



CSCE 580: Introduction to Al

CSCE 581: Trusted Al

Lecture 17: Building Chatbots

PROF. BIPLAV SRIVASTAVA, AI INSTITUTE 24TH OCT 2023

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Carolinian Creed: "I will practice personal and academic integrity."

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CSCE 580, 581 - FALL 2023

1

Organization of Lecture 17

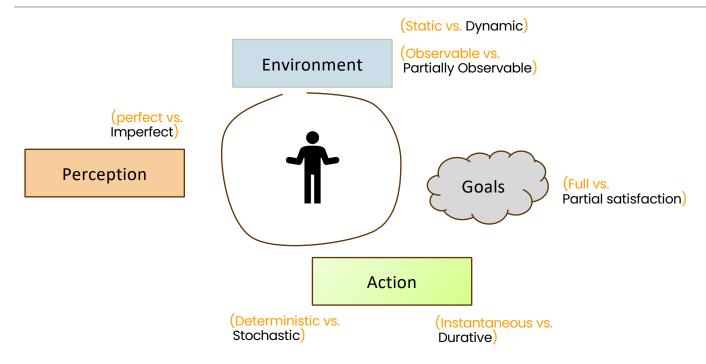
- Introduction Segment
 - Recap of Lecture 16
- Main Segment
 - Building Chatbots
 - RASA
 - SafeChat Framework
- Concluding Segment
 - Course Project Discussion
 - About Next Lecture Lecture 18
 - Ask me anything

Introduction Section

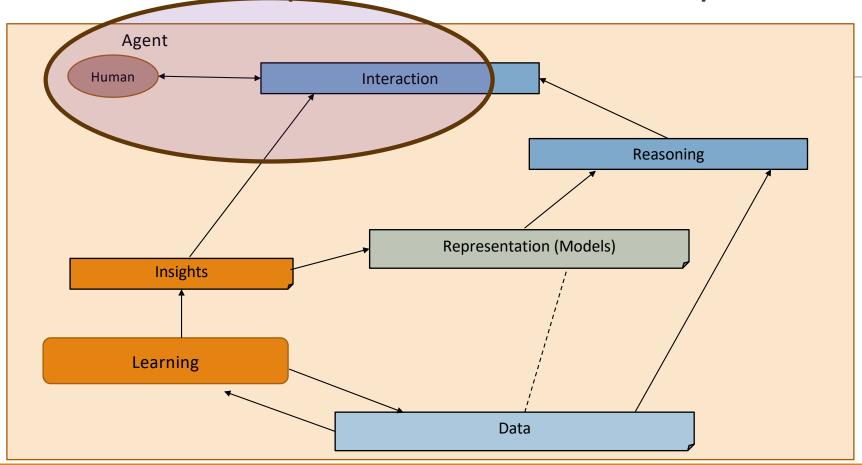
Recap of Lecture 16

- Topic discussed
 - Trust Issues
 - Explainability
 - LIME tool

Intelligent Agent Model



Relationship Between Main Al Topics



Where We Are in the Course

CSCE 580/581 - In This Course

- Week 1: Introduction, Aim: Chatbot / Intelligence Agent
- Weeks 2-3: Data: Formats, Representation and the <u>Trust Problem</u>
- Week 4-5: Search, Heuristics Decision Making
- Week 6: Constraints, Optimization Decision Making
- Week 7: Classical Machine Learning Decision Making, Explanation
- Week 8: Machine Learning Classification
- Week 9: Machine Learning Classification Trust Issues and

Mitigation Methods

• Topic 10: Learning neural network, deep learning, Adversarial

attacks

- Week 11: Large Language Models Representation, Issues
- Topic 12: Markov Decision Processes, Hidden Markov models -

Decision making

- Topic 13: Planning, Reinforcement Learning Sequential decision making
- Week 14: Al for Real World: Tools, Emerging Standards and Laws;
 Safe Al/ Chatbots

Main Section

Credit: Retrieved from internet

Rasa

- Rasa is an open source, scalable AI framework that can be used to build conversational agents.
- Rasa is used by many companies like American Express, BlueCross BlueShield, Dell,
- Chatbot terminology:
 - Intent: Intention of the user behind a message.
 - **Entity**: They are used to identify important parts of the message that affects the response chosen by the chatbot. Ex: Time, location.

