

The single-finger keyboard layout problem

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Outline

The QWERTY keyboard

- A major de-facto standard

- New challenges from new devices

An Ergonomic point of view

- n -fingers keyboards

- s -fingers keyboards

The problem

- Mathematical model

- SK-QAP vs QAP

Metaheuristics

- Neighborhoods

- Speed-ups

- QAP literature

- for SK-QAP

Benchmarks

Computational results

- Real languages

- Random instances

Conclusions

The QWERTY keyboard— A major de-facto standard

- ▶ Keyboards are the most popular and effective devices to insert, edit, delete and update long chunk of information.
- ▶ Keyboards used with many fingers (*n-fingers*) were introduced more than 100 years ago.
- ▶ The first keyboard, was Q-W-E-R-T-Y: **it is still the standard**

~ `	1 !	2 @	3 #	4 \$	5 %	6 ^	7 &	8 *	9 (	0)	- _	= +	Delete
Tab	Q	W	E	R	T	Y		I	O	P	{ [	}]	 \ _
Caps	A	S	D	F	G	H	J	K	L	:	" ,	' .	Enter
Shift		Z	X	C	V	B	N	M	< ,	> .	? /		Shift
Ctrl		Alt									Alt		Ctrl



- ▶ The proliferation of Portable Data Assistant (PDA), Smartphone and phones requires a strong improvement in the design of ad-hoc input devices.

- ▶ These devices are used in mobility and multitasking.

- ▶ The keyboards for portable systems are a still open design domain.



An Ergonomic point of view— n -fingers keyboards

Most research focused on the tentative to overtake QWERTY.

DVORAK												
ESC	F1	F2	F3	F4	F5	F6	F7	F8	F9	F10	F11	F12
~	1	2	3	4	5	6	7	8	9	0	[	]
→	'	,	.	P	Y	F	G	C	R	L	/	= \
⇧	A	O	E	U	I	D	H	T	N	S	-	⇧
⇧	;	Q	J	K	X	B	M	W	V	Z	⇧	
FN	^	⌂	⌂									

FITALY												
esc	z	v	c	h	w	k	-	menu	/	*	+	
del	f	i	t	a	l	y	.	num	1	2	3	
tab			n	e			.	back	4	5	6	
cap	g	d	o	r	s	b	(	enter	7	8	9	
shift	q	j	u	m	p	x	)	alt	=	0	%	
ctrl	!	?	:	:	'	*	&	<	>	@	#	\$

Typical measures are posture structure, discomfort produced, keying force, user acceptance etc.



Fixed layout, n symbols $\times$ n locations problem.

- ▶ M.A. Pollatschek, N. Gershoni and Y.T. Radday (1976)
Angewandte Informatik
– Simulation
- ▶ R.E. Burkard and J. Offermann (1977)
Zeitschrift fr Operations Research, B
– Simulated annealing (7-10% improvement over QWERTY)
- ▶ Eggers, Feillet, Kehl, Wagner and Yannou (2003)
European Journal of Operational Research
– Combined multi-objective function
 - (i) distribution of the fingers load among all fingers;
 - (ii) the hits number needed to compose a text;
 - (iii) comfort and speed for hand changes;
 - (iv) comfort and speed for finger changes;
 - (v) avoidance of great steps among two different keys;
 - (vi) hits direction (it should move from little finger towards thumb).
- Global score: Weighted linear combination
- Ant Colony Optimization
- English and German languages.



An Ergonomic point of view— s-fingers keyboards

The objective is to improve the typing accurateness, as well as the time spent to edit a text.

The law introduced by Fitt (1954) model the time and difficulties required to move to a target area



$$f(\cdot) = \alpha + \beta \log_2 \left(\frac{D}{A} + 1 \right)$$

α, β = prefixed constant values

D = distance of the starting-ending keys

A = size of the target key



Incomplete keyboards: less keys than language symbols (e.g., the 12 keys ISO used in most mobile phones).

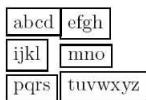
Combinatorial problem : find a minimum size partition of an alphabet, allowing the users to type any word of a given dictionary so that each word is recognized without ambiguity.



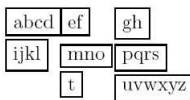
Cardinal and Langerman (2005)

Theoretical Computer Science

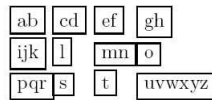
– NP-hard with two keys; several variants



6 Keys



8 Keys



12 Keys

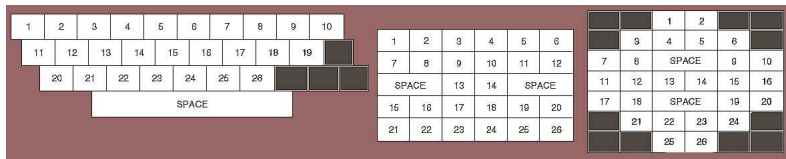
Optimal solutions by Cardinal and Lagerman



Complete keyboards: one keys for each symbol.

