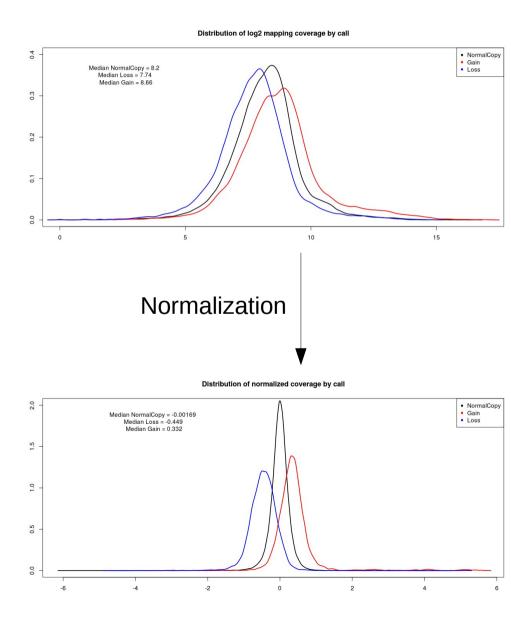
RobustCNV Description for Collaborators

CNV detection overview

- Little signal in raw data
 - Normalization removes systematic noise
- Segmentation breaks up intervals into groups
- Gain & loss calls made with sample-specific upper and lower threshold which is calculated based on postnormalization variability.



RobustCNV

Normalization

- Robust regression against PON
 - Iteratively re-weighted least squares → robust to outliers (CNVs) as compared to ordinary least squares
- Explicit GC normalization step removes most remaining GC bias when PON is poor

Segmention

 – DNAcopy – Circular Binary Segmentation (Olshen and Venkatraman, 2004)

Calling

Adaptive cutoff based on noise in sample.

Normalization: Stage 1 Robust Regression against PON

	Tumor	weight	PON1	PON2	PON3	 PON_N
interval1	843	w1	547	603	579	 14801
interval2	14995	w2	15670	12014	10766	 11831
interval3	10930	w3	16833	7806	7985	 5233
interval4	5645	w4	8460	4167	4699	 2543
interval5	1510	w5	1986	1365	1239	 13067
interval6	31967	w6	42245	22740	23146	 8287
interval7	8643	w7	14415	8444	11162	 7623
interval8	12025	8w	14776	11032	10553	 10771
interval9	15936	w9	21677	14401	13054	 20250
interval10	9068	w10	13100	7871	7234	 9401
interval11	37790	w11	46771	36182	28392	 8565
interval12	20440	w12	23731	17198	14487	 9881
interval13	3627	w13	4669	1910	2042	 19023
interval14	22654	w14	29845	18415	19862	 21193
						 22124
$interval_{_{\rm N}}$	17684	W _N	24969	18085	13307	 32116

CNV sample (observed)

Estimate w_i with RLM

minimize "e" with RLM

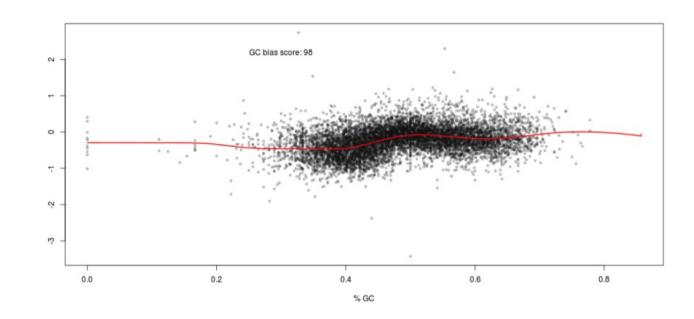
$$\hat{y} = \hat{\beta}_1 * PON_1 + \hat{\beta}_2 * PON_2 + \dots \hat{\beta}_n * PON_n$$

