



# Dynamic content changes of cordycepin and adenosine and transcriptome in *Cordyceps kyushuensis* Kob at different fermentation stages

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## Abstract

20% (w/w) Astragali radix was added to the rice medium to cultivate *C. kyushuensis* Kob. The fermentation product was collected at mycelium stage, coloring stage, stromata-forming initial stage and fruiting body stage of *C. kyushuensis* Kob. The dynamic content changes of cordycepin and adenosine were detected at different fermentation stages. In the rice medium with Astragalus radix, both cordycepin and adenosine reached the highest content value on the 30th day of fermentation, 17.31 mg/g and 0.94 mg/g, respectively, which were 8.6 times and 2.0 times of that in rice medium at the same stage. At the same time, transcriptomics technology was used to analyze *C. kyushuensis* Kob during these four periods.

**Keywords** *Cordyceps kyushuensis* Kob · Fermentation · Cordycepin · Adenosine · Transcriptome

## Abbreviations

CKK	<i>C. kyushuensis</i> Kob
CKK1	Mycelium stage at the 7th day
CKK2	Coloring stage at the 17th day
CKK3	Stromata-forming initial stage at the 30th day
CKK4	Fruiting body stage at the 50th day
DEGs	Differentially expressed genes
HPLC	High performance liquid chromatography

## Introduction

*Cordyceps* is a type of worm-forming fungus with medicinal value, belonging to Clavicipitaceae, Ascomycotina. *Cordyceps* contains a variety of active substances, including cordycepin, adenosine, cordyceps polysaccharides, alkaloids, mannitol, and various amino acids. It was commonly used in China for the treatment of fatigue, night sweating,

hyperglycemia, hyperlipidemia, asthenia after severe illness, respiratory disease, renal dysfunction, arrhythmias, heart and liver diseases during the past thousands of years. The pharmacological actions of *Cordyceps* such as antioxidant, immunosuppressive, hypoglycemic, hypolipidemic and anti-tumor have received significant attention from pharmacological researchers [1–3]. Recently, an increasing number of studies have demonstrated the potential of *Cordyceps* as dietary food and source of medicine in some countries [4–7].

Cordycepin (3'-deoxyadenosine) is an adenosine analogue, which was first isolated from *Cordyceps militaris* by Cunningham in 1950 [8]. It has pharmacological properties including anti-oxidation, antitumor, and immune regulation [9, 10]. Compared with adenosine, cordycepin removes the hydroxyl radical at the 3'-C [11]. Some studies have suggested that adenosine is a precursor for cordycepin synthesis [12, 13]. More and more researchers are focusing on the metabolism of *C. kyushuensis* Kob active substances, hoping to improve the content of cordycepin by improving the cultivation technology, and then enhance the medicinal value of artificial *Cordyceps*. Mao added millet or soybean to the medium and extended the culture time in dark condition to increase the content of cordycepin [14]. Raethong added different carbon sources to the culture medium to explore the content of cordycepin in *Cordyceps militaris*, and used transcriptomics to study the metabolic pathway of cordycepin synthesis under different carbon source conditions [15].

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*Astragalus radix* is the dried root of legume Mongolian *Astragalus* or *Astragalus membranaceus*, which is an important traditional Chinese medicine [16]. Its main active substances are saponins, flavones, astragalus polysaccharides, which make *Astragalus radix* have anti-cancer, anti-oxidation, cardiovascular protection and anti-aging effects [17, 18]. Fermentation of traditional Chinese medicine with medicinal fungi can increase the content and efficacy of certain active substances by biotransformation. Lin et al. added *Astragalus radix* to liquid medium to cultivate *Cordyceps militaris*, found that the fermentation liquid of *Astragalus* medium had better antitumor activity than the product cultured in synthetic medium [19]. Bae used fungi such as *Cordyceps sinensis*, *Cordyceps militaris*, *Phellinus linteus* and other fungus to ferment Red Ginseng extracts and found that after fermentation by *Cordyceps sinensis* and *Cordyceps militaris*, the content of ginsenoside increased [20].

Transcriptome sequencing technology can quickly and comprehensively detect almost all expressed genes in specific tissues or organs of a particular species, including protein-coding mRNAs and non-coding RNAs (tRNA, rRNA, etc.), which research on gene composition, function, and transcriptional regulation at the RNA level. At present, based on RNA-seq sequencing technology [21], the gene expression of a specific tissue or organ in a specific state can be studied, and then to explore the cell components and biological processes of the tissue or organ. So this technology was also applied to research *Cordyceps*, especially the exploration of cordycepin synthesis pathway. The whole genome sequencing of *Cordyceps militaris*, a closely related species with *C. kyushuensis* Kob, was completed in 2011 [22]. Liu analyzed the transcriptome of different growth stages of *Cordyceps cicadae* and found that cordycepin synthesis was related to purine nucleotide metabolism [23]. Zhao analyzed the transcriptome, proteome, and mitochondria of *C. kyushuensis* Kob and found that *C. kyushuensis* Kob was closely related to *Cordyceps militaris*, and found that there were four gene clusters related to cordycepin synthesis. They also found that the synthesis of cordycepin was accompanied by the synthesis of pentostatin [24], which is consistent with *Cordyceps militaris* [25].

In this study, *Astragalus radix* was added to the rice medium to cultivate *C. kyushuensis* Kob. The fermentation products were collected at the mycelium stage, coloring stage, stromata-forming initial stage and fruiting body stage of *C. kyushuensis* Kob, respectively. This work aims to investigate the dynamical changes of active substances during the fermentation process. To reveal the molecular basis of the dynamic changes of active substances, transcriptomics was used to analyze the four periods of *C. kyushuensis* Kob.