Many proposal: FITALY, ABC, OPTI, METROPOLIS, HOOKE, LEWIS, ... (see MacKenzie and Soukoreff, 2002)

- ▶ Li, Chen and Goonetilleke (2006)
Industrial Ergonomics
 - Three fixed layout



- Evaluate the movement through the Fitts' law.
- A simple simulated annealing



The s -finger keyboard layout problem: (SK-QAP)

1. a list of different **symbols**
2. identical unit square **keys** (or **locations**) arranged in a grid
3. each symbol is assigned to exactly one key;
4. each key may contain exactly one symbol.

N.B. **More** keys than symbols $\Rightarrow$ the layout is NOT known

	A	B	C	
	D	E	F	
	G	H	I	

A	B	C	D	E
F	G	H	I	

	A	B		
C	D	E	F	
	G	H	I	

One instance $\rightarrow$ many layouts

One layout $\rightarrow$ many symbols' assignment !



The problem— Mathematical model

- $N = \{1, 2, \dots, n\}$ set of symbols
- $M = \{1, 2, \dots, m^2\}$ set of locations (keys)
- $\varphi : N \rightarrow M$ maps each symbol $i \in N$ to a location $\varphi(i)$ (φ is a **solution**)
- $\mathcal{S}$ set of all possible solutions φ

Matrices $\bar{A}$ and B to denote frequencies and “distances”

$\bar{A} = (\bar{a}_{ik})$: $\bar{a}_{ik}$ is the **frequency** of the symbol pair (i, k) (in an average stat.);

$B = (b_{jl})$: b_{jl} is the penalty to move from j to l (Fitts function, Eucl. dist.)

The problem can be stated as

$$z = \min_{\varphi \in \mathcal{S}} \sum_{i=1}^n \sum_{k=1}^n \bar{a}_{ik} b_{\varphi(i)\varphi(k)} \quad (1)$$

Since matrix B is symmetric we can rewrite (1) as

$$z = \min_{\varphi \in \mathcal{S}} \sum_{i=1}^n \sum_{k=i+1}^n (\bar{a}_{ik} + \bar{a}_{ki}) b_{\varphi(i)\varphi(k)} = \frac{1}{2} \min_{\varphi \in \mathcal{S}} \sum_{i=1}^n \sum_{k=1}^n a_{ik} b_{\varphi(i)\varphi(k)} \quad (2)$$

where $A = (a_{ik})$ is a symmetric matrix with $a_{ik} = \bar{a}_{ik} + \bar{a}_{ki}$.



SK-QAP is a generalization of the classic

Quadratic Assignment Problem (QAP)

- set $n = m \Rightarrow$ (i) one symbols for each location $\Rightarrow$ (ii) fixed layout
- Previous works are all devoted to fixed layout



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- set $n = m \Rightarrow$ (i) one symbols for each location $\Rightarrow$ (ii) fixed layout
- Previous works are all devoted to fixed layout
 - ▶ QAP is known to be strongly $\mathcal{NP}$ -hard, hence SK-QAP
 - ▶ QAP is challenging: Benchmark instances nug27, nug28 and nug30 (proposed in the '60s) have been solved exactly only recently in **20 CPU days, 5 CPU months, and 2.5 CPU years**, respectively (see Adams, Guignard, Hahn and Hightower '07)
 - ▶ QAP has been attacked with several heuristics and metaheuristics (see, e.g., Drezner, Hahn and Taillard (2005), James, Rego and Glover, 2007).

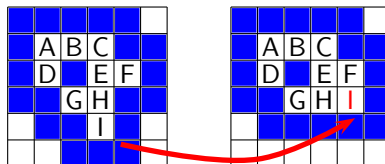


Neighborhood $\mathcal{N}_1$ (contour filling) : Set of solutions obtained by moving each symbol to an empty contour location.

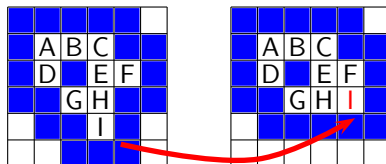
	A	B	C		
	D		E	F	
		G	H		
			I		



Neighborhood $\mathcal{N}_1$ (contour filling) : Set of solutions obtained by moving each symbol to an empty contour location.



Neighborhood $\mathcal{N}_1$ (contour filling) : Set of solutions obtained by moving each symbol to an empty contour location.