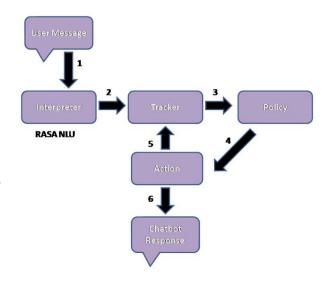
Message	Intent	Entities
When will the flight to ORD arrive at CAE?	Arrivals	ORD, CAE
Can I book an appointment with the dentist for tomorrow?	Booking	dentist, tomorrow

Credit:

1. https://rasa.com/docs/rasa/

Rasa Workflow

- Rasa consists of two major components: Rasa NLU and Rasa Core.
 - Rasa Natural Language Understanding (NLU) takes user message as input and recognizes entities and intent and passes it to RASA core.
 - Rasa Core selects the appropriate response based on the the input passed by Rasa NLU and sends it back to the user.
- Rasa workflow:
 - User message is converted into a dictionary which consists of the message, intent, and entities extracted.
 - Tracker keeps a record of the conversation.
 - Current state of the tracker is sent to the policy which decides the next action that needs to be taken.
 - Chatbot's response depends on the action chosen.



Credit:

- https://rasa.com/docs/rasa/
- https://www.analyticsvidhya.com/blog/2022/02/a-simpleguide-to-rasa-3-x/

Setting Up Virtual Environment (python env)

- 1. If you do not have 'pip' on your system, download the script from: https://bootstrap.pypa.io/get-pip.py
- 2. Run 'python get-pip.py' on your terminal to install pip.
- 3. Run 'python3 -m pip install --user virtualenv' to install virtual environment package.
- 4. Run 'python3 -m venv env' to create a virtual environment, 'env'.
- 5. Run 'source env/bin/activate' to activate the virtual environment.
- 6. To leave the virtual environment, run 'deactivate'.

Alternative: use conda

Setting Up Virtual Environment (conda env; recommended)

- Install anaconda from https://www.anaconda.com/download.
- To create a virtual environment, run the command 'conda create –name <env_name> python==3.8'
- 3. To activate the environment, run 'conda activate <env_name>'
- To deactivate the environment, run 'conda deactivate'.

```
Collecting package metadata (current_repodata.json): done
Solving environment: failed with repodata from current_repodata.json, will retry with next repodata source
Collecting package metadata (repodata.json): done
Solving environment: done
 => WARNING: A newer version of conda exists. <==
  current version: 23.3.1
  latest version: 23.9.0
Please update conda by running
    $ conda update -n base -c defaults conda
Or to minimize the number of packages updated during conda update use
     conda install conda=23.9.0
  environment location: C:\Users\klakk\.conda\envs\temp
  added / updated specs:
     - python==3.8
 he following NEW packages will be INSTALLED:
                     pkgs/main/win-64::ca-certificates-2023.08.22-haa95532_0
  openssl
                     pkgs/main/win-64::openssl-1.1.1w-h2bbff1b_0
                     pkgs/main/win-64::pip-23.3-py38haa95532_0
pkgs/main/win-64::python-3.8.0-hff0d562_2
  pip
 python
  setuptools
                     pkgs/main/win-64::setuptools-68.0.0-py38haa95532_0
  sqlite
                     pkgs/main/win-64::sqlite-3.41.2-h2bbff1b_0
                      pkgs/main/win-64::vc-14.2-h21ff451_1
                     pkgs/main/win-64::vs2015_runtime-14.27.29016-h5e58377_2
                      pkgs/main/win-64::wheel-0.41.2-py38haa95532_0
Proceed ([y]/n)? y
```

Build a Chatbot with Rasa

- Install Rasa using the command, 'pip install rasa==3.1'
- Run 'rasa init' to build a basic Rasa chatbot.
- 3. Run 'rasa shell' to talk to your chatbot.

What is SafeChat?

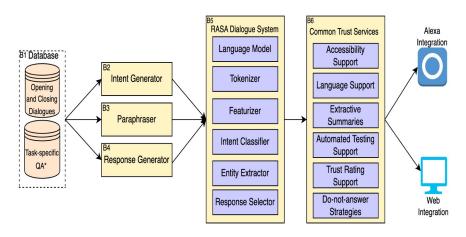
- SafeChat architecture was introduced in [1]. It is a Rasa-based framework that can be used to build safe and trustworthy chatbots.
- The uniqueness of SafeChat is:
 - A safe design where the responses can be traced back to their original source (e.g., official FAQs).
 - A do-not-answer strategy that can deflect certain user questions that are not supposed to be answered.
 - A low-programming design pattern based on the open-source Rasa platform to generate chatbots quickly for any region.
 - A quick domain-independent chatbot framework with CSV-based Q/A support and automatic intent generator with support for backend integration and testing.