## Materials and methods

### Microorganism and fermentation

*Cordyceps kyushuensis* Kob strain was conserved in potato dextrose agar (PDA) media in our lab and *C. kyushuensis* Kob mycelium was inoculated in PDA liquid medium for activation. Then the active mycelium was inoculated to the medium with 16 g rice and 4 g *Astragalus radix* in 500 mL glass jars. At the same time, 20 g rice medium without *Astragalus radix* as a control, then cultured at 23 °C for 5–7 days in dark until white mycelium filled the surface of the medium, then at 23 °C during the day and 13 °C in darkness for 40 days until forming the mature fruiting body. During the entire culture period of *C. kyushuensis* Kob, four samples were collected for further research, including CKK1 (mycelium stage at the 7th day), CKK2 (coloring stage at the 17th day), CKK3 (stromata-forming initial stage at the 30th day) and CKK4 (fruiting body stage at the 50th day).

Cordycepin and adenosine were purchased from Meilun Biotechnology Co., Ltd. (Dalian, China).

### Determination of cordycepin and adenosine by HPLC

Both medium and fungi from four different growth stages were collected, dried to constant weight and then powdered to sift by 60 mesh. 0.5 g powder sample of each growth stage were extracted using tenfold volume purified water to obtain cordycepin and adenosine. All solvents and samples were filtered through 0.45 µm filters before injection into HPLC. HPLC analysis was performed using Agilent 1260 Infinity II LC-system equipped with a TC-C18 column (particle size: 5 µm; length: 250 × 4.6 mm; Agilent, USA). Based on the preliminary experiments [24], the elution conditions for cordycepin and adenosine were performed with the solvents of deionized water (A) and methanol (B, 12%) at a flow rate of 0.8 mL/min for 60 min, which was monitored at a wavelength of 259 nm. The column oven was maintained at a constant temperature of 40 °C.

### RNA isolation and transcriptome sequencing

Total RNAs of *C. kyushuensis* Kob from different growth stages (CKK1, CKK2, CKK3 and CKK4) were extracted using TRIzol Reagent (Invitrogen)/RNeasy Mini Kit (Qiagen) according to the instructions of the manufacturer. The cDNA libraries were constructed and after quality testing by Agilent 2100 Bioanalyzer, Illumina HiSeqTM2500 was used to sequence. Three technical repetitions for each sample and

three biological repetitions for each stage were carried out during this experiment.

### DEGs analysis

FoldChange and FDR were two criterions to analyze if the same gene has differential expression between two samples. Differential expression genes were selected by  $p < 0.05$  and  $\text{FoldChange} > 2$ . Afterwards, GO and KEGG analyses were carried out to describe relevant functions.

## Results and discussion

### The content of cordycepin and adenosine

Cordycepin, a natural derivative of adenosine, has been shown to exert pharmacological properties including anti-oxidation, antitumor, and immune regulation. Cordycepin was found in *C. kyushuensis* Kob, and some literatures speculate that adenosine is the precursor of cordycepin, so we studied the changes of the content of these two substances at four different developmental stages of *C. kyushuensis* Kob by high-performance liquid chromatography. The content of adenosine and cordycepin in the rice medium increased with the fermentation time (shown in Figs. 1 and 2). On the 50th day of fermentation, the content of cordycepin was  $3.32 \pm 0.03$  mg/g, and the adenosine content was  $0.57 \pm 0.002$  mg/g. While, in the rice medium with Astragalus, both cordycepin and adenosine reached the highest content value on the 30th day of fermentation,  $17.31 \pm 0.3$  mg/g and  $0.939 \pm 0.002$  mg/g, respectively, which were 8.6 times and 2.0 times of that in rice medium at the same stage. Cordycepin and adenosine content increased rapidly from CKK2 (coloring stage at the 17th day) to CKK3 (stromata-forming initial stage at the 30th

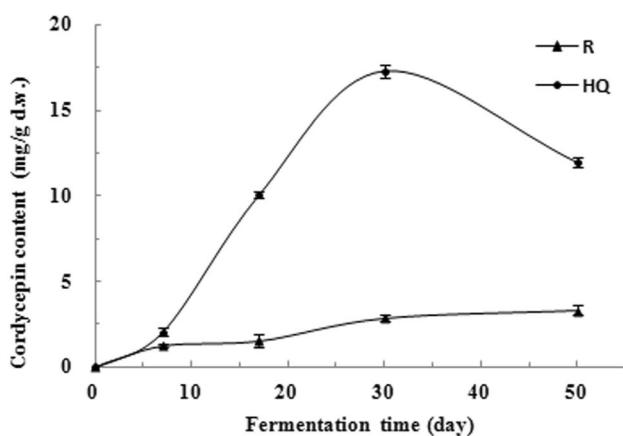


Fig. 1 Cordycepin content at different fermentation time. R rice medium, HQ rice medium with 20% (w/w) Astragalus radix

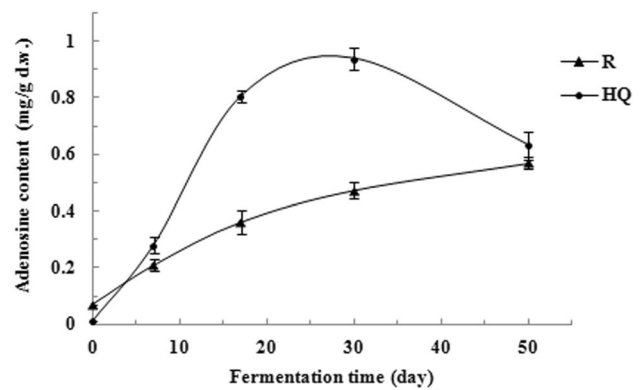


Fig. 2 Adenosine content at different fermentation time. R rice medium; HQ rice medium with 20% (w/w) Astragalus radix

day) and CKK4 (fruiting body stage at the 45th day). After 30 days of fermentation, the content of these two substances began to decrease. Probably due to Astragalus radix changed the secondary metabolites of *C. kyushuensis* Kob, therefore, accelerated the degradation of cordycepin and adenosine. In general, the changes in cordycepin and adenosine during the fermentation process were consistent. The possible reason would be that adenosine was thought as the direct precursor of both cordycepin [26] and pentostatin [27]. Xia et al. proved that dual biosynthesis of cordycepin and pentostatin was initiated by a single gene cluster in the medicinal fungus *Cordyceps militaris* from the precursor adenosine [25].

