n_classes].
               Return type torch.tensor
     training: bool
2.5 models.FCN3 module
class models.FCN3.model
     Bases: models.base model.PokerModelBase
     Model of Image classifier PokerModelBase provide the interfaces definition for image classifiers. model define
     output with 3 classes using FCN
     forward(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns 13 – Output tensor with score for classes
               Return type tensor
     predict(x)
               Parameters x (tensor) – Input tensor for the neural network
               Returns labels – The predicted labels are returned in shape [n_batches].
               Return type torch.tensor
```

prob(x)

Parameters x (tensor) – Input tensor for the neural network

Returns The predicted probabilities for each class are returned in shape [n_batches,n_classes].

Return type torch.tensor

training: bool

2.6 models.FCN4 module

class models.FCN4.model

Bases: models.base_model.PokerModelBase

Model of Image classifier PokerModelBase provide the interfaces definition for image classifiers. model define output with 4 classes using FCN

forward(x)

Parameters x (tensor) – Input tensor for the neural network

Returns 13 – Output tensor with score for classes

Return type tensor

predict(x)

Parameters x (tensor) – Input tensor for the neural network

Returns labels – The predicted labels are returned in shape [n_batches].

Return type torch.tensor

prob(x)

Parameters x (tensor) – Input tensor for the neural network

Returns The predicted probabilities for each class are returned in shape [n_batches,n_classes].

Return type torch.tensor

training: bool

2.7 models.base_model module

class models.base_model.PokerModelBase

Bases: torch.nn.modules.module.Module

Abstract base class for Image classifier PokerModelBase provide the interfaces definition for image classifiers. By the abstract base class, the implementation details of different models are hidden to the agent.

abstract forward(x)

Parameters x (tensor) – Input tensor for the neural network

Return type Defined by subclasses

```
abstract predict(x)
    Parameters x (tensor) - Input tensor for the neural network
    Returns The predicted labels are returned in shape [n_batches].
    Return type torch.tensor
abstract prob(x)
    Parameters x (tensor) - Input tensor for the neural network
    Returns The predicted probabilities for each class are returned in shape [n_batches,n_classes].
    Return type torch.tensor
training: bool
```

2.8 Module contents

CHAPTER

THREE

STRATEGY PACKAGE

3.1 Strategy handling:

We used Counterfactual Regret Minimization(CFR) for deciding which action we would like to use. The CFR has ability to explore every possible result of the action we made and reach Nash equilibrium. Since there does not exist any strategy that can guarantee we could win every single game, using the strategy that can reach Nash equilibrium becomes a good option. The advantage of using the Nash equilibrium strategies is that our exploitability is minimum. Therefore, our agent will not totally malfunction even though the opponent knows our strategy or we gave sufficient exploitative power. Since kuhn poker is a simple poker game, the whole result can be easily calculated by algorithm. We just directly used the result from CFR and used the random seed, which is an uniform distribution, to decide which action we want to take. For the PokerBot, we will engage two types of games, 3 cards and 4 cards, we used CFR sample code from the internet and modified it to generate 3 cards and 4 cards result. The reference website as following url: https://justinsermeno.com/posts/cfr/

3.2 Submodules

3.3 strategy.agent strategy module

class strategy.agent_strategy.PokerStrategy

Bases: strategy.base_strategy.StrategyBase

CFR strategy implementation PokerStrategy uses the probabilistic results of actions generated by CFR algorithm to determine what action the poker agent should take each time for a given game type.

$card3strategy() \rightarrow str$

Using random seed to decide which action we would do. The probability range is the result from CFR algorithm.

Note: The CFR result3 cards:

Player1 strategy: card history ["CHECK", "BET"]J [""] [0.79, 0.21]J ["CB"] [1.00, 0.00]Q [""] [1.00, 0.00]Q ["CB"] [0.45, 0.55]K [""] [0.39, 0.61]K ["CB"] [0.00, 1.00]

Player2 strategy: card history ["CHECK", "BET"]J ["B"] [1.00, 0.00]J ["C"] [0.67, 0.33]Q ["B"] [0.66, 0.34]Q ["C"] [1.00, 0.00]K ["B"] [0.00, 1.00]K ["C"] [0.00, 1.00]

$card4strategy() \rightarrow str$

Using random seed to decide which action we would do. The probability range is the result from CFR algorithm.