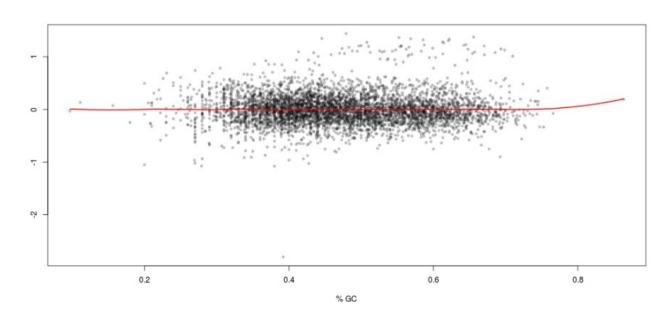
predicted

Normalized = $y - \hat{y}$

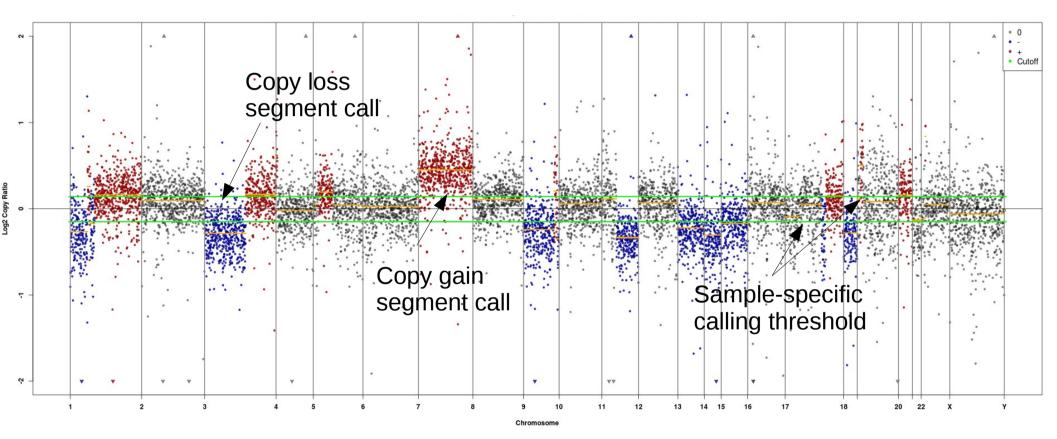
Normalization: Stage 2 Loess – remove residual GC bias

GC bias can still remain after normalization, especially in cases where systematic bias in the tumor sample is not well represented in the PON. This bias is explicitly removed from the log2 copy values by fitting a Loess model and subtracting the predicted values.





Calling gains and losses



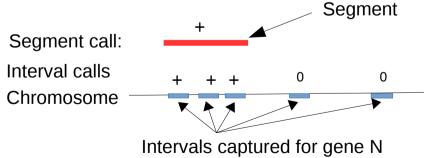
 Sample-specific calling threshold is a percentage* of the standard deviation of the intervals calculated as:

median([SD(seg1 intervals), SD(seg2 intervals) ... SD(segN intervals)]) * tuning

*The tuning parameter can be adjusted for higher sensitivity at the expense of specificity.

Segments → Intervals → Genes

- All callers produce segment calls
 - e.g. chr1:5000-20000 +
- Each baited interval is assigned a call based on the segment it intersects with.
- Gene calls are derived from the set of interval calls.



Gene Call: 3:+, 2:0 → Gain

Rules for Gene-level calls

<u>Rule</u>	<u>Gene-level Call</u>
'-' call > 2 times and and '+' > 50%	'gain+loss'
'-' call > 2 or is 100%	'loss'
'+' call > 50%	'gain'
'+' and '-' calls in the same gene (below threshold)	'mixed'
'+' calls but below threshold	'Normal+'
'-' calls but below threshold	'Normal-'
No + or - calls	'Normal'