### Summary of RNA-Seq data sets

RNA-Seq was performed for RNA samples extracted from four different developmental stages of *C. kyushuensis* Kob to obtain an overview for further analysis. After filtering out low-quality reads removing the contamination and linker sequences, 57,702,794, 57,412,046, 55,966,926, 56,965,700 clean reads were obtained for the samples of CKK1, CKK2, CKK3 and CKK4, respectively (Table 1). The Q20 of the four samples are more than 95%, Q30 are greater than 90%, and the GC content are about 55%, indicated that the quality of the sequencing data is reliable. The filtered sequencing clean data is compared with the reference genome *Cordyceps*

Table 1 Transcriptome sequencing raw data quality statistics

Feature	CKK-1	CKK-2	CKK-3	CKK-4
Average length	150.00	150.00	150.00	150.00
Raw reads	57,780,764	57,489,134	56,043,654	57,045,344
Clean reads	57,702,794	57,412,046	55,966,926	56,965,700
Q20 (%)	97.27	97.67	97.42	97.56
Q30 (%)	92.61	93.50	92.94	93.24
GC (%)	57.54	57.32	57.62	57.82

**Table 2** Clean reads mapped to the reference genome

Feature	CKK-1	CKK-2	CKK-3	CKK-4
Clean reads	57,702,794	57,412,046	55,966,926	56,965,700
Total mapped	51,575,374 (89.3811%)	51,003,081 (88.8369%)	50,393,978 (90.0424%)	51,957,589 (91.2086%)
Multiple mapped	1,365,950 (2.3672%)	1,159,288 (2.0192%)	1,225,311 (2.1894%)	1,197,235 (2.1017%)
Uniquely mapped	50,209,424 (87.0139%)	49,843,793 (86.8177%)	49,168,667 (87.8531%)	50,760,354 (89.1069%)

*militaris* CM01. The results were shown in Table 2. The contrast ratio of the sequencing sequences that can be mapped to the genome of the four samples is about 90%.

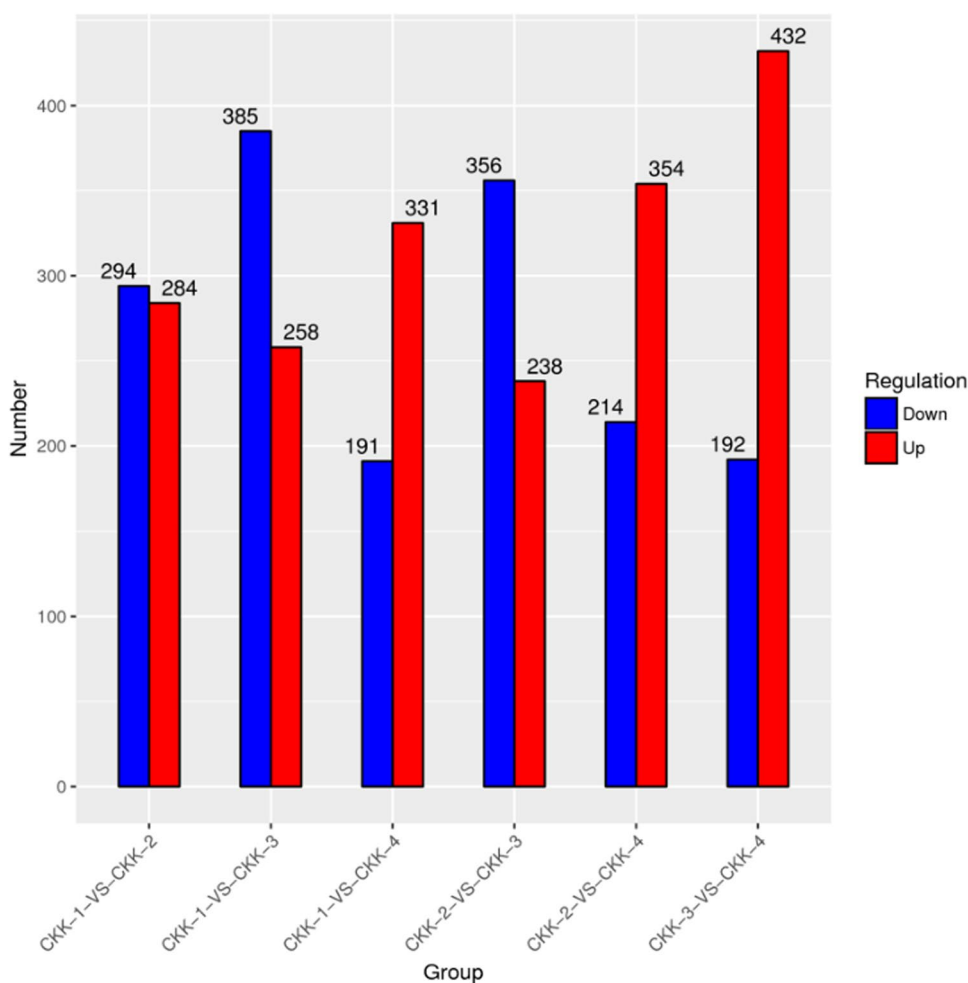
### Analysis of differentially expressed genes (DEGs)

Cuffdiff software (v2.2.1) was used to analyze the gene expression of four groups of samples. Pairwise comparison analysis of gene expression levels of four samples through the FPKM distribution map and box diagram of all genes (CKK1-VS-CKK2, CKK1-VS-CKK3, CKK1-VS-CKK4, CKK2-VS-CKK3, CKK2-VS-CKK4, CKK3-VS-CKK4). The test results were screened according to the

difference significance standard (different gene expression changed more than two times and  $p$ -value  $\leq 0.05$ ), and the significant difference expression of genes was counted up and down.