References:

 Muppasani, B., Pallagani, V., Lakkaraju, K., Lei, S., Srivastava, B., Robertson, B., ... & Narayanan, V. (2022). On Safe and Usable Chatbots for Promoting Voter Participation. arXiv preprint arXiv:2212.11219.

SafeChat Architecture (1/2)

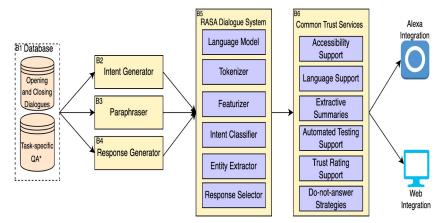
- Database (B1): The database is the source from which we extract the training data to train the chatbot. We ensure that the source is reliable and trustworthy. Task-specific QA refers to the data source pertaining to the chosen domain. The opening and closing dialogues are usually generic (like greeting and saying bye).
- Intent Generator (B2): Intent Generator helps in tagging existing questions to an intent, which can later be utilized to map any new incoming user utterance to an available intent to provide desired answers.
- Paraphraser (B3): A paraphraser can be used to augment the training data by paraphrasing the questions given in an official FAQ document.



*Domains: Elections, Finance, Water, Education, Power, ...

SafeChat Architecture (2/2)

- Response Generator (B4): A response is usually text but can also include multi-modal content like images and audio. The safe chatbot architecture reuses the response generation module available in the RASA Dialogue System.
- RASA Dialogue System (B5): We use the RASA chatbot framework to build the chatbot. The dialogue system has an NLU pipeline with different components for understanding human conversation and responding appropriately.
- Common Services (B6): The common services are optional, and the user has the flexibility of choosing the services they need. Some of the accessibility options are font settings and Text-to-Speech.
- **System Integration:** Our framework allows easier web integration and integration with Alexa.



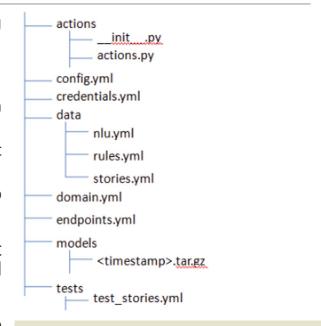
*Domains: Elections, Finance, Water, Education, Power, ...

Building a Chatbot using SafeChat

- 1. Run 'git clone https://github.com/ai4society/trustworthy-chatbot.git to clone our SafeChat repository.
- 2. Go to the project directory and run 'pip install –r requirements.txt' to install all the required packages.
- 3. Run 'code/configure_rasa.py', 'code/extract_intent.py' and 'code/paraphraser.py' files in the same order to create your chatbot.

Chatbot File Structure

- config.yml: It has pipeline, policies, and other NLU components.
- '/data' consists of:
 - nlu.yml: It contains intents and examples for each intent with entities.
 - rules.yml: Defines a fixed conversation path that chatbot follows.
 - stories.yml: It contains conversations paths the chatbot needs to take in order to respond to the user messages appropriately.
- domain.yml: This file acts as an index for the chatbot. It contains intents, entities, slots, responses, forms, and actions.
- '/models' contain the trained chatbot model that can be used to talk to the chatbot.



Credit:

- 1. https://rasa.com/docs/rasa/
- 2. https://www.analyticsvidhya.com/blog/2022/02/a-simple-guide-to-rasa-3-x/

Running your chatbot

- 1. Go to the 'Chatbot' directory that is generated and to train the chatbot, run 'rasa train'.
- 2. To talk to the trained chatbot, run 'rasa shell'. Also, run 'rasa run actions' in another instance of the terminal.

Build your own chatbot with SafeChat

1 Question		Answer
2 It is past the voter registrati	ion deadline and I havent up	dfyou
3 What offices, candidates an	nd questions are on my ballo	tThe offices, candidates and questions on a particular ballot will vary depending on the county and districts in which you reside.
4 How and where can I vote 6	early in person?	Visit an early voting center in your county during the early voting period and vote in person like you would at your polling place on election day.
5 Who can vote absentee?		State law allows voters with qualifying reasons to vote absentee by mail:
6 How can I vote absentee?		Step 1: Get your application
7 It's almost Election Day and I still have my absentee ball You can vote your absentee ballot and return it to your county elections office by mail or personal delivery by 7:00 p.m. on election day (or an		
8 I'm not voting early. Where	do I vote on Election Day?	At the polling place in your precinct.
9 What hours are polling place	ces open on Election Day?	Polling places will be open 7:00 a.m. to 7:00 p.m. As long as you are in line by 7:00 p.m., you will be allowed to vote.
10 What do I take with me to v	vote?	Your Photo ID.
11 What if I dont have one of t	these Photo IDs?	Make your voting experience as fast and easy as possible by getting a free Photo ID before voting.