```
Note: The CFR result4 cards:

Player1 strategy: card history ["CHECK", "BET"]J [""] [ 0.75, 0.25]J ["CB"] [ 1.00, 0.00]Q [""] [ 1.00, 0.00]Q ["CB"] [ 0.75, 0.25]K [""] [ 1.00, 0.00]K ["CB"] [ 0.00, 1.00]A [""] [ 0.25, 0.75]A ["CB"] [ 0.00, 1.00]

Player2 strategy: card history ["CHECK", "BET"]J ["B"] [ 1.00, 0.00]J ["C"] [ 0.51, 0.49]Q ["B"] [ 0.79, 0.21]Q ["C"] [ 1.00, 0.00]K ["B"] [ 0.20, 0.80]K ["C"] [ 0.51, 0.49]A ["B"] [ 0.00, 1.00]A ["C"] [ 0.00, 1.00]
```

 $get_strategy() \rightarrow str$

3.4 strategy.base_strategy module

```
{\bf class} \ {\bf strategy.base\_strategy.StrategyBase}
```

Bases: object

Base class for game strategy StrategyBase provides the interface definitions for game strategy, and defines the set value functions for inheritance.

```
get_strategy()
set_avaliable_actions(avaliable_actions: list)
set_bank(bank: int)
set_current_card(current_card: str)
set_gametype(gametype: int)
set_move_history(move_history: list)
set_order(order: int)
set_roll_the_dice(RollTheDice: bool)
```

3.5 Module contents

CHAPTER

FOUR

DATA SETS MODULE

4.1 Data handling

For data handling, we generated noisy images with different rotate angle and noise level for later training. After generated data we extracted features from the images which aimed to remove the noise as much as possible. Because our noise followed uniform distribution so most of the noise intensity was bigger than 0(the pure black) so we regarded those pixels as background.

data_sets.extract_features(img: <module 'PIL.Image' from '/home/xianbo/miniconda3/lib/python3.9/site-packages/PIL/Image.py'>)

Convert an image to features that serve as input to the image classifier.

Parameters img (Image) – Image to convert to features.

Returns features – Extracted features in a format that can be used in the image classifier.

Return type list/matrix/structure of int, int between zero and one

data_sets.generate_data_set($n_samples: int, data_dir: str, num_label: int = 4, noise_level: float = 0.2$) \rightarrow None

Generate n_samples noisy images by using generate_noisy_image(), and store them in data_dir.

Parameters

- **n_samples** (*int*) Number of train/test examples to generate
- data_dir (str) Directory for storing images. TRAINING_IMAGE_DIR, TEST IMAGE DIR are predefined path for training and testing.
- num_label (int in [3,4], default: 4)—Number of unique labels to generate. First 'num_label' lables in predefined LABELS will be used.
- noise_level (flat in range [0,1], default: 0.2) Probability with which a given pixel is randomized.

Examples

```
>>> generate_data_set(30,TRAINING_IMAGE_DIR,4,0.2)
30 pictures will be saved to TRAINING_IMAGE_DIR
```

data_sets.generate_noisy_image(rank, noise_level)

Generate a noisy image with a given noise corruption. This implementation mirrors how the server generates the images. However the exact server settings for noise_level and ROTATE_MAX_ANGLE are unknown. For the PokerBot assignment you won't need to update this function, but remember to test it.

Parameters

- rank (str in ['J', 'Q', 'K', 'A']) Original card rank.
- **noise_level** (*int between zero and one*) Probability with which a given pixel is randomized.

Returns noisy_img – A noisy image representation of the card rank.

Return type Image

Examples

