جامعة الحسن الثاني بالدار البيضاء +ه٠٥٨ ما المهود المهمود المهمد المهمود المهمد المهمد UNIVERSITÉ HASSAN II DE CASABLANCA

ECOLE NORMALE SUPERIEURE DE L'ENSEIGNEMENT TECHNIQUE DE MOHAMMEDIA



DÉPARTEMENT MATHÉMATIQUE INFORMATIQUE

Traitement parallèle en Big Data

Rapport

Examen

Réalisé par :

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Professeur:

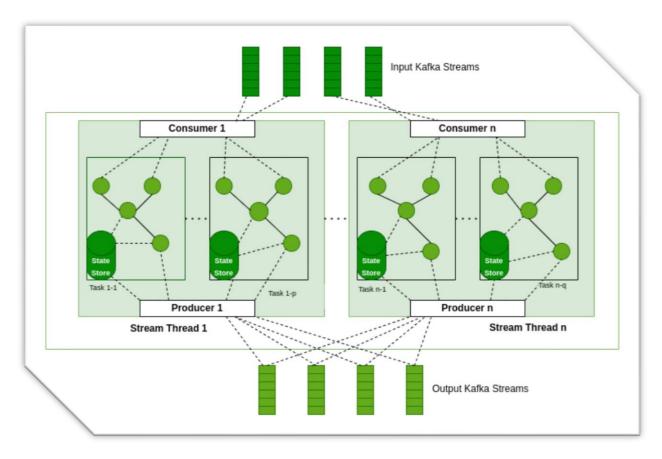
Mr. MOHAMED YOUSSFI

3ème année II-BDCC

Filière d'ingénieur : Ingénieur informatique, Big Data et Cloud Computing

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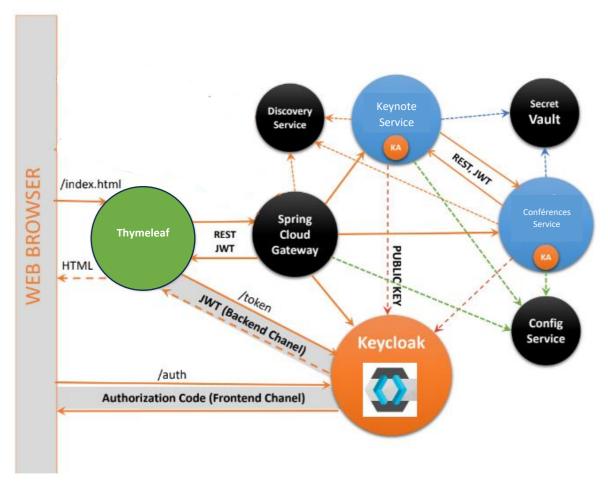
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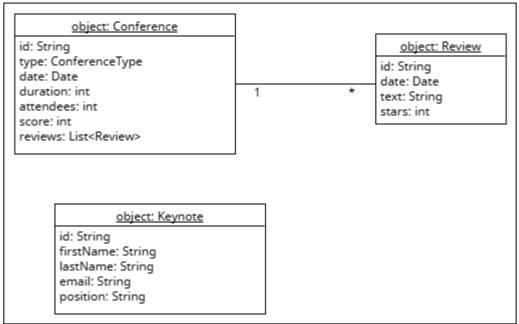


Le traitement parallèle occupe une place centrale dans le domaine du Big Data, où le volume, la variété et la vélocité des données posent des défis uniques. Face à cette réalité, les approches traditionnelles de traitement des données se révèlent souvent insuffisantes. C'est dans ce contexte que le traitement parallèle émerge comme une solution incontournable, permettant la distribution et l'exécution simultanée de tâches complexes sur des ressources informatiques multiples. Cette approche révolutionnaire transcende les limitations imposées par la capacité de traitement d'une seule machine, offrant une scalabilité et une efficacité sans précédent pour le traitement des ensembles de données massifs. Dans cette exploration, nous plongerons dans les fondements du traitement parallèle en Big Data, examinant les concepts clés, les modèles de programmation et les technologies qui propulsent cette révolution dans le domaine de l'informatique distribuée.

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A. Établir une architecture technique du projet





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B. Créer un Projet Maven incluant les micro-services suivants : keynoteservice, conference-service, gateway-service, discovery-service, config-service et angular-front-app

Conference-service

```
<dependencies>
       <groupId>org.springframework.boot
       <artifactId>spring-boot-starter-data-jpa</artifactId>
   </dependency>
       <groupId>org.springframework.boot</groupId>
       <artifactId>spring-boot-starter-oauth2-client</artifactId>
   </dependency>
       <groupId>org.thymeleaf.extras
       <artifactId>thymeleaf-extras-springsecurity6</artifactId>
   </dependency>
       <artifactId>bootstrap</artifactId>
   </dependency>
       <groupId>nz.net.ultraq.thymeleaf
       <artifactId>thymeleaf-layout-dialect</artifactId>
       <version>3.2.1
   </dependency>
       <groupId>org.springframework.boot
       <artifactId>spring-boot-starter-thymeleaf</artifactId>
   </dependency>
       <groupId>org.springframework.boot</groupId>
       <artifactId>spring-boot-starter-web</artifactId>
   </dependency>
       <scope>runtime</scope>
   </dependency>
   <dependency>
       <groupId>org.projectlombok
   </dependency>
       <groupId>org.springframework.boot</groupId>
       <artifactId>spring-boot-starter-test</artifactId>
       <scope>test</scope>
   </dependency>
       <groupId>org.springframework.boot
       <artifactId>spring-boot-starter-actuator</artifactId>
   </dependency>
       <groupId>org.springframework.boot
       <artifactId>spring-boot-starter-data-jpa</artifactId>
```