The results are shown in Fig. 3. Among them, the comparison results of CKK1-VS-CKK2 showed 294 down-regulated genes and 284 up-regulated genes; the comparison results of CKK1-VS-CKK3 showed 385 down-regulated genes and 258 up-regulated genes; the comparison results of CKK1-VS-CKK4 showed 191 down-regulated genes and 331 up-regulated genes; and the comparison results of CKK2-VS-CKK3 showed 356 down-regulated genes and 238 up-regulated genes; and the comparison results of CKK2-VS-CKK4 showed 214 down-regulated genes and 354 up-regulated genes; the comparison results of CKK3-VS-CKK4 showed 192 down-regulated genes and 432 up-regulated genes; the

**Fig. 3** Differentially expressed genes analysis. Horizontal bar chart shows the number of significant DEGs in each pairwise comparison set



comparison results of CKK2-VS-CKK4 showed 214 down-regulated genes and 354 up-regulated genes; the comparison results of CKK3-VS-CKK4 showed that there are 192 down-regulated genes and 432 up-regulated genes.

In addition, the Venn diagram was used to analyze the number of common differential genes between each sample and the other three samples. The results are shown in Fig. 4. The number of common differential genes compared CCK1 with CKK2, CKK3 and CKK4 are 103; the number of common differential genes of CKK2 compared with CKK1, CKK3, and CKK4 are 38; the number of common differential genes compared CKK3 with CKK1, CKK2 and CKK4 are 60; the number of common differential genes compared CKK4 with CKK1, CKK2 and CKK3 are 146.

### Functional annotation of differentially expressed genes (DEGs)

GO and KEGG enrichment analysis were performed on the selected DEGs. The final results were screened for the top 30 classification of GO enrichment analysis and the top 20 pathway of KEGG enrichment analysis.

During the growth process of *C. kyushuensis* Kob, it was necessary to go through the mycelial growth period (CKK1) for 7 days of dark culture. When the white mycelium filed the surface of the culture medium, it could be switched to light culture. During this period, *C. kyushuensis* Kob mycelium changed from white to yellow, which was the color transfer period (CKK2). GO analysis of the 38 common differential genes of CCK2 compared with CKK1, CKK3 and CKK4 (Fig. 5b) found that the GO terms of the significantly

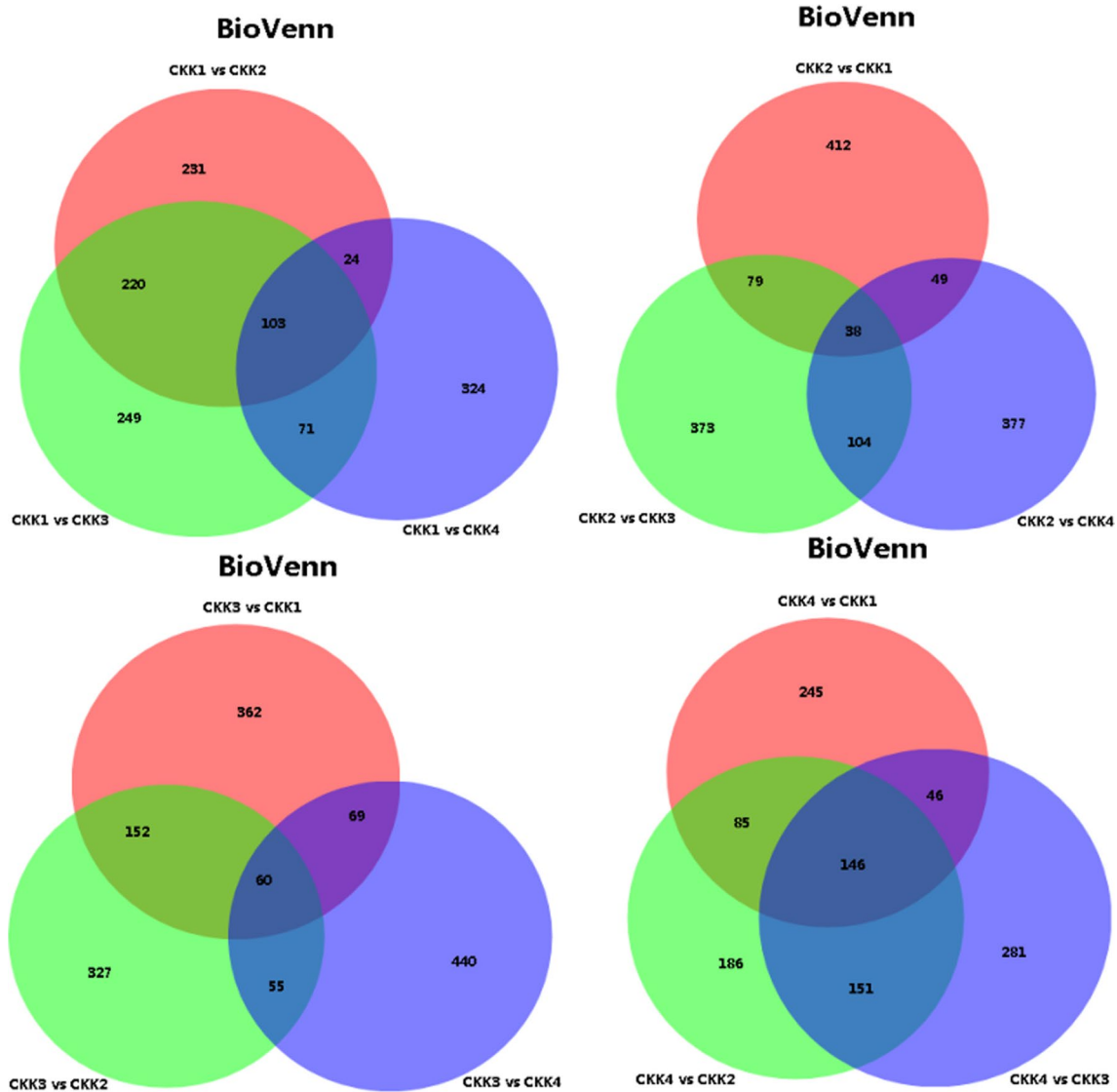
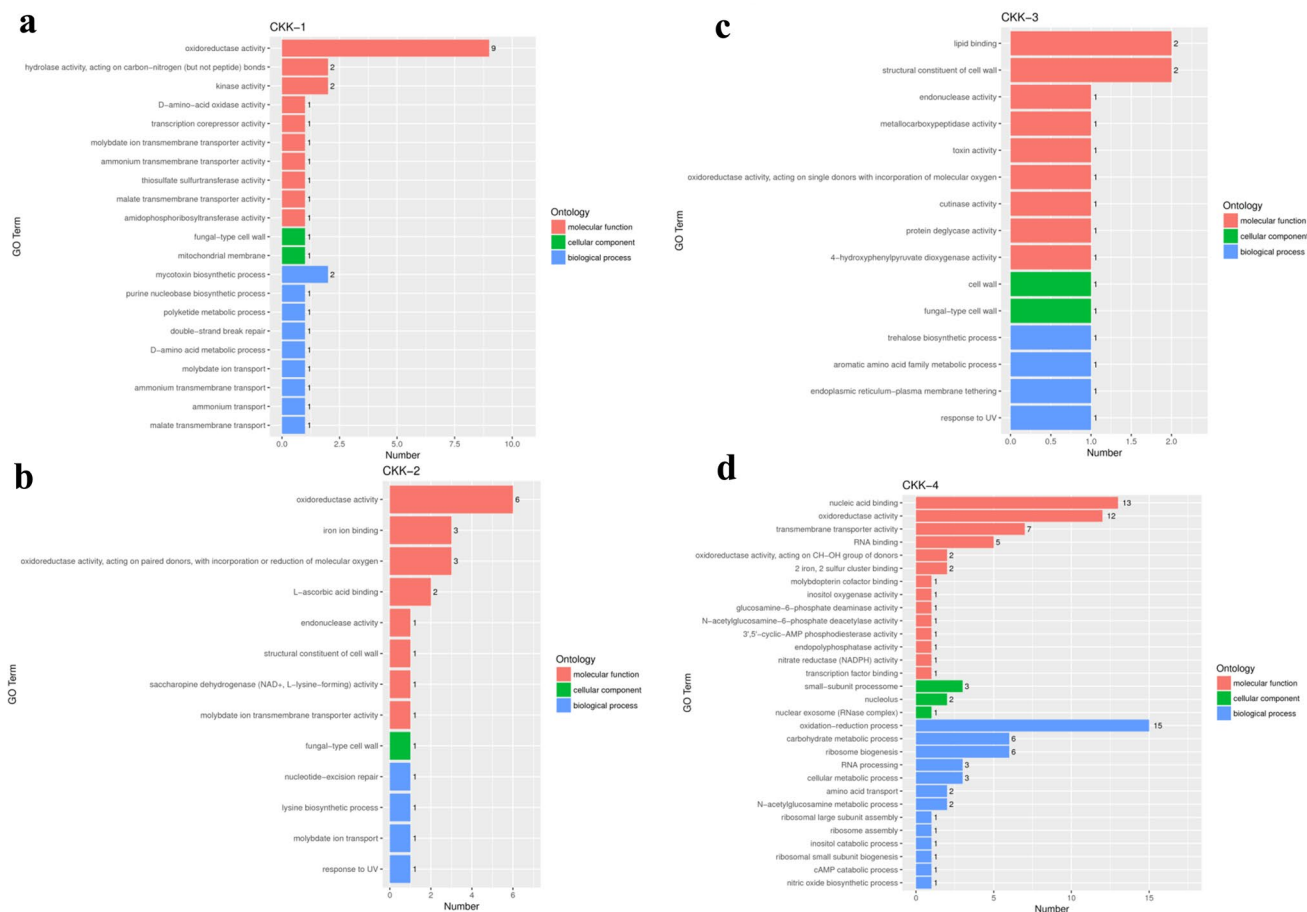