- 1. Create a new 'Chat.csv' file in the 'data/' directory with your desired FAQs. The CSV should have a column called 'Question' with all the queries and another column called 'Answer' with the corresponding answers.
- 2. Run 'code/configure_rasa.py', 'code/extract_intent.py' and 'code/paraphraser.py' files in the same order to create your chatbot.
- 3. Go to the generated 'Chatbot/' directory. Run 'rasa train' to train the chatbot and 'rasa shell' to interact with your chatbot. Also, run 'rasa run actions' in another instance of the terminal.

Working Screenshots: Running the Chatbot

```
(dummy) B:\ResearchPhD\Projects\Work\SafeChat\trustworthy-chatbot\Chatbot>rasa run actions
                                                                                                                                                                            |sers\klakk\.conda\envs\dummy\lib\site-packages\rasa\core\tracker_store.py:830: MovedIn20Warning:
  \Users\klakk\.conda\envs\dummy\lib\site-packages\rasa\core\tracker_store.py:830: MovedIn20Warning:
                                                                                                                                                                                                                                                                       0". Set environment variable SQLALCHEMY_MARN_20=1 to show all deprecation warnings. Set environment va
                                                                                                                                                                            SQLALCHEMY_SILENCE_UBER_MARNING=1 to silence this message. (Background on SQLAlchemy 2.0 at: https://sqlalche.me/e/b8d9)
                                                                                                                                                                         Base: DeclarativeMeta = declarative_base()
   ed to "sqlalchemy<2.0". Set environment variable SQLALCHEMY_WARM_20=1 to show all deprecation warnings. Set environment variable SQLALCHEMY
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  LENCE_UBER_WARNING=1 to silence this message. (Background on SQLAlchemy 2.0 at: https://sqlalche.me/e/b8d9)
 Rase: DeclarativeMeta = declarative hase()
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                                                                                                                                                                        Implementing implicit namespace packages (as specified in PEP 428) is preferred to 'pkg_resources.declare_namespace'. See https://setuptools.pypa.io/en/latest/references/keymords.html#keymord-namespace-pa
:\Users\klakk\.conda\envs\dummy\lib\site-packages\rasa\shared\utils\validation.py:131: DeprecationWarning: pkg_resources is deprecated as an Af
  See https://setuptools.pypa.io/en/latest/pkg_resources.html
                                                                                                                                                                         :\Users\klakk\.comda\emrs\dummy\lib\site-packages\pkg.resources\_init__pp:2871: DeprecationMarning: Deprecated call to 'pkg_resources.declare_namespace('mpl_tookkits')'.
Implementing implicit namespace packages (as specified in 9FP 428) is preferred to 'pkg_resources declare_namespace'. See https://setuotools.pypa.io/en/latest/references/keyword-namespace-pack
 :\Users\klakk\.conda\envs\dummy\lib\site-packages\pkg_resources\__init__.py:2871: DeprecationWarning: Deprecated call to `pkg_resources.declare
namespace('google')'.
Implementing implicit namespace packages (as specified in PEP 420) is preferred to `pkg_resources.declare_namespace`. See https://setuptools.pyp
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a.io/en/latest/references/keywords.html#keyword-namespace-packages
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 declare_namespace(pkg)
C:\Users\klakk\.conda\envs\dummy\lib\site-packages\pkg_resources\__init__.py:2871: DeprecationWarning: Deprecated call to `pkg_resources.declare
                                                                                                                                                                          \Users\klakk\.conda\envs\dummy\lib\site-packages\pkg_resources\_init_.py:2871: DeprecationNarning: Deprecated call to 'pkg_resources.declare_namespace('ruamel')'.
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Implementing implicit namespace packages (as specified in PEP 420) is preferred to `pkg_resources.declare_namespace`. See https://setuptools.py;
a.io/en/latest/references/keywords.html#keyword-namespace-packages
                                                                                                                                                                            sers\klakk\.conda\envs\dummy\lib\site-packages\sklearn\utils\mutticlass.py:14: DeprecationWarning: Please use `spmatrix` from the `scipy.sparse' namespace, the `scipy.sparse.base' namespace is depreca
declare namespace(pkg)
                                                                                                                                                                         from scipy.sparse.base import spmatrix
:\Users\klakk\.conda\envs\dummy\lib\site-packages\pkg_resources\__init__.py:2871: DeprecationWarning: Deprecated call to 'pkg_resources.declare
                                                                                                                                                                           Users|klakk|.conda\envs\dummy\lib\site-packages\future\standard_library\_init_.py:65: DeprecationWarning: the imp module is deprecated in favour of importlib: see the module's documentation for alterna
Implementing implicit namespace packages (as specified in PEP 420) is preferred to 'pkg_resources.declare_namespace'. See https://setuptools.pyp
                                                                                                                                                                         import imp
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a.io/en/latest/references/keywords.html#keyword-namespace-packages
 declare_namespace(pkg)
                                                                                                                                                                          \Users\klakk\.conda\envs\dummv\lib\site-mackages\setugtools\ distutils\version.gv:345: DeprecationWarning: distutils Version classes are deprecated. Use mackaging version instead.
:\Users\klakk\.conda\envs\dummy\lib\site-packages\pkg_resources\__init__.py:2871: DeprecationWarning: Deprecated call to `pkg_resources.declare
 namespace('ruamel')'
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Implementing implicit namespace packages (as specified in PEP 420) is preferred to 'pkg_resources.declare_namespace'. See https://setuptools.pyp
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a.io/en/latest/references/keywords.html#keyword-namespace-packages
                                                                                                                                                                         823-10-24 11:18:27 INFO root - Connecting to channel 'cmdline' which was specified by the '--connector' argument. Any other channels will be ignored, To connect to all given channels, onit the '--con
::\Users\klakk\.conda\envs\dummy\lib\site-packages\sanic_cors\extension.py:39: DeprecationWarning: distutils Version classes are deprecated. Use
                                                                                                                                                                         or' argument.
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packaging.version instead.
                                                                                                                                                                        0823-18-24 11:18:28 INFO rasa.core
                                                                                                                                                                                                                    - Loading model models\20231024-111523-pizzicato-buyer.tar.gz..
 SANIC VERSION = LooseVersion(sanic_version)
                                                                                                                                                                                                                     ommon – The UnexpecTED Intent Policy is currently experimental and might change or be removed in the future 🛦 Please share your feedback on it in the forum
2023-10-24 11:18:16 INFO rasa_sdk.endpoint - Starting action endpoint server...
                                                                                                                                                                           3-10-24 11:19:23 INFO root - Rasa server is up and running.
2023-10-24 11:18:16 INFO rasa_sdk.executor - Registered function for 'action_save_conversation'.
                                                                                                                                                                             paded. Type a message and press enter (use '/stop' to exi
2023-10-24 11:18:16 INFO rasa_sdk.executor - Registered function for 'action_session_id'
2023-10-24 11:18:16 INFO rasa_sdk.endpoint - Action endpoint is up and running on http://0.0.0.0:5055
```