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```
</dependency>
<dependency>
    <groupId>org.springframework.boot</groupId>
    <artifactId>spring-boot-starter-data-rest</artifactId>
</dependency>
   <groupId>org.springframework.boot
    <artifactId>spring-boot-starter-web</artifactId>
<dependency>
   <groupId>org.springframework.cloud
   <artifactId>spring-cloud-starter-config</artifactId>
   <version>4.1.0
</dependency>
   <groupId>org.springframework.cloud
   <artifactId>spring-cloud-starter-consul-discovery</artifactId>
   <version>4.1.0
</dependency>
   <artifactId>h2</artifactId>
   <scope>runtime</scope>
</dependency>
<dependency>
   <groupId>org.projectlombok</groupId>
</dependency>
   <groupId>org.springframework.boot
    <artifactId>spring-boot-starter-test</artifactId>
    <scope>test</scope>
</dependency>
<dependency>
   <groupId>org.springdoc</groupId>
    <artifactId>springdoc-openapi-starter-webmvc-ui</artifactId>
</dependency>
```

Keynote-service

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```
<dependency>
        <groupId>org.projectlombok</groupId>
        <optional>true</optional>
   </dependency>
       <groupId>org.springframework.boot
       <artifactId>spring-boot-starter-test</artifactId>
       <scope>test</scope>
   </dependency>
        <groupId>org.springframework.boot</groupId>
       <artifactId>spring-boot-starter-actuator</artifactId>
   </dependency>
        <artifactId>spring-boot-starter-data-jpa</artifactId>
   </dependency>
       <groupId>org.springframework.boot</groupId>
        <artifactId>spring-boot-starter-data-rest</artifactId>
   </dependency>
        <artifactId>spring-boot-starter-web</artifactId>
    </dependency>
   <dependency>
       <groupId>org.springframework.cloud
       <artifactId>spring-cloud-starter-config</artifactId>
   </dependency>
   <dependency>
       <groupId>org.springframework.cloud
        <artifactId>spring-cloud-starter-consul-discovery</artifactId>
   </dependency>
        <artifactId>h2</artifactId>
       <scope>runtime</scope>
   </dependency>
   </dependency>
        <groupId>org.springframework.boot</groupId>
       <artifactId>spring-boot-starter-test</artifactId>
       <scope>test</scope>
   </dependency>
       <groupId>org.springdoc</groupId>
       <artifactId>springdoc-openapi-starter-webmvc-ui</artifactId>
   </dependency>
</dependencies>
```

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gateway-service

discovery-service

```
<groupId>org.springframework.boot
      <artifactId>spring-boot-starter-actuator</artifactId>
   </dependency>
      <groupId>org.springframework.boot</groupId>
      <artifactId>spring-boot-starter-web</artifactId>
   </dependency>
      <artifactId>spring-cloud-starter-consul-config</artifactId>
   <dependency>
      <groupId>org.springframework.cloud</groupId>
   </dependency>
   <dependency>
      <artifactId>spring-cloud-starter-vault-config</artifactId>
   </dependency>
      <groupId>org.projectlombok</groupId>
      <optional>true</optional>
   </dependency>
      <artifactId>spring-boot-starter-test</artifactId>
   </dependency>
/dependencies>
```

config-service

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C. Développer et tester les micro-services discovery-service et gatewayservice et config-service

gateway-service

Application

Application.properties

```
server.port=9999
spring.application.name=gateway-service
spring.config.import=optional:configserver:http://localhost:8888
```

config-service

Application

```
@SpringBootApplication
@EnableConfigServer
@EnableDiscoveryClient
public class Application {
    public static void main(String[] args) {
        SpringApplication.run(Application.class, args);
    }
}
```

Application.properties

```
server.port=8888
spring.application.name=config-service
spring.cloud.config.server.git.uri=file:///C:/Tools/config-repo
```

discovery-service

```
© ConsulApplication
© ConsulConfigRestController
© MyConsulConfig
© MyVaultConfig

Tesources

⇒ application.properties

API rest-api-http.http
```

consul-application

```
@Bean
CommandLineRunner commandLineRunner() {
    return args -> {
```

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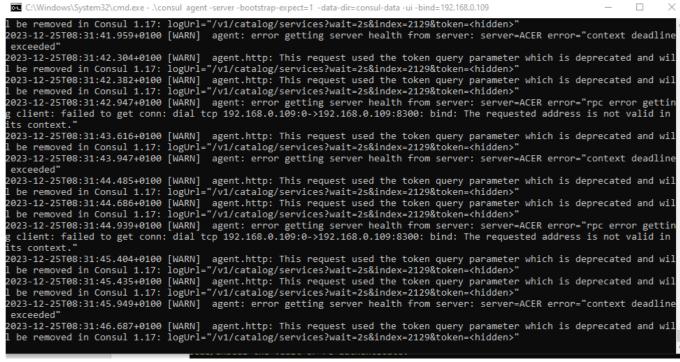
Application.properties