Fig. 4 Venn diagram of differentially expressed genes

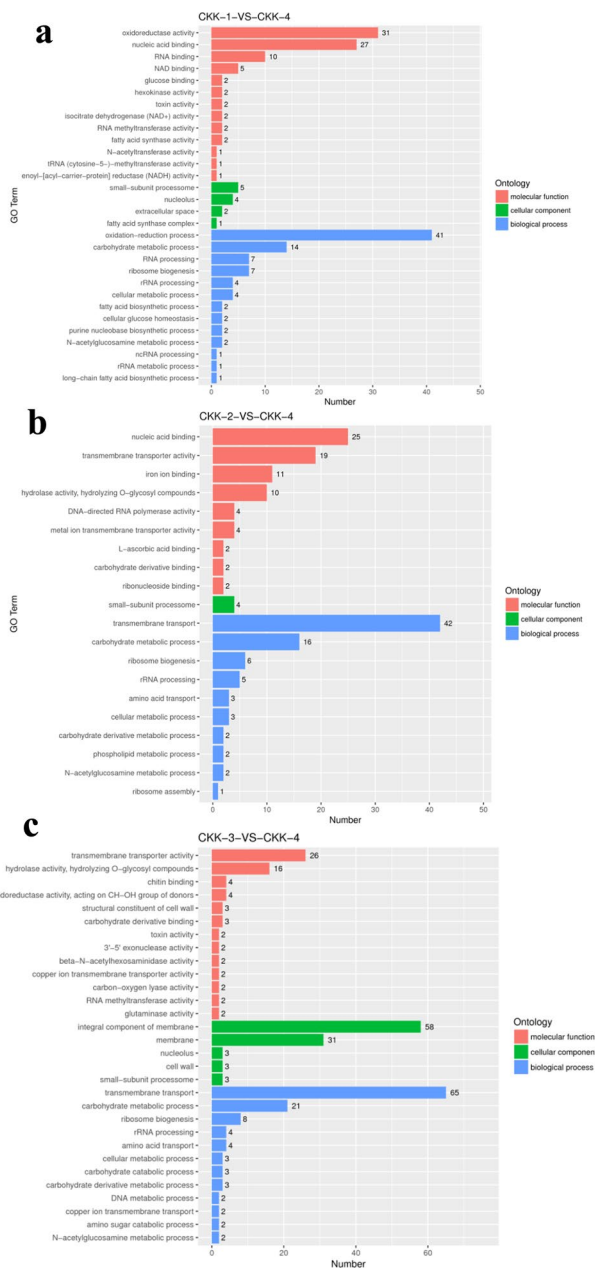


**Fig. 5** GO enrichment analysis of differentially expressed genes **a** CKK1; **b** CKK2; **c** CKK3; **d** CKK4

up-regulated genes in CKK2 were “structural constituent of cell wall”, “response to UV”, “oxidoreductase activity” and “nucleotide-excision repair”, etc., suggested that light enabled genes that respond to ultraviolet light expression, which might be related to color conversion. When most of mycelium of *C. kyushuensis* Kob turned yellow, it entered into the primordium growth stage (CKK3). GO analysis of 60 common differential genes of CCK3 compared with CKK1, CKK2, and CKK4 (Fig. 5c) found that the GO terms of the significantly up-regulated genes in CKK3 were “lipid binding”, “structural constituent of cell wall”, “Aromatic amino acid family metabolic process”, and “endoplasmic reticulum-plasma membrane tethering”, etc., which showed that in CKK3, a large number of substances such as lipids and aromatic amino acids were synthesized, and the intracellular information transmission was increased, which promotes the formation of stromata. GO analysis of 146 common differential genes of CCK4 compared with CKK1, CKK2, and CKK3 (Fig. 5d) found that the GO terms of the significantly up-regulated genes in CKK4 were “nucleic acid binding”, “oxidoreductase activity”, “small-subunit processome”, “ribosome biogenesis”, “carbohydrate metabolic process”,

“RNA processing” and “transmembrane transport”. These results indicated that in CKK4, nucleic acid metabolism, ribosome formation and carbon metabolism were accelerated, and cells proliferated to form fruit bodies and spores.

From the GO analysis of the common differential genes in each sample, compared with the other three periods, CKK4 contained the most differential genes. Compared with CKK1, genes significantly up-regulated in CKK4 were more concentrated in “nucleic acid binding”, “carbohydrate metabolic process”, “oxidoreductase activity”, “oxidation-reduction process”, “RNA binding”, “ribosome biogenesis” and “Hydrolase activity, hydrolyzing O-glycosyl compounds” and other entries (Fig. 6a), which indicated that compared with CKK1, there were more genes involved in nucleic acid metabolism, carbon metabolism and redox reactions in CCK4 stage. Compared with CKK2, genes significantly up-regulated in CKK4 were enriched in entries such as “transmembrane transporter activity”, “carbohydrate metabolic process”, “nucleic acid binding” and “transmembrane transport” (Fig. 6b), indicating that there were more genes involved in processes such as nucleic acid metabolism, carbon metabolism and transmembrane transport of substances



**Fig. 6** GO analysis of differentially expressed genes **a** CKK1-VS-CKK4; **b** CKK2-VS-CKK4; **c** CKK3-VS-CKK4

in CKK4. Compared with CKK3, genes significantly up-regulated in CKK4 were enriched in “transmembrane transport”, “ribosome biogenesis”, “integral component of membrane”, “nucleic acid binding”, “carbohydrate metabolic process” and “hydrolase activity, hydrolyzing O-glycosyl compounds” and other items (Fig. 6c), suggesting there were more genes in CCK4 stage involved in transmembrane transport of substances, nucleic acid metabolism, ribosome generation, carbon metabolism and hydrolysis reactions.

KEGG enrichment analysis was performed on the differential genes of CKK1-VS-CKK4, CKK2-VS-CKK4