Outputs: Gene level calls

Sample	Gene	Chromosome	geneStart	CompressedIntervalCalls	GeneCall	GeneSegmentMedian IntervalPattern
Sample1	PRKCZ	1	1982059	21:0	NormalCopy	0.0377 00000000000000000000
Sample1	TNFRSF14	1	2488093	3 11:0	NormalCopy	0.0377 0000000000
Sample1	TP73	1	3598919	9 14:0	NormalCopy	0.0377 0000000000000
Sample1	MTOR	1	11166651	L 60:0	NormalCopy	0.0377 000000000000000000000000000000000
Sample1	AGTRAP	1	11796255	57:0	NormalCopy	0.0377 0000000
Sample1	MTHFR	1	11850726	3 12:0	NormalCopy	0.0377 00000000000
Sample1	RS2901964	1	15792365	51:0	NormalCopy	0.0377 0
Sample1	C10RF144	1	16693742	25:0	NormalCopy	0.0377 00000
Sample1	SDHB	1	17345365	58:0	NormalCopy	0.0377 00000000
Sample1	RS16861326	1	18294426	61:0	NormalCopy	0.0377 0
Sample1	CHR1-2	1	20135326	61:0	NormalCopy	0.0377 0
Sample1	RS7521902	1	22490663	3 1:0	NormalCopy	0.0377 0
Sample1	EPHA8	1	22890118	3 17:0	NormalCopy	0.0377 0000000000000000
Sample1	ID3	1	23885440	2:0	NormalCopy	0.0377 00
Sample1	RUNX3	1	25228602	27:0	NormalCopy	0.0377 0000000
Sample1	ARID1A	1	27022884	121:0	NormalCopy	0.0377 000000000000000000000
Sample1	CHR1-3	1	29878032	21:0	NormalCopy	0.0377 0
Sample1	RS1866967	1	30185601	L 1:0	NormalCopy	0.0377 0
Sample1	LCK	1	32739788	3 11:0	NormalCopy	0.0377 0000000000
Sample1	TRIM62	1	33611449	7:0	NormalCopy	0.0377 0000000
Sample1	RS673604	1	35687754	1:0	NormalCopy	0.0377 0
Sample1	CHR1-4	1	37005035	5 1:0	NormalCopy	0.0377 0
Sample1	RS731174	1	38196780	1:0	NormalCopy	0.0377 0

Outputs: Summarized gene level calls

Gene	gain	gain+loss	loss	mixed	Norn	nalCopy Norma	ICopy- Norma	alCopy+
PLCG1		28	0	1	0	57	0	0
CDK6		26	0	0	0	60	0	0
CHR7-18		26	0	0	0	60	0	0
CHR7-19		26	0	0	0	60	0	0
CHR7-20		26	0	0	0	60	0	0
chr7:869836	65	26	0	0	0	60	0	0
HGF		26	0	0	0	60	0	0
HIP1		26	0	0	0	60	0	0
PTPN12		26	0	0	0	60	0	0
ABCB1		25	0	0	0	59	0	2
CARD11		25	0	0	0	61	0	0
CHR7-15		25	0	0	0	61	0	0
CHR7-16		25	0	0	0	61	0	0
CHR7-21		25	0	0	0	61	0	0

Outputs: QC Metrics

Sample	MaxNormalCor Max	TumorCor Mean	Coverage dQC	Var	GCscore	Cutoff	minPctTumorPurity1GainminPct7	TumorPurity1Loss
Sample1	0.652	0.698	34.4 0.174	0.275	3.8	0.252	38.2	32.1
Sample2	0.612	0.837	124 0.167	0.201	7.5	0.218	32.6	28
Sample3	0.608	0.835	122 0.12	0.142	4.6	0.151	22.1	19.9
Sample4	0.604	0.91	195 0.0349	0.756	9.5	0.37	58.5	45.2
Sample5	0.662	0.735	57.5 0.0924	0.127	1.9	0.161	23.6	21.1
Sample6	0.578	0.727	81.7 0.155	0.193	6.1	0.183	27	23.8
Sample7	0.522	0.83	120 0.154	0.155	6.4	0.187	27.7	24.3
Sample8	0.534	0.836	139 0.161	0.175	7.3	0.19	28.2	24.7
Sample9	0.49	0.775	106 0.139	0.276	7.1	0.197	29.3	25.5
Sample10	0.473	0.676	65.4 0.104	0.25	4	0.184	27.2	23.9
Sample11	0.545	0.701	76.3 0.0571	0.262	4.5	0.183	27	23.8
Sample12	0.546	0.837	95.6 0.111	0.268	8	0.24	36.2	30.7
Sample13	0.508	0.82	92.5 0.112	0.324	8.5	0.255	38.7	32.4
							#	

Minimum purity at which a single copy gain/loss could be detected.