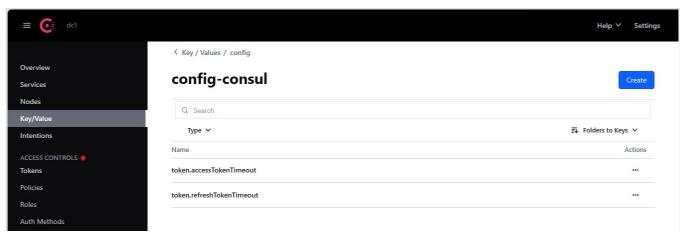
```
server.port=8084
spring.application.name=config-consul
management.endpoints.web.exposure.include=*

#by default
spring.config.import=optional:consul:, vault://
spring.cloud.vault.token=hvs.yn9wJcMXw3vDilCUCqtHaMTX
spring.cloud.vault.scheme=http
spring.cloud.vault.kv.enabled=true
```

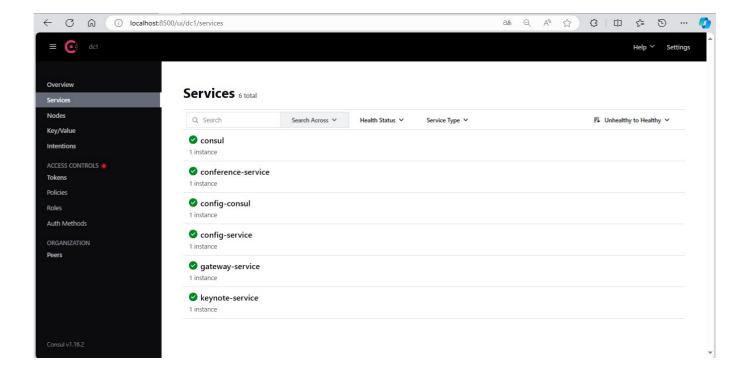
Teste

Démarrer consul





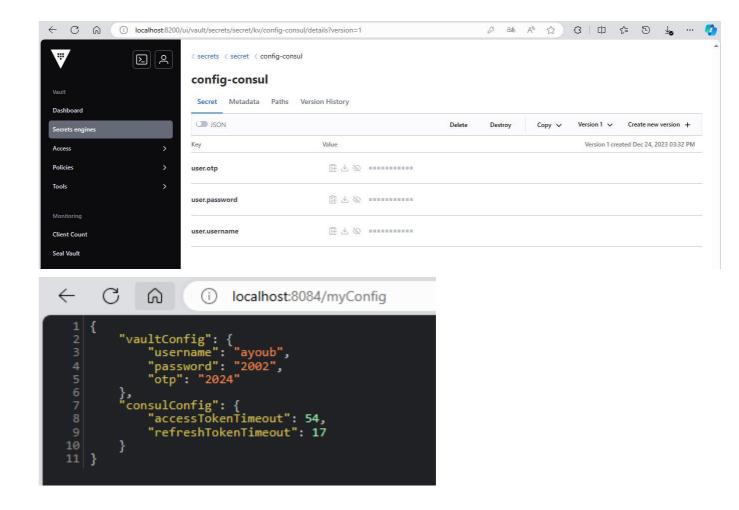
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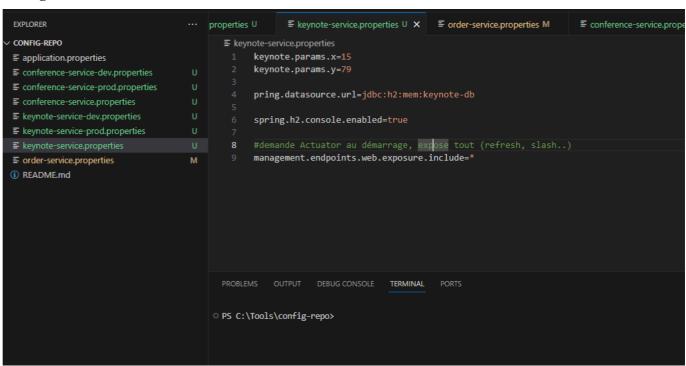
Démarrer vault

```
C:\Windows\System32\cmd.exe - vault server -dev
2023-12-24T12:49:44.867+0100 [INFO]
                                       rollback: Starting the rollback manager with 256 workers
2023-12-24T12:49:44.867+0100 [INF0]
2023-12-24T12:49:44.867+0100 [INF0]
                                       rollback: starting rollback manager
                                       core: restoring leases
                                       expiration: lease restore complete
2023-12-24T12:49:44.867+0100 [INFO]
2023-12-24T12:49:44.867+0100 [INFO]
                                       identity: entities restored
2023-12-24T12:49:44.867+0100
                               [INFO]
                                       identity: groups restored
2023-12-24T12:49:44.867+0100 [INFO]
                                       core: post-unseal setup complete
2023-12-24T12:49:44.867+0100 [INFO] core: vault is unsealed
2023-12-24T12:49:44.887+0100 [INFO] core: successful mount: namespace="" path=secret/ type=kv version=""
WARNING! dev mode is enabled! In this mode, Vault runs entirely in-memory
and starts unsealed with a single unseal key. The root token is already
authenticated to the CLI, so you can immediately begin using Vault.
You may need to set the following environment variables:
PowerShell:
    $env:VAULT_ADDR="http://127.0.0.1:8200"
cmd.exe:
    set VAULT_ADDR=http://127.0.0.1:8200
The unseal key and root token are displayed below in case you want to
seal/unseal the Vault or re-authenticate.
Unseal Key: W7nUmwwVT2BTdq2eaV4WEIZnqV8lhi5PwB6L4KR+GSM=
Root Token: hvs.yn9wJcMXw3vDilCUCqtHaMTX
Development mode should NOT be used in production installations!
C:\Tools\vault>vault kv put secret/vaultConfig user.username=ayoub user.password=2002 user.otp=2024
 ==== Secret Path =====
secret/data/vaultConfig
 ===== Metadata ======
                     Value
Key
created_time
                     2023-12-24T14:26:51.8006953Z
custom_metadata
                     <nil>
deletion_time
                     n/a
destroyed
                     false
version
```

