

Doctoral thesis (abridged)

博士論文 (要約)

**Application of unimodal-distributed  
morphological parameters for phenotyping of  
the budding yeast**

(単峰性分布をする形態パラメータを使った出  
芽酵母のフェノタイピング)

ガーネゴルモハンマディ ファルザン

**Chapters 1, 2 and 3 of this doctoral thesis cannot be made public on the Internet because they are supposed to be published as part of a journal.**

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