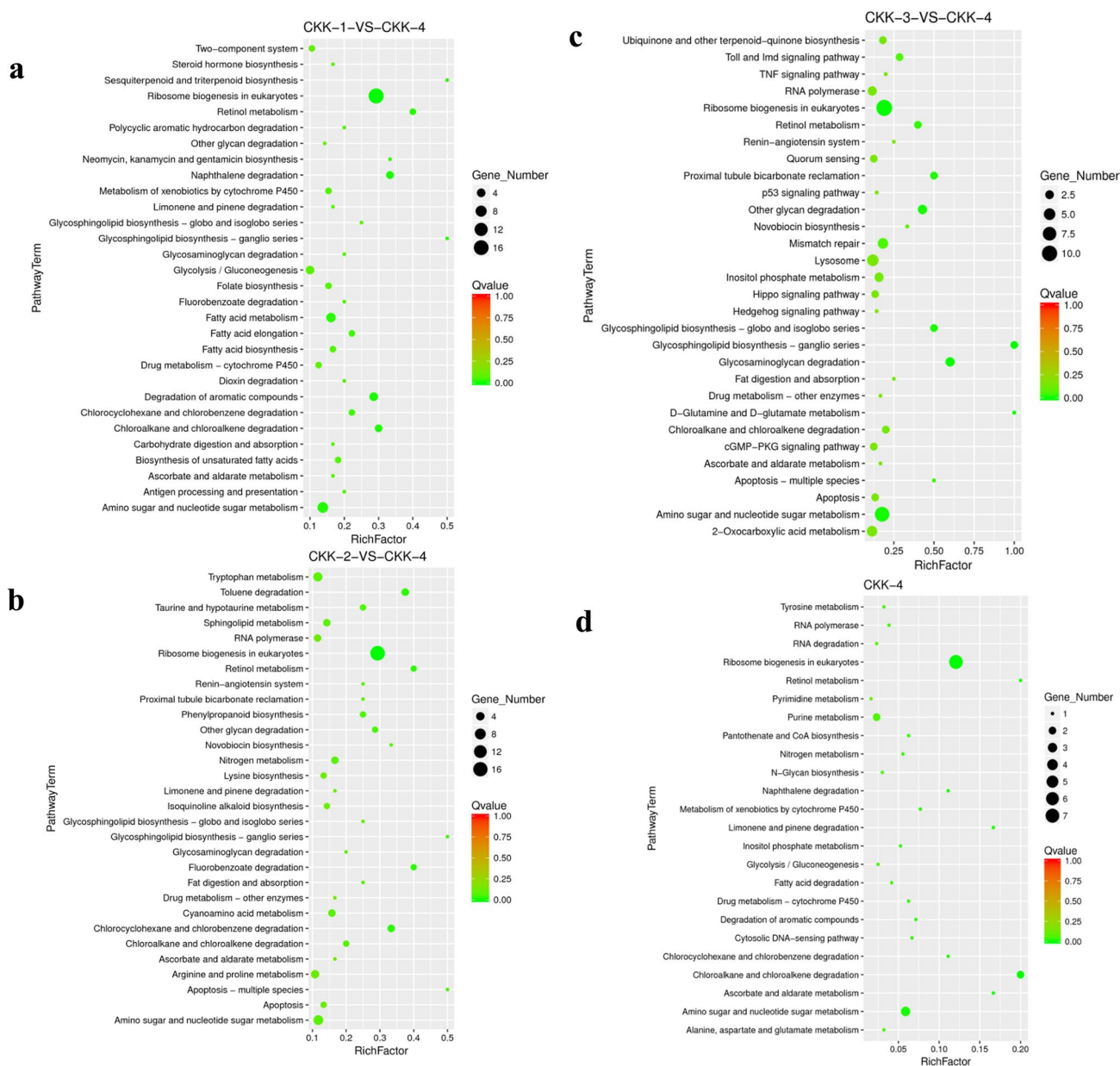
and CKK3-VS-CKK4. Compared with CKK1, genes significantly up-regulated in CKK4 were enriched in pathways such as “Ribosome biogenesis in eukaryotes”, “Amino sugar and nucleotide sugar metabolism”, “Fatty acid metabolism” and “Sesquiterpenoid and triterpenoid biosynthesis” (Fig. 7a), these pathways are more related to cell growth and proliferation. It is worth noting that compared with CKK1, the “Sesquiterpenoid and triterpenoid biosynthesis” pathway was significantly up-regulated during CCK4, which might be related to cholesterol synthesis. Compared with CKK2, genes significantly up-regulated in CKK4 were concentrated in pathways such as “Ribosome biogenesis in eukaryotes” and “Other glycan degradation” (Fig. 7b). Compared with CKK3, genes significantly up-regulated in CKK4 were concentrated in pathways such as “Ribosome biogenesis in eukaryotes”, “Amino sugar and nucleotide sugar metabolism” and “Other glycan degradation” (Fig. 7c). KEGG enrichment analysis of differential genes specific to CKK4 found that genes significantly up-regulated in CKK4 were enriched in ribosome formation, metabolism of certain amino acids and synthesis or degradation of secondary metabolites (Fig. 7d).

### Uncovering major changes in the transcriptional regulation of metabolism mediated by *Astragalus radix*

To reveal how the addition of *Astragalus radix* affects the four growth stages of *C. kyushuensis* Kob, the differentially expressed genes were subjected to hierarchical clustering analysis to determine the relative expression pattern between the four growth stages of *C. kyushuensis* Kob grown on *Astragalus radix* medium (Fig. 8). According to the functional importance of the annotated DEGs, the key genes with regulatory functions were screened (Table 3), such as purine synthesis, carbon metabolism and fatty acid synthesis.

During the mycelium growth stage of *C. kyushuensis* Kob (CKK1), the up-regulated gene was CCM\_07964 (hydrophobin). Hydrophobin can help fungi break through the air-liquid barrier to form aerial structures, and at the same time protect the mycelium [28–30]. Another gene of concern was CCM\_07859 (L-xylulose reductase, [EC:1.1.1.10]), whose product can participate in pentose and glucuronate interconversions, generate xylitol, and then participate in the pentose phosphate pathway to produce ribose 5-phosphate, which is a precursor substance of purines de novo synthesis [31].

Higher content of adenosine and cordycepin were measured during the color changing period of *C. kyushuensis* Kob, which means the synthesis of purine nucleotides was higher during this period. The genes up-regulated in CKK2 was CCM\_05895 (gluconokinase, [EC:2.7.1.12]), which product, glucokinase, participated in the pentose phosphate pathway,

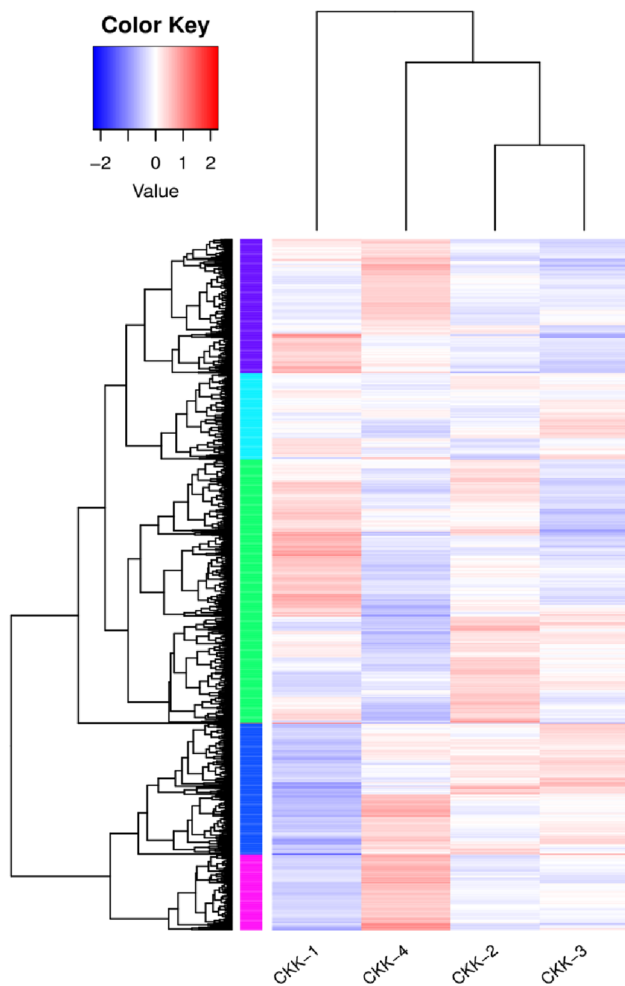


**Fig. 7** KEGG analysis of differentially expressed genes and KEGG analysis of common Differential genes in CCK4 **a** CCK1-VS-CCK4; **b** CCK2-VS-CCK4; **c** CCK3-VS-CCK4; **d** CCK4