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Config



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D. Développer et tester le micro-service Keynote-service (Entities, DAO, service, DTO, Mapper, RestController)

keynote-service

entities

```
@Entity
@Data @NoArgsConstructor @AllArgsConstructor @Builder
public class Keynote {
     @Id
          @GeneratedValue(strategy = GenerationType.IDENTITY)
          private Long id;
          private String firstName;
          private String lastName;
          private String email;
          private String jobTitle;
}
```

Web RestController

```
@RestController
@RefreshScope
public class Controller {
     @Value("${global.params.p1}")
     private String p1;
     @Value("${global.params.p2}")
     private String p2;
     @Value("${inventory.params.x}")
     private String x;
     @Value("${inventory.params.y}")
     private String y;
     @GetMapping("/params")
     public Map<String, String> params(){
         return Map.of("p1",p1,"p2",p2,"x",x,"y",y);
     }
}
```

```
@RestController
public class KeynoteRestController {
    private KeynoteRepository keynoteRepository;

    public KeynoteRestController(KeynoteRepository keynoteRepository) {
        this.keynoteRepository = keynoteRepository;
    }
    @GetMapping("/keynotes")

// @PreAuthorize("hasAuthority('ADMIN')")
    public List<Keynote> products() {
        return keynoteRepository.findAll();
    }
}
```

Application

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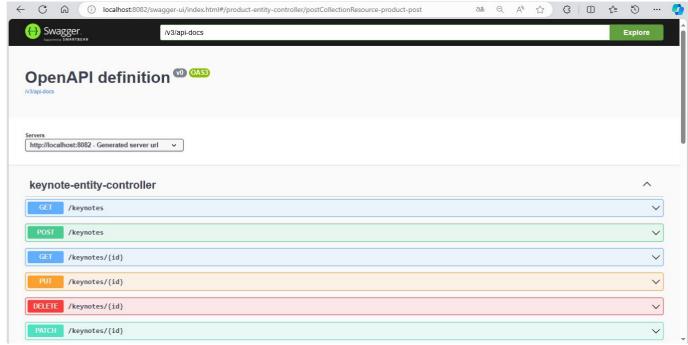
```
} ;
```

application.properties

```
server.port=8082
spring.application.name=keynote-service
spring.config.import=optional:configserver:http://localhost:8888
#demande Actuator au démarrage, expose tout (refresh, slash..)
management.endpoints.web.exposure.include=*
```

Teste





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E. Développer et tester le micro-service conférence-service (Entities, DAO, service, DTO, Mapper, RestController, Client Rest Open Feign)

entities

```
@Entity
@NoArgsConstructor @AllArgsConstructor @Getter @Setter @ToString @Builder
public class Conference {
    private Long id;
    private String titre;
    private ConferenceType type; // académique ou commerciale
    private Date date;
    private int duree; // en minutes
    private int nombreInscrits;
    private int score;

    // Relation avec les reviews
    @OneToMany(mappedBy = "conference", cascade = CascadeType.ALL)
    private List<Review> reviews;
}
```

Enum

```
public enum ConferenceType {
    ACADEMIC,
    COMMERCIAL
}
```

model

```
@NoArgsConstructor @AllArgsConstructor @Getter @Setter @Builder
public class Keynote {
    private Long id;
    private String firstName;
    private String lastName;
    private String email;
    private String jobTitle;
}
```