- The neighborhood size is $O(n^2)$.
- The exploration from scratch requires $O(n^3)$ time.
- Adapting the improvement proposed by Frieze, Yadegar, El-Horbaty (1989) for QAP it reduces to $O(n^2)$.



Neighborhood $\mathcal{N}_2$ (pairwise-exchange): Set of solutions obtained by swapping the assignment of two symbols r and s .

- ▶ The neighborhood size is $O(n^2)$.
- ▶ The exploration from scratch requires $O(n^3)$ time (no improvement possible)

Neighborhood $\mathcal{N}_k$ (k-exchange): Set of solutions obtained by permuting in all possible ways the assignments of k symbols.

- ▶ Generalization of the pairwise-exchange (with $k = 2$).
- ▶ The size of the neighborhood is $O(n^k)$.
- ▶ The objective function is re-computed from scratch for each solution ($O(n^2)$)



Property A solution of SK-QAP is not optimal if there is an empty line with symbols assigned on both sides.

	A		B	
D	C		E	G
			F	

	A	B		
D	C	E	G	
		F		



Property A solution of SK-QAP is not optimal if there is an empty line with symbols assigned on both sides.

	A		B	
D	C		E	G
			F	

	A	B		
D	C	E	G	
		F		

N.B. Special frequency matrices has optimal solutions with **holes**

	A	B	C	
	D		E	
	F	G	H	



QAP vs SK-QAP

QAP different solutions $\Leftrightarrow$ different permutations φ .
 SK-QAP different assignments $\varphi \Leftrightarrow$ may layouts

			D	
		A	C	
		B	E	F
			G	

(a)
original

	D			
A	C			
B	E	F		
	G			

(b)
translation

		B	A	
	G	E	C	D
		F		

(c)
90° right
rotation

			D	
			C	A
		F	E	B
			G	

(d)
vertical reflectional
symmetry

	A	B		
D	C	E	G	
		F		

(e)
canonical
form

Property We can restrict the search to canonical solutions.



We use a *long term memory* based on an hashing function

	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		



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	A	B		
D	C	E	O	F
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	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		

We select a witness
for each border



We use a *long term memory* based on an hashing function

	A	B		
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	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		

We select a witness
for each border

- Encode the symbols close to the four witness into a single integer (code)

	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		

	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		

	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		

	A	B		
D	C	E	O	F
G	H	I	P	L
	Q	R	S	
	M	N		

- Two solutions are supposed identical if the two codes are equal.



Simulated Annealing (SA)

Burkard and Rendl (1984)

Wilhelm and Ward (1987)

Connolly 1990

Tabu Search (TS)

Skorin-Kapov (1990)

Taillard (1991) *Robust Tabu Search*

Battiti and Tecchiolli (1994) *Reactive Tabu Search*

Connolly 1990

Variable Neighborhood Search (VNS)

Taillard and Gambardella (1999)

Ant Colony Optimization (ACO)

Maniezzo and Coloni (1999)

Gambardella, Taillard and Dorigo (1999)

Taillard (1998) *Fast ANT* (FANT)





R. Burkard, M.Dell'Amico, S.Martello
SIAM

in print (scheduled November 2008)

(Bipartite Matching, Linear Sum, Algebraic,
Bottleneck, Quadratic, Multi-index, Software
Codes, etc.)

Local Search

LS_Refine

1. Find a local optimum of value $\mathbf{z}_1$ with neighborhood $\mathcal{N}_1$
2. Try to improve the solution with $\mathcal{N}_2$, giving $\mathbf{z}_2$
3. **if $\mathbf{z}_2 > \mathbf{z}_1$ then goto 1.**

Two strategies

best-improvement: selects the best solution of the neighborhood

first-improvement selects the first improving solution

Metaheuristics

SA, TS, VNS and FANT implementd with

- a. $\mathcal{N}_1$, $\mathcal{N}_2$, $\mathcal{N}_1 \cup \mathcal{N}_2$
- b. speed-ups for SK-QAP
- c. the two strategies



English, French, Italian and Spanish languages.

List of the most frequent worlds

English and Spanish	http://www.wiktionary.org
French	Monde Diplomatique (1987-1997) (http://www.up.univ-mrs.fr/~veronis)
Italian	Scuola Normale Superiore of Pisa (http://alphalinguistica.sns.it)

- The first 10,000 words have been used
- The frequency of the transition between each pair of consecutive symbols was computed
- Punctuation was omitted, but for '**space**' and symbols ' and - for English



Language symbols by decreasing frequencies

English

ø E T O A N I H S R D L U F M W C Y G P B V K X J ' Q Z -

French

ø E S A I N T R U L O D C P M é ' V Q G F B H à X è J Y ê ô Z K ç ù î û W â ï ë ä

Italian

ø E A I O N R L T S C U D P M V G H F B ' Z Q è à ù ò é ì X K Y J W

Spanish

ø E A O S N R U L T D I M C P Q Y H B V G é á í ó J F Z ú ñ X K W ü

RANDOM INSTANCES

Five random benchmarks have been generated from the statistical distribution of the frequencies of each real language.