thereby promoting the production of ribose 5-phosphate and then providing precursors for purine synthesis. Another up-regulated gene was CCM\_08738 (amidophosphoribosyltransferase, [EC:2.4.2.14]). Amidophosphoribosyltransferase catalyzes the synthesis of 5-phosphoribosylamine and then participates in purine metabolism pathway. Purine nucleoside phosphorylase, a product of CCM\_04505 (purine nucleoside phosphorylase, [EC:2.4.2.1]), is one of the key enzymes in the purine rescue synthesis pathway. The 5'-nucleotidase

produced by CCM\_00622 may be involved in the hydrolysis of AMP to generate adenosine. The above enzymes may be involved in the synthesis of cordycepin and adenosine. In addition, no changes in genes related to *Astragalus radix* saponin synthesis were found. Therefore, after fermentation by *C. kyushuensis* Kob, the saponin substances in the culture medium were transformed to produce more saponins. But what kinds of enzyme played a role in this process need to be further studied.





**Fig. 8** Clustering of differentially expressed genes. Clustering is based on the log<sub>10</sub> (FPKM+1) value. Red indicates high-expressed genes and blue indicates low-expressed genes. The color changes from blue to red, which means that the gene expression is getting higher and higher

At *C. kyushuensis* Kob fruit body growth stage, cells proliferated in large quantities, and also produced a large number of secondary metabolites. During this stage, the content of adenosine and cordycepin was lower than CKK2. It is speculated that the increase in nucleic acid metabolism may promote more substrate synthesis nucleic acids, and on the other hand, adenosine and cordycepin were degraded. So there was a phenomenon that the adenosine and cordycepin content of CKK4 was lower than CKK2. Most of the genes up-regulated during the CKK4 period were also related to DNA replication, transcription, translation and secondary metabolite synthesis. Among which, CCM\_08738 (amidophosphoribosyltransferase, [EC:2.4.2.14]), CCM\_06768 (adenylosuccinate synthetase, [EC:6.3.4.4]), which also appeared to be up-regulated during this period, meaning that the products of purine metabolism might be more involved in nucleic acid metabolism to promote cell proliferation. In addition, a large amount of energy was generated during this period, CCM\_02997 (fatty acid synthase subunit beta, fungi type, [EC: 2.3.1.86]), which regulated the synthesis of fatty acids. CCM\_08316 (hexokinase, [EC: 2.7.1.1]) and CCM\_06062 (pyruvate kinase, [EC: 2.7.1.40]) regulated the glycolytic pathway and provided a large amount of precursor material and energy for cell proliferation. It is worth mentioning that CCM\_02867 (secreted glucosidase, [EC: 3.2.1]) appeared to be up-regulated during this period. It is speculated that the cells might secrete more glycosidases, which can promote the decomposition of nutrients in the culture medium. In addition, CCM\_07184 (squalene monooxygenase, [EC:1.14.14.17]) appeared to be up-regulated in CKK4, which production squalene monooxygenase is one of the important enzymes in cholesterol biosynthesis and also participates in other saponins synthesis [32].

**Table 3** FPKM of corresponding sequences in DEGs

GeneSymbol	CKK-1_FPKM	CKK-2_FPKM	CKK-3_FPKM	CKK-4_FPKM	Product
CCM_07964	1642.86	3.13	0	0	Hydrophobin
CCM_07859	220.73	63.24	12.63	53.88	L-xylulose reductase
CCM_05895	12.09	215.17	115.40	91.09	Glucokinase
CCM_08738	11.25	172.52	86.14	283.19	Amidophosphoribosyltransferase
CM_04505	10.61	56.87	38.19	19.99	Purine nucleoside phosphorylase
CCM_00622	2.70	90.51	46.45	14.23	5'-nucleotidase
CCM_06768	158.24	104.14	59.36	1725.09	Adenylosuccinate synthetase
CCM_02997	7.22	49.23	43.51	110.55	Fatty acid synthase beta subunit dehydratase
CCM_08316	4.61	24.08	32.29	67.22	Hexokinase
CCM_06062	56.52	160.77	90.68	142.12	Pyruvate kinase
CCM_02867	7.24	9.04	1.05	72.78	Secreted glucosidase
CCM_07184	5.20	16.14	33.19	46.08	Squalene monooxygenase

## Conclusion

In this study, it was found that by adding 20% (w/w) *Astragalus radix* to the cultivate medium of *C. kyushuensis* Kob could improve the content of cordycepin and saponins greatly during the fermentation process. Thus, *C. kyushuensis* Kob enriched cordycepin and saponins could be cultivated through controlling the cultivate medium and fermentation time. At the same time, the transcriptome technology was used to analyze the gene expression in four growth periods of *C. kyushuensis* Kob, which to some extent explained the reason for the increase of cordycepin and saponins. In addition, the anti-tumor, anti-aging and cardioprotective effects of the bidirectional fermentation products increased significantly. The relative experiment results will be reported subsequently.

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**Authors' contributions** Junyu Zhang: Fermentation and transcriptome experiment, formal analysis, data curation, methodology, writing—original draft. Tongtong Jian: HPLC experiment and data analysis. Yu Zhang: Fermentation experiment. Guoying Zhang: Writing—review & editing, funding acquisition, supervision. Jianya Ling: Review and editing, funding acquisition, supervision.

## Declarations

**Conflict of interests** On behalf of all authors, the corresponding author states that there is no conflict of interest.

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