



CSE 543: Information Assurance and Security

Using Machine Learning to detect classifying Malware in IoT Systems

Group 14 Weekly Report - 10

Person prepared this report: All the members of the group

Person approved this report: Amogh Manoj Joshi

Person submitted this report: Priyadarshini Venkatesan

List of members

1. Amogh Manoj Joshi (Group Leader)
2. Priyadarshini Venkatesan (Deputy Leader)
3. Vignan Varma Chekuri
4. Venkata Karthik Reddy Peddireddy
5. Siva Priya Bollineni
6. Anusha Akuthota
7. Sarika Naidu Chirki
8. Ramya Thota

Meeting Notes

03/24/2023: [12:30 pm - 1:00 pm] [Mode: In Person] [Loc: Hayden Library, common area]

- A last in-person meeting was held to finalize the to-do tasks for the remaining days till the report submission.
- The group members had summarized their detailed results based on the research papers they had read.
- The list of contents, organization of topics and flow of report was discussed in the meeting. Similarly, the remaining to-do tasks were discussed and distributed among the group members.
- **Attendance:** All the members were present.

Tasks Summary

Task Number	Task Name	Description of Task	Member	Task Status
1	Summarizing individual learnings	Team members summarized their learning for the project.	All Members	Done
2	Discussing and finalizing topics	Agreed on what to include on the final report	All Members	Done
3	Distributing to-do tasks	The task for the report was split among the team-mates.	All Members	Done
4	Working on the remaining to-do tasks	Members are working simultaneously on the tasks allocated to them.	All Members	On-Going
5	Preparing the final report	Members are collaborating for the final draft of the report	All Members	On-Going

Task Progress

Task Name	Member	Date and time of Review	Reviewer(s)	Mode of Review	Review Conclusion	Recommended Action
1)Summarizing individual learnings	All members	03/23/2023	All the members of the group	Group meeting	Satisfactory	Completed
2)Discussing and finalizing topics	All members	03/24/2023	All the members of the group	Group meeting	Satisfactory	Completed
3)Distributing to-do tasks	All members	03/24/2023	All the members of the group	Group meeting	Satisfactory	Completed
4)Working on the remaining to-do tasks	All members	03/28/2023	All the members of the group	Group meeting	Needs work	Ongoing
5)Preparing the final report	All members	03/28/2023	All the members of the group	Group meeting	Needs work	Ongoing

Problems:

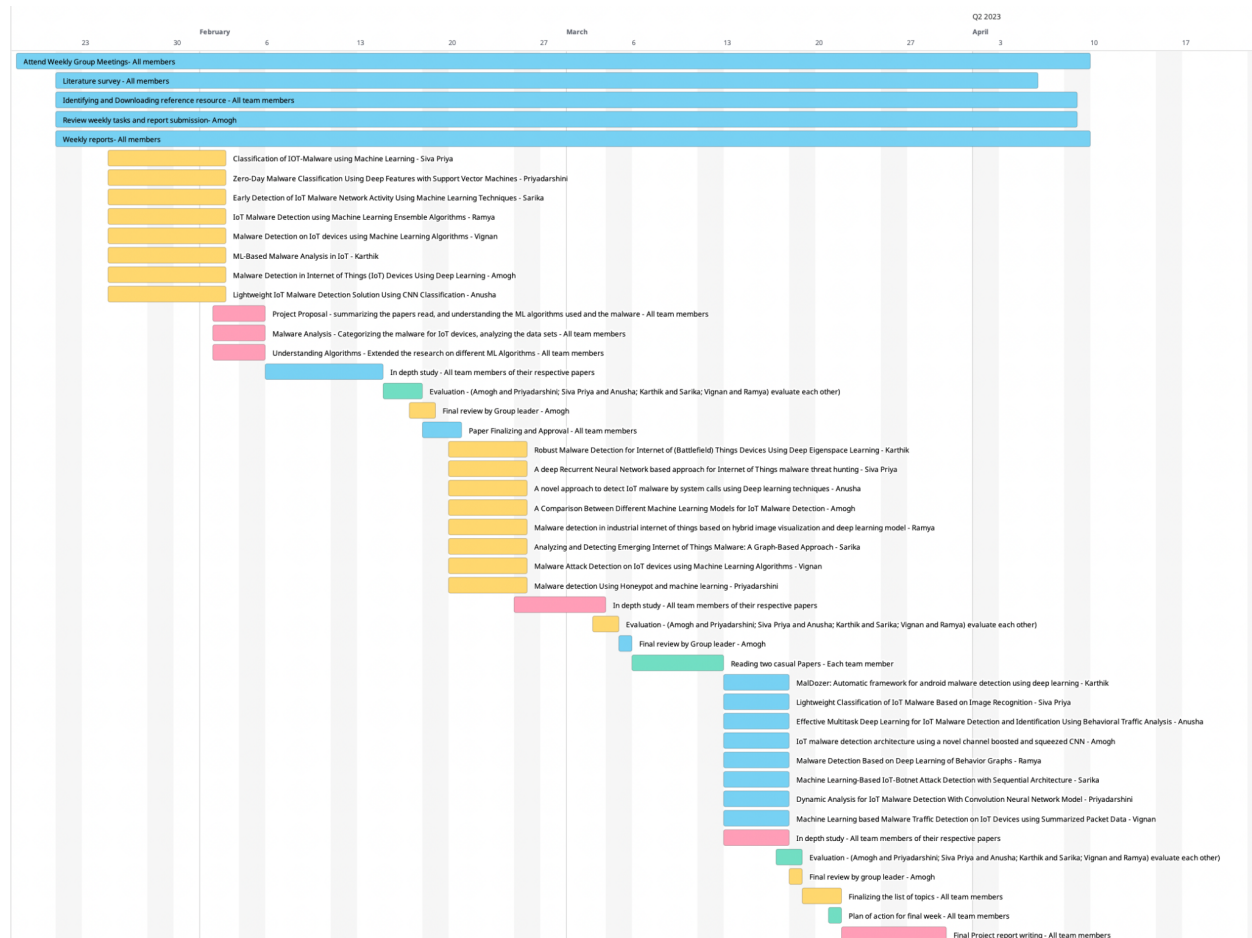
Faced by: All Team Members

Status: Solved

Problem: Assembling data and organizing the content into a single report.

Gantt Chart:

[Link to Gantt Chart](#)



References:

Indepth:

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Casual:

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