```
>>> generate_noisy_image("J",0.2)
```

data_sets.load_data_set(data_dir, n_validation)

Prepare features for the images in data_dir and divide in a training and validation set.

Parameters

- data_dir (str) Directory of images to load
- **n_validation** (*int*) Number of images that are assigned to the validation set

Returns

- **training_features** (*list*) Containing the arrays of int between 0 and 1 which are the training images features.
- training_labels (list) Containing the training labels of str which contain alphabet among'
 J,O,K,A'.
- validation_features (*list*) Containing the arrays of int between 0 and 1 which are the validation images features.
- validation_labels (*list*) Containing the validation labels of str which contain alphabet among' J,Q,K,A'.

CHAPTER

FIVE

CLIENT PACKAGE

This part is provided from the teacher. So, we don't add much information about this part.

5.1 Submodules

5.2 client.controller module

5.3 client.events module

```
class client.events.ClientRequestEventsIterator
    Bases: object
    close()
    is_closed()
    make_request(request)
    next()
    set_initial_request(request)
```

5.4 client.state module

```
class client.state.ClientGameRoundState(coordinator_id, round_id)
```

Bases: object

ClientGameRoundState tracks the state of the current round, from deal to showdown. Attributes should be accessed through their corresponding getter and setter methods. For the PokerBot assignment you should not modify the setter methods yourself (only test them).

_coordinator_id

Unique game coordinator identifier (token), duplicate from ClientGameState._coordinator_id

Type str

_round_id

Round counter, starts from 1

Type int

card

Current card in hand; "?" means the exact card rank is unknown and has to be recognized from _card_image

```
Type str, in ['J', 'Q', 'K', '?']
```

_card_image

Current card image in hand

Type Image

_turn_order

Player turn position for the current round, player '1' acts first

```
Type int, in [1, 2]
```

_moves_history

Previously made actions of both players. Actions in the list alternate between players, i.e., the first element is the first action of player '1', and the second element is the first action of player '2', etc. The last element of _moves_history is the last action made by your opponent. If you're the first to move, _moves_history will be empty.

Type list of str

_available_actions

Available actions this turn, e.g., on the first move, _available_actions = ['BET', 'CHECK', 'FOLD'].

Type list of str, where str in subset of ['BET', 'CHECK', 'FOLD', 'CALL']

outcome

Amount of chips won this round. Negative values indicate a loss.

```
Type str
```

_cards

Cards at showdown for both players, concatenated in player order. I.e., 'KJ' indicates player '1' holds a 'K', and player '2' holds a 'J'. If the opposing player folds, a question-mark is returned for that player's card; i.e. 'K?' indicates the card for player '2' was not revealed at showdown.

```
Type str
```

```
add_move_history(move)
get_available_actions()
get_card()
get_card_image()
get_cards()
get_coordinator_id()
get_moves_history()
get_outcome()
```

```
get_round_id()
     get_turn_order()
     is_ended()
     set_available_actions(available_actions)
     set_card(card)
     set_card_image(card_image)
     set_cards(cards)
     set_moves_history(moves_history)
     set_outcome(outcome)
     set_turn_order(order)
class client.state.ClientGameState(coordinator_id, player_token, player_bank)
     Bases: object
     A ClientGameState object tracks a specific game between two players. A game consists of multiple rounds from
     deal to showdown. Attributes should be accessed through their corresponding getter and setter methods. For the
     PokerBot assignment you should not modify the setter methods yourself (only test them).
     _coordinator_id
          Game coordinator identifier token
              Type str
     _player_token
          Unique player identifier token
              Type str
     _player_bank
          Amount of player credit chips
              Type int
     rounds
          Tracks the individual rounds played in this game
              Type list of ClientGameRoundState
     get_coordinator_id()
     get_last_round_state() \rightarrow client.state.ClientGameRoundState
     get_player_bank()
     get_player_token()
     get_rounds()
     start_new_round()
```

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update_bank(outcome)

5.5 Module contents

CHAPTER

SIX

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BIBLIOGRAPHY

 $[KuhnPoker] \ \ Kuhn\ poker\ -\ Wikipedia\ https://en.wikipedia.org/wiki/Kuhn_poker$

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