Web RestController

```
@RestController
@RefreshScope
public class Controller {
    @Value("${global.params.p1}")
    private String p1;
    @Value("${global.params.p2}")
    private String p2;
    @Value("${conference.params.x}")
    private String x;
    @Value("${conference.params.y}")
    private String y;
    @Value("${conference.params.y}")
    private String y;
    @GetMapping("/params")
    public Map<String, String> params(){
        return Map.of("p1",p1,"p2",p2,"x",x,"y",y);
    }
}
```

```
@Controller
public class ConferenceController {
    private ConferenceRepository conferenceRepository;
    private ClientRegistrationRepository clientRegistrationRepository;

    public ConferenceController(ConferenceRepository conferenceRepository,
    ClientRegistrationRepository clientRegistrationRepository) {
        this.conferenceRepository = conferenceRepository;
        this.clientRegistrationRepository = clientRegistrationRepository;
    }

    @GetMapping("/index")
```

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```
@GetMapping("/conferences")
   @PreAuthorize("hasAuthority('ADMIN')")
   public String keynotes(Model model) {
       SecurityContext context = SecurityContextHolder.getContext();
       Authentication authentication = context.getAuthentication();
       OAuth2AuthenticationToken oAuth2AuthenticationToken=
(OAuth2AuthenticationToken) authentication;
       DefaultOidcUser oidcUser = (DefaultOidcUser)
                .headers(httpHeaders -> httpHeaders.set(HttpHeaders.AUTHORIZATION,
                .body(new ParameterizedTypeReference<>(){});
       Map<String, String> oauth2AuthenticationUrls = new HashMap();
        Iterable<ClientRegistration> clientRegistrations =
(Iterable<ClientRegistration>) clientRegistrationRepository;;
        clientRegistrations.forEach(registration ->{
            oauth2AuthenticationUrls.put(registration.getClientName(),
registration.getRegistrationId());
```

Application

```
@SpringBootApplication
public class ConferenceFrontThymeleafAppApplication {
```

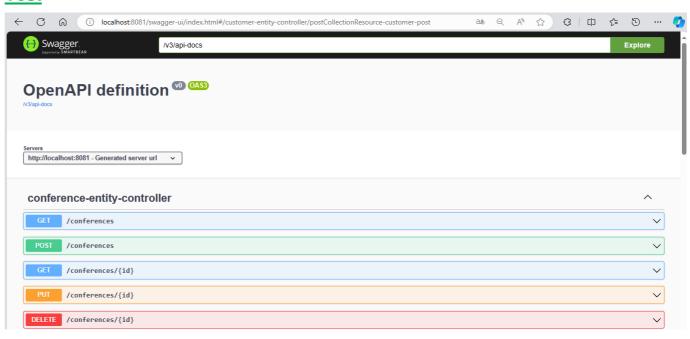
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application.properties

```
uri=http://localhost:8081/login/oauth2/code/enset-Conference-client
uri=http://localhost:8080/realms/enset-realm
```

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Test



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F. Développer un simple frontend web pour l'application

```
    ➤ ☐ resources
    ➤ templates
    <> conferences.html
    <> index.html
    <> keynotes.html
    <> notAuthorized.html
    <> oauth2Login.html
    <> template.html
    application.properties
    API rest-api-http.http
```

Conferences

```
<!DOCTYPE html>
  <meta charset="UTF-8">
  <title>Conference</title>
IDTitreTypeDateDurée
               </thead>
            </div>
      </div>
    </div>
 </div>
</body>
```

Keynotes

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Index

Template

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```
<link rel="stylesheet" type="text/css"</pre>
    <script src="webjars/bootstrap/5.3.2/js/bootstrap.bundle.js"></script>
DEQH/xAACAAEAAQUBAQAAAAAAAAAAAAABgIDBAUHAQj/xABFEAACAQIDBQQIAggEBACAAAABAgADEQQFIQYS
y7WmBmBsJMWWOa5tQAB0s5Z2PQAk2Hw1mb6N6vq8ywxPvM6/xIwHztLeYod83sblpj70kpjsKelVLd/bAnpY3
bFUiFsB5yR+pEwMZR0MOJMZ7NAeE0G0VQqgdPaBG74t2R/NJFVS0juaOpq0UbVWq079w3h95tj6In2TPLsKqU
```

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GPxW+wA9hAFQdFH58fObrabMwzHd03tAPwoOHm3GR/DpzM0g7VmOSk6RdU20nT/AEU7YlKn6JVP6s2FNifYc+ IiIBZr1VRWZjZVBJPQAXJnzhhtoAcS7gWV3dh+6zEjznctr8ci4arvLvqFsyj3r6bpPnrPnjNsnqUarq11VLF WiVXno1mtTGA87z18Yo5xyQ4MzXUTXYzEqomFjc/ROyCC3S4kRzTP73JYADhbW8h76LxjW5G3zvOAiGx8+k51 hI99x1PMDj4y21ZcBhvVKbVqqBquPaF+FNTy05+MhWLxTO1zoOQ5Ad0s1yf8ACnLhH+1t2Z2uTckzMqU7LaU4 SlbUy7iW0mqMP6a3duQvXjMxjawEYJOLHifpKMQe1JINhqcc9Ih0cow1BUkH4iTnKfSbi6dq5WqB+Idr+Ife8 5ujazIJvrzkqip3PKPShhKllqq1JupG8vxGo+EmmDxtOqu9TdXU81IP0ny0lbkZmYPMqtJq9Ko6MOakq/KOIs rDv7KH9ojie4TnWxDVcTma4jEMXfcqOSfd0Cr4DtaCTHboiWlZMswzAvXp0EuyI96rN7781PeWN/KXs62WSvh Bhyx3kW6PxKvx/hPC3SazK8busHYD9fidwtyVgzLY9L7ot4yZu46zozaSSObC7bbPnGtRYXuLMpKsOjLoRKaG <button class="navbar-toggler" type="button" data-bs-toggle="collapse" data-bs-</pre> expanded="false" aria-label="Toggle navigation"> Conferences Keynotes <a class="nav-link disabled" href="#" tabindex="-1" aria-</pre> disabled="true">Disabled role="button" data-bs-toggle="dropdown" aria-expanded="false"> Login

