Business Context and Justification of Approach

In the current environment, the process of matching skills to a job description is a time-consuming exercise for both the recruiter and the job seeker. The manual review of candidates' CVs during the recruitment process or even the use of keywords as a mechanism to filter the candidates lacks accuracy, is cumbersome, is highly subjective, and in turn results in unsuitable matches (Negi and Kumar, 2014).

That being said, there is a significant need for recruitment services that can match job descriptions and CVs and in turn optimize resource allocation for companies and enhance the recruitment process in terms of accuracy and efficiency.

Job matching systems are intelligent systems that help companies to identify the best candidates for a specific role, but also help candidates to identify the job roles that are more suitable to them and in turn have more chances to be offered the job.

Compared to other job matching systems, such as the Content-based system that provides recommendations based on the attributes and characteristics of the CVs or the Collaborative filtering system that provides recommendations based on the behavior and preferences of multiple users, the ontology-based matching system is preferred as it combines job specificities, industry standards, and qualifications to provides its recommendations.

In particular, the ontology-based matching system, through semantic understanding of data, ensures that matches are done based relevance of all concepts and not merely based on exact skills matching (Grimm et al., 2011). In addition, flexibility of such systems allows for adding new skills or qualification as the market evolves in order to identify the most suitable candidates for the companies and the most suitable job roles for the job seekers (Tang et al., 2023; Zhao and Meersman, 2005).

To facilitate the recruitment process and given the benefits of an ontology-based systems in terms of effectiveness and personalised job searches as describes before, such a prototype system was developed using Protégé (DeBellis, 2021). The design follows a domain-driven

structure that includes core classes (Table 1), object and data properties (Table 2), and a matching logic implemented through the use of SWRL rules (Figure 1).

Table 1. Core classes

Core class	Description				
Job Seeker	Refers to individuals looking for a job				
Job	Refers to open job opportunities				
Skill	Refers to an abstract category used to match job requirements and				
	candidates' CV				
Qualification	Refers to an abstract category used to match job requirements and				
	candidates' CV				
Experience	Refers to an abstract category used to match job requirements and				
	candidates' CV				

Table 2. Data and object properties

Job Seeker					
Data properties	hasName, hasYearsExperience,				
	hasPreferredLocation				
Object properties	hasSkill, hasQualification,				
,	hasExperienceLevel				
Job					
Object properties	requiresSkill, requiresQualification,				
	requiresExperienceLevel, hasLocation				

Figure 1. SWRL rule

JobSeeker(?js)	٨	Job(?job)	٨	hasSkill(?js,	?skill)	٨	requiresSkill(?job,	?skill)->
matchesJob(?js	, ?jc	ob)						

Such design was adopted as it includes key variables of a recruitment process, such as qualification, skills, experience, and preferences, as well as because it provides the flexibility of adding further requirements such as language preference due to its semantic richness.

Finally, the use of SWRL rule enables the Al-driven goal of the service and it facilitates the automated reasoning in order job seekers to be provided roles more suitable to their profiles and companies to be able to shortlist the most suitable profiles for the roles they are seeking to fill.

Analysis of Outputs with Evidence of Testing

After populating the ontology with example individuals, such as JobSeekerJohnStan and SeniorProcurementOfficer, assigning appropriate skills, qualifications, and experience, SWRL rule was applied to infer job matches. Running the Pellet reasoner as well, this rule correctly matched the job seeker to a job role and such relationship was appeared in the relevant section (Object Property Assertions) confirming that that the system is working properly.

Testing was performed during the development of the ontology systems and included the application of data and object property assertions to sample individuals, running of reasoning (Pellet) at each stage to ensure the ontology is able to infer relationships without errors, and use of SWRL Tab in order to define relevant matching rules. The system throughout the testing process provided evidence of effectiveness and rule-based reasoning for job matching. Appendix 1 includes screenshots of the outputs from Protégé.

As already mentioned, this ontology is not a theoretical framework but is a practical solutions that can help for companies and job seekers during the recruitment process. It is actually a semi-automated screening process that can be used to flag matches between CVs and job roles based on pre-defined rules.

The ontology that has been developed is a simple prototype and the objective is to present the capabilities of such system. However, considering the flexibility of ontology-based systems, this ontology can expand and include new job sectors, diverse candidates' CVs, additional rules with pre-defined weights, as well as additional preferences.

Additionally, given that the system does not perform the matching based on job titles or keywords but relies on semantic relationships, it can be used even in cases where job descriptions are continuously changing or where regional criteria may be applied.

Conclusion

This prototype ontology supports intelligent job matching and could result in effectiveness and efficiency gains during the recruitment process, providing several benefits for both the companies and job seekers. It provides a foundation for further development and subsequent deployment in an HR environment. Its reasoning capabilities and flexible design, contribute to the scalability and explainability of the systems, essential elements of an automated job matching system.

References

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Appendix 1. Screenshots of Progete outputs