Working Screenshots: Talking to the Chatbot

```
2023-10-24 11:30:29 INFO root - Rasa server is up and running.

Bot loaded. Type a message and press enter (use '/stop' to exit):

Your input -> What is the capital of South Carolina?

The capital of South Carolina is Columbia.

Your input -> What is the capital of Arizona?

The capital of Arizona is Phoenix.

Your input -> What is the capital of North Carolina?

The capital of North Carolina is Raleigh.
```

Survey Link

Please fill the survey using the following link to help us improve our SafeChat architecture.



Course Project

Project Discussion: What Problem Fascinates You?

- Data
 - Water
 - Finance
 - •
- Analytics
 - Search, Optimization, Learning, Planning, ...
- Application
 - Building chatbot
- Users
 - Diverse demographics
 - Diverse abilities
 - Multiple human languages

Project execution in sprints

- Sprint 1: (Sep 12 Oct 5)
 - Solving: Choose a decision problem, identify data, work on solution methods
 - Human interaction: Develop a basic chatbot (no AI), no problem focus
- Sprint 2: (Oct 10 Nov 9)
 - Solving: Evaluate your solution on problem
 - Human interaction: Integrated your choice of chatbot (rule-based or learning-based) and methods
- Sprint 3: (Nov 14 30)
 - Evaluation: Comparison of your solver chatbot with an LLMbased alternative, like ChatGPT