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Oauth2login

notAuthorized

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</div>
</div>
</body>
</html>

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G. Sécuriser l'application avec une authentification Keycloak

Coference

```
package ma.enset.conferencefrontthymeleafapp.sec;
import org.springframework.security.config.annotation.web.builders.HttpSecurity;
import org.springframework.security.core.authority.SimpleGrantedAuthority;
import org.springframework.security.core.authority.mapping.GrantedAuthoritiesMapper;
org.springframework.security.oauth2.client.oidc.web.logout.OidcClientInitiatedLogoutS
org.springframework.security.oauth2.client.registration.ClientRegistrationRepository;
@EnableMethodSecurity(prePostEnabled = true)
       this.clientRegistrationRepository = clientRegistrationRepository;
Exception {
                .authorizeHttpRequests(ar-
>ar.requestMatchers("/","/oauth2Login/**","/webjars/**","/h2-
console/**").permitAll())
                .authorizeHttpRequests(ar->ar.anyRequest().authenticated())
                .headers(h->h.frameOptions(fo->fo.disable()))
                .oauth2Login(al->
                        al.loginPage("/oauth2Login")
                        .defaultSuccessUrl("/")
                .logout((logout) -> logout
                .logoutSuccessHandler(oidcLogoutSuccessHandler())
                   .logoutSuccessUrl("/").permitAll()
                .exceptionHandling(eh->eh.accessDeniedPage("/notAutorized"))
   private OidcClientInitiatedLogoutSuccessHandler oidcLogoutSuccessHandler() {
        final OidcClientInitiatedLogoutSuccessHandler oidcLogoutSuccessHandler =
```

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keyknote

JwtAuthConverter

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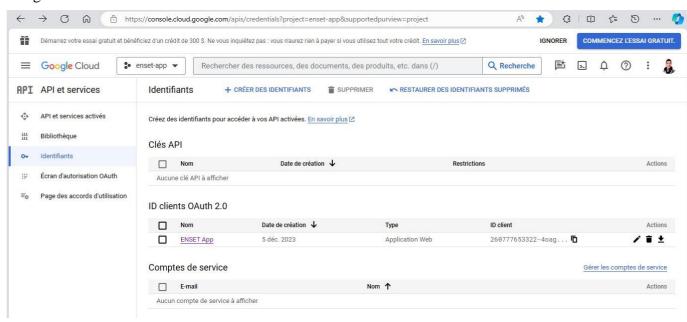
SecurityConfig