Algorithms coded in Delphi language and run on a PC Pentium 4 at 3.0 GHz under Windows XP with a **Time Limit** of 120 CPU seconds



Computational results— Real languages

Algorithms coded in Delphi language and run on a PC Pentium 4 at 3.0 GHz under Windows XP with a **Time Limit** of 120 CPU seconds

Best solutions

	J	F	W	B	X	
Q	U	O	T	H	C	
	M	S	ø	E	R	K
	P	I	N	A	Y	-
	Z	G	D	L	W	

English
(1.199.070.166)

			ù			
		Z	J	Q	X	
	H	C	O	U	M	ê
	V	I	N	E	D	ä
û	è	T	S	ø	L	'ë
	ô	é	R	A	P	à
	â	K	G	F	Y	W
			î	ç	ï	

French
(13.491.323.058)

			ù			
	è	F	G	'	Z	
é	H	C	I	L	B	
ì	S	O	ø	A	M	Y
à	T	N	E	R	V	W
	Q	U	D	P	K	
		J	ò	X		

Italian
(4.025.754.990)

		Q	é	V	á	ú	
	F	U	N	S	T	J	
ü	G	D	E	ø	O	P	K
	ó	I	R	A	L	Y	W
	X	B	M	C	H	ñ	
			Z	í			

Spanish
(1.229.359.070)



Algorithms coded in Delphi language and run on a PC Pentium 4 at 3.0 GHz under Windows XP with a **Time Limit** of 120 CPU seconds

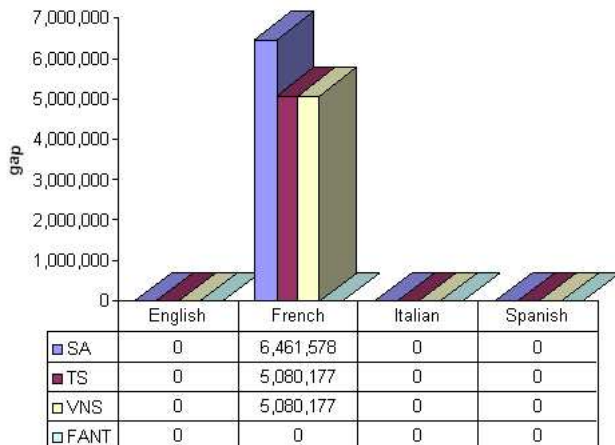
DELL' AMICO

			ù			
	è	F	G	'	Z	
é	H	C	I	L	B	
ì	S	O	ø	A	M	Y
à	T	N	E	R	V	W
	Q	U	D	P	K	
		J	ò	X		

Italian
(4.025.754.990)



Real Languages



Computational results— Random instances

N.	$\mathcal{L}$	SA2		SA12		TS2	TS12	VNS
		$\alpha = 0.95$	$\alpha = 0.98$	$\alpha = 0.95$	$\alpha = 0.98$			
1	English	0	0	0	0	0	0	0
2		0	10.730	0	115.629	0	0	0
3		0	0	0	1.290.638	0	0	0
4		0	0	0	0	0	0	0
5		0	0	0	0	0	0	0
1	French	0	142.729	1.297.299	131359	0	0	0
2		243.404	243.404	243.404	521.211	243.404	243.404	243.404
3		0	368.964	0	991.021	0	0	0
4		0	0	1.341.765	312.749	0	0	0
5		0	33.895	0	748.529	0	0	659.504
1	Italian	0	92.783	0	92.144	0	0	0
2		0	1.183.330	0	221.130	0	0	0
3		0	1.162.935	0	887.635	0	0	0
4		0	0	0	0	0	0	0
5		0	0	0	14.806	0	0	0
1	Spanish	0	0	0	0	0	0	0
2		0	0	0	0	0	0	0
3		0	0	0	0	0	0	0
4		0	52.141	0	0	0	0	0
5		0	0	0	0	0	0	0
#Best		22	14	20	11	22	22	21



- ▶ We discussed the single finger keyboard layout problem: an open domain
- ▶ We modeled the problem as a generalized Quadratic Assignment Problem
- ▶ We designed specialized metaheuristic algorithms
- ▶ We proposed **benchmark** instances from real languages

Data and results: www.or.unimore.it