CSCE 580, 581 - FALL 2023 2

Project Discussion: Dates and Deliverables

Project execution in sprints

- Sprint 1: (Sep 12 Oct 5)
 - Solving: Choose a decision problem, identify data, work on solution methods
 - Human interaction: Develop a basic chatbot (no AI), no problem focus
- Sprint 2: (Oct 10 Nov 9)
 - Solving: Evaluate your solution on problem
 - Human interaction: Integrated your choice of chatbot (rule-based or learning-based) and methods
- Sprint 3: (Nov 14 30)
 - Evaluation: Comparison of your solver chatbot with an LLMbased alternative, like ChatGPT

- Oct 12, 2023
- Project checkpoint
- In-class presentation
- Nov 30, 2023
- Project report due
- Dec 5 / 7, 2023
 - In-class presentation

CSCE 580, 581 - FALL 2023 2

Skeleton: A Basic Chatbot

- Run in an infinite loop until the user wants to quit
- Handle any user response
 - User can quit by typing "Quit" or "quit" or just "q"
 - User can enter any other text and the program has to handle it. The program should write back what the user entered and say – "I do not know this information".
- Handle <u>known</u> user query types // <u>Depends on your project</u>
 - "Tell me about N-queens", "What is N?"
 - "Solve for N=4?"
 - "Why is this a solution?"
- Handle chitchat // Support at least 5, extensible from a file
 - "Hi" => "Hello"
 - ...
- Store session details in a file

Illustrative Project

- **1. Title**: Solve and explain solving of n-queens puzzle
- **2. Key idea**: Show students how a course project will look like
- 3. Who will care when done: students of the course, prospective Al students and teachers
- **4. Data need**: n: the size of game; interaction
- 5. Methods: search
- **6. Evaluation**: correctness of solution, quality of explanation, appropriateness of chat
- **7. Users**: with and without Al background; with and without chess background
- **8. Trust issue**: user may not believe in the solution, may find interaction offensive (why queens, not kings? ...)

Project Discussion: Illustration

- Create a private Github repository called "CSCE58x-Fall2023-<studentname>-Repo". Share with Instructor (biplav-s) and TA (kausik-l)
- Create Google folder called "CSCE58x-Fall2023-<studentname>-SharedInfo". Share with Instructor (prof.biplav@gmail.com) and TA (lakkarajukausik90@gmail.com)
- 3. Create a Google doc in your Google repo called "Project Plan" and have the following by next class (Sep 5, 2023)

- 1. Title: Solve and explain solving of n-queens puzzle
- 2. Key idea: Show students how a course project will look like
- **3.** Who will care when done: students of the course, prospective AI students and teachers
- **4. Data need**: n: the size of game; interaction
- 5. Methods: search
- **6. Evaluation**: correctness of solution, quality of explanation, appropriateness of chat
- **7. Users**: with and without AI background; with and without chess background
- **8. Trust issue**: user may not believe in the solution, may find interaction offensive (why queens, not kings? ...)

CSCE 580, 581 - FALL 2023 2

Project Illustration: N-Queens

- Sprint 1: (Sep 12 Oct 5)
 - · Solving: Choose a decision problem, identify data, work on solution methods
 - Method 1: Random solution
 - Method 2: Search BFS
 - Method 3: Search ...
 - Human interaction: Develop a basic chatbot (no AI) as outlined
 - Deliverable
 - Code structure in Github
 - ./data
 - ./code
 - ./docs
 - ./test
 - Presentation: Make sprint presentation on Oct 12, 2023

Reference: Project Rubric

- Project results 60%
 - Working system ? 30%
 - Evaluation with results superior to baseline? 20%
 - Considered related work? 10%
- Project efforts 40%
 - Project report 20%
 - Project presentation (updates, final) 20%
- Bonus
 - Challenge level of problem 10%
 - Instructor discretion 10%
- Penalty
 - Lack of timeliness as per announced policy (right) up to 30%

Milestones and Penalties

- Oct 12, 2023
 - Project checkpoint
 - In-class presentation
 - Penalty: presentation not ready by Oct 10, 2023 [-10%]
- Nov 30, 2023
 - Project report due
 - Project report not ready by date [-10%]
- Dec 5 / 7, 2023
 - In-class presentation
 - Project presentations not ready by Dec 4, 2023 [-10%]

Lecture 17: Summary

- We talked about
 - Building Chatbots
 - Rasa
 - SafeChat Framework

Concluding Section

About Next Lecture – Lecture 18

Lecture 18: Explanation, Machine Learning – Unsupervised

- Recap: Trusted AI/ Explanations
- Unsupervised ML/ Clustering