Interfaces

Conference: USER, ADMIN

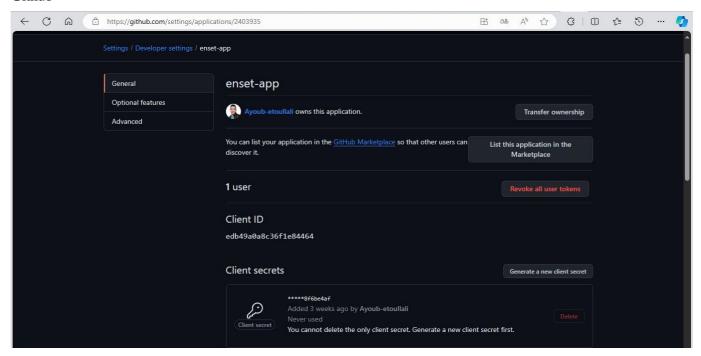
Keynote: ADMIN

Google

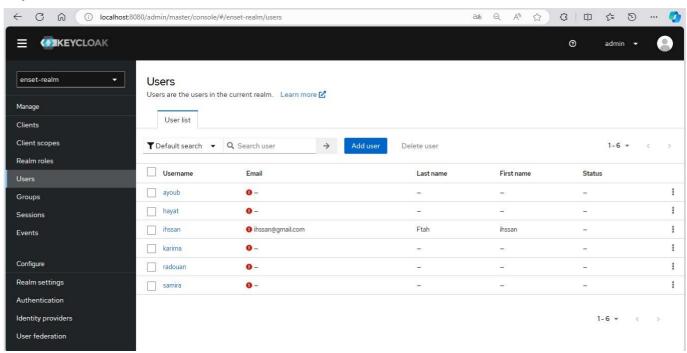


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Github



Keycloak

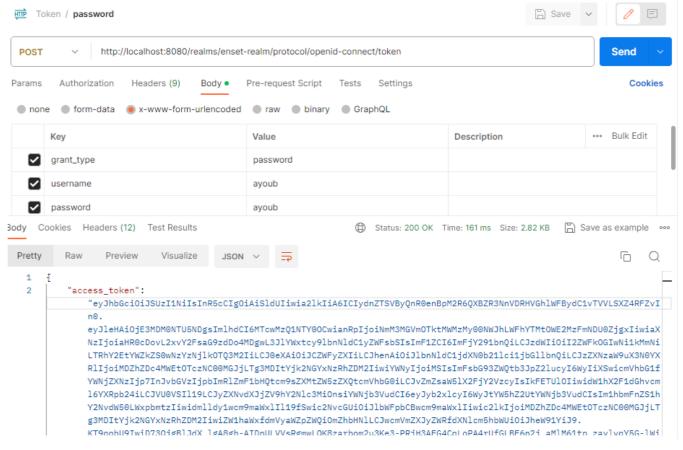


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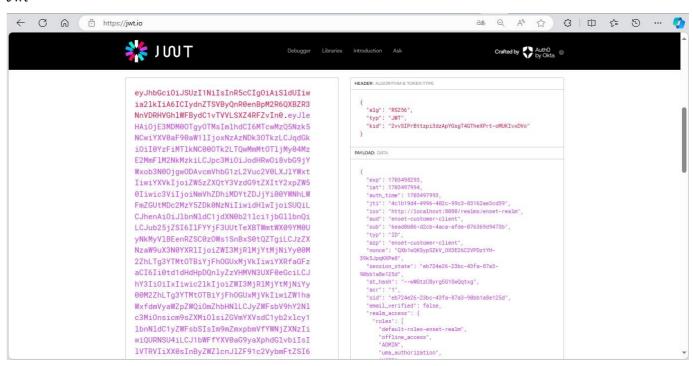


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Postman



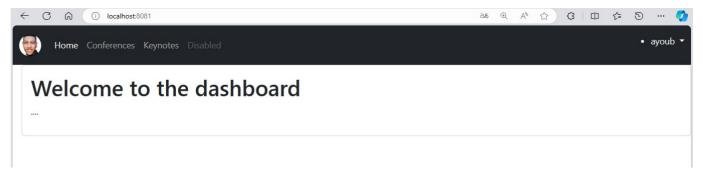
Jwt



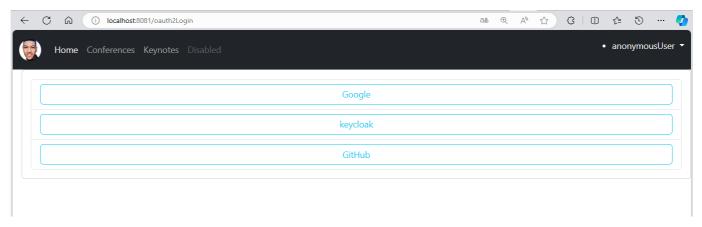
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Theamleaf

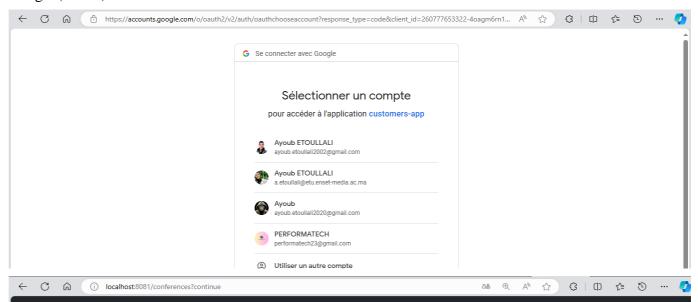
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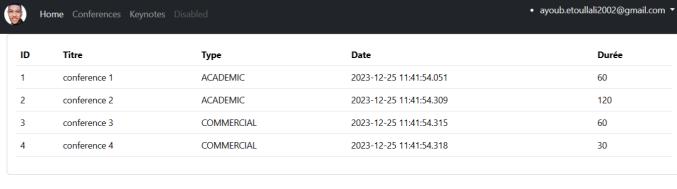


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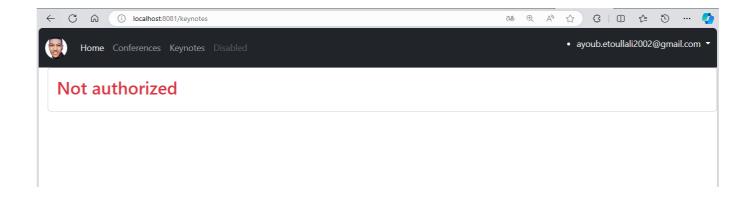


Google (USER)

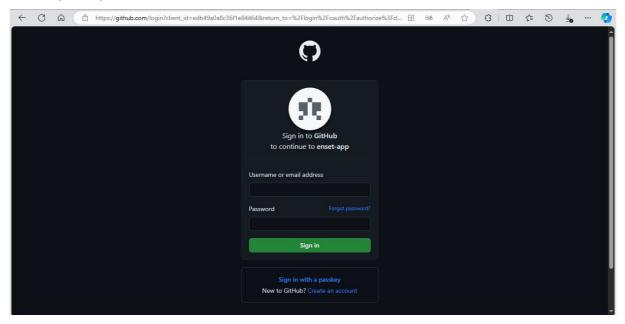




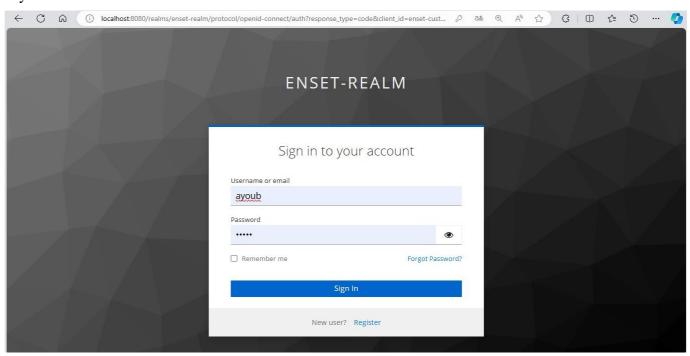
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Github (USER)

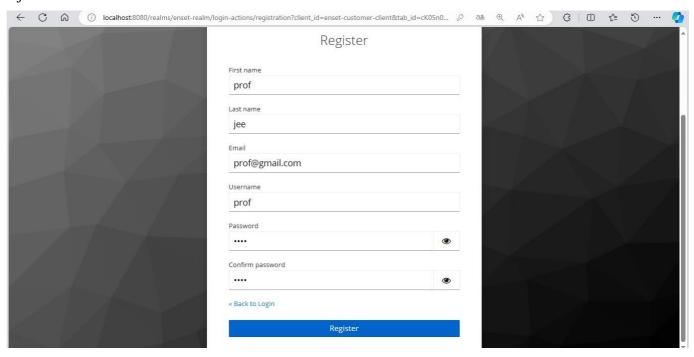


keycloak



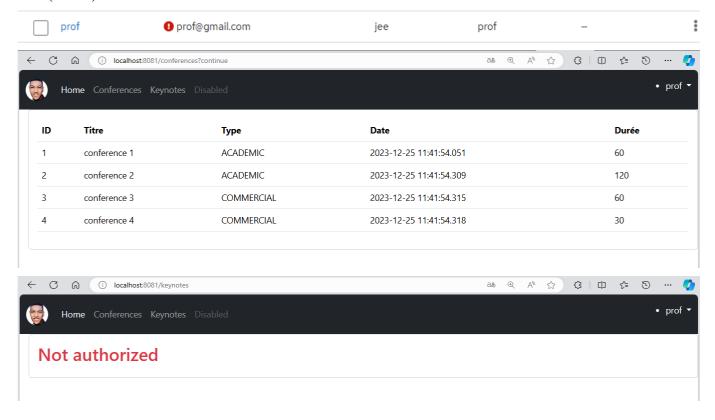
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Ajouter user



Keycloak

Prof (USER)



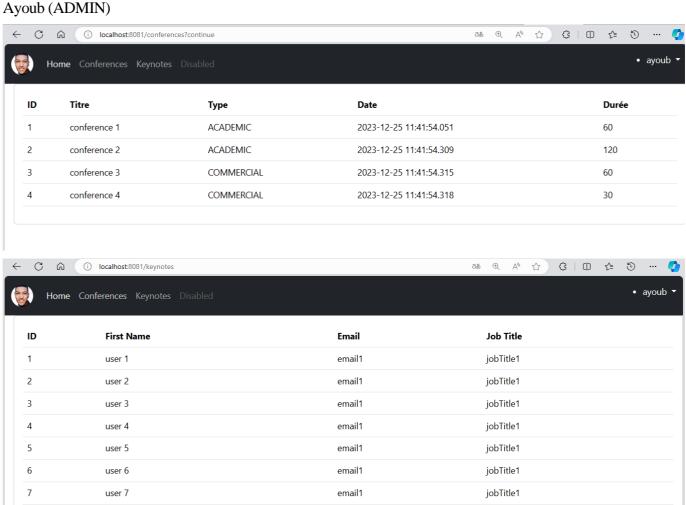
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8

9

user 8

user 9



email1

email1

jobTitle1

jobTitle1

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H. Déployer l'application avec Docker et Docker compose

En cour

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En conclusion, le traitement parallèle se dresse comme un pilier indispensable pour débloquer le potentiel du Big Data. Les défis posés par la gestion des données massives sont vastes, mais le traitement parallèle offre une réponse robuste, permettant de tirer parti de la puissance collective de multiples ressources. Des modèles de programmation tels que MapReduce ont ouvert la voie, tandis que des frameworks modernes tels que Spark et Flink ont apporté des améliorations significatives en termes de vitesse et de flexibilité. Les bases de données parallèles, les systèmes de fichiers distribués et l'utilisation judicieuse des GPU enrichissent encore davantage cette approche. À l'aube d'une ère où les données continuent de croître de manière exponentielle, le traitement parallèle en Big Data demeure une clé maîtresse, ouvrant la porte à une compréhension plus approfondie, à des insights plus rapides et à des découvertes qui façonnent l'avenir de l'informatique et de l'analyse des données.

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